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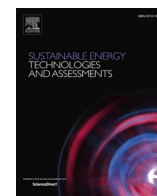
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Original article

An examination of country participation in carbon capture projects

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ABSTRACT

Carbon capture, utilisation and storage represents an important technology for countries to address climate change challenges, achieve decarbonisation and reach net zero targets. This study examines the factors that are associated with country level participation in carbon capture projects. A Poisson regression model is employed to examine the relationship between country level factors (such as GDP per capita, regional partition, trade openness, economic complexity and tax initiatives) and the number of carbon capture project initiated within a country (from 2019 up until February 2023). We find that a country's region (as defined by the World Bank), market affluence and level of CO₂ emissions is associated with a country's participation in carbon capture projects. The results indicate that nations that are more affluent and have higher CO₂ emissions are associated with increase participation in carbon capture projects. Carbon tax and Emissions Trading Systems have a positive impact on a country's participation in carbon capture projects, in particular carbon tax. This indicates that carbon tax acts as an effective incentive for industry engagement with carbon capture technologies. This study also examines the interplay between economic complexity and country level carbon capture project participation, where a negative relationship is observed.

Introduction

There is an increased need for a reduction of CO₂ emissions by countries and carbon neutrality in order to combat climate change [1,2]. Carbon capture, utilisation, and storage (CCUS) is emerging as an important technology to reduce emissions, especially in industrial sectors (that are often characterised as hard to decarbonise) [3–7]. The CCUS process involves separating and capturing CO₂ that is produced by processes using fossil fuels [8,9]. This captured CO₂ is transported and stored in geological reserves for long periods of times. An alternative to storing the CO₂ in geological reserves in the CCUS process is to use the captured CO₂ to produce chemicals, algae or building materials [10,11]. Fig. 1 provides a summary of the CCUS value chain (adapted from the work of Chen et al. [12]).

CCUS has been argued to be a necessity in reducing emissions and tackling climate change globally. Whilst there has been significant progress in recent decades in the development of solar, wind and hydro energy, these sources are unlikely to meet global energy demands [13,14]. Fossil fuel-based power generation remains a feature of the modern global economy [15], which is the activity that results in the largest emissions of CO₂. Therefore, carbon capture is a critical (even

vital) solution, mitigating these CO₂ emissions along with utilising captured carbon in various industries, whilst the technology and capabilities in renewable energy continue to be developed [16].

Bowen [17] notes that wide adoption of CCUS technology could account for 20 % of required CO₂ reduction by 2050. Mahjour & Faroughi [18] note that in heavy industries the use of carbon capture and storage could result in a 25–67 % reduction in CO₂ emissions. Yet Hong [19] notes that the global deployment of CCUS technologies is still not sufficient to reach 2050 net-zero targets. The increasing importance of carbon capture technologies in addressing the climate change crisis [11,20] has acted as the motivation for this study, which seeks to examine country level features associated with participation and investment in CCUS projects. In particular we seek to understand whether there are country level features associated with carbon capture project involvement (at the country level). This can then potentially inform and discuss policy aspects that can be used to foster the involved and participation of countries in carbon capture projects in effort to tackle climate change.

Peridas & Schmidt [21] provide an overview of the current status of carbon capture technology. They note that first generation carbon capture technology is mature yet does not meet efficiency expectations.

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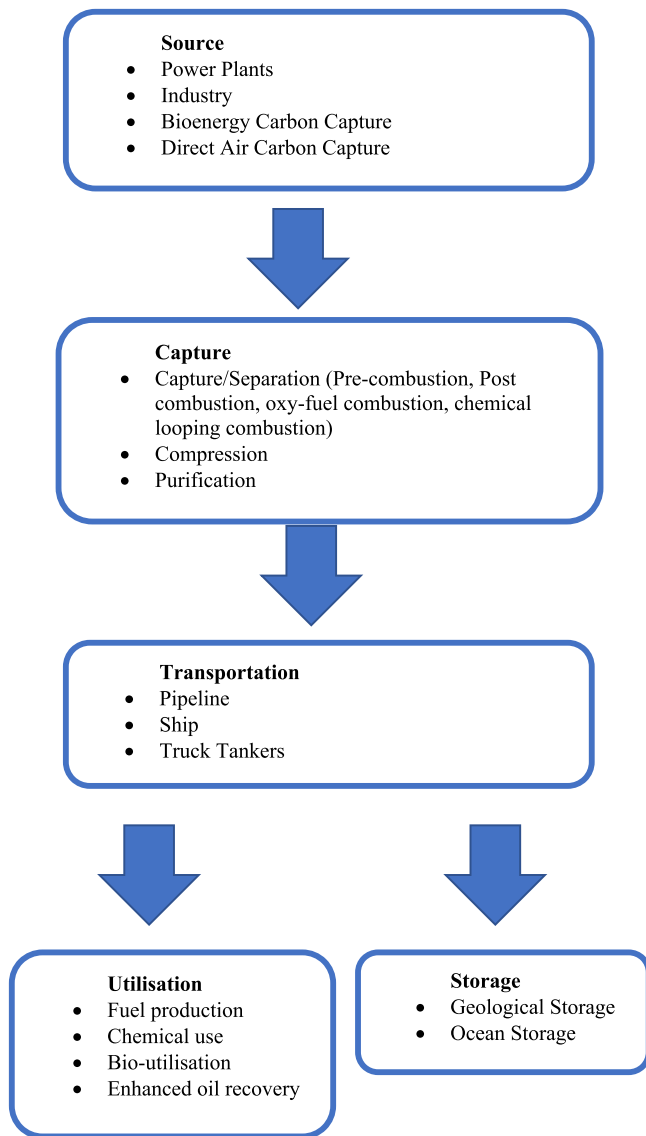


Fig. 1. Carbon Capture, Utilisation and Storage (CCUS) value chain.

Next generation (second and third) carbon capture technology seeks to improve efficiency and cost when deployed at scale; yet implementation on such scales has not been realised. Pipeline transportation of CO₂ is also a mature technology, and many of the challenges associated with transportation are not technological, rather operation (especially on larger scales). Peridas & Schmidt [21] further outline that there has been progress on policy to encourage and fund CCUS initiatives, yet much work is still required. Carbon capture is a technology that is established yet the general public (in several countries) are largely unaware of it, therefore, wider, public support for the uptake of CCUS initiatives is often lacking [22–24].

CCUS is an especially attractive option, for both governments and firms, as compared to more radical low carbon initiatives, as it focuses on reducing CO₂ emission by modifying existing processes [25]. However, CCUS still experiences several barriers to widespread adoption [26]; Alcade et al. [27] note that the main barriers are the cost and lack of stakeholder support (especially from key policy makers). In line with the work of Alcade et al. [27] several scholars have noted that core challenges that carbon capture projects have faced (which in some cases has led to their failure) include high cost and design issues and unfavourable economic conditions [28,29]. Reiner [30] notes in the case of Norway, the Mongstad project costs increased dramatically, almost four

times the original estimates. This resulted in government auditors shutting down the project, which did not go beyond the pilot phase [31]. The development and implementation of CCUS requires substantial investment, especially from governments in the first instance (to kick-start investment from industry) [32]. This would also allow for a spread of the costs (and risks) amongst a wider range of actors to prevent the high financial burden resting solely on one actor (such as government), which will make project implementation more likely and minimise the risk of the project failing in the pilot phase.

Although there are numerous challenges to implementing and deploying carbon capture and storage programmes, there are a number of prominent success stories. One example is the Petra Nova project in the USA, which is the largest carbon-capture retrofit at a coal plant; furthermore the project came in on time and under budget [33]. A further success story for carbon capture projects was the Quest project in Canada, which involved multiple industry actors, chiefly Shell Ltd [34]. Quest demonstrated the feasibility of large commercial scale carbon capture and storage. Wang et al. [29] suggest that a feature of successful CCUS projects is that they are not owned and operated by the public sector alone, rather are a form of public–private partnerships that share the associated risks and rewards.

Carbon capture projects occur across the globe [35]; the USA is the home to many large-scale projects, with a high level of carbon capture capacity [36,37]. Abdulla et al. [38] investigate the success and failure factors of CCUS projects in the USA, where they note that policy design was a critical factor contributing to the success (or failure) of a project. Although many CCUS projects occur in North America, several studies have examined the emergence of CCUS technologies in developing countries [39,40].

This study aims to understand what country level factors influence investment in carbon capture projects. Therefore, this paper aims to address the following research question:

RQ1: What country level features are associated with investment in carbon capture projects?

Emissions Trading Systems (ETS) can influence investment in CCUS initiatives and has been viewed more widely as a one of the lower cost options for policy makers in reducing CO₂ emissions [41,42]. ETS attempt to cap carbon emissions and allow for the trading of carbon emission credits. McLaughlin et al. [43] note that the impact of ETS on CCUS investment has been modest (due to low carbon prices in many regions [29]). However, ETS allow for trading (or purchase) of carbon emission credits in areas with low carbon fuel standards; therefore, ETS in the long term may prove to be an effective mechanism to fund CCUS initiatives. In their study of Chia's engagement with CCUS projects, Ouyang & Guo [44] note that ETS are vital for the effective deployment of carbon capture technology. They find that ETS shorten the time of CCUS investment to around 5.9 years.

Other policy tools have also been found to impact CCUS investment patterns, for instance, carbon tax. Carbon tax is usually applied to all non-renewable carbon emissions; therefore, carbon tax systems create economic incentives (in both developed and developing countries) to lower emissions [45]. Carbon tax policy aims to create barriers to high emission activities and subsequently aims to act as an incentive for investment in emission lowering technologies, such as CCUS [46,47]. Many studies have considered the interplay between carbon tax systems and CCUS investment [48]. However, Zhang et al. [49] note that the relationship between the use of CCUS technology and carbon tax policy remains ambiguous. For instance, in the case of the USA, Taruffelli et al. [50] find that tax credit schemes are not sufficient to foster large scale carbon capture investment.

Given the increased focus on ETS and carbon tax on CCUS activity, this study aims to address the following (second) research question:

RQ2: Are ETS or carbon tax policy instruments in place at the country level associated with investment in carbon capture projects?

In recent years, there has been increased interest in the interplay between the Economic Complexity Index (ECI) score of a country and country level sustainability performance and green issues [51]. The Economic Complexity Index (ECI) is a metric that is used to quantify the diversification and sophistication of the export basket of a country [52]. It is calculated by using international trade data, examining the export profile of countries, focusing on the products exported (and the sophistication and complexity of these exported products). Therefore, the ECI captures the production capabilities of a country and it is often used as an indicator of the knowledge base, skill base and sophistication of production of a country [53,54]. A country with a high ECI score is capable of more sophisticated production and manufacturing [55].

There has been much debate regarding the link between ECI and CO₂ emissions [56,57]. Some argue that higher ECI results in increased environmental degradation [58], as the processes for producing diverse and sophisticated products (for export) results in higher energy demands, along with an increase in consumption-based emissions [59]. In this case, countries with high ECI and higher emissions would be well positioned to engage with carbon capture projects, with high level of carbon to utilised in CCUS projects, a need to reduce emissions and potentially increased capabilities to engage with the carbon capture technologies. Others argue that a higher ECI is associated with a reduction of CO₂ emissions [60–62], as they are able to produce products more efficiently [63]; and that sophisticated products are often not high-emission intensity products [64]. Some studies suggest that countries with a higher ECI are better positioned to transition to cleaner energy sources, as they have more capacity to make the transition to renewables [65]. Can & Gozgor [66] find that in the case of France, higher ECI level suppress CO₂ emissions in the long run. A range of studies suggest that the link between ECI and environmental degradation is not simple or linear, rather is characterised by a quadratic relationship [67,68].

A number of studies draw on the EKC (Environmental Kuznets Curve) hypothesis when examining the link between CO₂ emissions and ECI [69–73]. The EKC hypothesis was first developed by Grossman & Krueger [74], and it considers the link between GDP per capita and environmental quality. The EKC hypothesis states there is an inverted U-shaped relationship between market affluence and CO₂ emissions, that as a country becomes more affluent its emissions also increase, up to a certain (tipping) point, after which increases in market affluence are associated with a decrease in carbon emissions. Market affluence has also been found to shape the adoption of carbon capture technologies at the country level; given the level of finance required, western and developed countries have progressed in the implementation and piloting of CCUS projects compared to developing countries (which are more reliant on public–private partnerships) [75].

Neagu [76] identify a EKC relationship (inverted U-shaped) between ECI and carbon emission in their study of a set of EU countries. This suggests that initially pollution increases when countries expand the complexity of the products they export, but then this reaches a turning point, and the increase in complexity offsets carbon emissions. Kazemzadeh et al. [77] also find that there is an inverted U-shaped relationship between ECI and energy intensity (defined as the ratio of energy consumption to economic output).

This study aims to examine the interplay between country level ECI scores and investment in carbon capture projects; therefore, this study addresses the following (third) research question:

RQ3: Do countries with a higher Economic Complexity Index (ECI) engage more in carbon capture project investment?

In the extant literature, there is extensive discussion and debate regarding the link between ECI and CO₂ emissions (and environmental degradation more generally), the relationship between ECI and participation in carbon capture projects is relatively understudied by comparison. Although there is no consensus on the how ECI impacts environmental outcomes, there remains a rich literature examining the problem [78–81]. This study aims to consider how ECI impacts

participation in a key emission mitigating technology, rather than the impact on a particular environmental outcome.

Table 1 below provides a summary of the main literature and areas relevant to the three research questions posed by this paper.

The paper is structured as follows; the next section will provide an overview of the data and methods utilised in this paper to address the research questions. This will be followed by the results, and the final section will provide a discussion and concluding comments.

Material & methods

In order to address the three research questions posed by this paper, we make use of data from the International Energy Agency (IEA) on carbon capture projects [83]. IEA data provides information covering advances in carbon capture, utilisation, and storage projects across the globe. The data contains a wide range of information on CCUS projects, including announcement date, country, project partners (the firms involved), project type, sector, fate of carbon and various other details on project status.

We examine carbon capture projects announced from 2019 onwards (up until February 2023), and the countries affiliated with these projects. We include projects at various stages, including planned, as this still reflects investment and association with CCUS technologies.

To address the research questions posed by this paper, we utilise a Poisson regression model. The Poisson regression approach was used as the outcome variable is the number of projects a country is affiliated with, and this is count data. The model specification then includes a number of country level attributes to address the research questions. Data on the country attributes was collected for 2019 (the starting year for the selection of carbon capture projects in the IEA data), in order to unpack how country features shape carbon capture investment patterns.

In the model specification, we included number of carbon capture projects before 2019, to capture existing capabilities and experience with carbon capture projects and technologies. Other country level variables include the regional partition the country belongs to (as defined by the World Bank), GDP per capita to account for market affluence, CO₂ emissions (metric tons per capita) and trade openness (as captured by level of exports as percentage of GDP). The country level attribute data was collected from the World Bank. Regional partitions are included, as regions have been noted to share characteristics linked to carbon capture potential [84], in particular political and economic

Table 1
Literature summary table.

Topic	Summary	References
Challenges associated with carbon capture projects.	Extant literature has identified a number of challenges in implementing and deploying CCUS, yet the focal challenge is cost. These projects require substantial investment.	[46,47]
Carbon capture projects and CO ₂ emissions.	Existing work has noted that countries with high levels of CO ₂ are associated with carbon capture projects.	[82]
Emissions Trading Systems (ETS) and carbon capture projects.	Current impact of ETS on carbon capture investment has been modest yet may represent a long-term mechanism to fund CCUS in future.	[29,41,42]
Carbon tax and carbon capture projects.	Extant literature points towards an ambiguous relationship between carbon tax and the uptake of CCUS projects.	[45,47–49]
Economic complexity and carbon capture projects.	Whilst there is extensive debate (yet no consensus) on the link between economic complexity and CO ₂ emissions (as noted in the references column), there is relatively less attention paid to the relationship between economic complexity and carbon capture.	[78–81]

factors [85]. Market affluence as captured by GDP per capita is included, given the significant relationship between income per capita and environmental quality extensively documented in the extant literature [86,87]. It also allows for an investigation into whether more affluent countries are better positioned to participate in carbon capture projects and foster the development of this technology. Trade openness is a further measure that has received attention when examining environmental quality and carbon emissions [88–90]. Patricio et al. [82] note countries that produce high levels of CO₂ represent the highest level of potential for CO₂ utilisation and the use of carbon capture technologies. Therefore, CO₂ emissions is included in the model to examine whether carbon capture projects are in countries with high levels of CO₂; either as a result of an increased need for carbon capture technologies to combat high emission levels, or to utilise the CO₂ they are producing. To address the third research paper, we included the Economic Complexity Index (ECI) in the model specification, data on country ECI scores was collected from MIT's Observatory of Economic Complexity [91].

In order to address the second research question posed by this paper, we run two additional models, one with an ETS variable included and another with a carbon tax variable included. Details on whether a country has an ETS, or carbon tax was drawn on data compiled by Dolphin & Xiahou [92]. The ETS variable, is a binary variable, indicating whether there is an ETS in place (in at least one sector) within the country (either at the national or sub-national level) with a 1, and 0 if there is no ETS. Similarly, the carbon tax variable is also a binary variable, with 1 if a country has carbon tax (in at least one sector at either the national or sub-national level) and 0 otherwise.

Results

This section contains two subsections, the first will provide a descriptive analysis, and this will then be followed by the regression analysis, which is used to tackle the three research questions posed by this paper.

Descriptive analysis

Fig. 2 provides a map of the number of projects affiliated with each country from 2019 up until February 2023. In line with previous studies, we observe a high level of CCUS projects associated with the USA [36,37]. Fig. 2 also shows the overall prominence of CCUS projects in North America, with a high number in both the USA and Canada. There is clear evidence of CCUS activity in Europe, most notably in the UK [93]. Inderberg & Wettstad [94] note that the UK has favourable structural capacity for CCUS, with offshore storage capacity and high levels of oil and gas industry expertise available.

There are a range of CCUS projects across the globe, including the

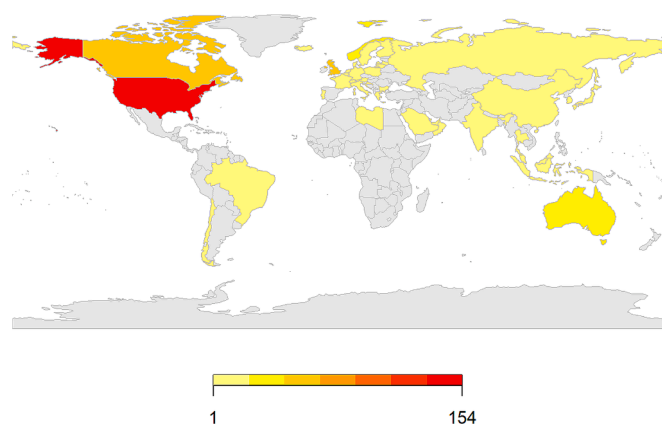


Fig. 2. World map of the number of carbon capture projects by country for 2019 to February 2023.

BRIC (Brazil, Russia, India and China) nations. A number of studies have documented the CCUS progress and interest in BRIC countries [40,95,96], often focusing on the case of China [97,98]. Whilst CCUS is a part of China's carbon mitigation strategies; Jiang et al. [99] note that there is low participation of Chinese firms in CCUS projects and technologies. Jiang et al. [99] attribute this to several factors, including lack of financial subsidies and lack of public understanding in the value of CCUS technologies. India has also faced challenges regarding the uptake and deployment of CCUS technologies [100], including lack of R&D investment, political issues, lack of public support and lack of financing [101]. Examining the case of Russia, Vasilev et al. [102] note that the efforts to implement and develop CCUS have been quite limited, with level of public awareness of CCUS representing a key challenge. Public awareness of CCUS technologies represents a key challenge (and potentially) barrier to the uptake of CCUS technologies across the globe [103–107].

Some projects are associated with firms from multiple countries, representing collaboration on carbon capture projects; yet typically, many projects involve firms from a single country. These patterns can be observed in Fig. 3. We can observe projects with multiple countries associated with them tend to be in Europe. Hake & Schenk [108] argue that international cooperation is pivotal for the development and implementation of CCUS technologies; especially given that the ultimate goal of CCUS deployment is the decrease of global CO₂ emissions. They argue that international cooperation provides a number of channels for the increased uptake of carbon capture projects. Firstly, carbon capture is a capital intensive, and somewhat risky technology [109], therefore international cooperation allows for risk and burden sharing amongst partners. Secondly, international cooperation potentially allows for global learning [32]; newly industrialised and developing countries may learn from the early adoption practices and deployment of carbon capture technologies in industrialised nations.

The carbon capture projects examined as part of this study cover a range of sectors, Fig. 4 highlights the number of projects per sector. Whilst there are a number of projects that focus on transport and storage separately, a high number involve both transport and storage development. A number of hard to decarbonise sectors are included in the carbon capture projects, more notably power and heat, whilst there are far less cement and iron and steel carbon capture projects.

In addition to the sector classifications, each project is characterised as a type of carbon capture project, depending on project activities. Table 2 provides an overview of available project types.

Fig. 5 presents the number of projects by type for the projects analysed as part of this study. We observe that a high number of projects focus on capture only, and relatively less on both carbon capture and usage. The number of projects on transport and storage, and a combination of the two are at similar levels.

Table 3 provides the descriptive statistics for a range of country level attributes included in this study. We can observe that the number of projects before 2019 was rather small, and that the number has grown substantially since then, demonstrating the increased implementation of carbon capture technologies. However, there is a high level of variation in terms of the number of projects per country, as reflected by the high standard deviation. There is also a high level of variation in a number of other country level variables, most notably CO₂ emissions and ECI.

Regression analysis

The regression analysis results are presented in Table 4; where there are three models. Models 2 and 3 contain the ETS and carbon tax variables respectively. An examination of the AIC/BIC scores indicates the inclusion of the carbon tax variable improves the model fit.

We observe that, as expected, the number of previous projects is a positive predictor of country participation in carbon capture projects, as the variable is positive and significant across all three models. This previous experience with CCUS indicates capacity and potentially a

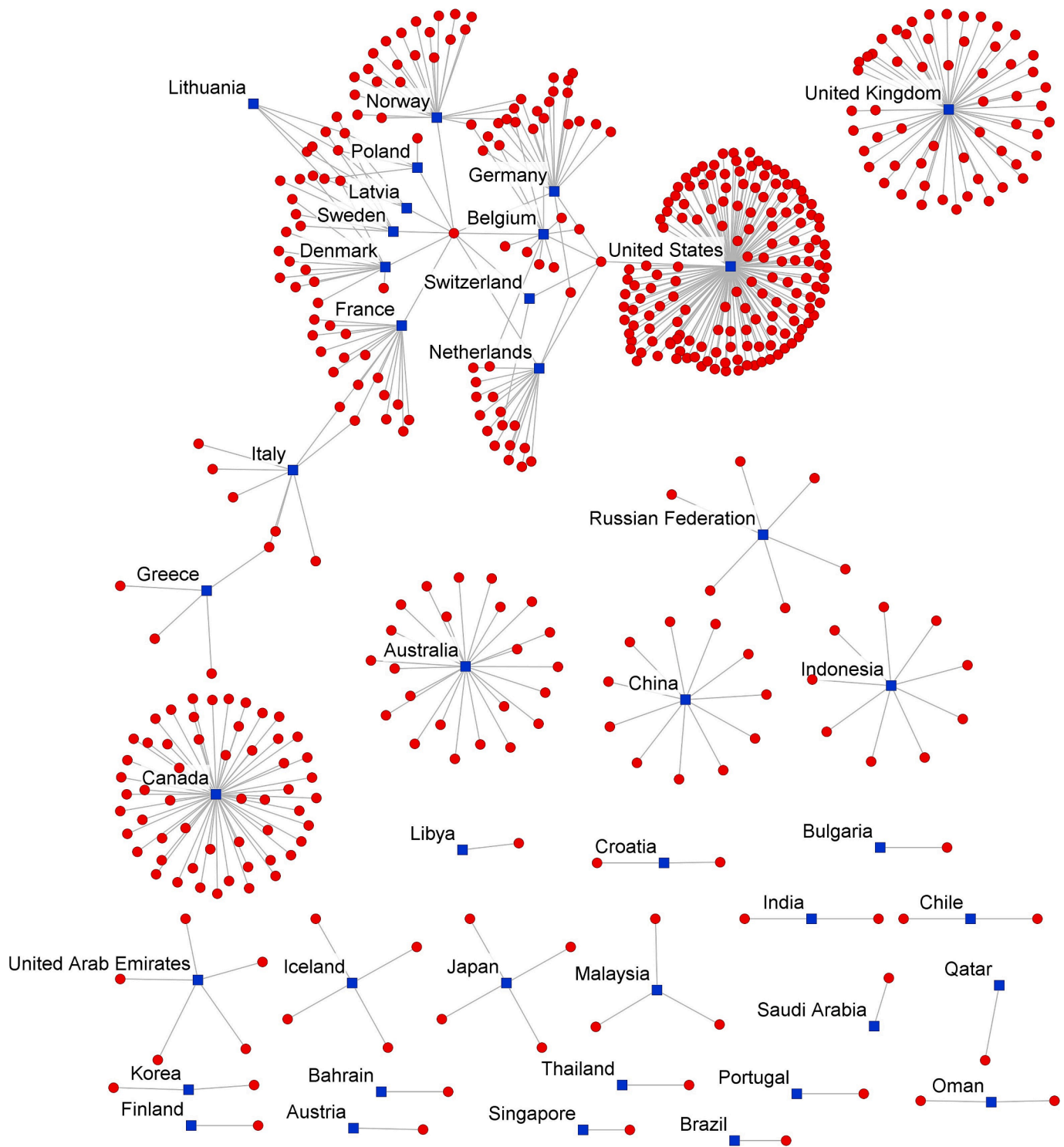


Fig. 3. Network of countries linked to carbon capture projects.

more favourable environment for CCUS.

The region results indicate whether countries from different regions participate in carbon capture projects more or less than the baseline region category, East Asia and Pacific. A positive and significant result for Europe and Central Asia and North America is observed. This indicates that projects are more likely to occur in these two region than East Asia and Pacific. This may reflect the higher level of political determination (especially in Europe) to achieve decarbonisation and net zero targets [110–112]. For Middle East and North Africa, we observe a negative and significant effect, indicating projects are less likely to be

associated with countries in this region compared to East Asia and Pacific.

The GDP per capita variable allows for the examination of the relationship between market affluence and involvement in CCUS projects. We observe across the three models a positive and significant effect, which indicates that wealthier, high-income countries are more likely to invest in carbon capture projects and technology. This finding is in line with extant work that has identified that the uptake in low income countries is low; many studies note that there is a need for low cost deployment and further policy instruments in these countries to

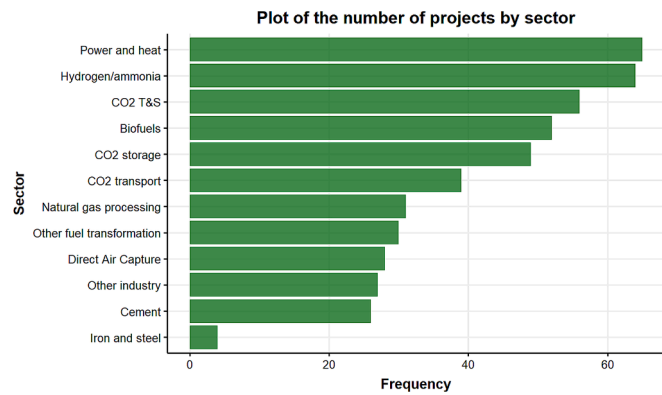


Fig. 4. Number of carbon capture projects (for the period 2019 to February 2023) by sector.

Table 2
Overview of project types.

Project Type	Description
Full chain	Full chain refers to the case where CO ₂ is transported from a capture site to an injection site,
Capture	Capture refers to capture-only projects that do not include any transport and storage development.
Transport	Transport refers to CO ₂ transport-only projects. Transport projects may include CO ₂ shipping and pipelines (amongst other transport options).
Storage	Storage refers to CO ₂ storage-only projects. These type of projects include both dedicated storage and CO ₂ enhanced oil recovery (EOR).
T&S	T&S projects include both CO ₂ transport and storage development.
CCU	CCU refers to a project that captures CO ₂ for use an identified source for the captured CO ₂ .

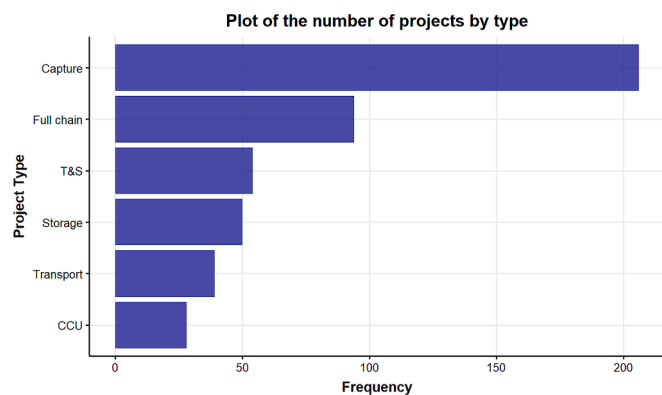


Fig. 5. Number of carbon capture projects (for the period 2019 to February 2023) by type.

Table 3
Descriptive Statistics.

Variable	Mean	Standard Deviation
Number of projects	14.73	32.05
Number of previous before 2019	1.85	4.34
GDP per capita	34584.15	22362.16
Trade Openness	48.71	29.08
CO ₂ Emissions	690279.75	1837555.78
ECI	0.82	0.88

Table 4
Regression Analysis Results.

	Model 1	Model 2	Model 3
(Intercept)	−10.3047*** (1.7084)	−11.5696*** (1.8224)	−11.1814*** (1.8483)
Number of projects before 2019	0.0449*** (0.0116)	0.0413*** (0.0116)	0.0726*** (0.0130)
Europe & Central Asia	0.9483*** (0.1788)	0.7164*** (0.2072)	0.9395*** (0.1772)
Latin America & Caribbean	−0.9181 (0.6095)	−0.7214 (0.6168)	−0.9997 (0.6127)
Middle East & North Africa	−1.3109*** (0.3512)	−1.2061*** (0.3591)	−1.1496** (0.3547)
North America	0.9786*** (0.2098)	0.6327** (0.2431)	0.6196** (0.2142)
South Asia	0.1310 (0.7678)	0.3511 (0.7751)	0.0533 (0.7689)
GDP per capita	0.8030*** (0.1186)	0.8492*** (0.1219)	0.7071*** (0.1261)
Trade Openness	−0.0037 (0.0032)	−0.0033 (0.0033)	0.0018 (0.0031)
CO ₂ emissions	0.3404*** (0.0545)	0.3913*** (0.0598)	0.4513*** (0.0628)
ECI	−0.4517*** (0.0867)	−0.5985*** (0.1097)	−0.5639*** (0.0928)
ETS		0.6121* (0.2450)	
Carbon Tax			0.6768*** (0.1403)
AIC	279.1241	274.6439	257.3787
BIC	297.7018	294.9104	277.6452
Log Likelihood	−128.5620	−125.3219	−116.6893

***p < 0.001; **p < 0.01; *p < 0.05.

encourage CCUS projects [113].

Carbon emissions (as measured by metric tons of CO₂ emissions per capita) is positive and significant. This indicates that CCUS projects are more likely to occur in countries that have high carbon emissions. This potentially reflects where there is a strong need for mitigating carbon emissions, that carbon capture is an attractive and favourable technology.

The second research question posed by this paper aimed to examine how ETS or carbon tax policy instruments shaped country level involvement in carbon capture projects. In model 2, presented in Table 4, ETS is included in the model. The ETS variable has a positive and significant effect, yet only at the 0.05 level. In model 3, we observe a much more pronounced effect when carbon tax is included, where the carbon tax variable is positive and significant at the 0.001 level. The results from models 2 and 3 provides some evidence that policy instruments such as carbon taxes or ETS do act an incentive for firms within countries to participate in carbon capture projects [114].

The third research question posed by this paper aimed at understanding the interplay between economic complexity and carbon capture activity at the country level. In the three models, there was a negative and significant effects. This suggests that lower levels of economic complexity is associated with carbon capture projects. This result is somewhat surprising, as it is expected that countries with more sophisticated production and manufacturing capabilities would be better placed to implement and adopt carbon capture technologies. Yet Balland & Rigby [115] examine the link between patenting activity and economic complexity in the US, and they find that cities with the highest economic complexity levels were not necessarily those with the high levels of patenting activity. Therefore, this result may reflect that it is not the “productive knowledge” capabilities (as captured by the ECI [116]) that result in a country participating in carbon capture projects, rather innovative knowledge; as the ECI underestimates the country level economic complexity that is derived from participation in non-tradable sectors [117].

Conclusion

The conclusion contains two subsections; the first will discuss the three research questions posed by this paper, and the insights provided by the analysis undertaken in this study. This will be followed by a subsection discussing the policy implications of the study.

Concluding comments

This paper set out to tackle three research questions linked to country level carbon capture project patterns, chiefly through a Poisson regression analysis. The first research question asked what country level features are associated with investment in carbon capture projects? The results presented in Table 4 indicates that there a number of features that have a positive and significant influence on the number of carbon capture projects associated with a country (at the 0.001 significance level across all three models). The results indicate that region plays an important role, with more carbon capture projects occurring in North America and Europe and Central Asia, and less in the Middle East and North Africa (compared to the baseline region). GDP per capita is another country level feature that is associated with carbon capture project investment and activity; the positive and significant result in Table 4 indicates projects are more likely to occur in more affluent nations. The results presented in Table 4 also note that countries with higher levels of CO₂ emissions are more likely to participate in carbon capture projects (positive effect across all three models with 0.001 significance level), reflecting that carbon capture is viewed as a favourable technology to tackle climate change challenges. It may also reflect that there is ample carbon to utilise in carbon capture initiatives and use in relevant sectors [82]. Furthermore, previous experience with carbon capture projects (before 2019) has a positive and significant impact on country involvement in carbon capture projects (as observed in Table 4), reflecting the importance of experience with the technology.

The second research questions asked whether ETS or carbon tax policy instruments at the country level was associated with investment in carbon capture projects? Whilst we observe from Table 4 that both ETS and carbon tax have a positive and significant effect on country level carbon capture activity, we observe this effect is more pronounced in the case of carbon tax (0.6768 with 0.001 significance level, compared with the 0.6121 with 0.05 significance level for ETS). This provides some support for the argument presented by Wittneben [118], who suggests that carbon taxes are more effective in lowering emissions at a faster rate (compared to ETS) with lower costs to the public and with no upper bounds for potential carbon reduction. Wittneben [118] notes that ETS have been less successful (compared to carbon tax systems) as a policy instrument to lower carbon emissions.

The final research question posed by this paper asked whether countries with higher economic complexity (as captured by the ECI) engaged in more carbon capture projects. The results from the Poisson regression analysis presented in Table 4 indicate a negative and significant effect (at the 0.001 significance level across all three models). This suggests that countries with higher economic complexity are less likely to be associated with high numbers of carbon capture projects. One explanation for this result is economic complexity is measured by the ECI, which is calculated using international trade data. Therefore, the ECI does not necessary capture knowledge or innovation levels directly, rather indirect “production knowledge” levels [116]. Yet, the capabilities required for carbon capture facilities may not rely on sophistication in production capabilities (as captured by traded goods), rather sophisticated and complex capabilities in non-tradeable sectors [117]. Rather than “production knowledge”, the R&D environment [119] and knowledge reserves (such as those represented by patents) [120], are potentially more relevant indicators of complexity” in the context of developing capabilities for participating in carbon capture projects. This highlights the need for further research to examine the interplay between a country’s knowledge base and technological capabilities and

carbon capture, drawing on alternative measures to the ECI or other forms of data.

Policy implications

There are a number of policy implications from the results of this study. A key policy implication is that carbon tax is positively associated with carbon capture project participation. This suggests that policy makers should employ this tool to encourage investment in CCUS projects. The implementation of any carbon tax should be administratively simple in order to be an effective policy tool in fostering CCUS projects [121]. Yet any tax employed should be higher than the operational and capital costs in order to fully encourage investment in CCUS, or involvement in a CCUS public – private partnership project [122]. The regional partition results point towards a need to consider where regionally stimulus fund to initiate carbon capture technologies should be allocated. In particular there is a need to direct fund to Middle East and North Africa, especially given the countries in this region are often fossil fuel rich [123], carbon capture deployment represents an important medium-term solution to the climate crisis, whilst these nations seek to transition to renewable energy sources [124].

CRedit authorship contribution statement

Matthew Smith: Conceptualization, Formal analysis, Methodology, Writing – review & editing, Data curation, Investigation, Writing – original draft. **Dimitris Christopoulos:** Resources, Funding acquisition, Supervision.

Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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Data availability

Data will be made available on request.

References

- [1] De La Peña L, Guo R, Cao X, Ni X, Zhang W. Accelerating the energy transition to achieve carbon neutrality. *Resour. Conserv. Recycl.* 2022;177:105957. <https://doi.org/10.1016/j.resconrec.2021.105957>.
- [2] Chen L, Msigwa G, Yang M, Osman AI, Fawzy S, Rooney DW, et al. Strategies to achieve a carbon neutral society: a review. *Environ. Chem. Lett.* 2022;20: 2277–310. <https://doi.org/10.1007/s10311-022-01435-8>.
- [3] Bäckstrand K, Meadowcroft J, Oppenheimer M. The politics and policy of carbon capture and storage: Framing an emergent technology. *Glob. Environ. Chang.* 2011;21:275–81. <https://doi.org/10.1016/j.gloenvcha.2011.03.008>.
- [4] Vergragt PJ, Markusson N, Karlsson H. Carbon capture and storage, bio-energy with carbon capture and storage, and the escape from the fossil-fuel lock-in. *Glob. Environ. Chang.* 2011;21:282–92. <https://doi.org/10.1016/j.gloenvcha.2011.01.020>.
- [5] Lau HC, Ramakrishna S, Zhang K, Radhamani AV. The role of carbon capture and storage in the energy transition. *Energy Fuels* 2021;35:7364–86. <https://doi.org/10.1021/acs.energyfuels.1c00032>.
- [6] Martin-Roberts E, Scott V, Flude S, Johnson G, Haszeldine RS, Gilfillan S. Carbon capture and storage at the end of a lost decade. *One Earth* 2021;4:1569–84.
- [7] Chen J, Xu Y, Liao P, Wang H, Zhou H. Recent progress in integrated CO₂ capture and conversion process using dual function materials: a state-of-the-art review. *Carbon Capture Sci. Technol.* 2022;4:100052. <https://doi.org/10.1016/j.cst.2022.100052>.
- [8] Gibbins J, Chalmers H. Carbon capture and storage. *Energy Policy* 2008;36: 4317–22. <https://doi.org/10.1016/j.enpol.2008.09.058>.
- [9] Maroto-Valer MM. Developments and innovation in carbon dioxide (CO₂) capture and storage technology: carbon dioxide (CO₂) storage and utilisation. Elsevier; 2010.

- [10] Osman AI, Hefny M, Abdel Maksoud MIA, Elgarahy AM, Rooney DW. Recent advances in carbon capture storage and utilisation technologies: a review. *Environ. Chem. Lett.* 2021;19:797–849. <https://doi.org/10.1007/s10311-020-01133-3>.
- [11] Roy P, Mohanty AK, Misra M. Prospects of carbon capture, utilization and storage for mitigating climate change. *Environ. Sci.: Adv.* 2023;2:409–23.
- [12] Chen S, Liu J, Zhang Q, Teng F, McLellan BC. A critical review on deployment planning and risk analysis of carbon capture, utilization, and storage (CCUS) toward carbon neutrality. *Renew. Sustain. Energy Rev.* 2022;167:112537.
- [13] Ahmad T, Zhang D. A critical review of comparative global historical energy consumption and future demand: the story told so far. *Energy Rep.* 2020;6: 1973–91. <https://doi.org/10.1016/j.ejegy.2020.07.020>.
- [14] de Castro C, Capellán-Pérez I. Standard, point of use, and extended energy return on energy invested (EROI) from comprehensive material requirements of present global wind, solar, and hydro power technologies. *Energies* 2020;13:3036. <https://doi.org/10.3390/en13123036>.
- [15] Smit B. Carbon capture and storage: introductory lecture. *Faraday Discuss.* 2016; 192:9–25. <https://doi.org/10.1039/C6FD000148C>.
- [16] Bahman N, Al-Khalifa M, Al Baharna S, Abdulmohsen Z, Khan E. Review of carbon capture and storage technologies in selected industries: potentials and challenges. *Rev. Environ. Sci. Biotechnol.* 2023;22:451–70. <https://doi.org/10.1007/s11157-023-09649-0>.
- [17] Bowen F. Carbon capture and storage as a corporate technology strategy challenge. *Energy Policy* 2011;39:2256–64.
- [18] Mahjour SK, Faroughi SA. Risks and uncertainties in carbon capture, transport, and storage projects: a comprehensive review. *Gas Sci. Eng.* 2023;119:205117. <https://doi.org/10.1016/j.jgsce.2023.205117>.
- [19] Hong WY. A techno-economic review on carbon capture, utilisation and storage systems for achieving a net-zero CO₂ emissions future. *Carbon Capture Sci. Technol.* 2022;3:100044. <https://doi.org/10.1016/j.ccst.2022.100044>.
- [20] Santos FD, Ferreira PL, Pedersen JST. The climate change challenge: a review of the barriers and solutions to deliver a paris solution. *Climate* 2022;10:75. <https://doi.org/10.3390/cli10050075>.
- [21] Peridas G, Schmidt BM. The role of carbon capture and storage in the race to carbon neutrality. *Electr. J.* 2021;34:106996.
- [22] L'Orange Seigo S, Dohle S, Siegrist M. Public perception of carbon capture and storage (CCS): a review. *Renew. Sustain. Energy Rev.* 2014;38:848–63. <https://doi.org/10.1016/j.rser.2014.07.017>.
- [23] Tsvetkov P, Cherepovitsyn A, Fedoseev S. Public perception of carbon capture and storage: a state-of-the-art overview. *Heliyon* 2019;5:e02845. <https://doi.org/10.1016/j.heliyon.2019.e02845>.
- [24] Wilberforce T, Olabi AG, Sayed ET, Elsaid K, Abdelkareem MA. Progress in carbon capture technologies. *Sci. Total Environ.* 2021;761:143203. <https://doi.org/10.1016/j.scitotenv.2020.143203>.
- [25] Gibbins J, Haszeldine S, Holloway S, Pearce J, Oakley J, Shackley S, et al. Scope for future CO₂ emission reductions from electricity generation through the deployment of carbon capture and storage technologies. vol. 40. Chapter; 2006.
- [26] Tapia JFD, Lee J-Y, Ooi REH, Foo DCY, Tan RR. A review of optimization and decision-making models for the planning of CO₂ capture, utilization and storage (CCUS) systems. *Sustainable Prod. Consumption* 2018;13:1–15. <https://doi.org/10.1016/j.spc.2017.10.001>.
- [27] Alcalde J, Heinemann N, Mabon L, Worden RH, De Coninck H, Robertson H, et al. Acorn: developing full-chain industrial carbon capture and storage in a resource- and infrastructure-rich hydrocarbon province. *J. Clean. Prod.* 2019;233:963–71.
- [28] Rode DC, Anderson JJ, Zhai H, Fischbeck PS. Six principles to guide large-scale carbon capture and storage development. *Energy Res. Soc. Sci.* 2023;103:103214. <https://doi.org/10.1016/j.erss.2023.103214>.
- [29] Wang N, Akimoto K, Nemet GF. What went wrong? Learning from three decades of carbon capture, utilization and sequestration (CCUS) pilot and demonstration projects. *Energy Policy* 2021;158:112546.
- [30] Reiner DM. Learning through a portfolio of carbon capture and storage demonstration projects. *Nat. Energy* 2016;1:1–7. <https://doi.org/10.1038/energy.2015.11>.
- [31] Wettestad J, Inderberg THJ, Gulbrandsen LH. Exploring paths and innovation in Norwegian carbon capture and storage policy. *Environ. Policy Gov.* 2024;34: 125–36. <https://doi.org/10.1002/et.2068>.
- [32] de Coninck H, Stephens JC, Metz B. Global learning on carbon capture and storage: a call for strong international cooperation on CCS demonstration. *Energy Policy* 2009;37:2161–5. <https://doi.org/10.1016/j.enpol.2009.01.020>.
- [33] Patel P, Henriksen PP. Can carbon capture and storage deliver on its promise? *MRS Bull.* 2017;42:188–9. <https://doi.org/10.1557/mrs.2017.34>.
- [34] Duong C, Bower C, Hume K, Rock L, Tessarolo S. Quest carbon capture and storage offset project: Findings and learnings from 1st reporting period. *Int. J. Greenhouse Gas Control* 2019;89:65–75. <https://doi.org/10.1016/j.ijggc.2019.06.001>.
- [35] Shen M, Kong F, Tong L, Luo Y, Yin S, Liu C, et al. Carbon capture and storage (CCS): development path based on carbon neutrality and economic policy. *Carbon Neutrality* 2022;1:37.
- [36] Li H, Jiang H-D, Yang B, Liao H. An analysis of research hotspots and modeling techniques on carbon capture and storage. *Sci. Total Environ.* 2019;687:687–701.
- [37] Beck L. Carbon capture and storage in the USA: the role of US innovation leadership in climate-technology commercialization. *Clean Energy* 2020;4:2–11.
- [38] Abdulla A, Hanna R, Schell KR, Babacan O, Victor DG. Explaining successful and failed investments in US carbon capture and storage using empirical and expert assessments. *Environ. Res. Lett.* 2020;16:014036.
- [39] Ko Y-C, Zigan K, Liu Y-L. Carbon capture and storage in South Africa: a technological innovation system with a political economy focus. *Technol. Forecast. Soc. Chang.* 2021;166:120633.
- [40] Román M. Carbon capture and storage in developing countries: a comparison of Brazil, South Africa and India. *Glob. Environ. Chang.* 2011;21:391–401. <https://doi.org/10.1016/j.gloenvcha.2011.01.018>.
- [41] Morris J, Paltsev S, Ku AY. Impacts of China's emissions trading schemes on deployment of power generation with carbon capture and storage. *Energy Econ.* 2019;81:848–58. <https://doi.org/10.1016/j.eneco.2019.05.014>.
- [42] Markard J, Rosenbloom D. Political conflict and climate policy: the European emissions trading system as a Trojan Horse for the low-carbon transition? *Clim. Pol.* 2020;20:1092–111. <https://doi.org/10.1080/14693062.2020.1763901>.
- [43] McLaughlin H, Littlefield AA, Menefee M, Kinzer A, Hull T, Sovacool BK, et al. Carbon capture utilization and storage in review: Sociotechnical implications for a carbon reliant world. *Renew. Sustain. Energy Rev.* 2023;177:113215. <https://doi.org/10.1016/j.rser.2023.113215>.
- [44] Ouyang Y, Guo J. Carbon capture and storage investment strategy towards the dual carbon goals. *J. Asian Econ.* 2022;82:101527. <https://doi.org/10.1016/j.asieco.2022.101527>.
- [45] Kahn JR, Franceschi D. Beyond Kyoto: a tax-based system for the global reduction of greenhouse gas emissions. *Ecol. Econ.* 2006;58:778–87. <https://doi.org/10.1016/j.ecolecon.2005.09.004>.
- [46] Dyarto R, Setyawan D. Understanding the political challenges of introducing a carbon tax in Indonesia. *Int. J. Environ. Sci. Technol.* 2021;18:1479–88. <https://doi.org/10.1007/s13762-020-02925-4>.
- [47] Gowd SC, Ganesan P, Vigneswaran VS, Hossain MS, Kumar D, Rajendran K, et al. Economic perspectives and policy insights on carbon capture, storage, and utilization for sustainable development. *Sci. Total Environ.* 2023;883:163656. <https://doi.org/10.1016/j.scitotenv.2023.163656>.
- [48] Grimaud A, Rouge L. Carbon sequestration, economic policies and growth. *Resour. Energy Econ.* 2014;36:307–31.
- [49] Zhang K, Wang Q, Liang Q-M, Chen H. A bibliometric analysis of research on carbon tax from 1989 to 2014. *Renew. Sustain. Energy Rev.* 2016;58:297–310. <https://doi.org/10.1016/j.rser.2015.12.089>.
- [50] Taruffelli B, Snyder B, Dismukes D. The potential impact of the U.S. carbon capture and storage tax credit expansion on the economic feasibility of industrial carbon capture and storage. *Energy Policy* 2021;149:112064. <https://doi.org/10.1016/j.enpol.2020.112064>.
- [51] Mealy P, Teytelboym A. Economic complexity and the green economy. *Research Policy* 2020;103948. <https://doi.org/10.1016/j.respol.2020.103948>.
- [52] Hidalgo CA, Hausmann R. The building blocks of economic complexity. *PNAS* 2009;106:10570–5. <https://doi.org/10.1073/pnas.0900943106>.
- [53] Hausmann R, Hidalgo C. *The Atlas of Economic Complexity: Mapping Paths to Prosperity*, vol. 1. The MIT Press; 2014.
- [54] Minondo A, Requena-Silvente F. Does complexity explain the structure of trade? *Canadian Journal of Economics/Revue Canadienne d'économie* 2013;46: 928–55. <https://doi.org/10.1111/caje.12033>.
- [55] Sweet CM, Eterovic Maggio DS. Do stronger intellectual property rights increase innovation? *World Dev.* 2015;66:665–77. <https://doi.org/10.1016/j.worlddev.2014.08.025>.
- [56] Ikram M, Xia W, Fareed Z, Shahzad U, Rafique MZ. Exploring the nexus between economic complexity, economic growth and ecological footprint: Contextual evidences from Japan. *Sustainable Energy Technol. Assess.* 2021;47:101460. <https://doi.org/10.1016/j.seta.2021.101460>.
- [57] Neagu O. Economic complexity: a new challenge for the environment. *Earth* 2021;2:1059–76.
- [58] Saud S, Haseeb A, Zafar MW, Li H. Articulating natural resource abundance, economic complexity, education and environmental sustainability in MENA countries: evidence from advanced panel estimation. *Resour. Policy* 2023;80: 103261. <https://doi.org/10.1016/j.resourpol.2022.103261>.
- [59] Li H-S, Geng Y-C, Shinwari R, Yangjie W, Rjoub H. Does renewable energy electricity and economic complexity index help to achieve carbon neutrality target of top exporting countries? *J. Environ. Manage.* 2021;299:113386.
- [60] Zheng F, Zhou X, Rahat B, Rubbaniy G. Carbon neutrality target for leading exporting countries: on the role of economic complexity index and renewable energy electricity. *J. Environ. Manage.* 2021;299:113558.
- [61] Lee C-C, Olasehinde-Williams G. Does economic complexity influence environmental performance? Empirical evidence from OECD countries. *Int J Finance Economics* 2022.
- [62] Boleti E, Garas A, Kyriakou A, Lapatinas A. Economic complexity and environmental performance: evidence from a world sample. *Environ Modeling Assessment* 2021;26:251–70.
- [63] Khezri M, Heshmati A, Khodaei M. Environmental implications of economic complexity and its role in determining how renewable energies affect CO₂ emissions. *Appl. Energy* 2022;306:117948.
- [64] Romero JP, Gramkow C. Economic complexity and greenhouse gas emissions. *World Dev.* 2021;139:105317. <https://doi.org/10.1016/j.worlddev.2020.105317>.
- [65] Doğan B, Balsalobre-Lorente D, Nasir MA. European commitment to COP21 and the role of energy consumption, FDI, trade and economic complexity in sustaining economic growth. *J. Environ. Manage.* 2020;273:111146. <https://doi.org/10.1016/j.jenvman.2020.111146>.
- [66] Can M, Gozgor G. The impact of economic complexity on carbon emissions: evidence from France. *Environ. Sci. Pollut. Res.* 2017;24:16364–70. <https://doi.org/10.1007/s11356-017-9219-7>.

- [67] Swart J, Brinkmann L. In: *Economic Complexity and the Environment: Evidence from Brazil*. Cham: Springer International Publishing; 2020. p. 3–45. https://doi.org/10.1007/978-3-030-30306-8_1.
- [68] Chu LK. Economic structure and environmental Kuznets curve hypothesis: new evidence from economic complexity. *Appl. Econ. Lett.* 2021;28:612–6. <https://doi.org/10.1080/13504851.2020.1767280>.
- [69] Agozie DQ, Gyamfi BA, Bekun FV, Ozturk I, Taha A. Environmental Kuznets Curve hypothesis from lens of economic complexity index for BRICS: evidence from second generation panel analysis. *Sustainable Energy Technol. Assess.* 2022;53:102597.
- [70] Adebayo TS, Rjoub H, Akadir SS, Oladipupo SD, Sharif A, Adeshola I. The role of economic complexity in the environmental Kuznets curve of MINT economies: evidence from method of moments quantile regression. *Environ. Sci. Pollut. Res.* 2022;29:24248–60.
- [71] Wang Q, Yang T, Li R. Economic complexity and ecological footprint: the Mediation effects of energy structure, industrial structure, and labor force. *J. Clean. Prod.* 2023;137389. <https://doi.org/10.1016/j.jclepro.2023.137389>.
- [72] Pata UK. Renewable and non-renewable energy consumption, economic complexity, CO₂ emissions, and ecological footprint in the USA: testing the EKC hypothesis with a structural break. *Environ. Sci. Pollut. Res.* 2021;28:846–61. <https://doi.org/10.1007/s11356-020-10446-3>.
- [73] Balsalobre-Lorente D, Ibáñez-Luzón L, Usman M, Shahbaz M. The environmental Kuznets curve, based on the economic complexity, and the pollution haven hypothesis in PIIGS countries. *Renew. Energy* 2022;185:1441–55. <https://doi.org/10.1016/j.renene.2021.10.059>.
- [74] Grossman GM, Krueger AB. Economic growth and the environment. *Q. J. Econ.* 1995;110:353–77. <https://doi.org/10.2307/2118443>.
- [75] Patidar AK, Singh RK, Choudhury T. The prominence of carbon capture, utilization and storage technique, a special consideration on India. *Gas Sci. Eng.* 2023;115:204999. <https://doi.org/10.1016/j.gsc.2023.204999>.
- [76] Neagu O. The link between economic complexity and carbon emissions in the European union countries: a model based on the environmental kuznets curve (EKC) approach. *Sustainability* 2019;11:4753. <https://doi.org/10.3390/su11174753>.
- [77] Kazemzadeh E, Fuinhas JA, Shirazi M, Koengkan M, Silva N. Does economic complexity increase energy intensity? *Energ. Eff.* 2023;16:1–22.
- [78] Safi A, Wei X, Sansaloni EM, Umar M. Breaking down the complexity of sustainable development: a focus on resources, economic complexity, and innovation. *Resour. Policy* 2023;83:103746. <https://doi.org/10.1016/j.resourpol.2023.103746>.
- [79] Saqib N, Radulescu M, Usman M, Balsalobre-Lorente D, Cilan T. Environmental technology, economic complexity, renewable electricity, environmental taxes and CO₂ emissions: Implications for low-carbon future in G-10 bloc. *Heliyon* 2023;9. <https://doi.org/10.1016/j.heliyon.2023.e16457>.
- [80] Caldarola B, Mazzilli D, Napolitano L, Patelli A, Sbardella A. Economic complexity and the sustainability transition: a review of data, methods, and literature. *J Phys Complex* 2024;5:022001. <https://doi.org/10.1088/2632-072X/ad4f3d>.
- [81] Stojkoski V, Koch P, Hidalgo CA. Multidimensional economic complexity and inclusive green growth. *Commun. Earth Environ.* 2023;4:1–12. <https://doi.org/10.1038/s43247-023-00770-0>.
- [82] Patricio J, Angelis-Dimakis A, Castillo-Castillo A, Kalmykova Y, Rosado L. Region prioritization for the development of carbon capture and utilization technologies. *J. CO₂ Util.* 2017;17:50–9. <https://doi.org/10.1016/j.jcou.2016.10.002>.
- [83] International Energy Agency. CCUS Projects Database 2023.
- [84] Ricci O, Seloese S. Global and regional potential for bioelectricity with carbon capture and storage. *Energy Policy* 2013;52:689–98. <https://doi.org/10.1016/j.enpol.2012.10.027>.
- [85] Romasheva N, Ilinova A. CCS projects: how regulatory framework influences their deployment. *Resources* 2019;8:181. <https://doi.org/10.3390/resources8040181>.
- [86] Aslam B, Hu J, Shahab S, Ahmad A, Saleem M, Shah SSA, et al. The nexus of industrialization, GDP per capita and CO₂ emission in China. *Environ. Technol. Innovation* 2021;23:101674. <https://doi.org/10.1016/j.eti.2021.101674>.
- [87] Mirziyoyeva Z, Salahodjaev R. Renewable energy and CO₂ emissions intensity in the top carbon intense countries. *Renew. Energy* 2022;192:507–12. <https://doi.org/10.1016/j.renene.2022.04.137>.
- [88] Wang Q, Zhang F. The effects of trade openness on decoupling carbon emissions from economic growth – evidence from 182 countries. *J. Clean. Prod.* 2021;279:123838. <https://doi.org/10.1016/j.jclepro.2020.123838>.
- [89] Caglar AE, Zafar MW, Bekun FV, Mert M. Determinants of CO₂ emissions in the BRICS economies: the role of partnerships investment in energy and economic complexity. *Sustainable Energy Technol. Assess.* 2022;51:101907. <https://doi.org/10.1016/j.seta.2021.101907>.
- [90] Gogor G. Does trade matter for carbon emissions in OECD countries? evidence from a new trade openness measure. *Environ. Sci. Pollut. Res.* 2017;24:27813–21. <https://doi.org/10.1007/s11356-017-0361-z>.
- [91] Simoes AJG, Hidalgo CA. The economic complexity observatory: an analytical tool for understanding the dynamics of economic development. *Proceedings of the 17th AAAI Conference on Scalable Integration of Analytics and Visualization*, Menlo Park, California: AAAI Press; 2011. p. 39–42.
- [92] Dolphin G, Xiahou Q. World carbon pricing database: sources and methods. *Sci. Data* 2022;9:573.
- [93] Smith M, Christopoulos D. Collaboration in decarbonisation research: comparing the UK and European funding landscape. *Int J Environ Res* 2024;18:53. <https://doi.org/10.1007/s41742-024-00602-9>.
- [94] Inderberg TH, Wettestad J. Carbon capture and storage in the UK and Germany: easier task, stronger commitment? *Environ Politics* 2015;24:1014–33. <https://doi.org/10.1080/09644016.2015.1062592>.
- [95] Rochedo PRR, Costa IVL, Império M, Hoffmann BS, de C Merschmann PR, Oliveira CCN, et al. Carbon capture potential and costs in Brazil. *J. Clean. Prod.* 2016;131:280–95. <https://doi.org/10.1016/j.jclepro.2016.05.033>.
- [96] Iglesias RS, Ketzner JM, Melo CL, Heemann R, Machado CX. Carbon capture and geological storage in Brazil: an overview. *Greenhouse Gases Sci. Technol.* 2015;5:119–30. <https://doi.org/10.1002/ghg.1476>.
- [97] Jiang K, Ashworth P. The development of carbon capture utilization and storage (CCUS) research in China: a bibliometric perspective. *Renew. Sustain. Energy Rev.* 2021;138:110521. <https://doi.org/10.1016/j.rser.2020.110521>.
- [98] Jaccard M, Tu J. Show some enthusiasm, but not too much: carbon capture and storage development prospects in China. *Glob. Environ. Chang.* 2011;21:402–12. <https://doi.org/10.1016/j.gloenvcha.2011.03.002>.
- [99] Jiang K, Ashworth P, Zhang S, Liang X, Sun Y, Angus D. China's carbon capture, utilization and storage (CCUS) policy: a critical review. *Renew. Sustain. Energy Rev.* 2020;119:109601. <https://doi.org/10.1016/j.rser.2019.109601>.
- [100] Shaw R, Mukherjee S. The development of carbon capture and storage (CCS) in India: a critical review. *Carbon Capture Sci. Technol.* 2022;2:100036. <https://doi.org/10.1016/j.cst.2022.100036>.
- [101] Gupta A, Paul A. Carbon capture and sequestration potential in India: a comprehensive review. *Energy Procedia* 2019;160:848–55. <https://doi.org/10.1016/j.egypro.2019.02.148>.
- [102] Vasiliev Y, Cherepovitsyn A, Tsvetkova A, Komendantova N. Promoting public awareness of carbon capture and storage technologies in the Russian Federation: a system of educational activities. *Energies* 2021;14:1408. <https://doi.org/10.3390/en14051408>.
- [103] Offermann-van Heek J, Arning K, Linzenich A, Ziefle M. Trust and distrust in carbon capture and utilization industry as relevant factors for the acceptance of carbon-based products. *Front. Energy Res.* 2018;6.
- [104] Perdan S, Jones CR, Azapagic A. Public awareness and acceptance of carbon capture and utilisation in the UK. *Sustainable Prod. Consumption* 2017;10:74–84. <https://doi.org/10.1016/j.spc.2017.01.001>.
- [105] Curry T, Reiner DM, Ansolabehere S, Herzog HJ. - How aware is the public of carbon capture and storage? In: Rubin ES, Keith DW, Gilboy CF, Wilson M, Morris T, Gale J, et al., editors. *Greenhouse Gas Control Technologies 7*, Oxford: Elsevier Science Ltd; 2005. p. 1001–9. <https://doi.org/10.1016/B978-008044704-9/50101-4>.
- [106] Miller E, Summerville J, Buys L, Bell L. Initial public perceptions of carbon geosequestration: implications for engagement and environmental risk communication strategies. *Int J Global Environ Issues* 2008;8:147–64. <https://doi.org/10.1504/IJGENVI.2008.017265>.
- [107] Carley SR, Krause RM, Warren DC, Rupp JA, Graham JD. Early public impressions of terrestrial carbon capture and storage in a coal-intensive state. *Environ. Sci. Technol.* 2012;46:7086–93.
- [108] Hake J-F, Schenk O. International Cooperation in support of CCS. In: Kuckshinrichs W, Hake J-F, editors. *Carbon Capture, Storage and Use: Technical, Economic, Environmental and Societal Perspectives*. Cham: Springer International Publishing; 2015. p. 311–27. https://doi.org/10.1007/978-3-319-11943-4_14.
- [109] Rai V, Victor DG, Thurber MC. Carbon capture and storage at scale: Lessons from the growth of analogous energy technologies. *Energy Policy* 2010;38:4089–98.
- [110] Geden O, Scott V, Palmer J. Integrating carbon dioxide removal into EU climate policy: prospects for a paradigm shift. *WIREs Clim. Change* 2018;9:e521.
- [111] Lee-Makiyama H, The EU. Green deal and its industrial and political significance. *JSTOR* 2021.
- [112] Gudde P, Oakes J, Cochrane P, Caldwell N, Bury N. The role of UK local government in delivering on net zero carbon commitments: you've declared a climate emergency, so what's the plan? *Energy Policy* 2021;154:112245. <https://doi.org/10.1016/j.enpol.2021.112245>.
- [113] Fragkos P. Assessing the role of carbon capture and storage in mitigation pathways of developing economies. *Energies* 2021;14:1879. <https://doi.org/10.3390/en14071879>.
- [114] del Río P. Why does the combination of the European Union Emissions Trading Scheme and a renewable energy target makes economic sense? *Renew. Sustain. Energy Rev.* 2017;74:824–34. <https://doi.org/10.1016/j.rser.2017.01.122>.
- [115] Balland P-A, Rigby D. The geography of complex knowledge. *Econ. Geogr.* 2017;93:1–23. <https://doi.org/10.1080/00130095.2016.1205947>.
- [116] Lee K, Lee J. National innovation systems, economic complexity, and economic growth: country panel analysis using the US patent data. *J. Evol. Econ.* 2020;30:897–928. <https://doi.org/10.1007/s00191-019-00612-3>.
- [117] Inoua S. A simple measure of economic complexity. *Res. Policy* 2023;52:104793. <https://doi.org/10.1016/j.respol.2023.104793>.
- [118] Witteben BFF. Exxon is right: let us re-examine our choice for a cap-and-trade system over a carbon tax. *Energy Policy* 2009;37:2462–4. <https://doi.org/10.1016/j.enpol.2009.01.029>.
- [119] Bae J, Chun D. How do country-specific R&D environments affect CCUS research performance and efficiency? from the perspective of knowledge diffusion and application. *Environ. Sci. Pollut. Res.* 2024;31:36083–92. <https://doi.org/10.1007/s11356-023-25837-5>.
- [120] Kang J-N, Wei Y-M, Liu L, Wang J-W. Observing technology reserves of carbon capture and storage via patent data: Paving the way for carbon neutral. *Technol. Forecast. Soc. Chang.* 2021;171:120933. <https://doi.org/10.1016/j.techfore.2021.120933>.

- [121] Papadis E, Tsatsaronis G. Challenges in the decarbonization of the energy sector. *Energy* 2020;205:118025. <https://doi.org/10.1016/j.energy.2020.118025>.
- [122] Xing X, Xiong Y, Wang R, Gao Y, Xu S, Ciais P, et al. A review of influencing factors for policy interventions in the deployment of bioenergy with carbon capture and storage. *Next Sustainability* 2024;4:100040. <https://doi.org/10.1016/j.nxsust.2024.100040>.
- [123] Boulanour Z, Essid L. Extending the resource curse hypothesis to sustainability: Unveiling the environmental impacts of Natural resources rents and subsidies in Fossil Fuel-rich MENA Countries. *Resour. Policy* 2023;87:104330. <https://doi.org/10.1016/j.resourpol.2023.104330>.
- [124] Kong C, Zhang J, Ntarmah AH, Kong Y, Zhao H. Carbon neutrality in the middle East and North Africa: the roles of renewable energy, economic growth, and government effectiveness. *Int. J. Environ. Res. Public Health* 2022;19:10676. <https://doi.org/10.3390/ijerph191710676>.