# Sustainable Energy & Fuels



View Article Online

View Journal | View Issue

# PAPER

Check for updates

Cite this: Sustainable Energy Fuels, 2024, 8, 811

Received 28th July 2023 Accepted 29th December 2023

DOI: 10.1039/d3se00978e

## 1 Introduction

In November 2021, the 197 Parties to the United Nations Framework Convention on Climate Change (UNFCCC) recognised the need for "rapid, deep and sustained reductions in global greenhouse gas emissions, including reducing global carbon dioxide emissions by 45 per cent by 2030 relative to the 2010 level and to net zero around mid-century"<sup>1</sup> to keep global warming below 1.5 °C. This urgency in decarbonising our economies also affects the hard-to-abate sector, aviation, which was responsible for 1.04 Gt of (tank-to-wake) CO<sub>2</sub> emissions in 2018 – representing roughly 2.5% of global CO<sub>2</sub> emissions<sup>2</sup> – with expected demand growth rates of about 2–3% p.a. over the next decades.<sup>3–5</sup> If climate change mitigation in the aviation sector continues to lag behind other sectors, international aviation's share of global CO<sub>2</sub> emissions could rise to 22% by 2050.<sup>6</sup>

# Future costs of power-to-liquid sustainable aviation fuels produced from hybrid solar PV-wind plants in Europe†

Kyle Seymour, <sup>(1)</sup>\*\* Maximilian Held,<sup>a</sup> Boris Stolz, <sup>(1)</sup> <sup>b</sup> Gil Georges<sup>a</sup> and Konstantinos Boulouchos<sup>a</sup>

Sustainable Aviation Fuels (SAFs) produced from renewable electricity *via* Power-to-Liquids (PtL), also called e-jet fuel, can reduce net greenhouse gas emissions of aircraft by up to 90%, but they are markedly more expensive than fossil jet fuel. Their future production costs are particularly dependent on the cost of renewable electricity and, to date, not analysed with high geographical scope and resolution. This study assesses the future production costs of PtL-SAF produced *via* electrolysis and Fischer–Tropsch synthesis from hybrid solar PV-wind power plants and  $CO_2$  captured from ambient air. At 5390 locations across Europe, plant configurations have been optimised considering spatial and temporal restrictions on electricity generation. Thus, cost-optimal production regions are identified for 2030, 2040 and 2050. By 2030, PtL-SAF costs in Europe could already be as low as 1.21 EUR per litre (1510 EUR per tonne) and decrease to 0.71 EUR per litre (880 EUR per tonne) by 2050. If the blending mandate for renewable fuels of non-biological origin within the ReFuelEU Aviation regulation were to be supplied purely from PtL-SAF production regions within Europe, the average PtL-SAF cost would rank at 1.22 EUR per litre (1525 EUR per tonne) in 2030 – 3 times the historical market price of fossil jet fuel – and at 0.81 EUR per litre (1000 EUR per tonne) by 2050. Consequently, the impact on ticket prices would be less than 1% by 2030, 3% by 2040, and 7% by 2050.

In October 2021, the International Air Transport Association (IATA) increased its ambition from halving 2005 emission levels until 2050 to achieving net-zero carbon emissions by 2050.<sup>7</sup> In October 2022, the International Civil Aviation Organisation (ICAO) followed this ambition and adopted a global long-term aspirational goal (LTAG) of net-zero carbon emissions for international aviation.<sup>8</sup>

Reports from the Mission Possible Partnership,<sup>5</sup> the Air Transport Action Group,<sup>9,10</sup> the International Transport Forum,<sup>11</sup> and the European aviation sector's industry associations<sup>12</sup> highlight potential pathways to net zero, including the amount of Sustainable Aviation Fuels (SAFs) required to achieve this goal. In all studies, SAFs – which can already be blended to fossil jet fuel up to 50% (ref. 13) today – represent the most important lever to curb aircraft CO<sub>2</sub> emissions. There is also increasing evidence that SAFs can reduce aviation induced cloudiness<sup>14</sup> – an effect that historically contributed about two thirds of the effective radiative forcing of aviation (whereas CO<sub>2</sub> was only responsible for one third).<sup>15</sup>

SAFs can be produced from sustainable biomass, hightemperature solar heat or clean electricity.<sup>16–18</sup> The limited availability of sustainable biomass warrants a focus on production pathways without such limits.<sup>8,19</sup> The third pathway, Power-to-Liquid (PtL), produces e-jet fuel from electricity and CO<sub>2</sub>, *e.g. via* electrolysis and Fischer–Tropsch synthesis, and is

<sup>&</sup>lt;sup>a</sup>ETH Zurich, Department of Mechanical and Process Engineering, Institute of Energy Technology, Leonhardstrasse 21, 8092 Zurich, Switzerland. E-mail: kwdseymour@ gmail.com

<sup>&</sup>lt;sup>b</sup>Federal Department of the Environment, Transport, Energy and Communications, Federal Office of Civil Aviation, Papiermühlestrasse 172, 3063 Ittigen, Switzerland † Electronic supplementary information (ESI) available. See DOI: https://doi.org/10.1039/d3se00978e

more mature than the second. Compared with fossil jet fuel, PtL-SAF can reduce the specific greenhouse gas (GHG) emissions of aircraft by about 70-90%,20-22 but is more expensive to produce than fossil jet fuel.

Therefore, the United States provide tax credits for the supply of SAFs<sup>23</sup> and the European Union introduced a blending mandate for SAFs to spur their production and use.24,25 The European blending mandate also includes a sub-mandate for the ramp-up of renewable fuels of non-biological origin, which include PtL.

With an increasing number of companies sending a demand signal to airlines and fuel producers by committing to use 10% SAFs by 2030,<sup>26</sup> it is crucial to address barriers and risks that impede this growth in a timely manner.27 To increase investment security and thus tackling a pivotal risk, accurate and high-resolution estimates of future fuel production costs are required. This study provides an overview of existing studies for the production costs of PtL fuels and adds regionally resolved fuel cost estimates for production regions across Europe (the EU-27, the UK and the European Free Trade Association).

#### 1.1 Literature review

Fig. 1-4 show a literature review of PtL fuel production costs estimates since 2010, and projected costs until 2050.16,21,28-51 Fuel production costs as stated in the references are recalculated to EUR<sub>2019</sub>, based on individual publication years and using the annual Harmonized Indices of Consumer Prices (HICP<sup>52</sup>).‡.

The cost of electricity is by far the biggest cost driver for PtL fuels, given the high electricity demand for electrolysis, see Fig. 1. Projected fuel production costs decrease over time, but the high spread in the results of individual studies does not support clear conclusions about the impact of individual

2030

8

6

5

Δ

З

2

Ω

2010

2020

production costs in EUR2019/liter

Fuel

production costs in EUR<sub>2019</sub>/liter

Fuel

6

5

4

2

2010

components (see Fig. 2-4):

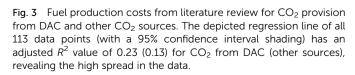
• Fuel product fractions: The FT synthesis yields a mixture of different fuel fractions according to the Schulz-Flory distribution and individual plant settings. The distillation of these FT liquids (syncrude) into individual fractions (kerosene, diesel, gasoline or naphtha) requires additional energy. However, the confidence intervals of the regression lines for syncrude and distilled fractions largely overlap.

• Source of CO<sub>2</sub>: Direct air capture of CO<sub>2</sub> (DAC) requires more energy than capturing it from point sources, leading to higher fuel costs, but also here confidence intervals overlap. In Fig. 3, "other CO<sub>2</sub> sources" include concentrated point sources like the post-combustion capture of  $CO_2$  from flue gases (e.g. of cement/coal power plants), the purchase of concentrated  $CO_2$ , and other unspecified sources.

• Electrolysis type: High-temperature (HT) electrolysis, i.e. solid oxide electrolysis (SOEL), offers a higher efficiency

CO<sub>2</sub> from DAC

Other CO<sub>2</sub> sources



2030

2020

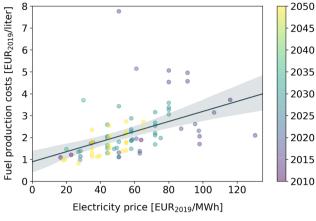


Fig. 2 Fuel production costs from literature review for distilled FT fuel Fig. 1 Literature review of PtL fuel production cost estimates for fractions and crude FT liquids. The depicted regression line of all 113 a range of electricity prices. The depicted regression line of all 85 data data points (with a 95% confidence interval shading) has an adjusted  $R^2$ value of 0.23 (0.13) for distilled fuel fractions (crude FT liquids), points (with a 95% confidence interval shading) has an adjusted  $R^2$ revealing the high spread in the data. value of 0.21, revealing the high spread in the data.



FT jet fuel/

diesel/ gasoline FT liquids

2040

2050



2040

2050

<sup>‡</sup> Studies published in 2020 and 2021 are not adjusted due to COVID-19 irregularities and due to the fact that the underlying data of these publications likely stems from pre-pandemic years. Values in other currencies are transformed to EUR values via historical currency exchange rates.53

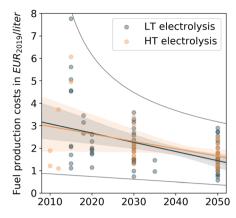


Fig. 4 Fuel production costs from literature review for low- and hightemperature electrolysis (LT/HT). The depicted regression line of all 96 data points (with a 95% confidence interval shading) has an adjusted  $R^2$ value of 0.19 (0.15) for LT (HT) electrolysis, revealing the high spread in the data

potential than low-temperature (LT) electrolysis like alkaline or polymer electrolyte membrane electrolysis (AEL or PEMEL). While the comparison of individual studies on either LT or HT electrolysis does not reveal any marked differences, studies that analyse both LT and HT electrolysis variants indicate that LT electrolysis is currently less expensive, but could be outperformed by HT electrolysis from 2030 onwards.33,37,44,45,48

In general, there are a number of reasons for the high variation in existing PtL fuel cost estimations, the most important being different assumptions for the plant setup, its geographical location, the operation of the plants, as well as capital and operational expenditures (CAPEX and OPEX) of individual components. With many of these factors hard to predict due to the yet-to-be-scaled nature of individual components, this study provides a sensitivity analysis of which plant variables most influence the final costs of PtL fuel production.

#### 1.2 Research gaps and contribution of this study

Most existing studies on PtL fuel costs generally focus on single fuel production plants and do not resolve for geographical differences, mostly because they consider the supply of electricity from the grid or excess renewable electricity.54 Three studies have analysed levelised costs of e-fuel production for multiple countries/regions, but do not provide a more granular resolution within country borders: A report published by the German Energy Agency at the end of 2020 optimises the cost for the global supply of various e-fuels between 2030 and 2050 with a resolution of 92 countries or regions.<sup>41</sup> Moritz et al. (2023) provide high-level production costs of hydrogen and hydrogenderived fuels for 113 countries.55 An industry report by Concawe published at the end of 2022 calculates the cost of supplying various e-fuels to Europe from four regions in Europe, Middle East and North Africa.<sup>56</sup> Two other studies provide a more indepth analysis of a few countries within Europe: Gonzalez-Garay et al. (2022) optimise the cost of PtL-SAF supply for Spanish aviation, based on solar energy.57 Ordóñez et al. (2022)

calculate the cost of PtL-SAF supply for aviation in five European countries (DE, ES, FR, GB, IT).58

We have identified a lack of scientific publications that combine the large regional coverage of some studies with the indepth analysis of regional fuel production cost differences of others. In particular, there is no study that assesses the cost of PtL-SAF production for all European countries, investigating regional differences (within individual countries) together with cost projections until 2050 and considering intra-day and seasonal energy storage. This study aims to combine these aspects. It analyses stand-alone PtL-SAF production plants utilising solar PV and wind energy. It showcases the benefits of combining these renewable energy sources with high untapped potential. Other energy sources, such as hydropower, as well as electricity supply from the grid have not been assessed. The present work excels existing studies in the geographical and temporal resolution within Europe. We divide Europe into 3102 onshore and 2288 offshore evaluation locations for which we determine the cost-optimal fuel production plant design and operation, given local solar irradiation, wind power potential, and land availability for the production of electricity from these sources.

Doing so, this paper provides insights into how a transformation towards a carbon-neutral aviation sector in Europe can be shaped: First, locations with lowest PtL-SAF production costs are identified. Since PtL-SAF is currently at least 3× more expensive than fossil jet fuel, these lowest-cost regions should be selected in particular for the initial ramp-up of production capacities. Second, parameters with the highest influence on fuel costs are derived from a sensitivity analysis. Third, the additional costs of PtL-SAF compared with fossil jet fuel are discussed in the light of the EU blending mandate - and what effect the cost differential could have on ticket prices.

#### 2 Methods

#### 2.1 Plant design

This section provides an overview of the modelled plant design, from its renewable electricity, water and air inputs to the final fuel product. Fig. 5 illustrates the plant setup.

To ensure a maximum  $CO_2$  reduction of the produced fuels, electricity is supplied by standalone hybrid solar PV-wind plants, which have been identified as promising for the

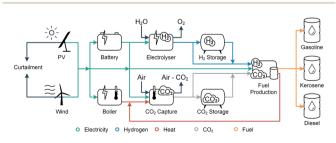


Fig. 5 PtL-SAF production process flowchart including all modelled components and energy/mass streams. "Fuel production" includes a reverse water-gas shift reaction step, Fischer-Tropsch synthesis, and refining.

production of synfuels in previous studies.<sup>34,59</sup> The majority of the produced electricity is consumed in the production of the fuel's initial constituents: hydrogen and  $CO_2$ .

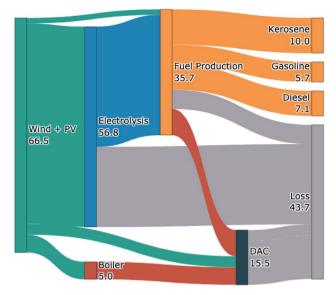
Hydrogen is produced *via* LT electrolysis – either AEL or PEMEL – due to its higher technology readiness level (TRL) than HT SOEL.<sup>60,61</sup> LT electrolysers also have the advantage of not requiring co-located high-temperature process heat.

 $CO_2$  is captured from ambient air *via* low-temperature direct air capture.<sup>62–64</sup> Required heat streams at 80–120 °C are recycled internally from process waste heat or produced *via* electric boilers. In the short-term,  $CO_2$  from fossil industrial point sources like coal power plants could lower the fuel production costs compared to PtL from DAC. However,  $CO_2$  should be supplied increasingly from air or biogenic point sources after 2030 (ref. 61 and 65) to achieve net-zero greenhouse gas emissions across the whole economy.

Hydrogen and CO<sub>2</sub> are converted to syngas *via* a reverse water-gas shift reaction (RWGS).<sup>35</sup> Syngas is converted to syncrude in a Fischer–Tropsch synthesis unit, and refined to individual fuel products (jet fuel, diesel, and gasoline) in a hydrocracker. This study excludes other PtL-SAF production pathways such as those *via* methanol. Since they are not yet certified, a lack of comprehensive process and plant data currently impedes a thorough analysis.<sup>66</sup> The fuel synthesis

Table 1 CAPEX, OPEX, lifetimes, and efficiencies of all plant components. "Fuel synthesis" costs include the costs of a reverse water–gas shift (RWGS) unit, Fischer–Tropsch synthesis and the refining of syncrude. Uncertainties on future DAC costs are high<sup>64</sup>

	Component	2020	2030	2040	2050	Unit	Reference
CAPEX	Solar PV	676	464	382	323	EUR per kWp	28, 78, 79
	Onshore wind (specific capacity of $0.2 \text{ kW}$ m <sup>-2</sup> , hub height of 200 m)	1760	1630	1569	1520	EUR per kW	79
	Onshore wind (specific capacity of $0.3 \text{ kW}$ m <sup>-2</sup> , hub height of 100 m)	1290	1192	1147	1110	EUR per kW	79
	Onshore wind (specific capacity of 0.47 kW m <sup><math>-2</math></sup> , hub height of 50 m)	1040	958	921	890	EUR per kW	79
	Offshore wind (monopile, up to 60 km from shore)	2890	2447	2253	2100	EUR per kW	28, 79
	Offshore wind (floating base, >60 km from shore)	4540	3845	3539	3300	EUR per kW	28, 79
	Electrolyser	1084	621	462	358	EUR per kW <sub>el</sub>	16, 28, 80-85
	Electrolyser stack replacement	33%	30%	28%	25%	% of electrolyser CAPEX	81, 86
	DAC	730	382	269	199	EUR per $(t_{CO_2} a)$	63
	Fuel synthesis	799	596	514	452	EUR per $kW_{ch}$	28, 80
	Li-ion battery	324	203	159	129	EUR per kWh <sub>el</sub>	78, 80, 87-89
	$H_2$ storage	21	15	13	11	EUR per kWh <sub>H</sub>	88, 90-92
	$CO_2$ storage	1500	1250	1000	750	EUR per $t_{CO_2}$	93
	Electrical boiler	100	100	100	100	EUR per $kW_{el}$	94
OPEX	Solar PV	2.0%	2.0%	2.0%	2.0%	% of CAPEX p.a.	28, 78, 79
	Wind (onshore and offshore)	2.5%	2.5%	2.5%	2.5%	% of CAPEX p.a.	28, 79
	Electrolyser	2.5%	2.5%	2.5%	2.5%	% of CAPEX p.a.	16, 28, 80-85
	DAC	4.0%	4.0%	4.0%	4.0%	% of CAPEX p.a.	63
	Fuel synthesis	2.5%	2.5%	2.5%	2.5%	% of CAPEX p.a.	28, 80
	Li-ion battery	2.5%	2.5%	2.5%	2.5%	% of CAPEX p.a.	78, 88
	H <sub>2</sub> storage	1.0%	1.0%	1.0%	1.0%	% of CAPEX p.a.	88, 91, 92
	$CO_2$ storage	2.5%	2.5%	2.5%	2.5%	% of CAPEX p.a.	83, 88, 93
	Electrical boiler	0%	0%	0%	0%	% of CAPEX p.a.	94
Lifetime	Solar PV	30	30	30	30	Years	28, 78, 79
	Wind (onshore and offshore)	30	30	30	30	Years	79
	Electrolyser system	30	30	30	30	Years	80, 84
	Electrolyser stacks	10	10	10	10	Years	81, 86
	DAC	12	15	17	20	Years	62
	Fuel synthesis	30	30	30	30	Years	80
Efficiency	Li-ion battery	15	15	15	15	Years	78, 88, 89, 95
	$H_2$ storage	30	30	30	30	Years	
	$CO_2$ storage	30	30	30	30	Years	_
	Electrical boiler	20	20	20	20	Years	94
	Electrolyser	20 60.0%	20 63.3%	20 66.7%	20 70.0%	% (LHV basis)	16, 28, 80, 81, 83-8
	DAC <sub>thermal</sub>	1.6	1.6	1.6	1.6	kWh <sub>th</sub> per kg <sub>CO<sub>2</sub></sub>	62
	DAC <sub>thermal</sub> DAC <sub>electrical</sub>	0.4	0.4	0.4	0.4	$kWh_{el}$ per $kg_{CO_2}$	62
	Fuel synthesis	65.0%	0.4 70.0%	0.4 75.0%	80.0%	% (LHV basis)	28, 80
	Li-ion battery (round-trip)	92.5%	92.5%	92.5%	80.0% 92.5%	% (LHV Dasis)	28, 80 95–98
	H <sub>2</sub> storage	92.5% 100%	92.5% 100%	92.5% 100%	92.5% 100%	% %	
	110 3101420	100%0	100%0	100%0	100%0	/0	-
	$CO_2$ storage	100%	100%	100%	100%	%	



**Fig. 6** Steady state energy balance of plant producing 10 GWh per year of kerosene. No storage depicted. Values represent energy supplied to each stage in GWh per year. Green corresponds to electricity, blue to hydrogen, orange to fuels, red to useable heat and grey to waste heat.

design (including a reverse water-gas shift (RWGS) unit, Fischer–Tropsch (FT) synthesis and the refining of syncrude) is based on ref. 39 and 67.

Li-ion batteries as well as hydrogen and  $CO_2$  storage in steel tanks balance electricity generation fluctuations and ensure a steady hydrogen and  $CO_2$  stream to the Fischer-Tropsch synthesis unit.

Capital and operational expenditures (CAPEX and OPEX), plant lifetimes and their efficiencies, *i.e.* their electricity and/or heat demand, of all plant components are summarised in Table 1. The Sankey diagram in Fig. 6 shows the resulting energy exchanges. The total plant efficiency from electricity to fuel amounts to 32–34% depending on battery storage utilisation – which is in line with a recent study by Grim *et al.* (2022).<sup>27</sup>

### 2.2 Plant optimisation

The minimum technical cost of fuel production is derived by optimising plant component sizing and hourly operation for a modular plant setup of 10 GWh jet fuel output per annum, according to renewable energy resource availability. The objective of the optimisation is the minimisation of the net present value (NPV) of lifetime costs of the plant while fulfilling an annual jet fuel production of 10 GWh (815 tonnes). This plant size is characteristic of first-of-a-kind PtL-SAF plants, but future full-scale production plants are likely to be many times larger. This study does not resolve for potential economies of scale, meaning plant CAPEX and OPEX are assumed to scale linearly with plant production capacity.

The plant design is optimised with the assumption of perfect foresight, meaning hourly energy and chemical storage dispatch decisions can be made with the benefit of knowledge of future electricity production over the course of a year. **2.2.1 Exogenous inputs and geographic scope.** The 5390 evaluation cells representing potential production regions were created by subdividing European land masses and coastal areas up to 100 km offshore into grids with size and centroids corresponding to the resolution of the used wind data (see below). For cells that fell on country borders, multiple cells were created – one for the portion of the cell in each country. For those that fell on coastlines, the same approach was taken for an onshore and an offshore cell.

The cost of fuel production using wind and solar PVgenerated electricity for each of these cells is dictated by the prevalence and intermittency of the renewable energy resources. The differences of those inputs across Europe drive the geographic variability of fuel production costs. In order to study this variability, hourly wind speed and solar irradiance data were obtained for each of the evaluation cells within Europe for 2016, a year without any large resource anomalies.<sup>68,69</sup>

Wind speed data was retrieved from the Modern-Era Retrospective analysis for Research and Applications, Version 2 (MERRA-2) dataset produced by NASA's Global Modelling and Assimilation Office.<sup>70</sup> Eastward and northward components of hourly average wind speed at heights of 10 meters and 50 meters were extracted for the year of 2016 at the MERRA-2 resolution of 0.5 by 0.625 degrees latitude and longitude, respectively. Wind speed data was converted to hourly power production using wind turbine power curves. At each cell, the optimal wind turbine model was selected in order to maximise full load hours (see ESI† for further information).

Solar irradiance data was obtained from the Photovoltaic Geographical Information System (PVGIS),<sup>71</sup> a web application developed by the European Commission Joint Research Centre. The tool was used to simulate hourly power output of a solar PV installation per kW of installed capacity of optimally-tilted southward-facing fixed axis PV panels. A default PV system loss value of 14% was used as recommended by the tool. Solar PV power production for every hour of 2016 was queried at the centroid of each evaluation cell using this method.

With hourly per-unit electricity production from wind and solar PV generation as exogenous inputs, the optimiser selects plant component capacities and hourly energy and mass exchanges to meet a yearly jet fuel production target of precisely 10 GWh.

**2.2.2 Land availability constraints.** The generation of renewable electricity *via* wind and solar power is constrained by available land area, which we modelled using the CORINE Land Cover data which splits Europe into 44 land cover types with a resolution of 25 hectares.<sup>72</sup> For each evaluation cell on land, the area of each land cover type is calculated. For individually selected land cover types, the maximum electricity generation capacity is calculated based on the required plant area per unit of produced fuel.

**2.2.3 Flexible operation and decision variables.** Plant operation is constrained primarily by two energy balances and two mass balances. In the electricity balance, the electricity demand of the electrolyser, electric boiler,  $CO_2$  capture plant, and battery must be met by a combination of energy supplied by the

wind turbines, PV system, and battery discharge minus curtailment. In the heat balance, the CO<sub>2</sub> capture system is supplied by excess heat from the FT reaction and the flexibly-operated boiler. Hydrogen supply to the FT synthesis unit is balanced by the electrolyser output and the hydrogen storage charge/discharge. Likewise,  $CO_2$  supply to the fuel synthesis is balanced by the CO<sub>2</sub> capture unit and the CO<sub>2</sub> storage charge/discharge.

In addition to the energy and mass balances, a few component operation constraints are also necessary. The rate of charge and discharge of the battery is constrained by a characteristic C-rate of 0.5 (ref. 73) and the FT synthesis unit must operate with a minimum baseload of 80% of its rated capacity. The charge states of energy and mass storage components must be the same at the end of the year as they were at the beginning.

Optimised decision variables are (a) component capacities, and (b) energy and mass exchange through the plant for each hour of the year, *i.e.* the plant operation, taking into account component efficiencies and wind/PV electricity availability. The ESI<sup>+</sup> provides a mathematical description of the optimisation problem.

After the optimisation yields a cost-optimal modular plant design within each evaluation cell, the plant size (production capacity) is determined by the area required for solar PV and wind power and the availability of land (see previous section). The PV land use area requirement is assumed to be 8.3 acres per MWac, which includes all area enclosed by the site boundary.74 The spacing of wind turbines is assumed to be 10 meters per meter of rotor diameter.75,76

#### 2.3 Economic assessment

2.3.1 Levelised cost of fuel (LCOF). The levelised cost of fuel production (LCOF) is used to make direct financial comparison of fuels produced in different locations. It represents the present value of the lifetime cost of plant CAPEX and OPEX per unit of fuel produced, as given in eqn (1).

$$LCOF = \frac{NPV_{plant}}{\sum_{t=0}^{L} \frac{F}{(1+r)^{t}}}$$
(1)

Annual fuel production, F, is discounted for year t using discount rate r = 5% (ref. 16 and 77), through the lifetime of the plant, L = 30 years. The net present value (NPV) of the plant, given in eqn (2), is the sum of the NPV of each plant component, k, given in eqn (3). The OPEX of each component for each year, i, of the plant's lifetime, L, is discounted using the NPV formula, eqn (4), which is used to derive the NPV of any expense or cash flow, R. The NPV of the CAPEX of each component is calculated for each component instalment, j, which occurs every l year, where l is the component lifetime. The number of component instalments, N, is limited by the lifetime of the overall plant. The last term of eqn (3) represents the resale value of the component at the end of the plant's lifetime.

$$NPV_{plant} = \sum_{k} NPV_{k}$$
(2)

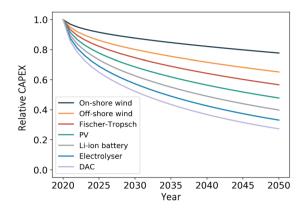


Fig. 7 CAPEX of the individual components of a jet fuel production plant, 16,28,62,63,78-85,87-89,99 normalised to their initial cost of 2020. PV and wind power costs in EUR per kWp, battery costs in EUR per kWh, electrolyser costs in EUR per kWel, Fischer-Tropsch synthesis plant costs in EUR per kW<sub>ch</sub>, DAC costs in EUR per  $(t_{CO_2} a)$ .

$$NPV_{k} = \sum_{i=0}^{L} [NPV(OPEX, i)] + \sum_{j=0}^{N} [NPV(CAPEX, j \cdot l)] - NPV\left(\frac{CAPEX}{l} \cdot (N \cdot l - L), L\right)$$
(3)

$$NPV(R, t) = \frac{R_t}{(1+r)^t}$$
(4)

The plant costs are allocated across the product fractions based on energy content, meaning the LCOF (in EUR per kWh) is the same for all. For kerosene, the annual production, F, of the modular plant is 10 GWh by design.

2.3.2 CAPEX, OPEX, lifetimes, and efficiencies. Projected CAPEX, OPEX, lifetimes, and efficiencies of plant components for 2030, 2040, and 2050 are based on a literature review, see Table 1 and ESI.<sup>†</sup>

Normalised to the initial costs in 2020, the projected experience rates of all technologies are depicted in Fig. 7.

#### 3 Results and discussion

#### **Regional variation in PtL-SAF production costs** 3.1

Fig. 8 shows the levelised cost of jet fuel production across Europe for 2020, 2030, 2040 and 2050. For visual simplicity, LCOF are presented in EUR per litre and EUR per kg only. The LCOF in EUR per MWh can be conveniently approximated from EUR per litre by multiplying by 100. By 2030, the lowest LCOF within Europe ranks at 1.21 EUR per litre (1500 EUR per tonne), by 2040 the LCOF goes down to 0.93 EUR per litre (1160 EUR per tonne), and by 2050 it lowers to 0.71 EUR per litre (890 EUR per tonne).

Fig. 9 illustrates the location dependency of the levelised cost of jet fuel production. Coastal areas at the English Channel, the North Sea and the Baltic Sea (roughly between 50° and 55° latitude) represent low-cost production sites due to their favourable onshore wind potential. When taking transportation

Paper

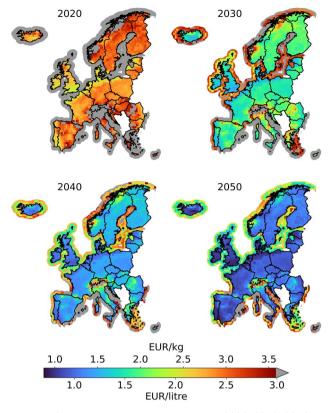
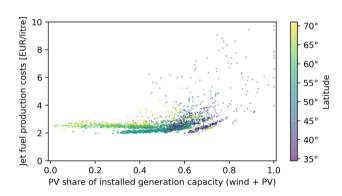


Fig. 8 PtL-SAF production costs in Europe for 2020, 2030, 2040, and 2050.



**Fig. 9** Location dependency of PtL-SAF production costs in 2020. The horizontal axis describes the share of solar PV *versus* total installed electricity generation from both solar PV and onshore wind power (left end: 100% wind; right end: 100% PV). The colour-coding describes the latitude of the production site.

costs into account, production along the English Channel and North Sea would be supported by proximity to the Central European Pipeline System (CEPS), which consists of 5273 km of pipeline transporting jet fuel between storage depots, rail and truck loading stations, sea ports, and commercial airports in Belgium, France, Germany, Luxembourg, and The Netherlands. Another low-cost production area is located in the South-Western part of the Iberian peninsula (35–40° latitude) where high solar irradiation favours the hybrid solar PV-wind production of PtL-SAF, with solar PV comprising 60–70% of the total installed electricity generation capacity.

Future work should use these cost estimates in conjunction with transportation costs, which are driven by regional demand constraints, to optimise production facility siting as was done by *e.g.* Gonzalez-Garay *et al.* (2022).<sup>57</sup> In contrast to these low-cost locations, the region of the Alps and coastal areas in the Mediterranean Sea show higher fuel production costs due to the limited wind potential in those places.

An example of the optimised hourly operation at a location in Poland is given in the ESI,† as is a series of maps indicating the storage capacities required to firm intermittent electricity generation. Overall, the combination of abundant wind power and solar PV enables high full load hours and therefore low-cost PtL-SAF production, whereas locations with a higher PV share compared to wind tend to show higher production costs (Fig. 9). Similarly, PtL-SAF production sites powered solely by offshore wind show comparatively higher fuel production costs because of the higher CAPEX requirements of wind turbines and larger battery storage required to balance intermittency.

### 3.2 Attribution of cost to plant components

The relative sizes of component capacities are a function of the local wind and PV resources. Thus, the share of installation cost (NPV of CAPEX and OPEX) attributable to each plant component is not fixed. However, for both onshore and offshore locations, electricity generation components represent the largest share of installation costs on average (about 50-60%), followed by the electrolyser (about 15-20%). Fig. 10 details the levelised cost of each plant component. Component costs are given as the NPV of lifetime CAPEX and OPEX and levelised by the total plant lifetime fuel production. The black lines, depicting the 5–95% quantile range across all evaluation cells, indicate significant variation. Even in extreme cases, however, the cost of electricity production (wind and PV) in 2050 is likely to contribute at least 0.25 EUR per litre (or 55% of the total LCOF) for onshore locations and 1.00 EUR per litre (70%) in offshore locations. While technology learning curves drive cost reductions for all components from 2020 to 2050, the most prominent declines are expected for the electrolyser and CO2 capture. Component costs represented as the share of total LCOF are available in the ESI.<sup>†</sup>

In this fuel production pathway, energy is buffered primarily in hydrogen storage tanks rather than in batteries. The geographic flexibility enabled by hydrogen pressure vessels comes at the expense of high cost of storage, but where geological storage options exist, this cost can be reduced by an order of magnitude or greater.<sup>90</sup> Fuel synthesis, battery, CO<sub>2</sub> storage, and process heat represent very small shares of the total fuel production costs and technological advancements in those areas are thus not expected to contribute to significant cost reductions.

#### 3.3 PtL-SAF production costs under varying land availability

Land availability constrains available PtL-SAF production sites. We consider three land types to showcase how our

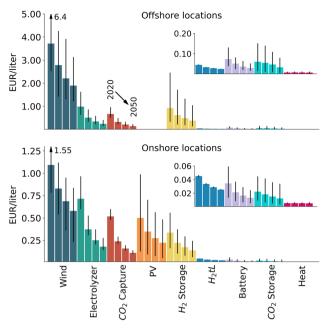


Fig. 10 Evolution of the levelised cost of each plant component from 2020 to 2050. Component costs are comprised of the NPV of lifetime CAPEX and OPEX and levelised by the total plant lifetime fuel production. The black lines indicate the 5-95% quantile range of all evaluation cells. Offshore locations (top plot) are solely powered by wind.

methodological approach can be used to estimate the PtL-SAF production potential and the resulting PtL-SAF cost curves for individual areas (see Fig. 11).

This analysis is based upon the assumption that a mixture of sparsely vegetated areas, pastures and offshore areas can be made available for PtL-SAF production without inducing any significant harmful side effects (*e.g.*, following the Do No Significant Harm taxonomy of the European Commission<sup>100</sup>).

• Sparsely vegetated areas: These are assumed to have few other use cases and a comparatively low risk of biodiversity loss.

• Pastures: The combined land use for agriculture and wind and/or solar PV parks ("agrivoltaics") has already been proven feasible and could be enlarged.<sup>101</sup>

• Offshore area: We assume offshore wind turbines up to 100 km from the shore can be used to produce electricity that is used at inland PtL-SAF production sites close to the shore.

The land types described above will not be completely available for PtL-SAF production sites. Not all pasture areas will offer the potential of combined land use and not all offshore sites will be available for offshore wind parks due to water protection zones and frequent shipping lanes. In addition, a variety of other factors needs to be considered, including the potential loss of biodiversity when repurposing land for industrial use, the availability of water (for electrolysis), whether a land area currently functions as a carbon sink, and potentially

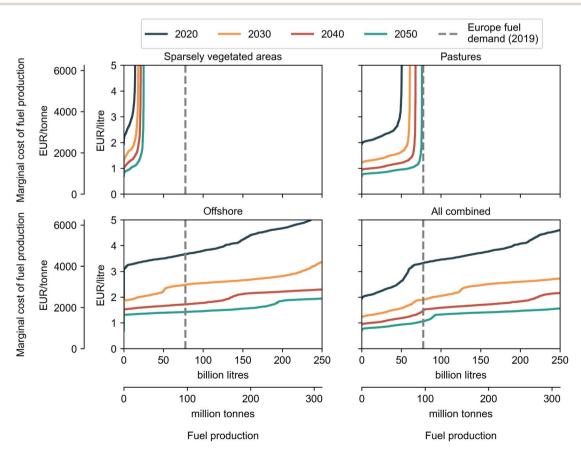


Fig. 11 Potential PtL-SAF production volumes and marginal fuel production costs in Europe, constrained by land availability and sorted by ascending fuel production cost.

#### Paper

preferable land uses, *e.g.* for reforestation. Based on such considerations, we have excluded other land types from this analysis where their land use for PtL-SAF production might be controversial. The selection of land types above is made to showcase the developed methodology but the ESI<sup>†</sup> provides access to a tool for investigating the impact of in-/excluding individual land cover types (from the full set of 44) in Europe from this kind of analysis. Whereas this study provides a first-order approximation on the production potential of PtL-SAF in Europe, further in-depth studies about regional and local land availability and PtL-SAF production costs should follow this paper.

Besides the fuel production costs per year, Fig. 11 also shows the jet fuel demand in Europe in 2019 from domestic and international aviation of 62 Mt (77 billion litres) as a vertical line.<sup>102</sup>

Neither sparsely vegetated areas nor pastures (at least in the short-term) are sufficient on their own to supply the full 2019 jet fuel demand of European states *via* PtL-SAF production at costs below 3 EUR per litre (3750 EUR per tonne). This is 7-8x the average historical fossil jet fuel market price of about 0.40 EUR per litre (500 EUR per tonne) – which, except for some short-term outliers, has been fluctuating between 0.2 and 0.6 EUR per litre between August 2013 and February 2022.<sup>103</sup>

However, SAFs will not only be supplied *via* PtL but also from sustainable biomass (such as agricultural or forestry residues) and all three land cover types combined suffice to meet the remaining share of PtL-SAF (see Section 3.5).

#### 3.4 Country-specific cost curves

As shown in Fig. 8, PtL-SAF production costs show a high regional variation. For national contexts, country-specific cost curves (similar to the pan-European one in Fig. 11) will be essential to determine whether countries could produce PtL-SAF domestically at competitive costs, whether they should import PtL-SAF from other European countries, and whether they have the opportunity to become PtL-SAF exporters in the future. Such country-specific cost curves can be found in the ESI† for the same combination of land types as in Fig. 11.

By 2030, France, Germany, Iceland, Ireland, Netherlands, Poland, and the United Kingdom are likely to be able to produce at least a billion litres of PtL-SAF fuel per annum each at costs lower than 1.5 EUR per litre ( $3.75 \times$  the historical average fossil jet fuel market price).

### 3.5 Potential impact of blending mandates

With the ReFuelEU Aviation regulation, the European Commission and the European Parliament have adopted a SAF blending mandate, including a sub-mandate for renewable fuels of non-biological origin of 1.2% by 2030, 10% by 2040, and 35% by 2050.<sup>24,104</sup> Here, we analyse at what cost Europe could fulfil this mandate purely with domestic (*i.e.* intra-European) PtL-SAF production.

While non-EU countries like the UK could adopt different blending mandates, we assume in this section that all European states will adopt such a mandate. We also assume that all renewable fuel volumes of non-biological origin will be PtL-SAF produced from the plant design discussed in this paper. We apply the provisional mandates onto the 2019 jet fuel demand and do not consider any changes in fuel demand (while the number of passengers is projected to increase at an annual growth rate of 2% within Europe, aircraft efficiency improvements, novel propulsion aircraft and other  $CO_2$  reduction measures could keep the jet fuel demand in Europe roughly at 2019 levels by 2050 (ref. 12)).

The cost of PtL-SAF is discussed in terms of LCOF and GHG abatement costs. GHG abatement costs are computed using the life-cycle GHG emission factor of fossil jet fuel ( $3.9 ext{ t} ext{ CO}_2 ext{ per t}$  fossil jet fuel<sup>105</sup>) and the expected GHG emissions reduction of PtL-SAF produced from hybrid solar PV-wind power plants of 87-88%.<sup>22</sup>

By 2030, the mandated fuel volumes could be produced at an average cost of about 1.22 EUR per litre (see Table 2). This translates to GHG abatement costs of about 300 EUR per  $t_{CO_2}$ e.

By 2040 (2050), the mandated fuel volumes could be produced at an average cost of about 0.97 (0.81) EUR per litre, translating to GHG abatement costs of 210 (150) EUR per  $t_{CO_2}$ e. Lowest-cost sites could produce PtL-SAF at 0.93 and 0.71 EUR per litre in 2040 and 2050, respectively.

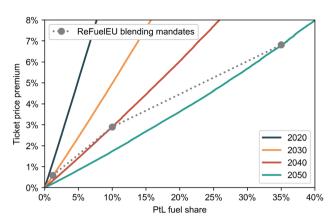
To quantify the impact of increased fuel prices on the end customer, we present a case study investigating the effect of blending mandates on ticket prices. Per year, the ticket price is compared to a reference case based on the cost of fossil jet fuel. It is assumed that the current share of fuel costs on total costs of ownership of an airline is 25% and non-fuel costs remain constant in future years.<sup>106</sup> Additionally, by extrapolating the historical annual rate of 1.5% fuel efficiency improvements of airlines<sup>107</sup> in future years, we incorporate a decreasing fuel consumption per seat-kilometre. The resulting ticket price premiums would be 0.6% by 2030, 3% by 2040, and 7% by 2050, see Fig. 12. A detailed derivation of the formula used to determine ticket price premiums is included in the ESI.<sup>†</sup>

To supply the provisional mandated fuel volumes within Europe, 8 GW each of solar PV and onshore wind power capacity would need to be installed by 2030 and 250 GW each in 2050, following the cost production curves in Fig. 11. This compares to 1053 GW globally installed solar PV capacity in 2022, and 899 GW globally installed (onshore and offshore) wind capacity in 2022 (ref. 108) – and projected capacity requirements of 26–35 TW solar PV and 14–16 TW wind power by 2050.<sup>109</sup> No offshore

 Table 2
 Average PtL-SAF production costs and GHG abatement costs

 to fulfil the provisional blending mandates purely with domestic
 production within Europe.<sup>24</sup> Combined, this yields an absolute GHG abatement potential

Metric	2030	2040	2050	Unit
Blending mandate	1.2	10	35	%
Resulting PtL-SAF volume	0.9	7.8	27.1	Billion litres
PtL-SAF production costs	1.22	0.97	0.81	EUR per litre
GHG abatement costs	300	210	150	EUR per t <sub>CO2</sub> e
Abated GHG emissions	2.5	21.3	74.5	Million t <sub>CO2</sub> e



**Fig. 12** Estimates of increased ticket prices from the use of varying shares of PtL-SAF (with the rest of the fuel being fossil jet fuel). Highlighted are the ticket price premiums resulting from the provisional blending mandates for renewable fuels of non-biological origin within ReFuelEU Aviation.

locations are used due to the more favourable, balanced electricity supply for PtL-SAF production plants from hybrid solar PV-onshore wind power plants.

Additionally, a  $CO_2$  capture demand for PtL-SAF production of 210 Mt  $CO_2$  by 2050 compares to a projected global capacity demand for 7–10 Gt  $CO_2$  by 2050.<sup>110</sup> An electrolyser capacity demand for PtL production of 205 GW compares to a projected global capacity demand for 7.8 TW by 2050.<sup>111</sup>

From the year 2000 to 2022, the global installed capacity of solar PV increased by three orders of magnitude.<sup>112</sup> With this as reference for technology growth supported by cost declines and targeted policy action, an increase from an installed electrolysis capacity of 200 MW in 2020 to over 200 GW in 2050 is ambitious but not beyond the realm of the possible.<sup>111</sup> With less than 0.1 Mt  $CO_2$  of installed DAC capacity globally in 2020, the challenge of meeting  $CO_2$  demand for PtL-SAF production is much larger.<sup>113</sup> In reality, other SAF production  $CO_2$  pathways, including those utilising point-source  $CO_2$  will also be required to fulfil the mandated SAF volumes. In either case, significant policy support will be required to drive the ramp-up of PtL-SAF production.

In 2050, a blending mandate of 50% of the final jet fuel demand would create a market of 22 billion EUR, which is approximately three times the fuel expenditure of the Lufthansa Group in 2022.<sup>114</sup>

### 3.6 Sensitivity analysis

The sensitivity of the LCOF to model inputs was evaluated using a Monte Carlo method, in which 1000 randomly selected onshore cells were simulated with varied inputs. Since the uncertainty of LCOF model inputs, such as future component CAPEX and efficiencies, are inherently uncharacterisable, model sensitivity was explored using uniform variations across all inputs as a necessary simplification. Thus, input values were randomly sampled from Gaussian distributions centred around their respective 2020 baseline values and with a standard deviation of 20% (see Table 1). This provides a method to characterise the response of the modeled LCOF to each input individually without constraining the model to a specific choice of values for all other inputs.

To characterise the sensitivity of LCOF to the model inputs, the inputs and outputs were transformed to a per-unit system. Each input was normalised by its baseline value (see Table 1). The output (LCOF) was normalised for each cell relative to the corresponding reference 2020 LCOF at each cell. The reference 2020 LCOF at each cell is that calculated with all baseline input values (as presented in Fig. 11). This per-unit transformation facilitates comparison of the relationships between modelled inputs and costs. Fig. 13 illustrates these relationships, derived *via* ordinary least squares regression, for the three inputs to which the model is most sensitive: chemical efficiency of fuel synthesis, electrolyser efficiency, and wind turbine CAPEX. Relative sensitivity is quantified by the slope and  $R^2$  values.

The noisiness of the plots is a consequence of two factors. The first is the natural diversity of wind and solar resources across evaluation cells. The second is artificial randomness due to sampling from the input distributions. Because the input distributions are arbitrarily characterised by a standard deviation of 20%, so too is the magnitude of the noise and associated correlation coefficients, which should therefore only be used to compare the strength of correlation relative to other inputs. The regression parameters for the nine inputs found to be most determinant of LCOF are provided in Table 3. The remainder of model inputs listed in Table 1 were found to have statistically insignificant regression parameters (p-value of slope >0.005) and are not included in Table 3.

Notably, the inputs most associated with the cost of electricity (wind and PV CAPEX) and electricity consumption (electrolyser CAPEX and efficiency), were found to be some of the most important. This result supports findings of numerous

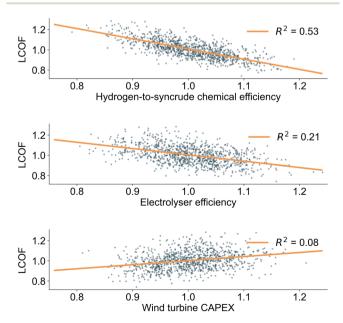


Fig. 13 Sensitivity of LCOF to the three most sensitive plant parameters: hydrogen-to-syncrude chemical conversion efficiency (top), electrolyser efficiency (middle), and wind turbine CAPEX (bottom).

Table 3Ordinary least squares regression parameters for model input sensitivity analysis. The parameters describe the relationship between the<br/>normalised values of each of the nine most sensitive model inputs and the normalised LCOF. The variable names correspond to those in the plant<br/>assumption spreadsheet and flowchart available in the ESI. "Fuel synthesis" includes a reverse water-gas shift (RWGS) unit, Fischer-Tropsch<br/>synthesis and the refining of syncrude

Parameter	Variable name	Slope	Slope 95% C.I.	Intercept	Intercept 95% C.I.	$R^2 \times 100$
Fuel synthesis chemical efficiency	H2tL_chem_efficiency	-1.007	[-1.07, -0.95]	2.015	[+1.96, +2.07]	53.09
Electrolyser efficiency	electrolyzer_efficiency	-0.622	[-0.70, -0.55]	1.627	[+1.55, +1.70]	21.35
Wind CAPEX	wind_CAPEX	0.403	[+0.31, +0.49]	0.599	[+0.51, +0.69]	7.54
Discount rate	discount_rate	0.359	[+0.27, +0.44]	0.644	[+0.56, +0.73]	6.67
Fuel synthesis baseload	H2tL_baseload	0.236	[+0.15, +0.32]	0.766	[+0.68, +0.85]	2.76
Wind lifetime	wind_lifetime	-0.192	[-0.28, -0.11]	1.195	[+1.11, +1.28]	1.92
Electrolyser CAPEX	electrolyzer_CAPEX	0.181	[+0.09, +0.27]	0.822	[+0.74, +0.91]	1.69
Solar PV CAPEX	PV_CAPEX	0.162	[+0.08, +0.25]	0.841	[+0.76, +0.92]	1.44
DAC CAPEX	CO <sub>2</sub> _CAPEX	0.156	[+0.07, +0.24]	0.847	[+0.76, +0.93]	1.29

other works identified in Section 1.1. Using the regression parameters in the table, it is possible to extrapolate fuel production costs under different assumptions of component CAPEX, efficiencies, *etc.* The results suggest, for example, that increasing the fuel synthesis chemical efficiency by 10% would reduce the LCOF by approximately 10%.

Furthermore, while future costs of DAC are highly uncertain, this analysis suggests LCOF costs are not as sensitive to the model input. Tripling the assumed DAC CAPEX from 730 to 2190 EUR per ( $t_{CO_2}$  a) would increase the LCOF by only about 30%.

## 3.7 Limitations and future research

This section discusses (1) the techno-economic model uncertainties; (2) critical assumptions; and (3) limitations on scope in an effort to guide interpretation and application of the presented results. We also include recommendations for future research that can be done on the back of the methods developed in this paper.

Model inputs are subject to uncertainties, especially when projecting into future years. For example, CAPEX cost reductions for renewable electricity generation have historically often been underestimated.115,116 Generally, differences in various plant component efficiencies, CAPEX, and OPEX would lead to different LCOF estimates. Therefore, a robust sensitivity analysis is included, in which the impact of these differences on LCOF are quantified. The results of the analysis, while mostly a characterisation of the model, also indicate which inputs should be more closely refined. While the sensitivity analysis was performed for model inputs clustered around 2020 assumptions, smaller Monte Carlo style simulations were run to test the model performance clustered around 2050 assumptions. The results, while not statistically significant due to the necessarily smaller sample size, indicate that the model responds to inputs similarly in this regime. To robustly extrapolate fuel production costs to different input assumptions in 2030, 2040, and 2050, the associated full-scale high sample size sensitivity analyses should be conducted in the future.

Hourly wind and solar resources from a single year were used to optimise plant operation and component sizing. The variable

concurrence of wind and solar resources in another year may lead to different optimal component sizing and a future iteration of the model should add robustness to this effect. Additionally, geographic fuel production potential and the resulting cost curves are dependent on the quality of the CORINE land use dataset, which has a limited resolution and has not been updated since 2018. Inclusion of other land types as well as projections of future competing offshore and onshore development (*e.g.* renewable energy for other uses) would have an impact on the cost curve. A refined analysis of available areas (including *e.g.* offshore shipping lanes) and investigation of the sustainability implications of development are key tasks for future work. Offshore wind coupled with onshore or any floating PV was not included in this analysis, but should be included in future iterations as well.

Simplifying assumptions made in our model represent areas for further analysis. While CAPEX and OPEX scale linearly with capacity in our analysis, economies of scale are likely to reduce the LCOF in large-scale commercial plants. Additionally, the assumption of perfect foresight of wind and solar energy in our model leads to perfectly optimal dispatch of energy storage, whereas the implementation of an imperfect algorithm would likely necessitate extra capacity margin and higher costs.

The presented costs and geographic production potential apply only to the specific plant configuration which was studied utilising solar PV and wind as the only energy sources and ambient air as the source of CO<sub>2</sub>. Application of results should thus be constrained accordingly. More work is needed to investigate how other likely sources of electricity and heat, such as hydro power, geothermal power, district heat, or grid-supplied renewable energy could impact LCOF and the broader related energy systems. For CO2, other sources - such as industrial point sources - should be considered. Similar analyses should also be performed for other technologies such as high-temperature electrolysis or methanol pathways instead of Fischer-Tropsch (see overview in ref. 117), which could lead to improvements of efficiency or specificity. With this, absolute LCOF values would decrease, but the relative deviations between different regions or years are expected to remain. Additional revenues from the sales of oxygen produced during electrolysis, and the effect of varying

prices of other co-products such as diesel and gasoline is also outside the scope of this research.

Cost-optimal supply of SAF in the mid-21st century will undoubtedly necessitate a diversity of production pathways, including those from biogenic point-sources. This study should serve as a tool to enable robust comparison of PtL-SAF supply to others under primary energy and land availability constraints within Europe.

The core contribution of this study lies in the presented approach to quantify regional variability. The open-source and open-access nature of all inputs and code allows researchers to directly build upon the presented work. Underlying assumptions can be easily adapted and input data updated. This work provides an important step for a holistic future research on the role of PtL-SAF in the future, which should assess the trade-offs between GHG intensity, production costs, raw material availability and other socio-economic indicators.

## 4 Conclusions

This paper estimates future production costs of power-to-liquid sustainable aviation fuels for 5390 locations within Europe. We developed an optimisation method for assessing the levelised cost of PtL-SAF produced from hybrid solar PV-wind plants, under varying land availability constraints. The lowest fuel production costs are observed in areas of high full load hours of onshore wind power – *e.g.* coastal areas at the English Channel, the North Sea and the Baltic Sea – as well as for areas on the Iberian Peninsula with a high combined potential of solar PV and onshore wind power. They rank at 1.21 EUR per litre ( $3 \times$  the average historical fossil jet fuel price) in 2030, 0.93 EUR per litre ( $2.3 \times$ ) in 2040, and 0.71 EUR per litre ( $1.8 \times$ ) in 2050.

Compared with biofuels, which today cost only about  $2-3\times$  of historical fossil jet fuel prices, PtL-SAF could overlap with these costs or become even cheaper in the 2030s. In the long-run (2050), we estimate PtL-SAF costs in Europe to be around at 0.8 EUR per litre. Only a limited amount of biofuels could be produced at similar cost ranges (at 0.7–1.1 EUR per litre), namely using hydroprocessed esters and fatty acids (HEFA) which rely on evidently limited feedstock.<sup>5</sup> The production costs of other, non-HEFA biofuels are projected at 1.1–1.7 EUR per litre by 2050.<sup>5,8</sup>

This paper also analyses the impact of land availability for solar PV and wind power plants. Making sparsely vegetated areas, pastures and offshore locations available for PtL-SAF production, the provisional blending mandates for renewable fuels of non-biological origin from the European Commission and the European Parliament could be fulfilled by domestic PtL-SAF production within Europe at an average cost of 1.22 EUR per litre in 2030, 0.97 EUR per litre in 2040, and 0.81 EUR per litre in 2050. Ticket prices under such a scenario could go up by <1% by 2030, 3% by 2040, and 7% by 2050 due to the increased fuel costs compared with fossil jet fuel. The required renewable electricity generation capacity installations would be 8 GW each of solar PV and onshore wind by 2030. For 2050, these numbers increase to 250 GW each.

# Author contributions

Kyle Seymour: conceptualisation, methodology, software, formal analysis, data curation, writing – review & editing, visualization. Maximilian Held: conceptualisation, methodology, investigation, writing – original draft, visualization. Boris Stolz: validation, investigation, writing – review & editing, visualization. Gil Georges: conceptualisation, supervision. Konstantinos Boulouchos: conceptualisation, supervision.

# Conflicts of interest

There are no conflicts of interest to declare.

# Acknowledgements

We would like to thank the Audi AG for the financial support to this work, Climeworks and Sunfire for their valuable feedback, Dr Christos Frouzakis for his computational support, and Saskia Adam for her methodological contributions. This research project is part of the Swiss Competence Center for Energy Research in Efficient Technologies and Systems for Mobility (SCCER mobility) of the Swiss Innovation Agency Innosuisse.

## References

- 1 UNFCCC, *Decision-/CP.26 Glasgow Climate Pact*, United Nations Framework Convention on Climate Change Technical Report, 2021.
- 2 H. Ritchie, Climate Change and Flying: what Share of Global CO<sub>2</sub> Emissions Come from Aviation? – Our World in Data, 2020, https://ourworldindata.org/co2-emissions-fromaviation.
- 3 International Air Transport Association (IATA), 20 Year Passenger Forecast, 2021, https://www.iata.org/en/ publications/store/20-year-passenger-forecast/#tab-3.
- 4 IEA, Net Zero by 2050: A Roadmap for the Global Energy Sector, International energy agency technical report, 2021.
- 5 MPP, *Making Net-Zero Aviation Possible: and Industry-Backed*, 1.5 °C-Aligned Transition Strategy, Mission Possible Partnership Technical Report, 2022.
- 6 EU Directorate General for Internal Policies, *Policy* Department A: Economic and Scientific Policy, Emission Reduction Targets for International Aviation and Shipping, IP/A/ENVI/2015-11, Öko-institut technical report, 2015.
- 7 International Air Transport Association (IATA), Resolution on the Industry's Commitment to Reach Net Zero Carbon Emissions by 2050, 2021, https://www.iata.org/ contentassets/dcd25da635cd4c3697b5d0d8ae32e159/iataagm-resolution-on-net-zero-carbon-emissions.pdf.
- 8 International Civil Aviation Organization (ICAO), States Adopt Net-Zero 2050 Global Aspirational Goal for International Flight Operations, 2022, https://www.icao.int/ Newsroom/Pages/States-adopts-netzero-2050-aspirationalgoal-for-international-flight-operations.aspx.
- 9 ICF, Fueling Net Zero: How the Aviation Industry Can Deploy Sufficient Sustainable Aviation Fuel to Meet Climate

*Ambitions*, an Icf Report for Atag Waypoint 2050 Technical Report, 2021.

- 10 ATAG, *Waypoint 2050*, Air Transport Action Group Technical Report, 2021.
- 11 International Transport Forum (ITF), *Decarbonising Air Transport: Acting Now for the Future*, OECD Publishing, Paris, 2021.
- 12 European Regions Airline Association (ERA), Civil Air Navigation Services Organisation (CANSO), European Regions Airline Association (ERA), Airports Council International-EUROPE (ACI) and Aerospace & Defence Industries Association of Europe (ASD), *Destination 2050: A Route to Net Zero European Aviation*, Nlr - royal netherlands aerospace centre, seo amsterdam economics technical report, 2021.
- 13 IATA, Fact Sheet 2 Sustainable Aviation Fuel: Technical Certification, International air transport association technical report, 2020.
- 14 C. Voigt, J. Kleine, D. Sauer, R. H. Moore, T. Bräuer, P. Le Clercq, S. Kaufmann, M. Scheibe, T. Jurkat-Witschas, M. Aigner, U. Bauder, Y. Boose, S. Borrmann, E. Crosbie, G. S. Diskin, J. DiGangi, V. Hahn, C. Heckl, F. Huber, J. B. Nowak, M. Rapp, B. Rauch, C. Robinson, T. Schripp, M. Shook, E. Winstead, L. Ziemba, H. Schlager and B. E. Anderson, *Commun. Earth Environ.*, 2021, 2, 114.
- 15 D. Lee, D. Fahey, A. Skowron, M. Allen, U. Burkhardt, Q. Chen, S. Doherty, S. Freeman, P. Forster, J. Fuglestvedt, A. Gettelman, R. De León, L. Lim, M. Lund, R. Millar, B. Owen, J. Penner, G. Pitari, M. Prather, R. Sausen and L. Wilcox, *Atmos. Environ.*, 2021, 244, 117834.
- 16 S. Brynolf, M. Taljegard, M. Grahn and J. Hansson, *Renewable Sustainable Energy Rev.*, 2018, **81**, 1887–1905.
- 17 C. Falter, N. Scharfenberg and A. Habersetzer, *Energies*, 2020, **13**, 802.
- 18 C. Falter, A. Valente, A. Habersetzer, D. Iribarren and J. Dufour, *Sustainable Energy Fuels*, 2020, 4, 3992–4002.
- 19 D. Oke, J. B. Dunn and T. R. Hawkins, *Sustainable Energy Fuels*, 2022, **6**, 721–735.
- 20 C. M. Liu, N. K. Sandhu, S. T. McCoy and J. A. Bergerson, *Sustainable Energy Fuels*, 2020, 4, 3129–3142.
- 21 P. Schmidt, V. Batteiger, A. Roth, W. Weindorf and T. Raksha, *Chem.-Ing.-Tech.*, 2018, **90**, 127–140.
- 22 K. Treyer, R. Sacchi and C. Bauer, *Life Cycle Assessment of Synthetic Hydrocarbons for Use as Jet Fuel: "Power-To-Liquid" and "Sun-To-Liquid" Processes*, Paul scherrer institute (psi), commissioned by the swiss federal office of civil aviation (foca). technical report, 2022.
- 23 J. A. Leggett and J. L. Ramseur, *Inflation Reduction Act of* 2022 (*IRA*): Provisions Related to Climate Change, Congressional research service technical report, 2022.
- 24 eFuel Alliance, *Press Release: Good to Go: EU Agrees on Ramp-Up of Climate-Neutral Aviation Fuels*, 2023, https://www.efuel-alliance.eu/fileadmin/Downloads/ Pressemitteilungen\_2023/ 20230426\_PM\_ReFuelEU\_Aviation\_EN\_final.pdf.
- 25 European Parliament, Amendments Adopted by the European Parliament on 7 July 2022 on the Proposal for a Regulation of

the European Parliament and of the Council on Ensuring a Level Playing Field for Sustainable Air Transport (COM(2021)0561 – C9-0332/2021 – 2021/0205(COD))(1), 2022, https://www.europarl.europa.eu/doceo/document/ TA-9-2022-0297\_EN.html.

- 26 World Economic Forum, *Clean Skies for Tomorrow Leaders:* 10% Sustainable Aviation Fuel by 2030, Press release, 22 Sep 2021, 2021, https://www.weforum.org/press/2021/09/cleanskies-for-tomorrow-leaders-commit-to-10-sustainableaviation-fuel-by-2030/.
- 27 R. G. Grim, D. Ravikumar, E. C. D. Tan, Z. Huang, J. R. Ferrell, M. Resch, Z. Li, C. Mevawala, S. D. Phillips, L. Snowden-Swan, L. Tao and J. A. Schaidle, *Energy Environ. Sci.*, 2022, 15, 4798–4812.
- 28 A. Verkehrswende, A. Energiewende and Frontier Economics, *The Future Cost of Electricity-Based Synthetic Fuels*, Agora verkehrswende agora energiewende frontier economics technical report, 2018.
- 29 F. G. Albrecht and T.-V. Nguyen, Energy, 2020, 192, 116511.
- 30 V. Becattini, P. Gabrielli and M. Mazzotti, Ind. Eng. Chem. Res., 2021, 60, 6848–6862.
- 31 W. L. Becker, R. J. Braun, M. Penev and M. Melaina, *Energy*, 2012, 47, 99–115.
- 32 R.-U. Dietrich, F. G. Albrecht, S. Maier, D. H. König, S. Estelmann, S. Adelung, Z. Bealu and A. Seitz, *Biomass Bioenergy*, 2018, **111**, 165–173.
- 33 S. Drünert, U. Neuling, T. Zitscher and M. Kaltschmitt, *Appl. Energy*, 2020, **277**, 115578.
- 34 M. Fasihi, D. Bogdanov and C. Breyer, *Energy Procedia*, 2016, **99**, 243–268.
- 35 Q. Fu, C. Mabilat, M. Zahid, A. Brisse and L. Gautier, *Energy Environ. Sci.*, 2010, **3**, 1382–1397.
- 36 C. Graves, S. D. Ebbesen, M. Mogensen and K. S. Lackner, *Renewable Sustainable Energy Rev.*, 2011, **15**, 1–23.
- 37 L. E. Hombach, L. Doré, K. Heidgen, H. Maas, T. J. Wallington and G. Walther, *J. Cleaner Prod.*, 2019, 207, 153–162.
- 38 N. Pavlenko, S. Searle and A. Christensen, *The Cost of Supporting Alternative Jet Fuels in the European Union*, The international council on clean transportation technical report, 2019.
- 39 D. H. König, N. Baucks, R.-U. Dietrich and A. Wörner, *Energy*, 2015, **91**, 833–841.
- 40 M. Ram, D. Bogdanov, A. Aghahosseini, A. Gulagi, S. A. Oyewo, M. Child, U. Caldera, K. Sadovskaia, J. Farfan, L. S. Barbosa, M. Fasihi, S. Khalili, D. Bernhard, G. Georg, T. Traber, F. De Caluwe, H.-J. Fell and C. Breyer, *Global Energy System Based on 100% Renewable Energy*, Lappeenranta university of technology and energy watch group technical report, 2019.
- 41 M. Ram, T. Galimova, D. Bogdanov, M. Fasihi, A. Gulagi, C. Breyer dena, M. Micheli and K. Crone, *Powerfuels in a Renewable Energy World: Global Volumes, Costs, and Trading 2030 to 2050*, Lut university and deutsche energieagentur gmbh (dena) technical report, 2020.
- 42 P. Runge, C. Sölch, J. Albert, P. Wasserscheid, G. Zöttl and
   V. Grimm, *Appl. Energy*, 2019, 233–234, 1078–1093.

- 43 S. Schemme, J. L. Breuer, M. Köller, S. Meschede, F. Walman, R. C. Samsun, R. Peters and D. Stolten, *Int. J. Hydrogen Energy*, 2020, 45, 5395–5414.
- 44 P. Schmidt, W. Zittel, W. Weindorf, T. Rakasha and D. Goericke, 16. *Internationales Stuttgarter Symposium*, Springer Fachmedien, Wiesbaden, 2016, pp. 185–199.
- 45 P. Schmidt and W. Weindorf, *Power-to-Liquids: Potentials* and *Perspectives for the Future Supply of Renewable Aviation Fuel*, German environment agency technical report, 2016.
- 46 C. Schnuelle, J. Thoeming, T. Wassermann, P. Thier, A. von Gleich and S. Goessling-Reisemann, *Energy Res. Soc. Sci.*, 2019, **51**, 187–197.
- 47 C. Schnuelle, K. Kisjes, T. Stuehrmann, P. Thier, I. Nikolic, A. von Gleich and S. Goessling-Reisemann, *Energies*, 2020, 13, 5522.
- 48 S. Siegemund, P. Schmidt, M. Trommler, O. Kolb, V. Zinnecker, W. Weindorf, W. Zittel, T. Raksha and J. Zerhusen, *E-fuels Study: the Potential of Electricity-Based Fuels for Low-Emission Transport in the EU - an Expertise by LBST and Dena*, Lbst, dena technical report, 2017.
- 49 Q. Smejkal, U. Rodemerck, E. Wagner and M. Baerns, *Chem. Ing. Tech.*, 2014, **86**, 679–686.
- 50 A. Tremel, P. Wasserscheid, M. Baldauf and T. Hammer, *Int. J. Hydrogen Energy*, 2015, 11457–11464.
- 51 C. Zhang, R. Gao, K.-W. Jun, S. K. Kim, S.-M. Hwang, H.-G. Park and G. Guan, *J. CO2 Util.*, 2019, **34**, 293–302.
- 52 Eurostat, Harmonised Indices of Consumer Prices, HICP (2015 = 100) - Annual Data (Average Index and Rate of Change), 2020, https://ec.europa.eu/eurostat/databrowser/view/ prc\_hicp\_aind/default/table?lang=en.
- 53 European Central Bank (ECB), *ECB Euro Reference Exchange Rate*, 2021, https://www.ecb.europa.eu/stats/ policy\_and\_exchange\_rates/ euro\_reference\_exchange\_rates/html/eurofxref-graphusd.en.html.
- 54 M. Millinger, P. Tafarte, M. Jordan, A. Hahn, K. Meisel and D. Thrän, *Sustainable Energy Fuels*, 2021, 5, 828–843.
- 55 M. Moritz, M. Schönfisch and S. Schulte, *Int. J. Hydrogen Energy*, 2023, **48**, 9139–9154.
- 56 Concawe and Aramco, *E-Fuels: A Technoeconomic Assessment* of European Domestic Production and Imports towards 2050, Concawe technical report, 2022.
- 57 A. Gonzalez-Garay, C. Heuberger-Austin, X. Fu, M. Klokkenburg, D. Zhang, A. van der Made and N. Shah, *Energy Environ. Sci.*, 2022, **15**, 3291–3309.
- 58 D. Freire Ordóñez, T. Halfdanarson, C. Ganzer, N. Shah, N. M. Dowell and G. Guillén-Gosálbez, *Sustainable Energy Fuels*, 2022, 6, 4749–4764.
- 59 C. Hank, S. Gelpke, A. Schnabl, R. J. White, J. Full, N. Wiebe, T. Smolinka, A. Schaadt, H.-M. Henning and C. Hebling, *Sustainable Energy Fuels*, 2018, 2, 1244–1261.
- 60 S. Schemme, R. C. Samsun, R. Peters and D. Stolten, *Fuel*, 2017, **205**, 198–221.
- 61 European Commission, Proposal for a Regulation of the European Parliament and of the Council on Ensuring a Level Playing Field for Sustainable Air Transport (COM(2021) 561 Final), European commission technical report, 2021.

- 62 C. Beuttler, L. Charles and J. Wurzbacher, *Front. Clim.*, 2019, 1, 10.
- 63 M. Fasihi, O. Efimova and C. Breyer, *J. Cleaner Prod.*, 2019, 224, 957–980.
- 64 J. Young, N. McQueen, C. Charalambous, S. Foteinis, O. Hawrot, M. Ojeda, H. Pilorgé, J. Andresen, P. Psarras, P. Renforth, S. Garcia and M. v. d. Spek, *One Earth*, 2023, 6, 899–917.
- 65 Global Alliance Powerfuels, *Powerfuels Application Fields Factsheets about Powerfuels Technologies and Their Areas of Application*, 2019.
- 66 ASTM, ASTM D7566-21: Standard Specification for Aviation Turbine Fuel Containing Synthesized Hydrocarbons, Astm technical report, 2022.
- 67 M. Prussi, M. Yugo, L. De Prada, M. Padella and R. Edwards, *JEC Well-To-Wheels Report v5 (EUR 30284 EN)*, Publications Office of the European Union, Luxembourg, JRC121213 edn, 2020.
- 68 A. Grochowicz, K. van Greevenbroek, F. E. Benth and M. Zeyringer, *Energy Econ.*, 2023, **118**, 106496.
- 69 C. C. C. S. (C3S), *European State of the Climate 2022*, climate.copernicus.eu/ESOTC/2022, 2023.
- 70 Global Modeling and Assimilation Office (GMAO), MERRA-2 tavg1\_2d\_slv\_Nx: 2d, 1-Hourly, Time-Averaged, Single-Level, Assimilation, Single-Level Diagnostics V5.12.4, 2015.
- 71 T. Huld, R. Müller and A. Gambardella, *Sol. Energy*, 2012, 86, 1803–1815.
- 72 European Environment Agency (EEA) and Joint Research Centre (JRC), CORINE Land Cover - Copernicus Land Monitoring Service, 2020, https://land.copernicus.eu/paneuropean/corine-land-cover.
- 73 S. Saxena, Y. Xing, D. Kwon and M. Pecht, *Int. J. Electr. Power Energy Syst.*, 2019, **107**, 438-445.
- 74 S. Ong, C. Campbell, P. Denholm, R. Margolis, and G. Heath, Land-Use Requirements for Solar Power Plants in the United States, Nrel/tp-6a20-56290 technical report, 2013.
- 75 M. F. Howland, S. K. Lele and J. O. Dabiri, *Proc. Natl. Acad. Sci. U. S. A.*, 2019, **116**, 14495–14500.
- 76 R. J. A. M. Stevens, B. F. Hobbs, A. Ramos and C. Meneveau, Wind Energy, 2017, 20, 465–477.
- 77 M. Lehtveer, S. Brynolf and M. Grahn, *Environ. Sci. Technol.*, 2019, 53, 1690–1697.
- 78 E. Vartiainen, G. Masson, C. Breyer, D. Moser and E. Román Medina, Prog. Photovoltaics, 2020, 28, 439–453.
- 79 I. Tsiropoulos, D. Tarvydas and A. Zucker, *Cost Development* of *Low Carbon Energy Technologies*, Jrc, european commission technical report, 2018.
- 80 IEA, *IEA G20 Hydrogen Report: Assumptions*, International energy agency technical report, 2019.
- 81 G. Matute, J. M. Yusta and L. C. Correas, *Int. J. Hydrogen Energy*, 2019, **44**, 17431–17442.
- 82 H. Böhm, A. Zauner, D. C. Rosenfeld and R. Tichler, *Appl. Energy*, 2020, 264, 114780.
- 83 J. Gorre, F. Ortloff and C. van Leeuwen, *Appl. Energy*, 2019, 253, 113594.

- 84 J. Michalski, U. Bünger, F. Crotogino, S. Donadei, G. S. Schneider, T. Pregger, K. K. Cao and D. Heide, *Int. J. Hydrogen Energy*, 2017, 42, 13427–13443.
- 85 A. Buttler and H. Spliethoff, *Renewable Sustainable Energy Rev.*, 2018, **82**, 2440–2454.
- 86 IRENA, *Hydrogen from Renewable Power: Technology Outlook for the Energy Transition*, International Renewable Energy Agency, Abu Dhabi, 2018.
- 87 Batstorm, *Battery Storage to Drive the Power System Transition*, Batstorm technical report, 2018.
- 88 P. Runge, C. Sölch, J. Albert, P. Wasserscheid, G. Zöttl and V. Grimm, *Economic Comparison of Electric Fuels Produced at Excellent Locations for Renewable Energies: A Scenario for* 2035, Fau technical report, 2020.
- 89 W. Cole and A. W. Frazier, *Cost Projections for Utility-Scale Battery Storage*, National renewable energy laboratory technical report, 2019.
- 90 G. L. DNV, Hydrogen in the Electricity Value Chain, 2019.
- 91 J. Gorre, F. Ruoss, H. Karjunen, J. Schaffert and T. Tynjälä, *Appl. Energy*, 2020, 257, 113967.
- 92 C. van Leeuwen and A. Zauner, Innovative Large-Scale Energy Storage Technologies and Power-To-Gas Concepts after Optimisation: Report on the Costs Involved with PtG Technologies and Their Potentials across the EU, Store &go technical report, 2018.
- 93 Element Energy, Shipping CO<sub>2</sub> UK Cost Estimation Study: Final Report for Business, Energy & Industrial Strategy Department, Element energy technical report, 2018.
- 94 E. Sperber, 2nd International Solar District Heating Conference, Hamburg, 2014.
- 95 M. Beuse, B. Steffen and T. S. Schmidt, *Joule*, 2020, 4, 2162– 2184.
- 96 M. Schimpe, M. Naumann, N. Truong, H. C. Hesse, S. Santhanagopalan, A. Saxon and A. Jossen, *Appl. Energy*, 2018, 210, 211–229.
- 97 C. Peralta P., G. Vieira, S. Meunier, R. Vale, M. Salles and B. Carmo, *Energies*, 2019, **12**, 375.
- 98 K. Mongird, V. Fotedar, V. Viswanathan, V. Koritarov, P. Balducci, B. Hadjerioua and J. Alam, *Energy Storage Technology and Cost Characterization Report*, U.s. department of energy technical report, 2019.
- 99 International Energy Agency (IEA), Capital Cost of Utility-Scale Battery Storage Systems in the New Policies Scenario, 2017-2040, 2019, https://www.iea.org/data-and-statistics/ charts/capital-cost-of-utility-scale-battery-storage-systemsin-the-new-policies-scenario-2017-2040.
- 100 European Commission, *Do No Significant Harm' Technical Guidance by the Commission (Recovery and Resilience Facility)*, European commission technical report, 2021.

- 101 E. H. Adeh, S. P. Good, M. Calaf and C. W. Higgins, *Sci. Rep.*, 2019, **9**, 11442.
- 102 European Environment Agency (EEA), National Emissions Reported to the UNFCCC and to the EU Greenhouse Gas Monitoring Mechanism, 2022, https://www.eea.europa.eu/ data-and-maps/data/national-emissions-reported-to-theunfccc-and-to-the-eu-greenhouse-gas-monitoringmechanism-17.
- 103 IATA, Fuel Price Monitor of the International Air Transport Association: Jet Fuel Price Developments, Aug 13 - Feb 22, 2022, https://www.iata.org/en/publications/economics/ fuel-monitor/.
- 104 Personal communications, Draft Text on Final ReFuel EU Aviation Blending Mandate, 2023.
- 105 CORSIA, Supporting Document: CORSIA Eligible Fuels-Life Cycle Assessment Methodology, Icao technical report, 2019.
- 106 T. Wassermann, H. Muehlenbrock, P. Kenkel and E. Zondervan, *Appl. Energy*, 2022, **307**, 117683.
- 107 B. Graver, U.S. Airlines on Track to Meet One Carbon Goal, Even without Government Leadership, International council on clean transportation technical report, 2018.
- 108 H. Ritchie, Installed Solar/wind Energy Capacity, 2023, https://ourworldindata.org/grapher/installed-solar-pvcapacity.
- 109 ETC, Making CleanElectrification Possible, 2023, https:// www.energy-transitions.org/wp-content/uploads/2022/07/ ETC-Global-Power-Report-Final.pdf.
- 110 ETC, Carbon Capture, Utilisation & Storage in the Energy Transition, 2022, https://www.energy-transitions.org/wpcontent/uploads/2022/08/ETC-CCUS\_executivesummary\_v1.7.pdf.
- 111 ETC, Making the Hydrogen Economy Possible, 2021, https:// www.energy-transitions.org/wp-content/uploads/2021/04/ ETC-Global-Hydrogen-Executive-Summary.pdf.
- 112 L. Kruitwagen, K. T. Story, J. Friedrich, L. Byers, S. Skillman and C. Hepburn, *Nature*, 2021, **598**, 604–610.
- 113 M. Ozkan, S. P. Nayak, A. D. Ruiz and W. Jiang, *iScience*, 2022, **25**, 103990.
- 114 L. Group, *Lufthansa Group Annual Report 2022*, 2022, https://investor-relations.lufthansagroup.com/fileadmin/ downloads/en/financial-reports/annual-reports/LH-AR-2022-e.pdf.
- 115 R. Way, M. C. Ives, P. Mealy and J. D. Farmer, *Joule*, 2022, 6, 2057–2082.
- 116 M. Xiao, T. Junne, J. Haas and M. Klein, *Energy Strategy Rev.*, 2021, **35**, 100636.
- 117 V. Dieterich, A. Buttler, A. Hanel, H. Spliethoff and S. Fendt, *Energy Environ. Sci.*, 2020, **13**, 3207–3252.