Understanding climate risk externalities through the global supply chains: a framework and review of the literature on existing approaches

Climate risk externalities

Received 23 June 2023 Revised 9 November 2023 Accepted 10 November 2023

Camille J. Mora, Arunima Malik, Sruthi Shanmuga and Baljit Sidhu The University of Sydney, Sydney, Australia

Abstract

Purpose – Businesses are increasingly vulnerable and exposed to physical climate change risks, which can cascade through local, national and international supply chains. Currently, few methodologies can capture how physical risks impact businesses via the supply chains, yet outside the business literature, methodologies such as sustainability assessments can assess cascading impacts.

Design/methodology/approach – Adopting a scoping review framework by Arksey and O'Malley (2005) and the PRISMA extension for scoping reviews (PRISMA-ScR), this paper reviews 27 articles that assess climate risk in supply chains.

Findings – The literature on supply chain risks of climate change using quantitative techniques is limited. Our review confirms that no research adopts sustainability assessment methods to assess climate risk at a business-level.

Originality/value — Alongside the need to quantify physical risks to businesses is the growing awareness that climate change impacts traverse global supply chains. We review the state of the literature on methodological approaches and identify the opportunities for researchers to use sustainability assessment methods to assess climate risk in the supply chains of an individual business.

Keywords Climate change risks, Supply chain performance, Extreme weather events, International business, Input–output analysis, Life-cycle analysis

Paper type Literature review

Introduction

Climate change poses imminent and future risks to the sustainability of international businesses (IBs) (Goldstein *et al.*, 2018; Oh and Oetzel, 2022; Pattberg, 2012; United Nations Climate Change, Global, 2019). IBs rely on local, national and international transport networks to enable their ability to move goods, services and people. All transportations are heavily dependent on infrastructure, which is vulnerable to extreme weather events, exacerbated by climate change. It is estimated that US\$5tn is spent on infrastructure in a year, and when infrastructure fails due to climate events, it impacts not only the physical assets but also causes socioeconomic domino effects that disrupt IBs via their supply chains (Woetzel *et al.*, 2020).

The latest Intergovernmental Panel on Climate Change (IPCC) Working Group II Report (AR6) findings show that the magnitude of climate change impacts were underestimated in previous assessments (IPCC, 2022). There has been an exponential increase in calls from business groups, insurers, regulators and other stakeholders, including investors, for disclosure of climate change risks to individual businesses and their management (Deloitte Insights, 2020; Flammer *et al.*, 2021; Horner, 2021; Krueger *et al.*, 2020; Vincent, 2020). Apart



from disclosing climate risks to stakeholders external to the firm, an understanding of these risks and their location is required for strategic managerial interventions to mitigate them. Stakeholders increasingly hold management accountable for their climate risk management practices and transparency in their disclosures (Thompson, 2018; WEF, 2022). However, given the geographically dispersed nature of IB suppliers and the interdependencies within their supply chains, management faces a crucial challenge in assessing and disclosing their climate change risks (Surminski *et al.*, 2018). Rising to this challenge requires the development of appropriate measurement methods and tools to assess risks and how risks are transmitted across sectors and international boundaries (Benzie and Persson, 2019; Challinor *et al.*, 2018).

Thus far, voluntary disclosure concerning material climate change risks is neither high nor detailed (Davidson and Schuwerk, 2021, 2022). This finding is concerning as the interaction of climate-related risks, sometimes occurring simultaneously and across various geographical regions, can significantly impact international businesses through their supply chains (Challinor et al., 2017, 2018). In fact, regulators are considering mandatory disclosure rules (Kiernan, 2022), while some industry groups seek to shape their industry's disclosure content (Vanderford, 2022). Several regulatory bodies have closely followed the recommendations of the Task Force on Climate-related Financial Disclosures (TCFD) (TCFD, 2017) and have increasingly voiced their concern and intent to regulate disclosure requirements; these regulators include the US Securities and Exchange Commission (2022), the Financial Reporting Council (Financial Reporting Council (FRC), 2021) in the UK and the International Sustainability Standards Board (International Sustainability Standards Board (ISSB), 2022). The Carbon Disclosure Project (CDP) runs an annual climate change disclosure survey based on the TCFD recommendations for companies to report and manage their environmental impacts, which the CDP then evaluates and scores. Despite the lack of requirements for mandatory disclosures, a handful of CDP respondent firms are at the forefront of the climate disclosure movement, scoring the highest A* rating from the CDP. These firms voluntarily disclose their impact on the climate, the climate's impact on them and their governance and management of climate change to CDP, which it then scores, Based on the disclosures made to the CDP in 2021, it is estimated that firms expect around US\$120 bn in costs to mitigate or resolve the physical environmental risks, regulatory risks, and market risks they face in their supply chains (CDP, 2021). This suggests that firms with high quality disclosure are assessing and trying to manage their exposure to climate risk in the

IBs are particularly susceptible to supply chain disruptions (Meixell and Gargeya, 2005; Rao and Goldsby, 2009) and uncertainty (Sharma et al., 2020), exacerbated by global and diversified operations (Reeb et al., 1998). Supply chain risk is generally characterized as the probability and exposure of an event that causes disruption, either directly or indirectly, in the supply chain networks (Garvey et al., 2015; Ghadge et al., 2012; Yatim et al., 2017). For example, NIKE, when reporting to the CDP, discussed how it was exposed to chronic physical risks in its supply chain as the majority of its production facilities are in Southeast Asia, which is exposed to rising mean temperatures. This could negatively impact manufacturing and logistics productivity and continuity based on NIKE's disclosure to the CDP in 2021 (accessible on the CDP website upon registration: https://www.cdp.net/en/ search). Similarly, Levis disclosed the potential financial impact it might face due to the increased severity of extreme weather events (EWE) disrupting their supply chains. They expected the potential risks to be delays in manufacturing or importation of products and increased costs to find alternative ports or warehouse facilities to ensure that the disruptions do not impact customers based on Levi Strauss and Co's disclosures to the CDP in 2020 (accessible on the CDP website upon registration as above for NIKE). Despite firms identifying climate risk in their supply chains as a material threat to their business, the

frameworks each firm uses to identify and manage these risks are still unclear, making a firm-level comparison difficult.

Concerning supply chain risks. IB literature concentrates on supply chain design, risk identification and management over physical risks. Miller (1992) presents a detailed framework for ways IBs can manage risks, where natural hazards are mentioned in a list of general environmental uncertainties. Only more recently are IB scholars looking towards developing strategies for dealing with risks arising from hazards or physical climate risks (Oh and Oetzel, 2022). There are a few reasons why research on physical climate risk demands more attention. Physical risks are more immediate and tangible as they directly impact firm operations, which causes a cascading impact across supply chains, damaging infrastructure and resulting in financial losses (Woetzel et al., 2020). Physical risks, especially those from EWE, are immensly difficult to plan for or predict, which makes them more damaging. In comparison, transition risk can be better planned for as it is often linked to governments' regulatory changes and policy enactment, which happens over a longer period of time. While transition risks pose significant reputational and financial concerns to IBs, it can be managed over a longer term and in line with the move to a low carbon economy. Hence, the potential of significant immediate financial implications from transition risk is comparatively lower.

Considerable academic literature examines managing supply chain risks arising from climate change (Chen *et al.*, 2015; Jin *et al.*, 2014). However, studies assessing supply chain climate risks are less common (Er Kara *et al.*, 2021; Ghadge *et al.*, 2020). While many organisations have developed climate risk assessment methods and services for businesses, these methods are proprietary and unavailable to the public (Fiedler *et al.*, 2021; UNEP Finance Initiative, 2021). Grey literature on climate risk assessment models produced by not-for-profit and research organisations, such as the World Risk Index (WRI) (Welle and Birkmann, 2015) and the Global Climate Risk Index (CRI) (Eckstein *et al.*, 2021) can inform the scope of existing models.

Various methodologies are commonly used to assess supply chain impacts (Ness *et al.*, 2007; Sala *et al.*, 2015). These methods are referred to as sustainability assessment methods. Sustainability assessment methods respond to the increasing need to assess non-economic indicators, such as environmental and social impacts associated with activities, for example, consumption and production. They also enable the enumeration of supply chain disruptions, which include climate-related hazards (Koks *et al.*, 2019). However, it is unclear whether these methodologies have been considered in the IB literature assessing climate risks and what opportunities exist for their use in climate risk assessments.

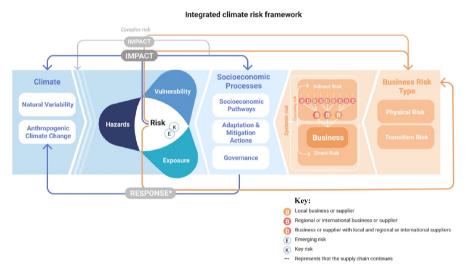
This paper reviews scholarly literature examining how physical climate risk has been assessed in supply chains to inform improved mitigation strategies. We start by defining climate risk and describing the methods capable of assessing supply chain impacts. We then present our review methodology, which is based on a scoping review framework by Arksey and O'Malley (2005) and the PRISMA extension for scoping reviews (PRISMA-ScR) (Tricco et al., 2018) framework. We discuss the results of the 27 empirical and conceptual studies selected for our review. We conclude by presenting a synthesis and our interpretations of the literature reviewed and suggesting a way forward for future research.

Terminology

Climate risk

According to the IPCC, climate risk refers to "the potential for adverse consequences for human or ecological systems" (Reisinger et al., 2020, p. 4), arising from the dynamic interactions between climate-related hazards and the exposure and vulnerability of human or ecological systems to those hazards. Alone, climate change is not a risk; it is the interaction of climate

change or the hazard with the evolving vulnerability and exposure of systems that culminate in risk (see the blue part of Figure 1) (Oppenheimer et al., 2014, p. 1050). Hazards or climate-related impacts, describe the climatic driver of a risk (Reisinger et al., 2020). Hazards can be acute, such as EWE, like floods or cyclones or chronic, such as rising sea levels and increased temperatures (Guo et al., 2021). Exposure is defined broadly as the presence of people, places, ecosystems, economic, social and cultural assets and vulnerability is defined as the predisposition to be adversely affected (Oppenheimer et al., 2014). Vulnerability and exposure are predominately the results of human interactions and socioeconomic processes. The interaction between climate risk and the broader economy, society and environment can



Note(s): The IPCC diagram (left in blue) contains several slight modifications to the original IPCC risk framework: 1) the IPCC risk framework does not contain 'RESPONSE*', which was added by the author, given that the IPCC also recognized the need for responses to be considered as a factor that can impact risk (Reisinger *et al.*, 2020). We inherently include greenhouse gas emissions and land-use change as a climate-related response, for example, if organizations reduce/increase greenhouse gas emissions in response to risk. 2) An additional 'IMPACT' was added to represent *complex risks* that magnify the overall risk based on the hazard. In the business risk framework (right in orange), it is important to note that each business along the supply chain would experience risks as direct risks and have their supply chains where they would experience indirect risks. This demonstrates the complexity of assessing risk in supply chains

Source(s): Figure by authors, adapted from Figure 19-1 Chapter 19 in: Oppenheimer, M., M. Campos, R.Warren, J. Birkmann, G. Luber, B. O'Neill, and K. Takahashi, 2014: Emergent risks and key vulnerabilities. In: Climate Change 2014: Impacts, Adaptation, and Vulnerability. Part A: Global and Sectoral Aspects. Contribution of Working Group II to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change [Field, C.B., V.R. Barros, D.J. Dokken, K.J. Mach, M.D. Mastrandrea, T.E. Bilir, M. Chatterjee, K.L. Ebi, Y.O. Estrada, R.C. Genova, B. Girma, E.S. Kissel, A.N. Levy, S. MacCracken, P.R. Mastrandrea, and L.L.White (eds.)]. Cambridge University Press, Cambridge, United Kingdom and New York, NY, USA, pp. 1039-1099

Figure 1. An integrated climate risk framework

culminate in varying degrees or types of risk. The IPCC identifies climate change as a complex risk symptomatic of multiple climate hazards coinciding with subsequent risks. Several additional risk types are pertinent to the scope of this paper and are used throughout to describe the nature of climate-related risks. They are systemic and cascading risks. *Systemic risks* arise from an initial localized failure but can trigger widespread disruptions to a system (King *et al.*, 2015; Simpson *et al.*, 2021). *Cascading risks* occur when an event or trend initiates other risks, where interactions can be one-way or create feedback loops (Simpson *et al.*, 2021).

In the business literature, climate risk refers to risks organisations face. The term climate risk gained popularity after the establishment of the TCFD in 2015 (TCFD, 2017). Commonly, climate risk is divided into two categories; physical and transition risks. Physical risks. similar to the IPCC understanding of climate hazards, can be acute or chronic, such EWE and longer-term climatic shifts or sea-level rise, respectively (In et al., 2022; Simpson et al., 2021; Surminski et al., 2018; Tsalis and Nikolaou, 2017). Chronic and acute risks can impact the operations of a business directly and indirectly through its supply chain (Clapp and Sillmann, 2019; TCFD, 2017). For example, an acute risk, such as a cyclone can disrupt operations for the business in the country in which the business operates or if the cyclone occurs elsewhere, can impact the business's operations via the supply chains. Transition risks refer to the risks arising from the transition to a low carbon economy and can include regulatory, litigation, technology or reputational risks (Arnell, 2016; Pattberg, 2012). For example, the Carbon Border Adiustment Mechanism (CBAM), a carbon levy on products from countries lacking serious pollution reduction programmes in the European Union, which is expected to come into force in 2023, will result in millions of dollars in tariffs on high-polluting exporters (Besser, 2021).

The two framings of climate risk, by the IPCC and the TCFD, have yet to be integrated. We adapt the IPCC framework on climate risk to incorporate transition and physical risks experienced by businesses (Magnan *et al.*, 2021), represented diagrammatically above (Figure 1). This figure combines the IPCC risk framework (left in blue) (Oppenheimer *et al.*, 2014) with the depiction of the sources of business risk (right in orange) in a comprehensive framework for examining climate-related risk propagating in businesses supply chains. In the IPCC risk framework (see Oppenheimer *et al.*, 2014, pp. 1046), "climate" (e.g. factors influencing climate) and "socioeconomic processes" (e.g. societal conditions and development pathways) drive the factors that constitute risks (Oppenheimer *et al.*, 2014). We include businesses as a driver of socioeconomic processes, which are increasingly informed or driven by business innovations. The IPCC and the United Nations Framework Convention on Climate Change (UNFCCC) recognise the need for businesses to drive climate action and climate safe and resilient development (IPCC, 2022).

Sustainability assessment methods

Since the World Commission on the Environment and Development (WCED) published the report "Our Common Future" in 1987, sustainable development and sustainability have become mainstream terms (Brundtland, 1987). Broadly, sustainability considers economic, social and environmental dimensions across intra- and inter-generational scales. Today, the United Nations Sustainable Development Goals (SDGs) encapsulate global cooperation to achieving and improving sustainability and sustainable development. Reporting and measuring sustainability is instrumental in cataloguing progress towards the SDGs or sustainability more broadly (Ness *et al.*, 2007). In the business management literature, it is widely recognised that you "cannot manage what you cannot measure". The sustainability assessment methods are used to measure progress towards sustainability and are reliable tools used across governments and businesses. Sustainability assessment methods often inform decision-making on managing or reducing embodied environmental and social

impacts of products and services across their entire value chains (Duchin and Levine, 2014, p. 1968). Much research catalogues and categorises the methods available to assess sustainability Ness *et al.* (2007) produce a framework based on three main categories: indicators/indices, product-related assessments and integrated assessment tools. Sala *et al.* (2015) produce a comprehensive sustainability assessment approach, defining the common methodologies selected in different assessments. Across these studies, two common sustainability assessment methods applied in the context of climate change are input—output analysis and life-cycle analysis (LCA). While other sustainability assessment methods exist (see Ness *et al.* (2007)), the existing research and applications of both IO and LCA are particularly relevant to questions on climate risk, which we outline below.

Input—output (IO) analysis uses the data from economic input—output tables that capture the flow of monetary goods and services in an economy to model various supply chain impacts across the sectors and regions (Leontief, 1936). IO-based methods, including multiregion input—output analysis (MRIO) and environmentally extended input—output analysis (EEIO), have been applied in sustainability-related studies seeking to examine the carbon footprints of households (Druckman and Jackson, 2009), businesses (Demeter *et al.*, 2022), sectors (Heihsel *et al.*, 2019; Malik *et al.*, 2018; Zhang and Wang, 2016) and countries (Hertwich and Peters, 2009). They are also used to assess the supply chain impacts of disasters (Huang *et al.*, 2021; Lenzen *et al.*, 2019) and cross-border impacts embodied in trade (Wang *et al.*, 2019; Wiedmann and Lenzen, 2018). LCA traces and quantifies resource or emissions use per unit of product over the life cycle of a product (Odeh and Cockerill, 2008; van der Velden *et al.*, 2015). Hybrid IO-LCA methods have been developed to overcome the limitations of IO and LCA taken separately (Yu and Wiedmann, 2018). In our paper, sustainability assessment methods represent IO or LCA methods.

These sustainability assessment methods are relevant to questions concerning climate risks arising in supply chains for IBs. Concerning transition risks, which may include increasing liability over greenhouse gas (GHG) emissions; it is possible to enumerate the GHG emissions arising in supply chains using sustainability assessment methods. For example, LCA and IO analysis are quantitative methodologies capable of linking the data from the economy or a company with physical information on GHGs to produce such assessments (Malik *et al.*, 2018). Concerning physical risks, however, fewer sustainability assessment methods enable the quantification of economic and non-economic impacts arising from supply chain disruptions, including hazards exacerbated by climate change. IO analysis is often used in this context, albeit to the authors' knowledge, it has never been extended to consider how the supply chain impacts of a hazard impact a particular business. Based on the constraints of IO analysis to model sectoral and economic resolutions, it would need to be integrated with LCA analysis to ascertain the impact on a business (Wiedmann *et al.*, 2009). As this paper focuses on physical risk, the most relevant of these applications is the ability of sustainability assessment methods to assess the cascading impacts of climate-related events.

Methods

We used a systematic scoping review to identify peer-reviewed journals to understand how climate risk is assessed in supply chains (Arksey and O'Malley, 2005). Systematic scoping reviews are more rigorous than scoping reviews alone, and commonly, IB literature reviews adapt systematic review frameworks to canvas the literature and propose future research directions (Kano *et al.*, 2020; Papanastassiou *et al.*, 2020). We adopt the five-step framework developed by Arksey and O'Malley (2005) (Figure 2), and adhere to the Preferred Reporting Items for Systematic Review and Meta-Analysis (PRISMA) guidelines – extension for scoping reviews (Tricco *et al.*, 2018) to outline the study screening process and report the results.

This review explores whether the sustainability assessment methods (as defined above) have been used to assess physical climate risks in global supply chains of IBs. As illustrated in the section above, sustainability assessment models are often used to assess sectoral and regional supply chain impacts and do not (yet) do so for a specific business. We therefore, hypothesise that a novel opportunity exists to extend the sustainability assessment methods to incorporate this capability. Further, to the author's knowledge, no paper systematically reviews the scientific and interdisciplinary academic literature on the use of sustainability assessment methods in global supply chains as they relate to assessing climate risk for businesses. This literature review aims to confirm the hypothesis by canvassing this research gap in the existing literature. We focus on physical climate risks as it is sporadic, imminent and tangible, compared to the risk from transition to a low carbon economy, which is longer term, enduring and potentially managed over several decades.

Answering this research question is important as, for IBs, risk assessment and management are incomplete without supply chain considerations. Globalisation has enabled many positive benefits for IBs, such as outsourcing talent and reducing costs. As Oh and Oetzel (2022) highlight, research on hazards and their implications for IBs cannot be ignored. This makes it even more necessary for research to focus on sustainability assessment methods within the global supply chains to help quantify physical climate risks so that IBs can have appropriate risk management strategies for unprecedented climate-related events. A growing body of literature canvasses the effects climate change will have on global supply chains (Ghadge et al., 2020; Pankratz and Schiller, 2019). However, none look at novel ways to quantify physical risk using the sustainability assessment methods.

To do so, firstly, this review seeks to understand:

1. What is the scope of academic literature assessing climate risk assessments in supply chains?

While we hypothesise that sustainability assessment methods will be used across the literature answering this question, we are not confined by only examining research with the same methods. Rather, we want to understand how they are used in the broader literature considering supply chains in climate risk assessments. This means that methods outside the two sustainability assessment methods described above and the sustainability literature, other methods may appear. However, in answering this question, this paper reveals how sustainability assessment methods have been used to assess physical climate risks in global supply chains. The second question is the crux of the review and intends to confirm our hypothesis: that an opportunity exists to extend the sustainability assessment methods to individual businesses. In doing so, we seek to explore the following:

2.Are sustainability assessment methods used at the level of a business? If not, how sustainability assessment methods can be applied to an individual IB to quantify its exposure to physical climate risks in its supply chain?

Through the first part of this question, we unveil the trends in studies using sustainability assessment methods and highlight the gap in the extant literature. The second part of the

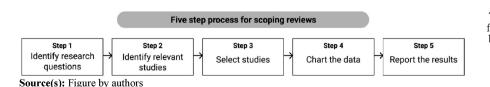


Figure 2.
The five step process followed in this study based on Arksey and O'Malley's (2005) scoping review framework

question is covered in the discussion, where we elaborate on the potential of sustainability assessment methods in this context.

Search strategy

We limited our search criteria to a meaningful search string aligned with our research questions to identify the literature to include in this scoping review. These terms were searched across titles, keywords and abstracts to constrain the research results on climate risk/assessments (Search 1). Our second search string (Search 2) expanded to include synonyms of "climate change", "supply chain", "risk" and "assessment". We do not include the term "physical" because climate risk encompasses physical risks. Notably, we also included the Boolean operator AND with synonyms for "business" to capture businessspecific literature (Table 1). Finally, we did not include the date as a parameter, searching for all studies up to and including March 2022.

While sustainability assessment methods are some of the dominant methods in interdisciplinary or sustainability-related literature to assess supply chain impacts, other modelling techniques exist in discipline-specific literature. Therefore, we did not choose to isolate our search to only studies that adopted sustainability assessment methods mentioned in the terminology section. Instead, we wanted to understand the existing methods used to assess climate risk in supply chains and assess the role and potential of sustainability assessment methods for future research.

Electronic databases consulted include Scopus, ScienceDirect, ABI/Inform and Web of Science. Scopus and ScienceDirect are well-established databases that capture most of the peer-reviewed scientific and interdisciplinary academic literature. Unlike other reviews in the IB literature, we do not confine ourselves to IB and business-specific journals (Caprar et al., 2022), as the observed literature on climate risk comes from disparate disciplines requiring a multidisciplinary approach. ABI/Inform was chosen because it is a business-specific literature database (Bauer et al., 2018; Kunz et al., 2020). Web of Science was selected as it includes Wiley and Emerald publications, which contain important supply chain management journals (Fan and Stevenson, 2018). Additionally, we supplemented our search strategy, adopting a multilayered strategy, including hand-searching, snowballing and cross-referencing to identify other relevant literature (Adams et al., 2016). We consulted

Scopus

Search 1 – parameters (* indicates wildcard operator used in the search so that additional terms were captured. For example, "climat*" captures "climate" and "climatic")

("climat* change") AND ("supply chain*") AND ("risk assess*")

ABI/Inform** Web of Science ScienceDirect***

ScienceDirect

("climate change" OR "climatic change") AND ("supply chain" OR "supply chains") and

("risk assessment") Search 2 – parameters

("climat*" OR "climat* change" OR "anthropogenic* climat* change" OR "global Scopus warming") AND ("supply chain*" OR "indirect impact*" OR "value chain") AND ("assess*" OR "analysis") AND ("risk*") AND ("business*" OR "organisation*" OR "firm*" ABI/Inform Web of Science

("climate change" OR "global warming") AND ("supply chain" OR "indirect impact") AND

("assessment" OR "analysis") AND ("business" OR "firm") AND ("risk")

Table 1. Literature search parameters

Note(s): *Indicates wildcard operator used in the search. **ABI/Inform did not enable a search across keywords, so only titles and abstracts were scanned. ***For ScienceDirect, we were limited by eight Boolean operators, so we selected the broadest terms possible for inclusion. Additionally, ScienceDirect does not support wildcards

the Social Science Research Network (SSRN) and the first ten pages of Google Scholar using our Search 1 parameters, owing to the limited functionality of both engines to narrow the search parameters to the abstract and keywords.

Climate risk externalities

Study selection

Our study selection process was guided by stringent inclusion and exclusion criteria (Arksey and O'Malley, 2005). The criteria in our scoping study required that the study be about climate risk assessments in supply chains (Table 2). We applied these criteria in the abstract screening. However, if the relevance of a study was unclear from the abstract, we read the paper in its entirety before determining its inclusion, Review articles, books, chapters, forums and conference hearings were also excluded, as it is common in more systematic literature reviews (Adams et al., 2016; Ghadge et al., 2012; Ghadge et al., 2020; Munn et al., 2018). Figure 3 shows the flow diagram for screening the dataset by adapting a PRISMA approach.

Data charting and analysis tool

We developed a consolidated database of the 27 papers reviewed, identifying key aspects important to our research scope using Excel (Table 3), Our database included; a) the author, b) the year, c) the journal in which it was published, d) the method type (e.g. quantitative), e) the specific method, f) the proxy for climate risk, g) the topic and whether it involved a sector or business and h) the region used as a case study as recommended by (Arksey and O'Malley, 2005).

In addition to analysing the data in our database, we use Bibliometrix, a quantitative bibliography mapping tool, to present an initial descriptive analysis of the results. This approach enables a more nuanced analysis of how the literature is situated in the context to one another and the relevance of the citations. We downloaded two separate data files with our articles from the World of Science and Scopus databases, following Caputo and Kargina (2021), to merge the two datasets together. These data are then run through Bibliometrix, which Linnenluecke et al. (2019) recommend for literature reviews in the business and management fields.

Code	Definition	Justification	
NOTCRA	The topic was either not on a <i>supply chain</i> climate risk assessment (Doubleday <i>et al.</i> , 2013) or examined climate risk but did not <i>assess</i> it explicitly (Weinhofer and Busch, 2013)	Ensures that methods to present climate risk assessments are the focus of the research	
NOTCR	The topic was not on climate risk explicitly. For example, the paper referred to climate risk in the abstract, but it was not the focus of the research	Ensures that the topic of the paper is related to climate risk broadly. For example, a paper examining drought risk extremes from climate change was included	
OTH	The topic was about sustainable supply chains, quantifying carbon footprints or other topics not related to climate risk (Palea and Santhià, 2022)	Ensures that we examine the literature on climate risk specifically	
RVA	The topic was related to climate change adaptation or mitigation, vulnerability or resilience and unrelated to a risk assessment of the latter	Ensures that the literature included is narrowed to assess risk, not mitigation/ adaptation. Research that developed climate risk assessments to reduce vulnerability was included	Table 2. Exclusion criteria and justification

JAL

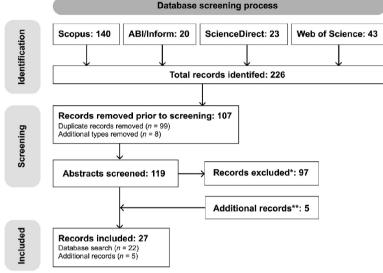


Figure 3.
Preferred Reporting
Items for Systematic
Review and MetaAnalysis (PRISMA)
guidelines – extension
for scoping review
(Tricco et al., 2018)
flowchart designed by
the authors

Note(s): *represents sources excluded based on exclusion criteria. **describes sources found outside database searches

Source(s): Figure by authors

Results

Descriptive statistics

A total of 226 records were initially identified from the databases during the search period in January–March 2022. After removing duplicates and following the screening of the remaining 119 records, 22 studies remained for inclusion in our review (Figure 4). Five additional studies were included based on snowballing search techniques. Of the studies reviewed, 88% were published since 2015 (Figure 5), which coincides with the establishment of the TCFD (TCFD, 2017). These results suggested the limited scope or research on climate risk in supply chains, which is pertinent to our first research question.

The Bibliometrix results present valuable information on the core themes across the articles and the most highly cited papers. Figure 6 shows that climate change risk and supply chain performance are the dominant themes in the reviewed literature. This also validates that our inclusion criteria helped us locate literature related to our research question. Further, the papers analysed in the coming sections are closely related to physical climate risks, as represented by the dominance of EWE in the word cloud (Figure 6). Figure 7 reveals that of the 27 papers included in our review, the top five most cited were published since 2015. The one outlier was a paper in 2010. This finding aligns with the year the Paris Agreement was ratified, and the first conversations on climate risk for businesses were discussed.

The methods

Quantitative methods. Quantitative methods such as IO analysis, hybrid LCA models, computational and mean-variance methods and machine learning models, were used in 54% of papers reviewed (N = 15). Sustainability assessment methods were the most applied category of quantitative methods (N = 5). This was unsurprising as these are well-established methods to quantify impacts propagating in the supply chains (Dietzenbacher

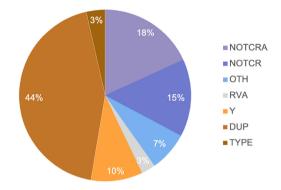
Anthorle	(Young)	Journal	Method	Mathods	Drovy for climate riels	Sector (S) or business	Portion/s
Autilot/S	(1001)	Jour rian	type	Mediod/s	I loay for chinate fish	(D). uetan	Mcgion/s
Vinke et al	(2022)	Gimate Risk	Quant	Modelling	Disaster (drought)	(S): Transport (ports)	Germany
Lin and Ma	(2022)	Frankemental Science and policy	Quant	Machine learning (ML) (change point analysis and spike point analysis analysis)	Weather (extreme weather events)	(S): Food	France
Nakano	(2021)	Journal of cleaner	Quant	Multiregion input—	Disasters (various)	(S): Automotive	USA, China, Japan and
Er Kara <i>et al</i>	(2021)	protaction International Journal of Production Research	Mixed methods	Cognitive mapping, surveys and systems dynamic (SD) modelling	Natural resources (raw materials) and logistics (operations)	(S): Performance	Not defined
Simpson et al.**	(2021)	One Earth	Qual	Analysis and content	Temperature	(S): General	Europe
Ali and Ismail	(2021)	Supply Chain Management	Mixed methods	Interviews and questionnaires	disasters (bushfire, heatwaves, floods and droughts)	(S): Food	Australia
Bonnafous and Lall	(2021)	Natural hazards and earth system sciences	Quant	Computation	Weather (extreme precipitation) & disaster	(S): Raw materials (bauxite, iron-ore,	Global
Wang et al	(2021)	Resources, Conservation and Boweling	Quant	Bayesian network model	Weather (increased precipitation)	(NA): Other (Water- energy-food nexus)	China
Ghadge et al	(2020)	Technological Forecasting and	Quant	SD modelling approach	Temperature (general)	(S): Energy (bioethanol (corn and	North America
Stokeld <i>et al</i>	(2020)	Social Jamige Climatic change	Quant	Combination of three models for climate, crop yield and trader climate risk exposure	Temperature and disasters (general)	switchgrass) (S): Food	Brazil
							(continued)

Table 3. Database of included literature

Author/s	(Year)	Journal	Method type*	Method/s	Proxy for climate risk	Sector (S) or business (B): detail	Region/s
Tenggren et al	(2020)	Journal of Environmental Planning and Manazement	Qual	Interviews	Weather (extreme weather events)	(B): General (export oriented businesses)	Sweden
Schaefer <i>et al</i>	(2019)	Journal of cleaner production	Quant	Monte Carlo Analytic Hierarchy Process (MCAHP)	Natural resources (water risk)	(B): Specific (Proctor and Gamble unit))	Global
Zhao et al	(2019)	Journal of cleaner production	Quant	MRIO	Natural resources (water scarcity)	(S): Water	Global
Srinivasan et al	(2019)	Computers and industrial engineering	Quant	Mean-variance models	Temperature	(S): Agriculture (food sourcing decisions)	South America, central Africa, Oceania, United States of America, Western and Eastern Europe and Australia
Yang et al	(2018)	Transportation Research Part D: Transport and Environment	Mixed methods	Fuzzy-Bayesian risk analysis and interviews	Environmental driver (sea-level rise and storm surges)	(S): Transport (ports)	China
Groundstroem and Juhola	(2018)	Environment systems and decisions	Qual	Comparative analysis	Various	(S): Energy	Finland, Sweden, Norway, Denmark and Iceland
Lim-Camacho et al	(2017)	Gobal Environmental Change	Mixed methods	Comparative analysis	Disaster (droughts, floods and fires)	(S): Natural resources (mining), Aquaculture (fisheries) and Food (rice)	Australia
Nakano	(2017)	Mitigation and adaptation strategies for global change	Quant	Life-cycle assessment framework for adaptive planning (LCA-AP)	Disease (dengue)	(S): Labour	USA, China, Japan, Germany, India and Brazil
Meinel and Abegg	(2017)	Gobal Environmental Change	Mixed methods	Surveys and interviews	General	(B): Manufacturing	Austria
Tsalis and Nikolaou***	(2017)	Business strategy and the environment	Mixed methods	SD approach	Regulatory risks	(B): General (performance)	Not specified
							(continued)

Author/s	(Year)	Journal	Method type*	Method/s	Proxy for climate risk	Sector (S) or business (B): detail	Region/s
Monasterolo et al	(2017)	Climatic change	Quant	Development of novel indices	Transition risk (greenhouse gas emissions)	(B): General exposure	Austria, Belgium, Cyprus, Estonia, Finland, France, Germany, Greece, Ireland, Italy, Luxembourg, Malta, the Netherlands, Portugal,
Otto et al.**	(2017)	Journal of Economic Dynamics and Control	Quant	MRIO analysis	Weather (extreme weather events)	(S): Manufacturing	Japan
Kim and Lee	(2016)	Sustainability	Mixed methods	ISO management approach and surveys with consultants	Weather (extreme heat and cold) and disaster (extreme precipitation and snow)	(B): Bank	Korea
Aviso et al	(2015)	Biomass and Bioenergy	Quant	Fuzzy inoperability input-output model (IIIV) work and supply-reduction framework	Disaster (typhoons)	(S): Energy (biodiesel)	The Philippines
Hseih	(2014)	Natural Hazards	Mixed methods	Disaster risk analysis	Disaster (tsunami and debris overflow)	(S): Transport (port)	Taiwan
Bierkandt <i>et al</i>	(2014)	Environment Systems and Decisions	Quant	MRIO analysis	Weather (extreme weather events)	(S): Machinery	Japan
Jacxsens et al	(2010)	Food Research International	Qual	Conceptual modelling	Disease (microbiological food safety)	(S) Food (general)	Not applicable
Note(s): *Quant The rows shaded	t = Quanti grey repr	Note(s): *Quant = Quantitative, Qual = Qualitative The rows shaded grey represents the papers that app	e ply the sust:	Note(s): *Quant = Quantitative, Qual = Qualitative The rows shaded grey represents the papers that apply the sustainability assessment methods to assess climate risk	nods to assess climate risk		

JAL



Note(s):

NOTCRA not on a climate risk assessment

NOTCR not on climate risk

OTH unrelated (i.e., examined the sustainability of supply chains)

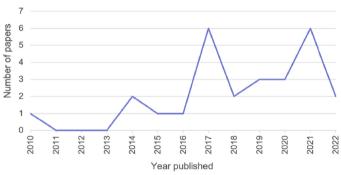
RVA was specific to resilience, vulnerability or adaptation but did not present a

risk assessment

DUP duplicate papers

TYPE research types excluded for analysis
Y represents studies that were included

Source(s): Figure by authors



Source(s): Figure by authors

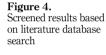


Figure 5. Number of papers included in the review by publication date (n = 27)

et al., 2020; Schulte in den Bäumen *et al.*, 2015; Wiedmann, 2009). It is worth noting that all studies using sustainability assessment techniques (N = 6) examine risk at an industry-sector level (i.e. an aggregation of businesses into one homogenous sector) and not at an individual-business level. The other quantitative methods demonstrate the diversity of potential methods to assess climate risk. However, the diversity of these quantitative methods renders comparing and assessing the consistency of the methods to be impossible.

Aviso *et al.* (2015) assessed the economic risks of climate change associated with the 5% mandatory biodiesel blending in the Philippines using a fuzzy inoperable input–output (IIM) model. Their model shows that climate risk manifests in the highest economic losses in coconut farming, manufacturing and other agriculture. A critical connection made is that increased dependency on biofuel increases the risk to agriculture caused by climate change.

Figure 6.
Word cloud of core themes created using Bibliometrix



web supply training critical climate risks change adaptation measures nordic climate assessment microbiological load safety change risk assessment virtual water scarcity economic supply network notembrish cross-horder impacts

Source(s): Figure by authors

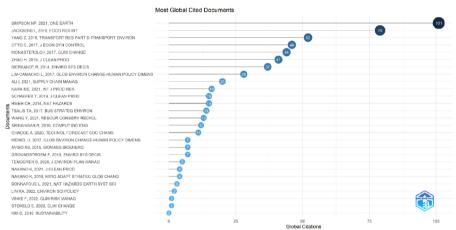


Figure 7.
Most cited literature included in the review created using Bibliometrix

Source(s): Figure by authors

Nakano (2017) used MRIO analysis to examine the cascading effects on labour losses from an increased risk of contracting dengue fever. A later paper by Nakano (2021) also used MRIO analysis to quantify climate risk on economic and labour factors using the automotive industry from the United States of America, Germany, Japan, China and the UK, as a case study. A notable aspect of this study is that risk is assessed based on a climate-related disaster risk factor (CDRF), used as an indicator encompassing both vulnerability and hazard. Bierkandt *et al.* (2014) and the later study by the same co-author Otto *et al.* (2017), developed a model called Acclimate to examine how disasters propagate in supply chains. The Acclimate model incorporates MRIO databases to enumerate the supply chain impacts. However, the studies are both focused on disaster impacts; they are situated in the context of being able to inform a risk assessment, so they were included for review. Zhao *et al.* (2019) applied MRIO analysis to examine virtual water scarcity risk (WSR) from climate change embodied in global supply chains. This was analysed concerning two scenarios: the business as usual (BAU) scenario, which is aligned to Representative Concentration Pathway (RCP) 8.5

and an optimistic scenario, which is aligned to RCP 4.5. An observation is that this extrapolation identifies the importance of climate risk at a business-level, yet does not seek to quantify it. For example, businesses within mining and agriculture sectors depend on freshwater resources and thus, would be heavily implicated because of water scarcity. Regardless, they highlight how WSR arising from climate change is connected via supply chains (Zhao et al., 2019).

The remaining quantitative studies (60%) employed vastly different methods. Monasterolo et al. (2017) used computational methods to develop novel indices to analyse two main dimensions of investors' vulnerability to climate risk, exposure of investors to climate risk and market share of financial actors weighted by its contribution to GHG emissions, Bonnafous and Lall (2021) also used computational methods; however, their model showed how the clustering of climate extremes affects natural mineral supply chains. Their study contributes to the underdeveloped field of hydroclimatic risk clustering and its impact on risk exposure, which is relevant for global portfolio managers in natural minerals. Stokeld et al. (2020) developed several modelling components to present Brazil's soy crop traders' exposure to climate risk. A benefit to their methodology is that they demonstrate insight into the subnational variation of climate risks on a particular crop, which may be vital for future adaptation and planning. Srinivasan et al. (2019) applied mean-variance models to assess climate risk in food sourcing decisions, though their analysis solely uses climatic data in sourcing decisions, ignoring other socioeconomic considerations. Lin and Ma (2022) adopted machine learning algorithms to identify the risk of EWE and price fluctuations for 25 food supply chains. A novel contribution of the method they employed is that they can show how highly temporal-correlated supply chains, such as sugar, bread and cereals, resulted in price jumps that were quick to reflect extreme temperature spikes, with the opposite being valid for lowly temporal-correlated supply chains. Wang et al. (2021) used Bayesian Network (BN) modelling to create a multivariable scenario simulation, with only one input representing climate risk – extreme precipitation. A limitation is that they do not specify supply chain risks in the BN model but instead focus on the impact on supply-demand risk arising from the input changes. Vinke et al. (2022) used a 1D flow solver, given its application in flood forecasting coupled with a Python package for logistics simulation, to calculate the cascading effects on inland shipping in the Rhine, Germany.

Qualitative methods. Qualitative methods, including interviews and surveys, were used in 11% of the papers reviewed (N = 4). Simpson et al. (2021) synthesise literature describing complex climate change risks to establish a holistic framework for risk assessment that encompasses the risks less developed by the IPCC reports. In their research, Tenggren et al. (2020) conducted qualitative interviews with large manufacturing businesses that produce their goods in Sweden but have high export shares to understand how they understand climate risks in business supply chains. Sweden is the case study selected because of its many import-dependent and export-oriented industries; thus, climate risk to businesses is likely to manifest through global supply chains. This study supports findings in previous studies (Linnenluecke et al., 2015), showing that businesses mostly regard climate change as a strategic risk and not as an operational one. This literature provides important insights into how climate risk is perceived and qualitatively assessed.

Researchers have designed qualitative frameworks for assessing risk and understanding how climate risk propagates in supply chains. Groundstroem and Juhola (2018) developed a conceptual framework to identify potential cross-border impacts on energy systems in the Nordic countries. Their methodology involved comparing statistical data from all Nordic counties to conduct a comparative analysis to demonstrate the supply chain risks. A contribution of their assessment is that it was one of the earlier academic papers to explore the cross-border impacts of climate change, specifically on the energy sector across various regions. Jacxsens *et al.* (2010) also created a conceptual framework but assessed various risks

of fresh produce microbiological food safety. Hsieh (2014) developed a risk map based on a literature review and results from workshops and interviews with experts to assess where the risk arises in the port of Taipei.

Mixed methods. Mixed methods represented 35% of the studies reviewed (N = 8). The most used method was systems dynamic (SD) modelling (Er Kara et al., 2021; Ghadge et al., 2020; Tsalis and Nikolaou, 2017); a computer-based simulation approach representing how systems respond to external influences. SD modelling also demands a qualitative approach to developing the causal loop diagram. Er Kara et al. (2021) identified the linkages between climate-related natural weather events and supply chain performance. To overcome biases in constructing their causal diagram, they surveyed 62 supply chain managers before transforming it into a stock and flow diagram. Their SD model, supported by climate scenarios, demonstrates how supply chain performance decreases under worsening climate scenarios when evaluated through effectiveness and efficiency. Tsalis and Nikolaou (2017) used STELLA modelling software to create their SD model, called the climate change risk assessment (CCRA) model, to analyse the effects of regulatory risks on corporate performance. Their methods were divided into a qualitative component, the creation of the causal loop diagram, and a quantitative component, using STELLA modelling to reveal the supply chain climate risks on corporate performance. Ghadge et al. (2020) applied an SD approach to assessing the extent of potential disruptions arising from climate change. Their input data were based on various sources in the literature as well as expert consultation. Using eight scenarios, four for each crop (corn and switchgrass), they demonstrated the effects of the extreme RCP pathways on yield and non-yield periods. Their model showed that climate risk manifests through decreased yield, production and shortages for final consumers. The results indicated that bioethanol availability may decrease by one-fourth by 2060. The SD modelling studies conceptually present a holistic assessment of climate risk in supply chains. However, since the construction of the SD model is based on a causal loop diagram, which the authors of the paper usually do, there may be increased biases.

Four studies combined social research methods such as surveys and interviews into their methodologies. Ali and Ismail (2021) used qualitative interviews and quantitative questionnaires to determine whether social capital impacts climate risks between small and medium-sized enterprises (SMEs) in the Australian citrus industry and their "portfolio of inter-organizational relationships or associations" (Ali and Ismail, 2021, p. 5). Their independent variables are climate risk, consortia and social capital, with their dependent variable being performance. To test their hypothesis, they used regression analysis. Their results showed that SMEs associated with consortia and those nurturing social capital face reduced climate change risks. This finding suggests that cooperating on climate risks with similar SMEs can reduce climate risk and could be tested in the industry to demonstrate its success. Meinel and Abegg (2017) also used a combination of interviews and quantitative surveys to assess how manufacturing firms perceive climate risk. Their results are analysed based on a sectoral comparison, which they use to generate hypotheses on potential drivers of entrepreneurship. Yang et al. (2018) combined data from surveys from experts across China with a fuzzy Bayesian risk analysis to show how port adaptation measures influence their climate change risk. They also use their model to assess the cost-effectiveness of the adaptation measure. Schaefer et al. (2019) constructed a water risk index for firms by using Monte Carlo Analytic Hierarchy Process (MCAHP) to derive weights for each metric obtained from survey data.

Lim-Camacho *et al.* (2017) used a comparative analysis to examine how complex and simple supply chains react to climate-related risks. Complex supply chains are those with many interacting suppliers, and in contrast, simple supply chains may have few suppliers for any producer. They used a simulation approach adapted from Plaganyi *et al.* (2014) coupled with a qualitative literature review to map the supply chain nodes. Kim and Lee (2016)

JAL

developed a web-based application assessing climate risk based on the International Standard Organisation (ISO) 31000 approaches. The ISO 31000 is an internationally accepted risk management guideline that provides principles, frameworks, and processes for managing risk for organisations (ISO, 2021). It represents the only model, in this review, to look at direct climate risks to businesses while also touching on supply chain risks. The main limitation of the model is that it could not show how the climate risk propagates through supply chains beyond Korea.

The perspective

Food-related risk assessments were the most researched area (26%). This trend is consistent with developments in the supply chain literature focusing on food supply chains (Ghadge et al., 2020). Lin and Ma (2022) specifically examined the impact of EWE in France on 25 food supply chains during the 15 years from 2005 to 2019. Stokeld et al. (2020) also focused on food supply chains, but only the soy supply chain, Unlike Lin and Ma (2022) and Stokeld et al. (2020), Srinivasan et al. (2019) identified the interconnectedness of supply chains and the risks they are exposed to by evaluating food sourcing decisions for banana, coconut and barley. Ali and Ismail (2021) adopt a similar approach, examining how climate risks can be reduced by establishing consortia between the Australian citrus industry SMEs. Following the food sectors, energy or energy production was a common topic or sector assessed (Aviso et al., 2015; Groundstroem and Juhola, 2018). All other papers solely focused on climate risks from a sectoral or event perspective, and a few studies focus on various risk types at the firm-level. Tsalis and Nikolaou (2017) considered the impacts and risks caused by climate change between different and critical variables of a business's operation and climate change. They investigate this through an SD approach and use qualitative data from five Greek SMEs to confirm their causal loop diagram, Schaefer et al. (2019) developed their water risk index by applying it to a case study using available supplier data from Proctor and Gamble.

The concentration of case studies was in single countries (Figure 8) (Ali and Ismail, 2021; Bierkandt *et al.*, 2014; Ghadge *et al.*, 2020; Groundstroem and Juhola, 2018; Lin and Ma, 2022; Otto *et al.*, 2017; Simpson *et al.*, 2021; Tenggren *et al.*, 2020). Several studies incorporated the supply chain risks facing developing countries in their models (Nakano, 2017, 2021; Srinivasan *et al.*, 2019). Two studies focused solely on developing countries. Aviso *et al.* (2015) focused on the ripple economic effects of climate risk in the Philippines, while Stokeld *et al.* (2020) examined how trader risk exposure increases under climate scenarios across interconnected soy supply chains in Brazil. Zhao *et al.* (2019), Schaefer *et al.* (2019) and

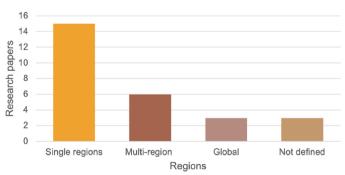


Figure 8.Concentration of regions represented in the literature review

Source(s): Figure by authors

Bonnafous and Lall (2021) are the only studies to assess climate risk across global supply chains, identifying which sectors are most impacted by virtual water scarcity and examining how global land area facing extreme precipitation or drought risk affects mining commodities, respectively. Limited research assessing cascading global climate risk may be due to complex supply chain interactions that are challenging to model using international databases and limited data. Additionally, conducting climate risk assessments may be challenging, given that definitions of climate risk vary. However, global assessments are crucial as businesses often operate globally.

Proxy for climate risk

Around 12 studies (44%) examined climate change through increased frequency of weather events and climate-related disasters. Lin and Ma (2022) used EWE, sourced from European Climate Assessment and Dataset, as a proxy for climate risk, while extreme precipitation indices were used by Bonnafous and Lall (2021). Wang et al. (2021) and Kim and Lee (2016). Nakano (2021) developed an index of disasters based on those exacerbated by climate change. In one study by Aviso et al. (2015), increased typhoon risk was represented as climate risk and selected as a risk to biofuel production based on other literature (Stromberg et al., 2011). Vinke et al. (2022) use flooding as a proxy for climate risk based on a rigorous literature review. Bierkandt et al. (2014) and Otto et al. (2017) simulated shocks to the Japanese manufacturing sector using various data from past climate-related EWE that resulted in a loss of production output. Four studies (15%) used temperature increase as a proxy to represent how climate change manifests as a risk (Ghadge et al., 2020; Simpson et al., 2021; Srinivasan et al., 2019; Stokeld et al., 2020). For example, Srinivasan et al. (2019) used GHG emissions and temperature increases inherent in RCP 6.0 developed by the IPCC to represent climate risk to examine crop suitability and risk calculation in food sourcing decisions. Ali and Ismail (2021) adopted a qualitative approach in defining their climate risk proxies. They reported that SMEs in the citrus industry found temperature increases, bushfires, droughts and flooding represent climate risks to their operations. Natural resource depletion and scarcity are also used as proxies. Zhao et al. (2019) presented the existing literature demonstrating how water scarcity arises from climate change. Schaefer et al. (2019) also assesses that water risk is an inherent climate-related risk, however, in reports from the CDP, only 28% see water as a risk to their business.

Instead of developing a proxy for climate risk, Er Kara et al. (2021) modelled two scenarios arising from climate change on logistics operation and raw material availability. Only Nakano (2017) cited the World Health Organisation, which developed quantitative risk assessments, factoring in how climate change increases dengue fever cases (WHO, 2014). This risk is modelled across the labour force across specific regions (Nakano, 2017). The use of disease as a proxy for climate change is highly relevant given the links between human health and climate change (Paz, 2021; Watts et al., 2018). Several studies examined the effects of climate risk on both sectors and businesses (Monasterolo et al., 2017; Tsalis and Nikolaou, 2017); however, climate risk was represented as a regulatory risk and not a physical one.

Limitations

Our search and exclusion criteria were deliberately designed to be specific, given our research interest in examining how climate risk is *assessed* in supply chains. For example, findings showing that extreme weather influenced by climate change are associated with lower and more volatile earnings and cash flows (Huang *et al.*, 2018) do not reveal how climate change risk is assessed. Furthermore, the design of our keywords may also have resulted in similar research being excluded. We attempted to overcome this by including several synonyms in our second search. More comprehensive systematic reviews apply fewer keywords per string

to ensure coverage of all literature. As we were interested in conducting a scoping review, this was irrelevant. Secondly, grey literature was excluded as the focus was on academic research presenting climate risk assessments. However, it has been observed that climate risk assessments may be more common in the grey literature (Ghadge *et al.*, 2020). To overcome this limitation, we consulted grey literature in our discussion.

Discussion and pathways forward

Through our systematic scoping review, we found that 27 papers or $\sim 20\%$ of the literature we screened for quantifying risk in supply chains (total papers = 119), presented a methodology to do so. Within the review of the 27 papers, several key trends emerge. Firstly, the literature on climate risk assessments and supply chain risk are extensive yet separate, and this observation corroborated the findings in Ghadge et al. (2020a, b). Within the business literature, according to Ghadge et al. (2020a, b), climate change has received the least attention in supply chain risk-management literature owing to the challenges of predicting climaterelated disruptions. However, there is continued interest in understanding supply chain risks and cascading impacts outside the business literature, demonstrating ongoing challenges in defining optimal approaches for quantifying physical climate risks. Secondly, as part of our review, we sought to understand how supply chain climate risks were assessed, which draws attention to the models used. As detailed in the methods section, many methods were employed across the literature (Table 3). While it is out of the scope of this review to assess the potential for all methods to assess physical climate risk to IBs, interested readers can explore other related literature reviews by (Ghadge et al., 2020). We present a critical assessment of the methods employed below.

Sustainability assessment methods were the most used in the studies reviewed (20%). This was expected, given that they are well-established models for tracing supply chain impacts (Dietzenbacher et al., 2020). The climate-related risks assessed included floods and other EWEs (Aviso et al., 2015; Nakano, 2021), disease (Nakano, 2017) and natural resource scarcity (Zhao et al., 2019). These studies represent how MRIO can be used across various types of climate risk to demonstrate how it impacts the economy through output and productivity loss. Interestingly, the physical climate risks facing businesses via their supply chains was only examined in four studies, through the lens of performance (Ali and Ismail, 2021; Er Kara et al., 2021) or transition risks (Monasterolo et al., 2017; Tsalis and Nikolaou, 2017). Each of these studies employed various methods, yet none employed sustainability assessment methods to assess risk for a specific business. In contrast, research that assessed risk to businesses, such as Katopodis et al. (2021), who used the Climate Risk Assessment Matrix (CRAM) to assess climate risk to facing a Greek oil refinery, does not include supply chain risks.

As observed in our review, besides literature adopting sustainability assessment methods to assess climate risk, quantitative and mixed-methods approaches (comprising systems dynamic modelling and qualitative techniques such as interviews and surveys to develop causal loop diagrams) offer alternative options for assessing climate risk. As mentioned, SD models were the next common quantitative method employed. The SD model employed by Ghadge *et al.* (2020) (based on the systems theory) uses simulation-based approaches to understand the behaviour between variables and their interaction over time. A benefit of their approach is that their proposed model is estimated using a commercial simulation software and can forecast results for 40 years (from 2020 to 2060). The ability to forecast results has important implications for businesses wanting to understand future risks. However, assumptions in terms of the boundaries of the model and included variables are inherent limitations of this approach (Er Kara *et al.*, 2021).

A benefit of qualitative approaches is that greater insight into the specifics of the business can be ascertained, especially through interviews and surveys (Bewley, 2002). For example, in Er Kara et al. (2021), 62 surveys with business representatives from various industries determined the most prominent risks based on the practitioner's point of view. However, sometimes biases are inherent in sampling processes; in the same study, the survey was shared with over 240 industry contacts (Er Kara et al., 2021). In their survey of 102 firms in the Austrian Alps of Tyrol, Meinel and Abegg (2017) discuss the limitations of such a specific case study focus. They highlight that due to limited replies from each sector, no statistical tests could verify the results from comparative analysis. Therefore, while greater specificity can be gained, qualitative approaches can introduce biases. Causal loop diagramming can reveal important patterns in the supply chain activities of businesses, yet rely on the interpretation of the activities based on interviews or other literature (Ghadge et al., 2020). This means that the final causal loop diagram can introduce additional biases. Also, where it is used to develop the SD model, causal loop diagramming does not consider the regional distribution of supply chains (Ghadge et al., 2020).

Sustainability assessment methods offer greater spatial resolution than these approaches, which is important for international businesses regarding borderless climate risks. These methods could address concerns raised in several studies regarding the difficulty in accessing data on the impact of climate change on SC operations (Er Kara et al., 2021), which could be achieved using sustainability assessment methods. Furthermore, it offers the ability to quantitatively identify sectoral risk hotspots. By identifying sectoral hotspots, businesses and policymakers can understand the vulnerabilities in existing supply chains. The identification of risk hotspots could spur greater research into this area and inspire greater industry collaboration regarding climate change adaptation in supply chains. However, there are some inherent challenges in adopting sustainability assessments at a business-level, the most notable being the need to collect disaggregated expense data from the business, which might be unavailable due to confidentiality issues and disaggregated damage data of climate-related hazards (see (Koks and Thissen, 2016) for detail on what data are needed to use sustainability assessment methods for disaster analysis).

These trends reveal the scope of academic literature developing and applying sustainability assessment methods in supply chain climate risk assessments, which was the first research question presented in this study. While an assessment of the strengths and weaknesses between sustainability assessment methods and other methodologies in this review is outside the scope of this paper, we can ascertain that sustainability assessment methods are well-suited to questions concerning physical climate risks. Our second research question sought to understand the role and potential of sustainability assessments informing assessment of business risks. As we found in this review, sustainability assessment methods have not been applied in the context of individual businesses. Rather, they are used to assess risks at a sectoral and regional-level. The reason for sectoral and regional resolutions is that MRIO analysis is based on national inputoutput tables, which collate data from statistical agencies on the monetary transactions between sectors and regions. Integrating business data into input-output tables would require a hybrid modelling approach, as in Malik et al. (2015). In their research, they coupled an Australian MRIO model with engineering process data on algal bio-crude production to undertake a hybrid lifecycle assessment for measuring the direct and indirect impacts of producing bio-crude. However, as demonstrated in their research, a notable challenge is obtaining disaggregated (detailed) expenditure data from companies.

Future research pathways

Addressing underestimations of risk. In disclosing climate risk, businesses routinely underestimate the magnitude of physical and supply chain risks (Goldstein et al., 2018;

Sakhel, 2017). Goldstein et al. (2018) analysed CDP climate disclosures of the top 500 companies by market capitalisation and found that the firms identify and disclose transition risk as material to their business at about twice the rate of physical risks. This is surprising given just in 2022, natural disasters resulted in direct economic losses estimated at US\$313 bn, out of which only US\$132 bn was insured (Aon, 2023), indicating the impact climate events can have on the economy and the underestimation of climate risk by firms. Yet, managing risk is a key objective of IBs (Miller, 1992). The ability of sustainability assessment methods to capture indirect risks is highly relevant for businesses interested in assessing total climate risk (Fiedler et al., 2021). Consider a business evaluating the likelihood of an immediate risk. such as a storm, impacting their business headquarters. The likelihood of a storm of a certain magnitude may be assessed as increasing from a once-a-vear event to a twice-a-vear event under future climate scenarios. However, this assessment ignores that the business may depend on inputs from another business that operates in a location, where the likelihood of another climate-related hazard significantly would impact their production capacity. Zscheischler et al. (2018) recommend accounting for regional risk differences to develop more robust climate risk assessments. While researchers such as Romilly (2007) present risk indices for locations in which businesses operate, their research does not consider in-time interactions across supply chains. Novel ways to apply MRIO analysis could overcome risk underestimation challenges by revealing how climate risk manifests in a business's supply chain, thus enabling businesses to work collaboratively with their suppliers on adaptation and mitigation strategies. In 2022, a report by the CDP stated that most of the supply chain disclosures did not include assessments on broader supplier impacts, such as Scope 3 emissions (CDP, 2022). Additionally, considering tipping points in a risk assessment would help businesses contextualize the ripple effects of the risk they may face under future climate change (Magnan et al., 2021; Simpson et al., 2021). Finally, future risk assessments should consider that climatic hazards can interact with non-climatic hazards simultaneously, exacerbating overall risk nonlinearly (Oppenheimer et al., 2014).

Integrating climate models and supply chain risk assessments for businesses. Climate models facilitate managerial understanding of future climate-related risks and opportunities under various scenarios (TCFD, 2017). Notably, some sustainability assessment methods, such as MRIO analysis and LCA, can be utilized with climate change scenarios relevant to businesses, such as those presented by the IPCC. Zhao et al. (2019) demonstrates this opportunity by incorporating the change in water scarcity risk under climate change scenarios. One challenge in conducting climate risk assessments that rely on climate model data is that communicating risk across time horizons may vary considerably from a business versus scientific perspective (Fiedler et al., 2021; Weber et al., 2018). The World Risk Report by the World Economic Forum surveyed experts and business leaders and indicated that risks in 0–2 years are short term, 2–5 years are medium term and 5–10 years are long term (WEF, 2022). In comparison, the scientific community and the IPCC have a broader time horizon for climate impacts defined in 20 year increments, where the short term is between 2021–2040, the midterm is between 2041–2060 and the long term is between 2081–2100 (IPCC, 2022). This disparity indicates that adopting sustainability assessment methods into climate risk assessments requires careful consideration of representing risk time horizons.

Developing open-source risk models for transparency. Climate risk assessments can promote societal and policy responses, and can promote public knowledge of climate risks, impacts and consequences (IPCC, 2022). However, risk assessment models, particularly those used by businesses and climate services, are not open source (Fiedler et al., 2021). For example, during the 2020 CDP reporting period, companies projected costs up to US\$120 bn across their supply chains arising from environmental and climate risks in the next five years (CDP, 2021). However, how businesses reporting to the CDP estimated their supply chain climate risks was not disclosed. A report by the United Nations Environment Programme

Finance Initiative presents an overview of commercially available methodologies or climate services that assess the physical risks of climate change. Unsurprisingly, only four companies of the 19 surveyed provide the methods for public use but do not provide the source code (UNEP Finance Initiative, 2021). Researchers have called for more transparent models and processes to overcome potential biases in a business's private climate assessment models or self-reporting (Walenta, 2020). Therefore, future research designing open-source climate risk assessment models for businesses (and businesses uptake of these models) is a valuable opportunity.

Conclusion

Given the genuine and legitimate pressures on firms to manage and report climate risk to external stakeholders, more work is required at the individual business level. Research shows that the more complex the supply network, the greater the risk (Harland et al., 2003). Businesses must understand more comprehensively how climate risk cascades through their increasingly complex and dispersed supply chain networks to develop effective resilience and mitigation strategies (Er Kara et al., 2021; Ivanov and Dolgui, 2019). Beyond the direct risks of climate change, businesses also face ongoing regulatory risks propagating through supply chains as large economies move to net zero. Interconnected supply chains have offered companies worldwide opportunities to expand operations into geographically distant regions and lower production costs; however, this expansion comes with considerable risk as climate impacts in one region could cause severe disruptions to global supply chains, and regulatory changes can ripple through the system. This review indicates a gap in the literature for using sustainability assessment methods, such as MRIO analysis, LCA, and hybrid MRIO-LCA methods to assess physical climate risk across a businesses supply chains. The results presented and the opportunities identified come at an opportune time. given the findings underpinning the IPCC Working Group II Report (AR6) (IPCC, 2022).

References

- Adams, R., Jeanrenaud, S., Bessant, J., Denyer, D. and Overy, P. (2016), "Sustainability-oriented innovation: a systematic review", *International Journal of Management Reviews : IJMR*, Vol. 18 No. 2, pp. 180-205, doi: 10.1111/ijmr.12068.
- Ali, I. and Ismail, G. (2021), "Managing climate risks through social capital in agrifood supply chains", Supply Chain Management, Vol. 26 No. 1, pp. 1-16, doi: 10.1108/SCM-03-2020-0124.
- Aon (2023), "2023 weather, climate and catastrophe insight", available at: https://www.aon.com/weather-climate-catastrophe/index.aspx
- Arksey, H. and O'Malley, L. (2005), "Scoping studies: towards a methodological framework", International Journal of Social Research Methodology, Vol. 8 No. 1, pp. 19-32, doi: 10.1080/ 1364557032000119616.
- Arnell, N. (2016), A Short Guide to Climate Change Risk, Routledge, London.
- Aviso, K.B., Amalin, D., Promentilla, M.A.B., Santos, J.R., Yu, K.D.S. and Tan, R.R. (2015), "Risk assessment of the economic impacts of climate change on the implementation of mandatory biodiesel blending programs: a fuzzy inoperability input-output modeling (IIM) approach", Biomass and Bioenergy, Vol. 83, pp. 436-447, doi: 10.1016/j.biombioe.2015.10.011.
- Bauer, T., Kourouxous, T. and Krenn, P. (2018), "Taxation and agency conflicts between firm owners and managers: a review", *Business Research*, Vol. 11 No. 1, pp. 33-76, doi: 10.1007/s40685-017-0054-y.
- Benzie, M. and Persson, Å. (2019), "Governing borderless climate risks: moving beyond the territorial framing of adaptation", *International Environmental Agreements: Politics, Law and Economics*, Vol. 19 Nos 4-5, pp. 369-393, doi: 10.1007/s10784-019-09441-v.

- Besser, L. (2021), "Australian exporters could face millions of dollars in European tariffs as EU seeks to punish polluters", available at: https://www.abc.net.au/news/2021-03-11/australia-to-face-huge-tariffs-in-europe-over-climate-emissions/13233360 (accessed 11 March 2021).
- Bewley, T. (2002), "Interviews as a valid empirical tool in economics", The Journal of Socio-Economics, Vol. 31 No. 4, pp. 343-353, doi: 10.1016/S1053-5357(02)00176-2.
- Bierkandt, R., Wenz, L., Willner, S.N. and Levermann, A. (2014), "Acclimate—a model for economic damage propagation. Part 1: basic formulation of damage transfer within a global supply network and damage conserving dynamics", *Environment Systems and Decisions*, Vol. 34 No. 4, pp. 507-524, doi: 10.1007/s10669-014-9523-4.
- Bonnafous, L. and Lall, U. (2021), "Space-time clustering of climate extremes amplify global climate impacts, leading to fat-tailed risk", *Natural Hazards and Earth System Sciences*, Vol. 21 No. 8, pp. 2277-2284, doi: 10.5194/nhess-21-2277-2021.
- Brundtland, G.H. (1987), Report of the World Commission on Environment and Development: Our Common Future, United Nations General Assembly document A/42/427.
- Caprar, D.V., Kim, S., Walker, B.W. and Caligiuri, P. (2022), "Beyond "Doing as the Romans Do": a review of research on countercultural business practices", *Journal of International Business Studies*, Vol. 53 No. 7, pp. 1449-1483, doi: 10.1057/s41267-021-00479-2.
- Caputo, A. and Kargina, M. (2021), "A user-friendly method to merge Scopus and Web of Science data during bibliometric analysis", *Journal of Marketing Analytics*, Vol. 10 No. 1, pp. 82-88, doi: 10. 1057/s41270-021-00142-7.
- CDP (2021), Global Supply Chain Report 2020, The Carbon Disclosure Project, England [Report].
- CDP (2022), Engaging The Supply Chain: Driving Speed And Scale, [Report](CDP Global Supply Chain Report 2021, The Carbon Dislcosure Project, England, Issue.
- Challinor, A.J., Adger, N.W. and Benton, T.G. (2017), "Climate risks across borders and scales", Nature Climate Change, Vol. 7 No. 9, pp. 621-623, doi: 10.1038/nclimate3380.
- Challinor, A.J., Adger, W.N., Benton, T.G., Conway, D., Joshi, M. and Frame, D. (2018), "Transmission of climate risks across sectors and borders", *Philosophical Transactions of the Royal Society of London. Series A: Mathematical, Physical, and Engineering Sciences*, Vol. 376 No. 2121, p. 20170301, doi: 10.1098/rsta.2017.0301.
- Chen, L.-M., Liu, Y.E. and Yang, S.-J.S. (2015), "Robust supply chain strategies for recovering from unanticipated disasters", Transportation Research Part E: Logistics and Transportation Review, Vol. 77, pp. 198-214, doi: 10.1016/j.tre.2015.02.015.
- Clapp, C. and Sillmann, J. (2019), "Facilitating climate-smart investments", One Earth, Vol. 1 No. 1, pp. 57-61, doi: 10.1016/j.oneear.2019.08.009.
- Davidson, B. and Schuwerk, R. (2021), *Flying Blind: the Glaring Absence of Climate Risks in Financial Reporting, Carbon Tracker*, London, available at: https://carbontracker.org/reports/flying-blind-the-glaring-absence-of-climate-risks-in-financial-reporting/ (accessed 6 June).
- Davidson, B. and Schuwerk, R. (2022), *Still Flying Blind: the Absence of Climate Risks in Financial Reporting*, Carbon Tracker, London, [Report], available at: https://carbontracker.org/reports/flying-blind-the-glaring-absence-of-climate-risks-in-financial-reporting/
- Deloitte Insights (2020), The Fourth Industrial Revolution: at the Intersection of Readiness and Responsibility, Deloitte Insights, Global, available at: https://www2.deloitte.com/content/dam/insights/us/articles/us32959-industry-4-0/DI_Industry-4.0.pdf
- Demeter, C., Lin, P.-C., Sun, Y.-Y. and Dolnicar, S. (2022), "Assessing the carbon footprint of tourism businesses using environmentally extended input-output analysis", *Journal of Sustainable Tourism*, Vol. 30 No. 1, pp. 128-144, doi: 10.1080/09669582.2021.1924181.
- Dietzenbacher, E., Lahr, M.L. and Lenzen, M. (2020), Recent Developments in Input-Output Analysis, Edward Elgar Publishing.

- Doubleday, Z.A., Clarke, S.M., Li, X., Pecl, G.T., Ward, T.M., Battaglene, S., Frusher, S., Gibbs, P.J., Hobday, A.J., Hutchinson, N., Jennings, S.M. and Stoklosa, R. (2013), "Assessing the risk of climate change to aquaculture: a case study from south-east Australia", Aquaculture Environment Interactions, Vol. 3 No. 2, pp. 163-175, doi: 10.3354/aei00058.
- Druckman, A. and Jackson, T. (2009), "The carbon footprint of UK households 1990-2004: a socio-economically disaggregated, quasi-multi-regional input-output model", *Ecological Economics*, Vol. 68 No. 7, pp. 2066-2077, (Ecological Economics), doi: 10.1016/j.ecolecon.2009.01.013.
- Duchin, F. and Levine, S.H. (2014), "Industrial ecology", in Fath, B. (Ed.), *Encyclopedia of Ecology*, 2nd ed., Elsevier, pp. 352-358, doi: 10.1016/B978-0-12-409548-9.09407-0.
- Eckstein, D., Künzel, V. and Schäfer, L. (2021), Global Climate Risk Index 2021. Who Suffers Most from Extreme Weather Events? Weather-Related Loss Events in 2019 and 2000-2019, Germanwatch e.V., Berlin, Germany.
- Er Kara, M., Abhijeet, G. and Bititci, U.S. (2021), "Modelling the impact of climate change risk on supply chain performance", *International Journal of Production Research*, Vol. 59 No. 24, pp. 7317-7335, doi: 10.1080/00207543.2020.1849844.
- Fan, Y. and Stevenson, M. (2018), "A review of supply chain risk management: definition, theory, and research agenda [Review of SCRM]", *International Journal of Physical Distribution & Logistics Management*, Vol. 48 No. 3, pp. 205-230, doi: 10.1108/IJPDLM-01-2017-0043.
- Fiedler, T., Pitman, A.J., Mackenzie, K., Wood, N., Jakob, C. and Perkins-Kirkpatrick, S.E. (2021), "Business risk and the emergence of climate analytics", *Nature Climate Change*, Vol. 11 No. 2, pp. 87-94, doi: 10.1038/s41558-020-00984-6.
- Financial Reporting Council (FRC) (2021), Taskforce on Climate-Related Financial Disclosures (TCFD):

 Ahead of Mandatory Reporting, Financial Reporting Lab, London, available at: https://www.frc.org.uk/getattachment/09b5627b-864b-48cb-ab53-8928b9dc72b7/FRCLab-TCFD-Report_October_2021.pdf
- Flammer, C., Toffel, M.W. and Viswanathan, K. (2021), "Shareholder activism and firms' voluntary disclosure of climate change risks", Strategic Management Journal, Vol. 42 No. 10, pp. 1850-1879, doi: 10.1002/smj.3313.
- Garvey, M.D., Carnovale, S. and Yeniyurt, S. (2015), "An analytical framework for supply network risk propagation: a Bayesian network approach", European Journal of Operational Research, Vol. 243 No. 2, pp. 618-627, doi: 10.1016/j.ejor.2014.10.034.
- Ghadge, A., Dani, S. and Kalawsky, R. (2012), "Supply chain risk management: present and future scope", *International Journal of Logistics Management*, Vol. 23 No. 3, pp. 313-339, doi: 10.1108/ 09574091211289200.
- Ghadge, A., van der Werf, S., Er Kara, M., Goswami, M., Kumar, P. and Bourlakis, M. (2020a), "Modelling the impact of climate change risk on bioethanol supply chains", *Technological Forecasting and Social Change*, Vol. 160, 120227, doi: 10.1016/j.techfore.2020.120227.
- Ghadge, A., Wurtmann, H. and Seuring, S. (2020b), "Managing climate change risks in global supply chains: a review and research agenda", *International Journal of Production Research*, Vol. 58 No. 1, pp. 44-64, doi: 10.1080/00207543.2019.1629670.
- Goldstein, A., Turner, W.R., Gladstone, J. and Hole, D.G. (2018), "The private sector's climate change risk and adaptation blind spots", *Nature Climate Change*, Vol. 9 No. 1, pp. 18-25, doi: 10.1038/ s41558-018-0340-5.
- Groundstroem, F. and Juhola, S. (2018), "A framework for identifying cross-border impacts of climate change on the energy sector", *Environment Systems & Decisions*, Vol. 39 No. 1, pp. 3-15, doi: 10. 1007/s10669-018-9697-2.
- Guo, H., Wang, R., Garfin, G.M., Zhang, A., Lin, D., Liang, Q.o. and Wang, J.a. (2021), "Rice drought risk assessment under climate change: based on physical vulnerability a quantitative assessment method", Science of the Total Environment, Vol. 751, 141481, doi: 10.1016/j. scitotenv.2020.141481.

- Harland, C., Brenchley, R. and Walker, H. (2003), "Risk in supply networks", Journal of Purchasing and Supply Management, Vol. 9 No. 2, pp. 51-62, doi: 10.1016/S1478-4092(03)00004-9.
- Heihsel, M., Lenzen, M., Malik, A. and Geschke, A. (2019), "The carbon footprint of desalination: an input-output analysis of seawater reverse osmosis desalination in Australia for 2005-2015", *Desalination*, Vol. 454, pp. 71-81, doi: 10.1016/j.desal.2018.12.008.
- Hertwich, E.G. and Peters, G.P. (2009), "Carbon footprint of Nations: a global, trade-linked analysis", Environmental Science & Technology, Vol. 43 No. 16, pp. 6414-6420, doi: 10.1021/es803496a.
- Horner, W. (2021), "Companies grapple with disclosing climate-change risks", Wall Street Journal, available at: https://www.wsj.com/articles/companies-grapple-with-disclosing-climate-change-risks-11635080400 (accessed 6 June 2023)
- Hsieh, C.-H. (2014), "Disaster risk assessment of ports based on the perspective of vulnerability", Natural Hazards, Vol. 74 No. 2, pp. 851-864, doi: 10.1007/s11069-014-1214-4.
- Huang, H.H., Kerstein, J. and Wang, C. (2018), "The impact of climate risk on firm performance and financing choices: an international comparison", *Journal of International Business Studies*, Vol. 49 No. 5, pp. 633-656, doi: 10.1057/s41267-017-0125-5.
- Huang, R., Malik, A., Lenzen, M., Jin, Y., Wang, Y., Faturay, F. and Zhu, Z. (2021), "Supply-chain impacts of Sichuan earthquake: a case study using disaster input-output analysis", *Natural Hazards (Dordrecht)*, Vol. 110 No. 3, pp. 2227-2248, doi: 10.1007/s11069-021-05034-8.
- In, S.Y., Weyant, J.P. and Manav, B. (2022), "Pricing climate-related risks of energy investments", Renewable & Sustainable Energy Reviews, Vol. 154, 111881, doi: 10.1016/j.rser.2021.111881.
- International Sustainability Standards Board (ISSB) (2022), [Draft] IFRS S2 Climate-Related Disclosures, International Sustainability Standards Board, London, available at: https://www.ifrs.org/content/dam/ifrs/project/climate-related-disclosures/issb-exposure-draft-2022-2-climate-related-disclosures.pdf
- IPCC (2022), Summary For Policymakers (Climate change 2022: impacts, adaptation, and vulnerability. Contribution of working group II to the sixth assessment report of the intergovernmental panel on climate change, issue. Cambridge University Press, Cambridge and New York.
- ISO (2021), ISO 31000:2018 Risk Management A Practical Guide, International Organization for Standardization, Geneva, Switzerland, available at: https://www.iso.org/news/ref2773.html
- Ivanov, D. and Dolgui, A. (2019), "New disruption risk management perspectives in supply chains: digital twins, the ripple effect, and resileanness", IFAC-PapersOnLine, Vol. 52 No. 13, pp. 337-342,doi: 10.1016/j.ifacol.2019.11.138.
- Jacxsens, L., Luning, P.A., van der Vorst, J.G.A.J., Devlieghere, F., Leemans, R. and Uyttendaele, M. (2010), "Simulation modelling and risk assessment as tools to identify the impact of climate change on microbiological food safety the case study of fresh produce supply chain", Food Research International, Vol. 43 No. 7, pp. 1925-1935, doi: 10.1016/j.foodres.2009.07.009.
- Jin, M., Granda-Marulanda, N.A. and Down, I. (2014), "The impact of carbon policies on supply chain design and logistics of a major retailer", *Journal of Cleaner Production*, Vol. 85, pp. 453-461, doi: 10.1016/j.jclepro.2013.08.042.
- Kano, L., Tsang, E.W.K. and Yeung, H. W.-c. (2020), "Global value chains: a review of the multi-disciplinary literature", *Journal of International Business Studies*, Vol. 51 No. 4, pp. 577-622, doi: 10.1057/s41267-020-00304-2.
- Katopodis, T., Adamides, E.D., Sfetsos, A. and Mountouris, A. (2021), "Incorporating future climate scenarios in oil industry's risk assessment: a Greek refinery case study", Sustainability (Basel, Switzerland), Vol. 13 No. 22, 12825, doi: 10.3390/su132212825.
- Kiernan, P. (2022), "SEC floats mandatory disclosure of climate-change risks, emissions", Wall Street Journal, available at: https://www.wsj.com/articles/sec-to-float-mandatory-disclosure-of-climate-change-risks-emissions-11647874814 (accessed 6 June 2023)
- Kim, D. and Lee, J. (2016), "Development of a web-based tool for climate change risk assessment in the business sector", Sustainability, Vol. 8 No. 10, p. 1013, doi: 10.3390/su8101013.

- King, D., Schrag, D., Dadi, Z., Yi, Q. and Ghosh, A. (2015), Climate Change: A Risk Assessment.
- Koks, E.E. and Thissen, M. (2016), "A multiregional impact assessment model for disaster analysis", Economic Systems Research, Vol. 28 No. 4, pp. 429-449, doi: 10.1080/09535314.2016.1232701.
- Koks, E., Pant, R., Husby, T., Többen, J. and Oosterhaven, J. (2019), "Multiregional disaster impact models: recent advances and comparison of outcomes", in *Advances in Spatial and Economic Modeling of Disaster Impacts*, pp. 191-218, doi: 10.1007/978-3-030-16237-5_8.
- Krueger, P., Sautner, Z. and Starks, L.T. (2020), "The importance of climate risks for institutional investors", The Review of Financial Studies, Vol. 33 No. 3, pp. 1067-1111, doi: 10.1093/rfs/hhz137.
- Kunz, J., May, S. and Schmidt, H.J. (2020), "Sustainable luxury: current status and perspectives for future research", Business Research, Vol. 13 No. 2, pp. 541-601, doi: 10.1007/s40685-020-00111-3.
- Lenzen, M., Malik, A., Kenway, S., Daniels, P., Lam, K.L. and Geschke, A. (2019), "Economic damage and spillovers from a tropical cyclone", *Natural Hazards and Earth System Sciences*, Vol. 19 No. 1, pp. 137-151, doi: 10.5194/nhess-19-137-2019.
- Leontief, W.W. (1936), "Quantitative input and output relations in the economic systems of the United States", The Review of Economics and Statistics, Vol. 18 No. 3, pp. 105-125, doi: 10.2307/1927837.
- Lim-Camacho, L., Plagányi, É.E., Crimp, S., Hodgkinson, J.H., Hobday, A.J., Howden, S.M. and Loechel, B. (2017), "Complex resource supply chains display higher resilience to simulated climate shocks", Global Environmental Change, Vol. 46, pp. 126-138, doi: 10.1016/j.gloenvcha.2017. 08.011.
- Lin, R.-A. and Ma, H.-W. (2022), "Detecting spikes and change points in climate-food system: a case study in France", Environmental Science & Policy, Vol. 127, pp. 146-160, doi: 10.1016/j.envsci. 2021.10.018.
- Linnenluecke, M.K., Birt, J. and Griffiths, A. (2015), "The role of accounting in supporting adaptation to climate change", Accounting and Finance, Vol. 55 No. 3, pp. 607-625, doi: 10.1111/acfi.12120, available at: https://core.ac.uk/download/pdf/43363019.pdf
- Linnenluecke, M.K., Marrone, M. and Singh, A.K. (2019), "Conducting systematic literature reviews and bibliometric analyses", *Australian Journal of Management*, Vol. 45 No. 2, pp. 175-194, doi: 10.1177/0312896219877678.
- Magnan, A.K., Pörtner, H.-O., Duvat, V.K.E., Garschagen, M., Guinder, V.A., Zommers, Z., Hoegh-Guldberg, O. and Gattuso, J.-P. (2021), "Estimating the global risk of anthropogenic climate change", Nature Climate Change, Vol. 11 No. 10, pp. 879-885, doi: 10.1038/s41558-021-01156-w.
- Malik, A., Lenzen, M., Ralph, P.J. and Tamburic, B. (2015), "Hybrid life-cycle assessment of algal biofuel production", Bioresour Technol, Vol. 184, pp. 436-443, doi: 10.1016/j.biortech.2014.10.132.
- Malik, A., Lenzen, M., McAlister, S. and McGain, F. (2018), "The carbon footprint of Australian health care", The Lancet Planetary Health, Vol. 2 No. 1, pp. e27-e35, doi: 10.1016/S2542-5196(17)30180-8.
- Meinel, U. and Abegg, B. (2017), "A multi-level perspective on climate risks and drivers of entrepreneurial robustness – findings from sectoral comparison in alpine Austria", Global Environmental Change, Vol. 44, pp. 68-82, doi: 10.1016/j.gloenvcha.2017.03.006.
- Meixell, M.J. and Gargeya, V.B. (2005), "Global supply chain design: a literature review and critique", Transportation Research Part E: Logistics and Transportation Review, Vol. 41 No. 6, pp. 531-550, doi: 10.1016/j.tre.2005.06.003.
- Miller, K.D. (1992), "A framework for integrated risk management in international business", Journal of International Business Studies, Vol. 23 No. 2, pp. 311-331, doi: 10.1057/palgrave.jibs.8490270.
- Monasterolo, I., Battiston, S., Janetos, A.C. and Zheng, Z. (2017), "Vulnerable yet relevant: the two dimensions of climate-related financial disclosure", *Climatic Change*, Vol. 145 Nos 3-4, pp. 495-507, doi: 10.1007/s10584-017-2095-9.
- Munn, Z., Peters, M.D.J., Stern, C., Tufanaru, C., McArthur, A. and Aromataris, E. (2018), "Systematic review or scoping review? Guidance for authors when choosing between a systematic or

- scoping review approach", BMC Medical Research Methodology, Vol. 18 No. 1, p. 143, doi: 10. 1186/s12874-018-0611-x.
- Nakano, K. (2017), "Future risk of dengue fever to workforce and industry through global supply chain", Mitigation and Adaptation Strategies for Global Change, Vol. 23 No. 3, pp. 433-449, doi: 10.1007/s11027-017-9741-4.
- Nakano, K. (2021), "Risk assessment for adaptation to climate change in the international supply chain", Journal of Cleaner Production, Vol. 319, 128785, doi: 10.1016/j.jclepro.2021.128785.
- Ness, B., Urbel-Piirsalu, E., Anderberg, S. and Olsson, L. (2007), "Categorising tools for sustainability assessment", Ecological Economics, Vol. 60 No. 3, pp. 498-508, doi: 10.1016/j.ecolecon.2006.07.023.
- Odeh, N.A. and Cockerill, T.T. (2008), "Life cycle analysis of UK coal fired power plants", *Energy Conversion and Management*, Vol. 49 No. 2, pp. 212-220, doi 10.1016/j.enconman.2007.06.014.
- Oh, C.H. and Oetzel, J. (2022), "Multinational enterprises and natural disasters: challenges and opportunities for IB research", *Journal of International Business Studies*, Vol. 53 No. 2, pp. 231-254, doi: 10.1057/s41267-021-00483-6.
- Oppenheimer, M., Campos, M., Warren, R., Birkmann, J., Luber, B., O'Neill, B. and Takahashi, K. (2014), Emergent Risks and Key Vulnerabilities (Part A: Global and sectoral aspects. Contribution of working group II to the fifth assessment report of the intergovernmental panel on climate change, issue, C. U. Press, New York, available at: https://www.ipcc.ch/report/ar5/wg2/
- Otto, C., Willner, S.N., Wenz, L., Frieler, K. and Levermann, A. (2017), "Modeling loss-propagation in the global supply network: the dynamic agent-based model acclimate", *Journal of Economic Dynamics and Control*, Vol. 83, pp. 232-269, doi: 10.1016/j.jedc.2017.08.001.
- Palea, V. and Santhià, C. (2022), "The financial impact of carbon risk and mitigation strategies: insights from the automotive industry", *Journal of Cleaner Production*, Vol. 344, 131001, doi: 10. 1016/j.jclepro.2022.131001.
- Pankratz, N.M.C. and Schiller, C. (2019), "Climate change and adaptation in global supply-chain networks", Proceedings of Paris December 2019 Finance Meeting EUROFIDAI - ESSEC, European Corporate Governance Institute, Finance Working Paper No. 775/2021, doi: 10.2139/ ssrn.3475416.
- Papanastassiou, M., Pearce, R. and Zanfei, A. (2020), "Changing perspectives on the internationalization of R&D and innovation by multinational enterprises: a review of the literature", *Journal of International Business Studies*, Vol. 51 No. 4, pp. 623-664, doi: 10.1057/ s41267-019-00258-0.
- Pattberg, P. (2012), "How climate change became a business risk: analyzing nonstate agency in global climate politics", Environment and Planning. C, Government & Policy, Vol. 30 No. 4, pp. 613-626, doi: 10.1068/c1179.
- Paz, S. (2021), "Climate change impacts on vector-borne diseases in Europe: risks, predictions and actions", The Lancet Regional Health - Europe, Vol. 1, 100017, doi: 10.1016/j.lanepe.2020.100017.
- Plaganyi, E.E., van Putten, I., Thebaud, O., Hobday, A.J., Innes, J., Lim-Camacho, L., Norman-Lopez, A., Bustamante, R.H., Farmery, A., Fleming, A., Frusher, S., Green, B., Hoshino, E., Jennings, S., Pecl, G., Pascoe, S., Schrobback, P. and Thomas, L. (2014), "A quantitative metric to identify critical elements within seafood supply networks", *PLoS One*, Vol. 9 No. 3, e91833, doi: 10.1371/ journal.pone.0091833.
- Rao, S. and Goldsby, T.J. (2009), "Supply chain risks: a review and typology", The International Journal of Logistics Management, Vol. 20 No. 1, pp. 97-123, doi: 10.1108/09574090910954864.
- Reeb, D.M., Kwok, C.C.Y. and Baek, H.Y. (1998), "Systematic risk of the multinational corporation", *Journal of International Business Studies*, Vol. 29 No. 2, pp. 263-279, doi: 10.1057/palgrave.jibs.8490036.
- Reisinger, A., Howden, M., Vera, C., Garschagen, M., Hurlbert, M., Kreibiehl, S., Mach, K.J., Mintenbeck, K., O'Neill, B., Pathak, M., Pedace, P., Pörtner, H.-O., Poloczanska, E., Corradi, M.R., Sillmann, J., van Aalst, M., Viner, D., Jones, R., Ruane, A.C. and Ranasinghe, R. (2020), The Concept of Risk in the IPCC Sixth Assessment Report: A Summary of Cross-Working Group

- Discussions, [Report]. I. P. o. C. Change, available at: https://www.ipcc.ch/site/assets/uploads/2021/02/Risk-guidance-FINAL_15Feb2021.pdf
- Romilly, P. (2007), "Business and climate change risk: a regional time series analysis", *Journal of International Business Studies*, Vol. 38 No. 3, pp. 474-480, doi: 10.1057/palgrave.jibs. 8400266.
- Sakhel, A. (2017), "Corporate climate risk management: are European companies prepared?", *Journal of Cleaner Production*, Vol. 165, pp. 103-118, doi: 10.1016/j.jclepro.2017.07.056.
- Sala, S., Ciuffo, B. and Nijkamp, P. (2015), "A systemic framework for sustainability assessment", Ecological Economics, Vol. 119, pp. 314-325, doi: 10.1016/j.ecolecon.2015.09.015.
- Schaefer, T., Udenio, M., Quinn, S. and Fransoo, J.C. (2019), "Water risk assessment in supply chains", Journal of Cleaner Production, Vol. 208, pp. 636-648, doi: 10.1016/j.jclepro.2018.09.262.
- Schulte in den Bäumen, H., Többen, J. and Lenzen, M. (2015), "Labour forced impacts and production losses due to the 2013 flood in Germany", *Journal of Hydrology (Amsterdam)*, Vol. 527, pp. 142-150, doi: 10.1016/j.jhydrol.2015.04.030.
- Sharma, P., Leung, T.Y., Kingshott, R.P.J., Davcik, N.S. and Cardinali, S. (2020), "Managing uncertainty during a global pandemic: an international business perspective", *Journal of Business Research*, Vol. 116, pp. 188-192, doi: 10.1016/j.jbusres.2020.05.026.
- Simpson, N.P., Mach, K.J., Constable, A., Hess, J., Hogarth, R., Howden, M., Lawrence, J., Lempert, R.J., Muccione, V., Mackey, B., New, M.G., O'Neill, B., Otto, F., Pörtner, H.-O., Reisinger, A., Roberts, D., Schmidt, D.N., Seneviratne, S., Strongin, S., van Aalst, M., Totin, E. and Trisos, C.H. (2021), "A framework for complex climate change risk assessment", One Earth, Vol. 4 No. 4, pp. 489-501, doi: 10.1016/j.oneear.2021.03.005.
- Srinivasan, R., Giannikas, V., Kumar, M., Guyot, R. and McFarlane, D. (2019), "Modelling food sourcing decisions under climate change: a data-driven approach", Computers & Industrial Engineering, Vol. 128, pp. 911-919, doi: 10.1016/j.cie.2018.10.048.
- Stokeld, E., Croft, S.A., Green, J.M.H. and West, C.D. (2020), "Climate change, crops and commodity traders: subnational trade analysis highlights differentiated risk exposure", Climatic Change, Vol. 162 No. 2, pp. 175-192, doi: 10.1007/s10584-020-02857-5.
- Stromberg, P.M., Esteban, M. and Gasparatos, A. (2011), "Climate change effects on mitigation measures: the case of extreme wind events and Philippines' biofuel plan", *Environmental Science & Policy*, Vol. 14 No. 8, pp. 1079-1090, doi: 10.1016/j.envsci.2011.06.004.
- Surminski, S., Di Mauro, M., Baglee, J.A.R., Connell, R.K., Hankinson, J., Haworth, A.R., Ingirige, B. and Proverbs, D. (2018), "Assessing climate risks across different business sectors and industries: an investigation of methodological challenges at national scale for the UK", *Philosophical Transactions of the Royal Society of London. Series A: Mathematical, Physical, and Engineering Sciences*, Vol. 376 No. 2121, p. 20170307, doi: 10.1098/rsta.2017.0307.
- TCFD (2017), Recommendations of the Task Force on Climate-Related Financial Disclosures, Taskforce on Climate Related Financial Disclosures, Switzerland, [Report], available at: https://assets. bbhub.io/company/sites/60/2020/10/FINAL-2017-TCFD-Report-11052018.pdf
- Tenggren, S., Olsson, O., Vulturius, G., Carlsen, H. and Benzie, M. (2020), "Climate risk in a globalized world: empirical findings from supply chains in the Swedish manufacturing sector", *Journal of Environmental Planning and Management*, Vol. 63 No. 7, pp. 1266-1282, doi: 10.1080/09640568. 2019.1660626.
- Thompson, J. (2018), "Shell pension fund challenged to disclose response to climate risk", *Financial Times*, Vol. 7 October, available at: https://www.ft.com/content/f4a43daa-511e-384e-b297-9193f90233a7 (accessed 6 June).
- Tricco, A.C., Lillie, E., Zarin, W., O'Brien, K.K., Colquhoun, H., Levac, D., Moher, D., Peters, M.D.J., Horsley, T., Weeks, L., Hempel, S., Akl, E.A., Chang, C., McGowan, J., Stewart, L., Hartling, L., Aldcroft, A., Wilson, M.G., Garritty, C., Lewin, S., Godfrey, C.M., Macdonald, M.T., Langlois, E.V., Soares-Weiser, K., Moriarty, J., Clifford, T., Tunçalp, O. and Straus, S.E. (2018), "PRISMA

- extension for scoping reviews (PRISMA-ScR): checklist and explanation", *Annals of Internal Medicine*, Vol. 169 No. 7, pp. 467-473, doi: 10.7326/M18-0850.
- Tsalis, T.A. and Nikolaou, I.E. (2017), "Assessing the effects of climate change regulations on the business community: a system dynamic approach", Business Strategy and the Environment, Vol. 26 No. 6, pp. 826-843, doi: 10.1002/bse.1953.
- UNEP Finance Initiative (2021), The Climate Risk Landscape: Mapping Climate-Related Financial Risk Assessment Methodologies, available at: https://www.unepfi.org/publications/banking-publications/the-climate-risk-landscape/
- UNFCCC (2019), Major Companies Face USD 1 Trillion in Climate Risks, United Nations Climate Change, Gloabl, available at: https://unfccc.int/news/major-companies-face-usd-1-trillion-inclimate-risks (accessed 4 June 2019).
- van der Velden, N.M., Kuusk, K. and Köhler, A.R. (2015), "Life cycle assessment and eco-design of smart textiles: the importance of material selection demonstrated through e-textile product redesign," *Materials & Design*, Vol. 84, pp. 313-324, doi: 10.1016/j.matdes.2015.06.129.
- Vanderford, R. (2022), "Big banks band together to measure and manage climate risk", Wall Street Journal, available at: https://www.wsj.com/articles/big-banks-band-together-to-measure-and-manage-climate-risk-11641985202 (accessed 6 June 2023)
- Vincent, M. (2020), "UK companies face closer scrutiny on disclosing climate change risks", Financial Times, available at: https://www.ft.com/content/58322f34-53d2-11ea-8841-482eed0038b1 (accessed 6 June 2023)
- Vinke, F., van Koningsveld, M., van Dorsser, C., Baart, F., van Gelder, P. and Vellinga, T. (2022), "Cascading effects of sustained low water on inland shipping", Climate Risk Management, Vol. 35, 100400, doi: 10.1016/j.crm.2022.100400.
- Walenta, J. (2020), "Climate risk assessments and science-based targets: a review of emerging private sector climate action tools", Wiley Interdisciplinary Reviews. Climate Change, Vol. 11 No. 2, n/a, doi: 10.1002/wcc.628.
- Wang, S., Zhao, Y. and Wiedmann, T. (2019), "Carbon emissions embodied in China–Australia trade: a scenario analysis based on input–output analysis and panel regression models", *Journal of Cleaner Production*, Vol. 220, pp. 721-731, doi: 10.1016/j.jclepro.2019.02.071.
- Wang, Y., Zhao, Y., Wang, Y., Ma, X., Bo, H. and Luo, J. (2021), "Supply-demand risk assessment and multi-scenario simulation of regional water-energy-food nexus: a case study of the Beijing-Tianjin-Hebei region", Resources, Conservation and Recycling, Vol. 174, 105799, doi: 10.1016/j. resconrec.2021.105799.
- Watts, N., Amann, M., Ayeb-Karlsson, S., Belesova, K., Bouley, T., Boykoff, M., Byass, P., Cai, W., Campbell-Lendrum, D., Chambers, J., Cox, P.M., Daly, M., Dasandi, N., Davies, M., Depledge, M., Depoux, A., Dominguez-Salas, P., Drummond, P., Ekins, P., Flahault, A., Frumkin, H., Georgeson, L., Ghanei, M., Grace, D., Graham, H., Grojsman, R., Haines, A., Hamilton, I., Hartinger, S., Johnson, A., Kelman, I., Kiesewetter, G., Kniveton, D., Liang, L., Lott, M., Lowe, R., Mace, G., Odhiambo Sewe, M., Maslin, M., Mikhaylov, S., Milner, J., Latifi, A.M., Moradi-Lakeh, M., Morrissey, K., Murray, K., Neville, T., Nilsson, M., Oreszczyn, T., Owfi, F., Pencheon, D., Pye, S., Rabbaniha, M., Robinson, E., Rocklöv, J., Schütte, S., Shumake-Guillemot, J., Steinbach, R., Tabatabaei, M., Wheeler, N., Wilkinson, P., Gong, P., Montgomery, H. and Costello, A. (2018), "The Lancet Countdown on health and climate change: from 25 years of inaction to a global transformation for public health", The Lancet (British Edition), Vol. 391, 10120, pp. 581-630, doi: 10.1016/S0140-6736(17)32464-9.
- Weber, C., McCollum, D.L., Edmonds, J., Faria, P., Pyanet, A., Rogelj, J., Tavoni, M., Thoma, J. and Kriegler, E. (2018), "Mitigation scenarios must cater to new users", *Nature Climate Change*, Vol. 8 No. 10, pp. 845-848, doi: 10.1038/s41558-018-0293-8.
- WEF (2022), The Global Risks Report 2022, World Economic Forum, Global.
- Weinhofer, G. and Busch, T. (2013), "Corporate strategies for managing climate risks", *Business Strategy and the Environment*, Vol. 22 No. 2, pp. 121-144, doi: 10.1002/bse.1744.

Welle, T. and Birkmann, J. (2015), "The world risk index – an approach to assess risk and vulnerability on a global scale", *Journal of Extreme Events*, Vol. 02 No. 01, 1550003, doi: 10.1142/ S2345737615500037.

- Climate risk externalities
- WHO (2014), Quantitative Risk Assessment of the Effects of Climate Change on Selected Causes of Death 2030s and 2050s.
- Wiedmann, T. (2009), "A review of recent multi-region input-output models used for consumption-based emission and resource accounting", *Ecological Economics*, Vol. 69 No. 2, pp. 211-222, doi: 10.1016/j.ecolecon.2009.08.026.
- Wiedmann, T. and Lenzen, M. (2018), "Environmental and social footprints of international trade", Nature Geoscience, Vol. 11 No. 5, pp. 314-321, doi: 10.1038/s41561-018-0113-9.
- Wiedmann, T.O., Lenzen, M. and Barrett, J.R. (2009), "Companies on the scale", *Journal of Industrial Ecology*, Vol. 13 No. 3, pp. 361-383, doi: 10.1111/j.1530-9290.2009.00125.x.
- Woetzel, J., Dickon Pinner, S., Samandari, H., Engel, H., Krishnan, M., Boland, B., Cooper, P. and Ruby, B. (2020), *Will Infrastructure Bend or Break under Climate Stress?*, McKinsey Insititute, Global, p. 26.
- Yang, Z., Ng, A.K.Y., Lee, P. T.-W., Wang, T., Qu, Z., Sanchez Rodrigues, V., Pettit, S., Harris, I., Zhang, D. and Lau, Y.-y. (2018), "Risk and cost evaluation of port adaptation measures to climate change impacts", *Transportation Research Part D: Transport and Environment*, Vol. 61, pp. 444-458, doi: 10.1016/j.trd.2017.03.004.
- Yatim, P., Lin, N.S., Lam, H.L. and Choy, E.A. (2017), "Overview of the key risks in the pioneering stage of the Malaysian biomass industry", Clean Technologies and Environmental Policy, Vol. 19 No. 7, pp. 1825-1839, doi: 10.1007/s10098-017-1369-2.
- Yu, M. and Wiedmann, T. (2018), "Implementing hybrid LCA routines in an input-output virtual laboratory", Journal of Economic Structures, Vol. 7 No. 1, p. 33, doi: 10.1186/s40008-018-0131-1.
- Zhang, X. and Wang, F. (2016), "Hybrid input-output analysis for life-cycle energy consumption and carbon emissions of China's building sector", *Building and Environment*, Vol. 104, pp. 188-197, doi: 10.1016/j.buildenv.2016.05.018.
- Zhao, H., Qu, S., Guo, S., Zhao, H., Liang, S. and Xu, M. (2019), "Virtual water scarcity risk to global trade under climate change", *Journal of Cleaner Production*, Vol. 230, pp. 1013-1026, doi: 10. 1016/j.jclepro.2019.05.114.
- Zscheischler, J., Westra, S., van den Hurk, B.J.J.M., Seneviratne, S.I., Ward, P.J., Pitman, A., AghaKouchak, A., Bresch, D.N., Leonard, M., Wahl, T. and Zhang, X. (2018), "Future climate risk from compound events", *Nature Climate Change*, Vol. 8 No. 6, pp. 469-477, doi: 10.1038/s41558-018-0156-3.

Corresponding author

Arunima Malik can be contacted at: arunima.malik@sydney.edu.au