



Near-term deployment of carbon capture and sequestration from biorefineries in the United States

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Capture and permanent geologic sequestration of biogenic CO₂ emissions may provide critical flexibility in ambitious climate change mitigation. However, most bioenergy with carbon capture and sequestration (BECCS) technologies are technically immature or commercially unavailable. Here, we evaluate low-cost, commercially ready CO₂ capture opportunities for existing ethanol biorefineries in the United States. The analysis combines process engineering, spatial optimization, and lifecycle assessment to consider the technical, economic, and institutional feasibility of near-term carbon capture and sequestration (CCS). Our modeling framework evaluates least cost source–sink relationships and aggregation opportunities for pipeline transport, which can cost-effectively transport small CO₂ volumes to suitable sequestration sites; 216 existing US biorefineries emit 45 Mt CO₂ annually from fermentation, of which 60% could be captured and compressed for pipeline transport for under \$25/tCO₂. A sequestration credit, analogous to existing CCS tax credits, of \$60/tCO₂ could incent 30 Mt of sequestration and 6,900 km of pipeline infrastructure across the United States. Similarly, a carbon abatement credit, analogous to existing tradeable CO₂ credits, of \$90/tCO₂ can incent 38 Mt of abatement. Aggregation of CO₂ sources enables cost-effective long-distance pipeline transport to distant sequestration sites. Financial incentives under the low-carbon fuel standard in California and recent revisions to existing federal tax credits suggest a substantial near-term opportunity to permanently sequester biogenic CO₂. This financial opportunity could catalyze the growth of carbon capture, transport, and sequestration; improve the lifecycle impacts of conventional biofuels; support development of carbon-negative fuels; and help fulfill the mandates of low-carbon fuel policies across the United States.

carbon dioxide removal | bioenergy | climate policy | carbon capture | energy systems

Atmospheric carbon dioxide removal will likely play a critical role in climate change mitigation and in deep decarbonization of energy and land sectors worldwide (1, 2). A promising class of technologies for carbon removal is known as bioenergy with carbon capture and sequestration (BECCS), which involves the capture and permanent sequestration of biogenic CO₂ produced during energy conversion. However, many BECCS technologies, including thermochemical conversion and postcombustion CO₂ capture, are commercially and technologically immature (3, 4). For instance, large-scale biomass gasification faces technical hurdles, while cellulosic ethanol production and carbon capture and sequestration (CCS) have not yet reached widespread commercial adoption, despite policy support. In light of the perceived near-term unavailability of BECCS, CCS, and advanced bioenergy conversion processes, many have criticized the large-scale inclusion of these techniques in century-scale climate change mitigation pathways (5). For instance, gigatonne-scale BECCS deployment will likely require construction of a large-scale CO₂ transport network to suitable geologic sequestration sites, commercialization of advanced biomass conversion technologies, and cultivation of novel bioenergy feedstocks at an unprecedented scale (3, 6, 7). Underpinning these challenges is the fact that many existing bioenergy facilities are distant from geologic

formations that allow for safe, reliable, and permanent CO₂ sequestration.

Near-term opportunities to develop, demonstrate, and deploy BECCS technologies can reduce costs, improve performance, and clarify their sustainable scale (8). In particular, analysis that identifies opportunities to leverage existing infrastructure, technologies, and policies can enhance both near-term and long-term mitigation efforts by deploying existing technologies and developing experience in CCS. These opportunities, however, are currently limited: robust carbon pricing regimes to support BECCS have not yet been implemented, and the United States seems poised to reduce its commitment to energy innovation in the near term (9). Existing deployment of BECCS and CCS lags several orders of magnitude behind stringent climate change mitigation scenarios, while advanced bioenergy and CCS technologies have faced numerous setbacks in recent years (3). At present, 3.7 MtCO₂/y is sequestered in dedicated geologic storage worldwide via four CCS projects, while 28 MtCO₂/y of industrial CO₂ is utilized for enhanced oil recovery (EOR) (10). In contrast, recent 2 °C-consistent scenarios by the International Energy Agency envisage 4.2 GtCO₂/y of emissions reductions via CCS by 2050, while median BECCS deployments in 2100 reach 12 GtCO₂/y in 2 °C-consistent scenarios analyzed by the Intergovernmental Panel on Climate Change (5).

Capture of biogenic CO₂ from fermentation is unique because, unlike many other BECCS technologies, it does not require a costly separation of CO₂ and can be applied at existing biorefineries. Practiced commercially for several decades, fermentation of sugars

Significance

Carbon dioxide removal through the permanent sequestration of biogenic CO₂ is a critical technique for climate change mitigation, but most bioenergy with carbon capture and sequestration (CCS) technologies are technically immature or commercially unavailable. In contrast, examples of CCS of biogenic CO₂ resulting from fermentation emissions already exist at scale. Here, we evaluate low-cost, commercially ready sequestration opportunities for existing biorefineries in the United States. We find that existing and proposed financial incentives suggest a substantial near-term opportunity to catalyze the growth of CCS infrastructure, improve the impacts of conventional biofuels, support development of carbon-negative biofuels, and satisfy low-carbon fuel policies.

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and starch currently produces over 26 billion gallons/y of ethanol worldwide. Moreover, fermentation produces a high-purity (99%) gaseous CO₂ stream consisting only of CO₂, H₂O, and small amounts of organic and sulfur compounds (11). Thus, purification, dehydration, and compression of fermentation CO₂ streams can be accomplished at relatively low cost via existing technologies, including reciprocating or centrifugal compressors, pumps, and glycol dehydration (12). Cost estimates for CO₂ capture and compression from fermentation are typically \$30/tCO₂, among the lowest of all CO₂ point sources (12–14). In comparison, the ranges of estimates of capture and compression costs from coal-fired power plants and other large-scale industrial processes that emit dilute combustion gases are 60–90 and 100–120 \$/tCO₂, respectively (13, 15). A typical dry mill ethanol plant in the midwestern United States can reduce the lifecycle carbon intensity of its ethanol by over 30 gCO₂-eq/MJ through deployment of CCS, reducing overall carbon intensity by 40% (16). CCS technologies can also be applied to ethanol production via fermentation of lignocellulosic and sugarcane feedstocks, enabling carbon-negative fuels production (17).

Indeed, carbon capture, utilization, and sequestration from corn ethanol have found a number of applications in recent years. Fermentation from corn ethanol is the largest source for merchant CO₂ markets, such as food, beverage, and dry ice, in the United States (18). CO₂ from ethanol fermentation has also been used for EOR and sequestered in deep saline aquifers (19). For instance, the Illinois Industrial CCS project in Decatur, Illinois, captures 1 MtCO₂/y from a corn ethanol facility with 300 million gallon/y capacity for sequestration in the Mt. Simon sandstone, a saline aquifer. This project has developed technical capacity in geologic storage site characterization, reservoir monitoring, and project development (20). Similarly, Red Trail Energy in Richardton, North Dakota, plans to sequester 180,000 tCO₂/y from ethanol fermentation in the Broom Creek Formation by 2020 (21). Both projects take advantage of their proximity to saline aquifers suitable for geologic sequestration, which is one option for long-term CO₂ storage. These geologic formations have sufficient volume, permeability, and overlying cap rocks to ensure permanent retention of the injected CO₂.

As of late 2016, the United States had capacity to produce 15.8 billion gallons/y of ethanol from 216 biorefineries, equivalent to 6% of the US on-road transportation energy demand (22). These facilities primarily use corn as a feedstock, although some use sorghum, wheat starch, cellulosic biomass, tobacco, and food-processing waste (e.g., cheese whey). Biorefineries producing ethanol are located in 28 US states but are concentrated in the Midwest, where most corn is grown (Fig. 1A). However, large portions of the Midwest do not overlie geology suitable for geologic sequestration. As a result, permanent sequestration of fermentation-derived CO₂ from existing biorefineries will necessitate construction of pipelines to transport CO₂ to more prospective areas of the United States. Pipeline transport exhibits economies of scale (23, 24), which motivates aggregation of multiple small-volume sources for higher-volume transportation. The cost of long-distance transport of relatively small volumes of CO₂ emitted from biorefineries may be prohibitive, especially should aggregation not occur.

Since 2005, the United States and other countries have developed energy and climate policies that could incentivize CO₂ capture and sequestration from existing biorefineries. For example, CCS applied to ethanol production can be valued under low-carbon fuels policy, biofuels mandates, supportive CCS policy, and other climate policy instruments as long as emissions benefits are quantified and credited appropriately (25). These policies exist at the sub-national, national, and international level.

Here, we evaluate the technical, economic, and institutional feasibility of near-term CO₂ capture opportunities for existing biorefineries in the United States using process engineering, spatial optimization, and lifecycle assessment. We provide detailed

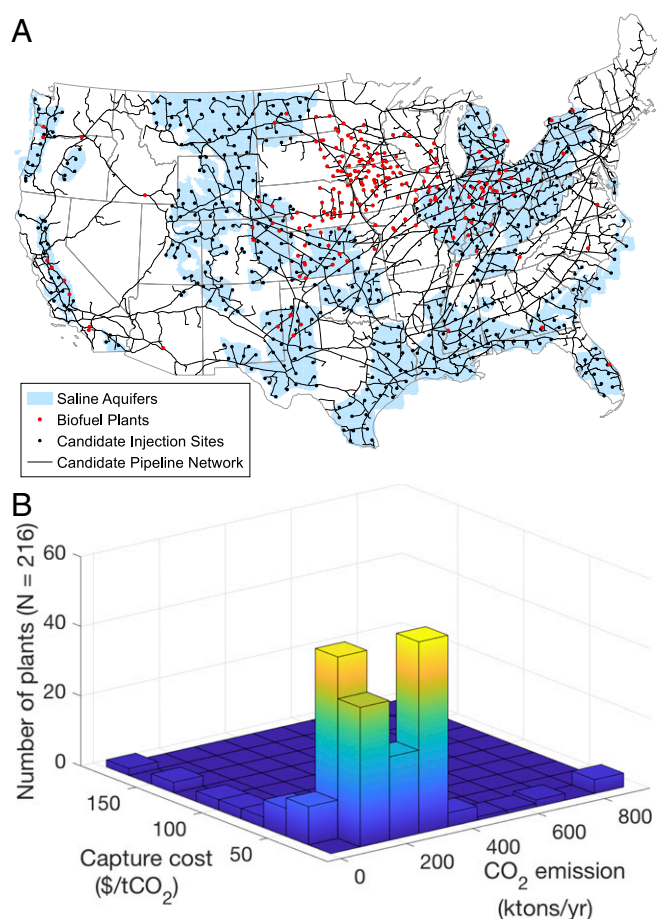


Fig. 1. (A) Existing and planned ethanol biorefineries, saline aquifers, candidate CO₂ pipeline rights of way, and candidate injection sites in the United States. Lack of adequate sequestration capacity in proximity of existing biorefineries necessitates the construction of a CO₂ transportation network to achieve high levels of abatement. (B) Contour plot of modeled abatement costs and scales for CO₂ capture and compression for biorefineries ($n = 216$); 60% of fermentation CO₂ emissions are available for pipeline transport for under \$25/tCO₂.

spatial characterization of (i) fermentation CO₂ emissions, (ii) capture and compression costs, (iii) sequestration and abatement costs, and (iv) CO₂ transportation costs to sequestration sites. Our modeling framework explicitly considers the economies of scale that can be achieved through aggregation of CO₂ sources into integrated pipeline networks, which can reduce overall transportation costs. We also examine recent and proposed policies for low-carbon fuels and CCS to better understand how they might incentivize CCS deployment.

Results

Large-scale deployment of CCS at existing US biorefineries requires detailed characterization of costs and candidate CO₂ transport networks. Below, we study (i) fermentation CO₂ emissions, (ii) capture and compression costs, (iii) sequestration and abatement costs, (iv) transport costs, and (v) profits under different incentive scenarios. Aggregating quantities and costs results in supply curves for CO₂ sequestration and abatement (*Methods*).

The majority of midwestern biorefineries are not collocated with suitable sites for geologic sequestration (Fig. 1A). Based on source–sink matching, 60% of current nationwide capacity requires pipeline transport to basins in, for instance, Illinois, the Dakotas, Wyoming, or Kansas. Cumulatively, US ethanol biorefineries emit

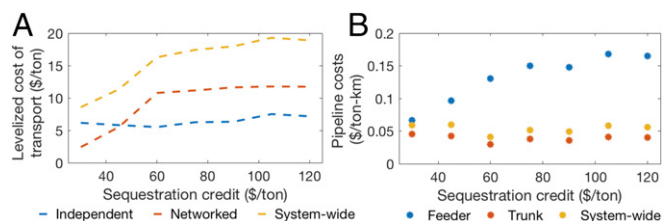


Fig. 4. (A) Levelized transport costs (dollars per ton) and (B) pipeline costs (dollars per ton-kilometer) across sequestration credit scenarios. Levelized transport costs associated with individual plants are disaggregated between feeder and trunk pipelines. Levelized pipeline costs are allocated between trunk pipelines, which handle CO₂ from multiple biorefineries, and feeder pipelines, which transport the CO₂ of a single biorefinery. The levelized cost of networked transport increases at higher credit prices as CCS at biorefineries farther from injection points becomes cost-effective and necessitates larger pipeline networks. Trunk pipelines exhibit economies of scale, but feeder pipelines do not. Nevertheless, the levelized cost of transport does not exceed \$19/tCO₂ in any scenario.

carrying 3.7 MtCO₂/y. In contrast, this amount increases to 22 inches, carrying at least 9.8 MtCO₂/y, for sequestration credits between \$60 and \$120/tCO₂. Larger pipeline networks would become increasingly cost-effective if CCS from nonethanol sources of CO₂, such as power plants and other industrial sources, becomes economically feasible.

Constraints on geologic storage capacity were not a strong factor in CCS network construction for existing biorefineries. Nevertheless, we find that some saline aquifers bordering the Midwest approach, but do not exceed, their storage capacity over a 20-y injection period. For instance, some injection sites in eastern North Dakota reach up to 69% of their capacity across analyzed sequestration credits, while others in Illinois reach 45%. However, we do not consider competition for storage between biorefineries and fossil fuel plants or other industrial sources of CO₂, both of which are situated throughout much of the Midwest. Should other facilities perform CCS in capacity-limited regions, biorefinery operators could be forced to transport their CO₂ longer distances.

Profits increase with sequestration and abatement credits, making CCS increasingly lucrative for ethanol producers. Average profits, defined as the difference between cost and credit price, increase from \$5.0 to \$20.8, \$47.8, and \$76.1/tCO₂ sequestered at \$30, \$60, \$90, and \$120/tCO₂ sequestered, respectively. At \$120/tCO₂ sequestered, total profits are as much as \$3.3 billion/y (Fig. S2). Profits are similar across abatement credit scenarios. While the distribution of such profits depends on contractual arrangements, there is nevertheless the potential for high profits for biorefineries or CO₂ off-takers.

Discussion

Fermentation CO₂ streams are a strategic early source for cost-effective CCS deployment in the United States. To assess the technical, economic, and institutional feasibility of CCS from existing biorefineries, we discuss (i) system economics, (ii) emissions impacts, (iii) producer coordination, (iv) additional revenue opportunities, and (v) implications for CCS and BECCS commercialization.

CCS is profitable at existing biorefineries at sequestration credits as low as \$30/tCO₂ (Fig. 24). The current paradigm suggests that, although CCS from existing biorefineries has lower capture costs than for less-concentrated CO₂ sources, like coal, it faces higher transport and sequestration costs due to their small scale (13, 14, 23). In contrast, our analysis shows that integrated pipeline networks allow sequestration of biorefinery CO₂ emissions at low overall cost. Should supportive policy treat biogenic, industrial, and fossil CO₂ emissions equally, ethanol is likely a low-cost entry point for CCS in the United States. In practice,

consistent accounting for biogenic CO₂ emissions and CO₂ removal poses considerable challenges to policymakers (25).

Increasingly large sequestration and abatement credits increase producer profits but have declining returns for incremental emissions impacts (Fig. 2B). Declining incremental emissions reductions result from the prevalence of low-cost abatement across biorefineries. There are diminishing returns to CCS as sequestration credits exceed \$75/tCO₂: at this point, nearly 85% of all fermentation emissions can be sequestered cost-effectively. Beyond this credit price, the value of credits accrues primarily to producers as profit (Fig. S2). Plant or infrastructure operators can profit over \$3 billion/y at a sequestration credit price of \$120/tCO₂.

CCS is effective at reducing the carbon intensity of existing ethanol production, positioning it as an important tool to reduce emissions in the transportation sector. Lifecycle assessment indicates that a typical dry mill ethanol plant in the midwestern United States can reduce overall carbon intensity by at least 40% via CCS (16). At scale, we estimate that biorefineries with CCS can contribute roughly 1.5 billion gallons/y of ethanol to the California market through 2030, providing 7–8 MtCO₂/y of abatement on a lifecycle basis or 4–5% of California's 2030 goal based on demand forecasts, fuel blending constraints, proposed standards, and lifecycle assessments (SI Text). Should biorefiners adopt CCS on corn ethanol production, it would likely qualify as one of the lowest-carbon intensity crop-based fuels produced in the United States. Nevertheless, CCS does not mitigate the detrimental impacts of large-scale corn ethanol production, including high water and fertilizer demands, nitrous oxide emissions, and potential effects on food prices.

Coordination and development of an integrated CO₂ transport network are important for low-cost CCS implementation. An integrated approach to pipeline infrastructure offers the lowest average cost for operators over the life of the project if sufficient capacity utilization is achieved relatively early in the life of the pipeline (28). Across scenarios that we consider, the levelized cost of transport does not exceed \$19/tCO₂ (Fig. 4). While transport costs increase with quantity of CO₂ sequestered, pipeline aggregation and the inherently low cost of CO₂ capture allow 68% of the available resource to be sequestered at costs at or below \$60/tCO₂. At short transportation distances, truck transportation of CO₂ may be more cost-effective than pipeline transport (14). Integrated pipelines also reduce the barriers to entry and are more likely to lead to faster development and deployment of CCS. There is early momentum for integrated pipeline infrastructure development in the United States: the Carbon Storage Assurance and Facility Enterprise initiative is intended to develop integrated CCS storage complexes constructed and permitted for operation in the 2025 timeframe, including in Nebraska and Kansas (29).

Similar opportunities exist for EOR using fermentation CO₂, creating additional revenues. EOR is widely practiced in the United States and currently procures CO₂ from biorefineries in Kansas (30). Basins in Texas, Oklahoma, Wyoming, Michigan, and Louisiana constitute current demand, but EOR could potentially expand to California, North Dakota, Colorado, and West Virginia among other states (31). Additional demand may come from EOR in Residual Oil Zones. However, many EOR sites are farther than saline aquifers from the Upper Midwest, where biorefineries are concentrated. Ultimately, the choice of CO₂ sequestration in saline aquifers or via EOR will depend on economics, policy instruments, and storage regulations. Finally, our analysis suggests that other countries, including Brazil, China, Canada, and the European Union (EU), could adopt CCS at ethanol biorefineries at low costs (SI Text).

Sequestration and abatement credits can develop experience in carbon sequestration, project finance, and business models for CCS. The rate of fermentation CO₂ emissions is an order of magnitude larger than existing dedicated-storage geologic injection rates and is twofold higher than rates of industrial CO₂ sequestered via EOR (10, 30). Importantly, implementation does not rely on widespread deployment of costly or unproven solvents,

sorbents, or membranes for commercial-scale CO₂ capture (*SI Text*). Capture at existing biorefineries also provides valuable experience for future cellulosic biorefineries equipped with CCS, which will have similar scale and CO₂ purity. Cellulosic biorefineries with CCS can achieve net negative lifecycle emissions, playing an important role in stringent climate change mitigation scenarios (17). Furthermore, there is a geographic overlap between existing ethanol biorefineries and potential cellulosic feedstocks, like agricultural residues and dedicated energy crops (6). As such, CO₂ transportation infrastructure for existing biorefineries could support CCS at future cellulosic biorefineries in the United States. In this scenario, transport operators may wish to overbuild CO₂ pipelines in anticipation of future CO₂ supply from advanced BECCS technologies. Prior work has identified overbuilding as cost-effective when CO₂ supply is expected to increase over time (32).

Policy Context

Recent financial incentives offered under state and national policy suggest a substantial near-term opportunity to permanently sequester biogenic CO₂. Below, we highlight the opportunities and shortcomings of existing policies to incentivize CCS from biorefineries. We find that low-carbon fuel and CCS policies in the United States can likely incentivize CCS, but national and international quantity mandates fail to provide adequate incentives as currently designed.

Market-based incentives for CO₂ abatement in the transportation sector, both in the United States and internationally, can incentivize CCS. For instance, several states and provincial jurisdictions (e.g., California, Oregon, British Columbia) have implemented low-carbon fuel standards (LCFSs), which are market-based policies to reduce the lifecycle carbon intensity of transportation fuels over time (33). These systems provide an economic incentive for emissions abatement in biofuel production. Their potential can be evaluated through the analogous abatement credits that we study. Average monthly abatement credit prices in California's LCFS have ranged from ~\$75 to \$125/tCO₂ since late 2015, with a price ceiling of \$200/tCO₂. Political uncertainty surrounding California's climate programs has recently been resolved, and analyses suggest that LCFS credit prices will remain high, particularly if post-2020 targets are tightened (34). Currently, California is developing a quantification methodology and permanence protocol for CCS that will enable its use in the LCFS and, potentially, cap and trade programs. Should these methodologies be adopted as part of the LCFS, biorefiners will be able to provide an additional source of low-carbon ethanol to California, helping fulfill the mandates of the LCFS.

Similar CCS opportunities exist in other jurisdictions implementing LCFSs. Oregon's Clean Fuel Standard can adopt fuel pathways from California's LCFS, easing regulatory implementation of CCS. Canada is currently developing a national Clean Fuels Standard to achieve 30 MtCO₂ of annual reductions by 2030, which would extend LCFS policies beyond the province of British Columbia (35). Canada is currently the largest importer of United States ethanol: should it implement a Clean Fuels Standard, it could serve as an additional market driver for CCS deployment for ethanol (36).

Newly revised CCS tax policy in the United States can also produce revenues for existing ethanol biorefineries. The Bipartisan Budget Act of 2018 (H.R. 1892) includes a 12-y tax credit of up to \$50/tCO₂ sequestered in secure geologic storage, which is similar to the sequestration credits that we study (37). This proposal expands an existing tax credit for CO₂ sequestration, which was previously \$20/tCO₂ (38). Smaller tax credits would also be available for EOR operations. We estimate that 99% of fermentation CO₂ from biorefineries in the United States meets the minimum facility-level capture threshold of 25,000 tCO₂ sequestered per year. While other sources of industrial CO₂ would also qualify for this tax credit, our analysis suggests that biorefineries could be a cost-effective option for industrial CCS at the national scale.

In contrast to other policy instruments, biofuel quantity mandates fail to provide incentive for CCS at existing biorefineries as currently designed. For instance, the US Renewable Fuels Standard (RFS) provides limited support for CCS deployment on biofuels, as all corn ethanol production is statutorily mandated as a "conventional biofuel" and generates the lowest priced category of credit (39). Moreover, the binned structure of the RFS means that even producers of "advanced biofuels" from other feedstocks do not directly benefit from reductions in carbon intensity of their fuels. Nevertheless, the US Environmental Protection Agency has proposed registration, recordkeeping, and reporting requirements to allow CCS in the RFS. The EU is currently evaluating its post-2020 climate policy; however, it is unclear if the EU will eliminate its Fuel Quality Directive, which regulates the carbon intensity of transportation fuels, in favor of a quantity-based mandate (33). Without a carbon intensity regulation, European policy may not provide adequate incentive for CCS. Similarly, Canada's Renewable Fuels Regulations do not currently require lifecycle emissions reductions (35). Quantity mandates are the primary driver of ethanol exports: as a result, international policy changes may be necessary to encourage further markets for ethanol with CCS (36). We also note that policy uncertainty, including evolving regulations, repeated expiration and renewal of policies, and lack of coordination between policymakers, can affect revenues and finance for CCS at existing biorefineries.

Conclusion

The challenge as well as the importance of meeting gigatonne-scale CO₂ removal envisioned in stringent climate change mitigation scenarios cannot be overstated. However, CCS integration at biorefineries could catalyze the growth of carbon capture, transport, and sequestration in the United States. Such deployments would build critical experience with carbon sequestration, project finance, and business models for CCS, which would be applicable worldwide. Finally, existing and proposed policies seem poised to make CCS integration cost-effective. Deploying CCS at existing biorefineries is an important step forward toward understanding the potential for large-scale BECCS.

Methods

Data Development. We estimate facility-level CO₂ fermentation emissions based on current and under construction production and apply an emissions factor of 2,853 tCO₂/million gallons ethanol production as in ref. 19. We estimate capital and operating costs for CO₂ capture and compression using methods developed in ref. 40, with updates to fermentation CO₂ parameters from ref. 13 and state-level industrial electricity prices from the Energy Information Administration. We assume that biorefineries use grid electricity for compression, which is priced at state-level industrial electricity prices, and have a carbon intensity equal to that of the North American Electric Reliability Corporation subregion. We estimate the cost and capacity of CO₂ pipelines constructed from X80 steel with o.d. values of 3, 4, 6, 8, 10, 14, 18, 22, 26, and 30 inches based on data and methods in refs. 23 and 24. We assess site-specific sequestration costs, which include the cost of site characterization based on areal footprint, well drilling and completion, injection equipment, operating and maintenance costs, and ongoing monitoring and verification costs, based on methods in refs. 41 and 42 (*SI Text*). We include a fixed cost of \$52 million per site to account for development costs. We calculate CO₂ abatement costs by accounting for regional variation in the carbon intensity of electricity supplied for compression, adopting lifecycle assessment methods and data used by the State of California (43). We assume a 10% cost of capital and a 20-y project lifetime. We adjust capital costs of pipelines to 2014 using US Bureau of Labor Statistics cost indices and the costs of storage using the Information Handling Services (IHS) Upstream Capital Cost Index.

Candidate CO₂ pipeline rights of way follow existing natural gas pipelines as reported by the National Pipeline Mapping System (44). Where existing pipelines do not exist, possible rights of way are added by following major roads. The lengths of portions of the candidate network that pass through urban areas (US Census Bureau) and/or mountainous regions (slope greater than 8%) are adjusted to reflect a 50% increase in total construction cost under these conditions.

Problem Statement and Scenarios. We minimize the total cost of capture, compression, transportation, and sequestration using integer programming to identify cost-effective sequestration opportunities (6, 45) (*SI Text*). Our five decision variables consist of two positive continuous variables representing CO₂ flow through each pipeline segment and the amount of CO₂ injected into each aquifer resource as well as three binary variables that identify the activation of individual pipeline segments, aquifer resources, and CO₂ capture at biorefineries. Our model is implemented in the General Algebraic Modeling System and solved using a branch-and-bound method. As a result of model complexity, solutions yield optimality gaps of 10–50%, which mean that solutions should be considered feasible but not necessarily optimal. As a result, implementation of CCS at each subsidy level is likely even more favorable than indicated by this study.

In each scenario, we assume a credit price for sequestration or abatement. System boundaries are described in detail in *SI Text*. Sequestration credits emulate existing CCS tax credits (37), while abatement credits emulate tradeable climate policy instruments, such as credit prices in an LCFS (33). In practice, price volatility, the availability of other low-carbon transportation fuels, lifecycle emissions accounting, tax equity availability, and policy duration will affect the cost-effectiveness of a CCS project incentivized by tax credits or tradeable permit systems. We do not explicitly assess other potential revenue streams, including utilization options, like EOR or beverage

carbonation. We define profit as the difference between cost and credit price and do not formally consider ethanol production costs.

We generate supply curves both at the facility level and the system level. Facility-level supply curves depict capture, transport, and sequestration costs at each biorefinery for a given credit price (Fig. 2A and Fig. S1). System-level supply curves depict overall abatement or sequestration at the industry level for a given credit price (Fig. 2B). We calculate facility-level transportation costs by assigning the full cost of pipelines used by individual plants (e.g., feeder pipelines) to each respective plant and identifying a leveled cost of injection for each shared network, which is paid by each plant participating on that network. This approach simulates a scenario in which an independent pipeline operator charges a fixed rate for usage of the network. However, this does mean that each plant on an individual network pays the same rate regardless of their proximity to an injection site. Feeder pipelines are defined as pipelines that are used by only one plant, while trunk pipelines are shared among many plants.

Data Access. Biorefinery data presented here are available online from the Renewable Fuels Association at www.ethanolrfa.org/resources/biorefinery-locations/. Existing pipeline rights of way are available at <https://www.npms.phmsa.dot.gov/>. National Carbon Sequestration database data on saline aquifers are available at <https://www.netl.doe.gov/research/coal/carbon-storage/natcarb-atlas>.

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