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## Fuelling hydrogen futures? A trust-based model of social acceptance†

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Public trust plays a fundamental role in shaping national energy policies in democratic countries, as exemplified by nuclear phase-out in Germany following the Fukushima accident. While trust dynamics have been explored in different contexts of the energy transition, few studies have attempted to quantify the influence of public trust in shaping social acceptance and adoption potential. Moreover, the interaction between public trust and perceived community benefits remains underexplored in the literature, despite the relevance of each factor to facilitating social acceptance and technology uptake. In response, this quantitative analysis closes a parallel research gap by examining the antecedents of public trust and perceived community benefits in the context of deploying hydrogen heating and cooking appliances across parts of the UK housing stock. Drawing on results from a nationally representative online survey ( $N = 1845$ ), the study advances insights on the consumer perspective of transitioning to 'hydrogen homes', which emerged as a topical and controversial aspect of UK energy policy in recent years. Partial least squares structural equation modelling and necessary condition analysis are undertaken to assess the predictive capabilities of a trust-based model, which incorporates aspects of institutional, organisational, interpersonal, epistemic, and social trust. Regarding sufficiency-based logic, social trust is the most influential predictor of public trust, whereas trust in product and service quality corresponds to the most important necessary condition for enabling public trust. Nevertheless, trust in the government, energy sector, and entities involved in research & development are needed to facilitate and strengthen public trust. Overall, this study enriches scholarly understanding of how public trust may shape prospects for trialling novel low-carbon technologies, highlights the need for segment-specific consumer engagement, and advances scholarly understanding of the innovation-decision process in the context of net-zero pathways. As policymakers approach critical decisions on the portfolio of technologies needed to support residential decarbonisation, public trust will prove fundamental to fuelling hydrogen-based energy futures.

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## 1 Introduction

In recent decades, hydrogen has been increasingly discussed as a critical component of accelerating net-zero ambitions,<sup>1–3</sup> following earlier hype cycles associated with the global 'hydrogen economy'<sup>4</sup> since the 1970s.<sup>5–7</sup> Visions for hydrogen-based energy futures, as discussed in the literature during the mid-2000s,<sup>8–11</sup> have gradually morphed into more tangible expectations for developing the global hydrogen supply chain<sup>12</sup> to support multi-sectoral decarbonisation targets.<sup>13–16</sup> Growing policy commitment towards scaling up hydrogen technologies

is mirrored by an upsurge in national hydrogen strategies since the late 2010s.<sup>17–20</sup>

In December 2017, Japan became the first country to publish a hydrogen strategy,<sup>18</sup> following long-held policy aspirations for developing a national hydrogen economy.<sup>21,22</sup> Subsequently, more than 60 countries have launched national hydrogen strategies or developed roadmaps.<sup>19</sup> Notably, the European Union (EU) is seeking a global leadership role following the release of its hydrogen strategy for a climate-neutral Europe in 2020.<sup>23</sup> However, there are also notable differences regarding ambitions and pathways for establishing hydrogen economies,<sup>24,25</sup> as further discussed in respect to the UK and five other country cases in Section 2.

Notably, the EU strategy identified objectives for three phases, with the second phase commencing in 2025‡ ahead of the final phase from 2030 onwards.<sup>23</sup> By contrast, the UK Hydrogen

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‡ Install at least 40 GW of renewable hydrogen electrolyzers by 2030 and achieve production of up to 10 million tonnes of renewable hydrogen.<sup>23</sup>



Strategy (August 2021)<sup>26</sup> specified illustrative hydrogen demand forecasts for 2030 and 2035 across four key sectors: industry (10–21 TW h and 25–45 TW h); power (0–10 TW h and 10–30 TW h); transport (0–6 TW h and 20–45 TW h), and heat in buildings (<1 TW h and 0–45 TW h). Additionally, the strategy stated that a policy decision on ‘hydrogen homes’ – composed of hydrogen-fuelled technologies for space heating, hot water, and cooking<sup>27</sup> – should be taken by 2026,<sup>26</sup> which has been affirmed in recent commitments.<sup>28</sup> Critically, around 84% of UK homes are connected to the national gas grid,<sup>29,30</sup> with the residential sector contributing towards 16% of national greenhouse gas (GHG) emissions (97% carbon dioxide).<sup>31</sup> Accordingly, the UK Heat and Buildings Strategy (October 2021) underscored the need to phase out the installation of natural gas boilers by 2035 in support of aspirations for net-zero buildings by 2050.<sup>32</sup>

Against the backdrop of shifting policy perceptions regarding the role of hydrogen homes in the UK’s low-carbon future, this study presents a consumer-oriented perspective;<sup>33</sup> focused on understanding the antecedents of and interactions between perceived community benefits, domestic hydrogen acceptance, and willingness to adopt a hydrogen home before 2030. Critically, the conceptual framework tested in this study departs from previous approaches<sup>33,34</sup> by modelling public trust, technology perceptions, safety perceptions, and production perceptions as predictors of perceived community benefits (economic, social, and environmental benefits). In turn, the following research questions are tackled by employing partial least squares structural equation modelling (PLS-SEM) and necessary condition analysis (NCA):

- What are the antecedents of public trust in the domestic hydrogen transition?
- Do the antecedents of public trust differ across segments of the UK population?
- What are the antecedents of perceived community benefits in the domestic hydrogen transition?
- What is the relationship between perceived community benefits, domestic hydrogen acceptance, and consumer willingness to adopt a hydrogen home before 2030?

Section 2 further contextualises the study in relation to the emergence of national hydrogen economies and international activities around residential hydrogen, before outlining the methodology in Section 3. Next, Section 4 reviews the literature and formulates hypotheses which comprise the conceptual framework presented in Section 5. Section 6 reports the modelling results from PLS-SEM and NCA, while Section 7 discusses the findings and their implications for transitioning to hydrogen homes. Lastly, Section 8 concludes by outlining a future research agenda and highlighting key lessons for supporting public trust in low-carbon, hydrogen-based energy systems.

## 2 Recent developments in hydrogen technology and policy for the residential sector

Accelerating heat decarbonisation for the residential sector is among one of the foremost environmental imperatives and

challenges of climate policy.<sup>35</sup> According to the Intergovernmental Panel on Climate Change (IPCC), the building sector accounted for 21% of global greenhouse gas (GHG) emissions in 2019,<sup>36</sup> while the International Energy Agency (IEA) estimates that the operations of buildings accounts for 26% of global energy-related emissions.<sup>37</sup> Moreover, the residential sector is the largest contributor to energy sector emissions globally with a 12.5% share, attributed mainly to fossil fuel heating and to a lesser extent, gas cooking.<sup>38</sup>

Table 1 reflects these trends across six major economies (Australia, Canada, Germany, Japan, the Netherlands, and the UK) wherein, on average, natural gas and oil accounted for 70% of residential heating in 2020 (SD = 0.12). Crucially, gas heating is significantly more prevalent, averaging 55% across the sample compared to 16% for oil, with Japan (50%) and Germany (25%) representing outliers in this category. Accordingly, each country has a strong incentive to accelerate residential decarbonisation and has explored the possibility of supporting this imperative through low-carbon hydrogen technologies.

At present, the Netherlands and Japan have the strongest commitments towards deploying hydrogen-fuelled appliances for home heating, both from a technological and policy perspective (see Table 1). Nevertheless, contingent on both international and national developments in the hydrogen and broader energy landscape, other countries such as the UK and Canada may scale up investments and policy support for residential hydrogen in the future. Following recent studies,<sup>39–41</sup> the following sub-sections outline the latest developments in hydrogen technology and policy across the countries reported in Table 1, with Section 2.6 providing a more in-depth look at the UK.

### 2.1 Australia

Australia’s National Hydrogen Strategy (November 2019) identified domestic and commercial heating as a potential use case,<sup>20</sup> as reflected by pioneering social acceptance research on residential hydrogen.<sup>44–46</sup> However, following the September 2024 policy update,<sup>47</sup> electrification is now regarded as the main technology pathway for decarbonising the building stock. Nevertheless, the government maintains regulatory support for enabling local hydrogen blending projects. At present, possibilities for larger scale deployment of hydrogen home appliances remains heavily contingent on whether technology advancements are realised in the upcoming years.<sup>47</sup> Although Australian households remain highly gas dependent, insights from this study are currently more relevant to other hydrogen uses cases such as fuel cell vehicles and alternative technologies such as heat pumps.

### 2.2 Canada

The Canadian national hydrogen strategy (December 2020) identified a potential role for hydrogen in residential decarbonisation, through blending with natural gas (up to 20% by volume) or as a long-term replacement fuel supplied *via* dedicated hydrogen pipelines.<sup>48</sup> In October 2022, the Canadian-based energy company ATCO started blending 5% hydrogen



Table 1 Overview of the potential role of hydrogen in residential decarbonisation in Australia, North America, Asia, and Europe<sup>a</sup>

Country	Launch of national hydrogen strategy	Most recent update to national hydrogen strategy	Proportion of natural gas in residential heating (2020)	Proportion of oil in residential heating (2020)	Need to decarbonise the residential sector	Focus on hydrogen heating and technology pathway
Australia	Nov-2019	Sep-2024	58%	1%	High <sup>b</sup>	Decreasing and limited focus; fuel cells
Canada	Dec-2020	Apr-2024	53%	7%	High	Sustained and moderate focus; fuel cells and/or boilers
Germany	Jun-2020	Jul-2023	46%	25%	Very high <sup>c</sup>	Limited focus but openness; fuel cells and/or boilers
Japan	Dec-2017	Jun-2023	12%	50%	High	Strong and sustained focus; fuel cells
Netherlands	Apr-2020	Jul-2021	85%	1%	Extremely high <sup>d</sup>	Strong and sustained focus; fuel cells and/or boilers
UK	Aug-2021	Dec-2023	75%	9%	Extremely high	Previously strong but declining focus; boilers

<sup>a</sup> Source: authors' compilation based on ref. 19, 42 and 43. <sup>b</sup> 59–70% natural gas and oil in residential heating = high. <sup>c</sup> 71–80% natural gas and oil in residential heating = very high. <sup>d</sup> >80% natural gas and oil in residential heating = extremely high.

into the local gas grid at Fort Saskatchewan, which serves around 2100 customers.<sup>49</sup> Furthermore, ATCO's Energy Discovery Centre aims to become the first building in North America to be heated by 100% hydrogen. Hydrogen pilot projects for residential and commercial heating are also underway in Alberta and Ontario, with the most recent (May 2024) progress report on Hydrogen Strategy for Canada maintaining ambitions to explore the feasibility of both hydrogen blending and dedicated hydrogen infrastructure for heat decarbonisation purposes.<sup>49</sup>

### 2.3 Germany

Germany's national hydrogen strategy (June 2020) expressed a degree of openness regarding the long-term potential of hydrogen heating, with Measure 21 noting the importance to integrate electricity, heat, and gas infrastructure to accelerate decarbonisation,<sup>50</sup> while pathways for hydrogen fuel cells and boilers have been discussed in the literature.<sup>51–53</sup> Notably, Measure 18 of the strategy focused on extending the government's program for highly efficient fuel-cell heating systems, while Measure 19 referenced the ambition to support funding for 'hydrogen readiness' installations as part of the Combined Heat and Power Act.<sup>50</sup> However, the July 2023 update to Germany's national hydrogen strategy sees a limited role for hydrogen in residential applications during the current decade, with activities restricted to pilot projects.<sup>54</sup> Nevertheless, hydrogen fuel cells and boilers are recognised as a potentially necessary alternative for buildings that cannot be electrified efficiently; provided there is sufficient hydrogen supply and demand at the local level which is also cost-effective.

Overall, the German government acknowledges the potential for hybrid heating systems in niche locations, alongside a role for hydrogen in supplying heat networks, while otherwise taking a cautious approach towards hydrogen heating.<sup>54</sup> At the same time, it should be noted that the role of hydrogen heating remains highly politicised, with the green party opposing this option whereas the liberal party is seen to hold a more technology-neutral perspective.<sup>55</sup>

### 2.4 Japan

Japan's position as a pioneer in hydrogen fuel cell technology<sup>56,57</sup> is reflected by its national program for residential fuel cell development, with the domestically produced ENE-FARM co-generation system providing electricity and hot water.<sup>18</sup> As of June 2021, around 400 000 ENE-FARM units had been deployed in Japan, with the government setting an ambitious target of 5.3 million installations by 2030.<sup>58</sup> In June 2023, the government updated its hydrogen strategy and affirmed its commitment to scaling up the deployment of household fuel cells by approximately ten-fold by 2030 through cost reductions and supporting policy mechanisms,<sup>59</sup> such as participation in the 'supply-demand adjustment market' for nationwide load balancing.<sup>60</sup>

Given ambitions for scaling up the deployment of ENE-FARM units, technology developments in Japan are highly significant in the context of global residential decarbonisation



policy. With commercial deployment already underway and policy targets in place, fuel cells may prove a more technoeconomically and socio-politically feasible deployment pathway in Japan compared to hydrogen boilers (and cookers) in countries such as the UK and Netherlands (see Section 2.5 and 2.6).

## 2.5 The Netherlands

The Dutch hydrogen strategy (April 2020) adopted a multi-sectoral focus on hydrogen applications for industrial, residential, and transport sectors; highlighting the long-term potential of hydrogen heating and need to scale up pilot projects before 2030.<sup>64</sup> In June 2022, the Minister of Climate and Energy expressed further support for using hydrogen as a replacement for gas heating,<sup>62</sup> with the new (right-wing) Dutch government affirming its ambitions to scale up hydrogen and carbon dioxide pipelines.<sup>63</sup> Notably, in July 2024, the government reversed the mandate for replacing existing gas boilers with heat pump installations by 2026,<sup>64</sup> reflecting growing political advocacy for preserving national gas infrastructure with switching to green gases (*i.e.* hydrogen and biomethane).<sup>65</sup>

Policy support has been reflected through the scaling up of hydrogen pilot projects in select locations,<sup>66–68</sup> with increasing discussions around hybrid solutions wherein a heat pump and hydrogen boiler are integrated into a smart heating system.<sup>69</sup> It follows that hydrogen technology and policy developments in the Netherlands, particularly the results from ongoing pilot projects, are instructive to steering decision-making in the UK,<sup>28,65</sup> and may also entail wider spillover effects for heat decarbonisation pathways in neighbouring countries such as Germany.

## 2.6 The United Kingdom

Concentrating on developments in the UK context, the possibility of converting parts of the national gas grid to hydrogen has engaged the research community and attracted interest from policy makers for well over a decade.<sup>70–72</sup> The initial push for developing sustainable hydrogen research dates back to a series of multi-million-pound grants awarded to UK institutes by the Engineering and Physical Sciences Research Council (EPSRC) between 2003 and 2017,<sup>73–75</sup> as mapped in Fig. 1.

In an early contribution employing the UK MARKAL energy systems model, Dodds and Demoullin<sup>71</sup> noted that technical feasibility would likely “depend on the willingness of the UK government and the network owners to invest resources over the next 20 years to prepare for and minimise the costs of a national conversion program.” In a parallel analysis using an improved version of the model, Dodds and McDowall<sup>72</sup> concluded that the only economically optimal pathway of achieving large-scale decarbonisation of the gas supply would rely on converting the network to deliver hydrogen for use in micro-combined heat and power (CHP) fuel cells. Subsequent studies have followed suit in both the UK context<sup>76</sup> and at the global level,<sup>77</sup> following the gradual uptake of fuel cell home heating systems in Japan during the 2010s<sup>7</sup> and largely positive consumer experience in small-scale European trials between 2012 and 2017.<sup>78</sup>

In 2015, the Committee on Climate Change (CCC) reported that no policy was in place for domestic hydrogen (*i.e.* red status). Following the development of small-scale feasibility studies, the need for a formal strategy was identified by 2016 (*i.e.* amber status: policy at risk).<sup>79</sup> Subsequently, the Leeds City Gate H21 project (see Fig. 1) provided a comprehensive evidence



Fig. 1 Events supporting the development of hydrogen homes in the UK, 2003–2022. Source: authors' illustration. <sup>a</sup>Engineering and Physical Sciences Research Council. <sup>b</sup>Using the UK MARKAL model (now UK TIMES model). <sup>c</sup>Committee on Climate Change. <sup>d</sup>The Office of Gas and Electricity Markets.



base on the feasibility of decarbonising parts of the existing UK gas network at minimal consumer cost, with several envisioned economic and societal benefits.<sup>80</sup> Additionally, the CCC released their ‘Hydrogen in a low-carbon economy’ report in November 2018, which identified a potential role for hydrogen as a hybrid heating solution for UK buildings in conjunction with heat pumps.<sup>81</sup>

In reflection, during the mid-2010s, UK heat decarbonisation remained strongly characterised by uncertainties regarding future energy demand<sup>82</sup> and an associated lack of policy clarity.<sup>70</sup> Some scholars attribute political uncertainty to the incumbent gas sector trying to resist large-scale electrification.<sup>83</sup> Such a pathway is arguably achievable through the deployment of heat pumps and district heat networks, alongside energy efficiency upgrades to properties.<sup>70,84</sup>

Boait and Greenough<sup>85</sup> conclude that hydrogen will inevitably cost more than natural methane, making strategic decisions around its applications critical to social acceptance for the wider hydrogen economy, while other critiques have cautioned against the use of residential hydrogen.<sup>84,86</sup> Nevertheless, it is widely agreed that a moderate hydrogen enrichment of natural gas (up to ~15–20%) could be technically feasible by repurposing existing pipelines<sup>87</sup> and viable for domestic heating without significant modification to existing boiler appliances.<sup>88</sup> Additionally, a minority of studies have demonstrated the potential viability of integrating residential hydrogen into the UK’s energy future to support security of supply and climate change targets.<sup>89,90</sup> Crucially, the release of the UK Hydrogen Strategy<sup>26</sup> marked the most definitive policy milestone to date for generating potential conditions for domestic hydrogen awareness and acceptance.

Against this background, the domestic hydrogen transition is confronted by substantial socio-technical barriers,<sup>91</sup> which have been exacerbated following recent setbacks in planned village trials<sup>92</sup> for the North of England<sup>93,94</sup> and an increase in policy push towards 100% electrification of the UK residential sector.<sup>95</sup> In response, the government has opted to draw more heavily on evidence presented by other hydrogen pioneers, namely, Germany and the Netherlands, while continuing to monitor the techno-economic feasibility of hydrogen homes through its national research.<sup>28</sup> Furthermore, the UK government has reaffirmed the need to develop a comprehensive consumer engagement strategy to build social acceptance for rapidly developing and deploying hydrogen networks.<sup>26</sup>

This study supports the government’s objective by elucidating new insights on consumer attitudes towards hydrogen homes, following earlier social science research conducted during the HyDeploy and H21 projects.<sup>96–98</sup> Critically, data collection for this research took place towards the end of 2022, thereby measuring public trust prior to the collapse of planned hydrogen village trials, which has reduced the likelihood of launching hydrogen homes in the near-term. Situated at a unique juncture between the publication of the UK Hydrogen Strategy (August 2021)<sup>26</sup> and the government’s most recent update on hydrogen heating policy (March 2024),<sup>28</sup> this case study significantly advances social science scholarship on the

dynamics of public trust in low-carbon energy futures and social acceptance.

## 3 Methodology

### 3.1 Questionnaire design and data collection

This quantitative study employs an online survey to examine how different segments of the UK public perceive the prospective transition to hydrogen homes. The survey design leverages insights from qualitative data collected *via* online focus groups,<sup>99,100</sup> which included an explicit focus on public trust in key stakeholders influencing the discourse around hydrogen homes.<sup>101</sup>

The evidence base was further supported by extensive rounds of literature review on the topic,<sup>91,102,103</sup> ahead of piloting the survey to establish content and face validity.<sup>33,34</sup> Data was collected between October and December 2022, with the final sample proving broadly representative of the UK population ( $N = 1845$ ), as further discussed when conducting multigroup analysis.<sup>104</sup> At the sub-group level, the sample is composed of respondents with high levels of technology and environmental engagement (VEG:  $N = 331$ ), moderate levels of technology and environmental engagement (MEG:  $N = 458$ ), fuel stressed respondents with less than moderate levels of engagement in technology and the environment (FSG:  $N = 379$ ), and finally, a control group with less than moderate levels of engagement who are not fuel stressed (BLG:  $N = 677$ ). In addition to increasing representation across different segments of the housing stock, this approach helps engage directly with segments of the population that will be involved in shaping net-zero pathways, both as citizens and potential consumers.

Importantly, all respondents qualify as property owners (37.2% outright owners; 62.8% mortgage owners) living in homes with gas heating and cooking appliances. Furthermore, each respondent self-reported to having an “at least moderate level of financial involvement in purchasing decisions”, while attributing “at least moderate importance to choosing their heating and cooking technologies”, as described in ESI Note 1 (see SN1†). The filtering methods help account for agency and choice as potential predictors of energy acceptance, while ensuring the sample meaningfully captures demographic groups directly involved in the technology transition under examination.<sup>105</sup>

Specific details of each survey item and the sample composition are provided in SN2 and SN3,† thus supporting the transparency and reproducibility of the research, while prior publications from this dataset further describe the survey design (*e.g.* SN5† in ref. 31) and multigroup approach.<sup>33,34,104,106</sup> Most pertinent to this analysis, trust in 16 specific actors and stakeholders was measured by administering a single question as described in Section 5, which was evaluated *via* an 11-point Likert scale (see Section 6.1) and subsequently modelled across five distinct dimensions (*i.e.* sub-constructs) using PLS-SEM (see Section 6.2.2).

Although data collection for this study is limited to the UK, the analysis has international relevance given that “social mechanisms of trust and confidence” are vital for supporting



national energy transitions, both from an investment and consumption perspective.<sup>107</sup> Moreover, researchers have increasingly identified an association between public attitudes towards climate policies and political trust,<sup>108–110</sup> which has motivated cross-national studies.<sup>111,112</sup> The relationship between trust in the media and political trust continues to engage scholars, with Hanitzsch and colleagues<sup>113</sup> positing the notion of a ‘trust nexus’; wherein the erosion of trust in the media is associated with a broader sense of public disenchantment with political institutions, at least in more politically polarised societies. Evidence suggests that the so-called trust nexus has strengthened over time following public backlash towards elite groups,<sup>113</sup> while Paterson *et al.*<sup>114</sup> document the rise of anti-net zero populism in the UK against a background of declining government trust.

This study presents context- and technology-specific insights on public trust, following data collection in the UK during the final quarter of 2022. While longitudinal and cross-national datasets provide clear grounds to expand the analytical scope, cross-sectional research conducted at the national level provides an important foundation for deriving further insights on the spatio-temporal dynamics of public trust in emerging low-carbon technologies (see Section 7.1). Moreover, the UK shares at least some comparable features to countries such as the Netherlands and Germany regarding its political economy, energy sector, and net-zero ambitions,<sup>115–117</sup> making the study partly generalisable to other nations shaping the global hydrogen economy, as briefly discussed in Section 7.1.3.

### 3.2 Combined use of PLS-SEM and NCA

This research follows the trajectory set by recent studies on the adoption dynamics of domestic hydrogen<sup>33,106</sup> by combining the use of partial least squares structural equation modelling (PLS-SEM) and necessary condition analysis (NCA).<sup>118,119</sup> Whereas PLS-SEM is grounded in additive sufficiency-based logic (*i.e.* an increase in  $X$  leads to an increase in  $Y$ ), NCA is predicated in necessity logic to identify the ‘must-have’ (*i.e.* necessary but not sufficient) factors for enabling a target outcome.<sup>120</sup>

PLS-SEM is a recommended second-generation statistical technique for conducting exploratory social science research,<sup>121–123</sup> as evidenced across a wide range of fields<sup>124,125</sup> including strategic management,<sup>126</sup> e-learning,<sup>127</sup> and energy acceptance.<sup>103</sup> Among numerous applications, scholars have leveraged PLS-SEM to examine the adoption of solar PV and biofuels,<sup>128</sup> smart homes,<sup>129–131</sup> energy-efficient heating appliances,<sup>132</sup> green information technology,<sup>133</sup> and hydrogen fuel cell vehicles (HFCVs).<sup>134,135</sup> Foremost, the method supports theory development while bridging the analytical gap between explanation and prediction.<sup>136,137</sup> PLS-SEM functions by minimising the unexplained variance of antecedent constructs within a conceptually-grounded path model<sup>138</sup> to support a predictive-oriented approach to SEM.<sup>136,139</sup>

This study employed SmartPLS 4.1 software<sup>140</sup> to explore a trust-based model of domestic hydrogen acceptance and adoption, wherein perceived community benefits is operationalised as a mediating construct. The first stage of PLS-SEM

involves assessing the measurement model, ahead of evaluating the structural model,<sup>141</sup> while adhering to best research practices to ensure methodological rigour.<sup>142</sup> In all cases, reflective constructs compose the model since indicators are highly correlated and do not represent the entirety of the construct.<sup>143,144</sup> To validate public trust as a higher-order construct composed of five sub-constructs, this study applies the repeated indicators approach as described in SN5.<sup>†145</sup>

To support results from PLS-SEM, importance-performance map analysis (IMPA) is carried out to further understand the role of public trust in shaping consumer attitudes towards domestic hydrogen. IMPA helps better communicate insights from PLS-SEM to decision-makers,<sup>146,147</sup> and is applied at both the construct and indicator level for public trust, in accordance with guidelines in the literature.<sup>148,149</sup> In sum, the technique involves plotting unstandardised total effects on the  $x$ -axis and latent variable scores on the  $y$ -axis (rescaled from 0–100), thereby comparing importance (*i.e.* total effect size) and performance (*i.e.* average latent variable score).<sup>148</sup>

Contrary to methods which operate from an additive perspective (*i.e.* multiple regression and SEM), NCA identifies critical determinants which cannot be compensated for by alternative factors, while detecting what level of the critical determinant is required to enable the target outcome.<sup>150–152</sup> Necessary condition hypothesising<sup>153,154</sup> has advanced significantly in recent years, following the formalisation of the method by Dul<sup>155</sup> and subsequent methodological contributions.<sup>156,157</sup> Since its inception,<sup>158,159</sup> NCA has attracted considerable interest from social science researchers to enhance theory-method compatibility and empirical insights,<sup>160</sup> as reflected in the context of supply chain management,<sup>161,162</sup> ethical consumer decision-making,<sup>150</sup> energy, environment and sustainability,<sup>163–166</sup> and adoption of artificial intelligence,<sup>167</sup> among numerous examples.<sup>152,168,169</sup>

In brief, NCA establishes a ceiling line above the data in an  $XY$  scatter plot to separate areas with and without data observations.<sup>120,156</sup> When handling continuous data – as approximated in this study by the use of an 11-point Likert scale – researchers should apply the ceiling regression-free disposal hull (CR-FDH).<sup>120,170</sup> The CR-FDH is recommended for handling discrete data, producing a regression line (ordinary least squares) through the corners of the ceiling envelopment-free disposal hull (CE-FDH), which displays a non-decreasing step function ceiling line.<sup>120</sup>

By generating a ceiling line through the data, NCA gauges whether a potential necessity effect is observed; corresponding to the empty region within the upper left quadrant of the scatterplot, which widens with a stronger necessary condition.<sup>120,156</sup> A necessity hypothesis is statistically supported when the effect size ( $d$ ) exceeds 0.10 together with a significant permutation value ( $p > 0.05$ ).<sup>156</sup> Parameters of  $0.1 \leq d < 0.3$ ,  $0.3 \leq d < 0.5$ , and  $d \geq 0.5$  indicate a medium, large effect, and very large effect size, respectively.<sup>156</sup> Bottleneck tables support NCA by relaying the configuration of the ceiling line.<sup>120,157</sup> Thus, each row represents a target outcome such as public trust or perceived community benefits, while each column states the minimum



required value of a corresponding predictor for ensuring the outcome level.<sup>167,170</sup>

Accordingly, harnessing insights from PLS-SEM and NCA provides a complementary perspective of causality and data analysis to advance theoretical and empirical insights,<sup>33</sup> which together with IMPA offers practical value for decision-makers.<sup>171</sup> The combined use of PLS-SEM and NCA has featured in the context of public transportation preferences<sup>118,172</sup> adoption of electric motorcycles,<sup>173</sup> decarbonisation for the transport sector,<sup>174</sup> electronic customer-to-customer interaction,<sup>175</sup> acceptance of medical wearable devices,<sup>176</sup> food waste management,<sup>170</sup> green competitive advantage,<sup>177</sup> and consumer purchasing behaviour<sup>178</sup> including the adoption of blockchain technology<sup>179</sup> and e-books,<sup>149</sup> among other topics.<sup>180,181</sup> In carrying out PLS-NCA, this study follows guidelines for best practice established by the pioneer of NCA, Jan Dul,<sup>120,159</sup> in addition to procedures specified by PLS-SEM practitioners, namely Richter and colleagues.<sup>149,182</sup>

Following the evaluation of public trust, a combined importance-performance map analysis (cIMPA) is undertaken at

the construct level for perceived community benefits.<sup>119</sup> cIMPA incorporates bottleneck percentages from NCA into the data output, thereby relaying the magnitude of different prerequisite factors.<sup>119</sup> Leveraging from traditional IMPA,<sup>148,183,184</sup> cIMPA can help support policy formation and managerial action by identifying areas of strategic value for enabling and strengthening the target outcome.<sup>119</sup>

**3.2.1 Summary of methods.** This study implements combined PLS-SEM and NCA to examine consumer attitudes towards hydrogen home, as examined through the interactions between public trust dynamics and perceptions of hydrogen appliances, safety attributes, production pathways, and perceived economic, social and environmental benefits. Following this summary, Section 4 reviews the literature to develop a series of testable hypotheses for evaluating a trust-based model of hydrogen acceptance and adoption potential, which is formalised in Section 5. Subsequently, 6.1 analyses descriptive statistics focused on public trust dynamics and differences between consumer sub-groups. Next, Section 6.2 reports the findings from PLS-SEM, which is complemented by

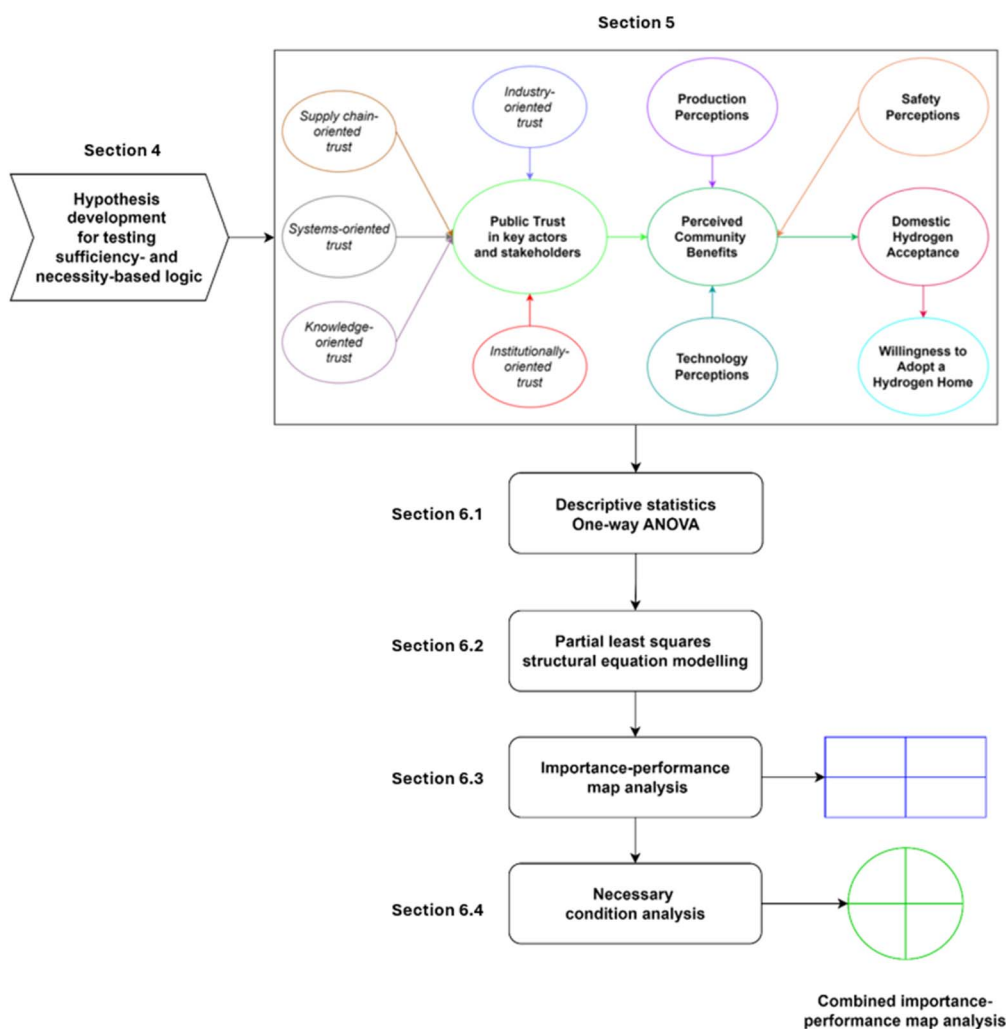


Fig. 2 Research procedure and data analysis techniques.





Fig. 3 Trends in public trust research based on Scopus search results.

IMPA in Section 6.3. Finally, results for NCA are presented in Section 6.4 and supplemented by cIMPA in Section 6.4.3 (see Fig. 2).

## 4 Literature review and hypotheses development

### 4.1 Scopus results for public trust

The Scopus search results ( $N = 43$ ) reflect clear growth dynamics for technology acceptance studies engaging with public trust. Fig. 3 displays results for 39 studies (excluding four studies published in 2024§), with around 69% of the total citation count attributed to studies published within the last four years (2020–2023).¶ Among the top ten most highly cited publications, three engaged directly with the energy sector, focusing on public attitudes towards carbon dioxide storage in the Netherlands,<sup>185</sup> social acceptance of electricity generation sources in the Chilean context,<sup>186</sup> and offshore wind acceptance in the United States.<sup>187</sup> Across the sample, six journals are represented more than once,|| whereas 26 journals are represented by a single study. The representation of 32 journals for a sample of 43 studies, following a relatively narrow keyword search, reflects the diverse nature of public trust in shaping multiple cases of technology and social acceptance.

The VOSviewer software tool provides a network visualisation of keywords,<sup>188</sup> based here on the association strength between 134 connected items within the Scopus dataset (total = 179). The map was composed of 13 clusters of keywords, spanning from 14 items for the largest cluster to three items for the smallest cluster ( $M = 10.3$ ,  $SD = 3.5$ ). Derivatives of trust

featured across six clusters: ‘chain of trust’ in Cluster 2 (green: 13 items) in connection to ‘energy transition’ and ‘offshore wind’, among other items; ‘public trust’ in Cluster 4 (yellow: 13 items) in relation to ‘nuclear power’ and ‘renewable energy’; ‘trust’ and ‘trust cultures’ in Cluster 5 (purple: 12 items) linking to ‘smart cities’, ‘autonomous vehicles’, and ‘structural equation modelling’; ‘trust in automation’ and ‘trust in technology’ connecting to ‘driverless cars’, ‘technology adoption’, and ‘artificial intelligence’ in Cluster 6 (turquoise: 12 items); social trust in Cluster 10 (pink: 9 items) with links to ‘green control techniques’ and ‘investing in renewable energy’; and finally, ‘trust gap’ represented in Cluster 12 (blue-grey: 4 items) in association with ‘energy transitions’, ‘nuclear’ and ‘deliberative energy governance’. Additionally, ‘consumer-decision making’ and ‘social acceptance’ featured in Cluster 8 (brown: 11 items), while ‘multi-group structural equation modelling’ and ‘willingness to adopt’ represented in Cluster 9, with ‘public acceptance’ defining Cluster 11 (light green: 8 items), alongside ‘nuclear energy’, ‘nuclear power policy’, and ‘fusion energy’ (see Fig. 4).

### 4.2 The dynamics of public trust

Public trust is multi-faceted in nature and highly complex, as reflected throughout several studies across multiple contexts,<sup>189–195</sup> which includes a growing focus on climate change engagement,<sup>196</sup> sustainable energy communities,<sup>197</sup> and emerging technologies.<sup>198–200</sup> For example, in the context of biotechnology, Master and Resnik<sup>201</sup> cautioned that media hype could lead to a loss of public trust and social acceptance. As reflected by the Scopus search results, energy researchers have examined how trust influences the social licence to operate for extractive industries,<sup>202–207</sup> public engagement in the energy transition and climate policy,<sup>208–214</sup> stakeholder perceptions of marine energy futures,<sup>215,216</sup> energy-related behaviours,<sup>217–220</sup> and adoption of new technologies for the agricultural sector,<sup>221–226</sup> among other topics.<sup>227–230</sup>

§ 213 citations up to April 4th 2024.

¶ 16 studies conducted before 2020 (including three studies for the period 2003–2012) account for 704 citations from a total of 2294 citations.

|| *Energy Research & Social Science*: 4 times; *Energy Policy*: 3 times; *Sustainability Switzerland*: 3 times; *Technology in Society*: 3 times; *Renewable and Sustainable Energy Reviews*: 2 times; *Technological Forecasting and Social Change*: 2 times.





Table 2 Summary of literature findings on public trust

Source and year	Technology	Country context and sample size	Actors and stakeholders	Results and measurement scale for public trust
254 2011	Nuclear power	Switzerland <i>N</i> = 967	<ul style="list-style-type: none"> <li>• Scientists</li> <li>• Inspecting authorities</li> <li>• Swiss Federal Office of Energy</li> <li>• Power plant operators</li> </ul>	<ul style="list-style-type: none"> <li>• <i>M</i> = 3.58, <i>SD</i> = 1.08</li> <li>• <i>M</i> = 3.52, <i>SD</i> = 1.06</li> <li>• <i>M</i> = 3.38, <i>SD</i> = 0.98</li> <li>• <i>M</i> = 3.07, <i>SD</i> = 1.22</li> </ul> > 5-Point Likert scale
255 2017	Nuclear power	China <i>N</i> = 605	<ul style="list-style-type: none"> <li>• Scientists</li> <li>• Government</li> <li>• Nuclear power companies</li> <li>• The media</li> </ul>	<ul style="list-style-type: none"> <li>• <i>M</i> = 5.30, <i>SD</i> = 1.51</li> <li>• <i>M</i> = 4.76, <i>SD</i> = 1.68</li> <li>• <i>M</i> = 4.49, <i>SD</i> = 1.58</li> <li>• <i>M</i> = 3.94, <i>SD</i> = 1.62</li> </ul> > 7-Point Likert scale
256 2017	Nuclear power	China (Haiyan County) <i>N</i> = 491	<ul style="list-style-type: none"> <li>• Institutions and experts</li> <li>• Government</li> <li>• Power plant operators</li> </ul>	<ul style="list-style-type: none"> <li>• 38.8%; 34.5%<sup>a</sup></li> <li>• 34.9%; 29.2%</li> <li>• 18.6%; 25.7%</li> </ul>
209 2021	Nuclear power	Japan  <i>N</i> = 285	<ul style="list-style-type: none"> <li>• Government</li> <li>• Nuclear power specialists</li> <li>• Electricity companies</li> <li>• The media</li> <li>• Non-profit organisations or NGOs</li> <li>• The internet</li> </ul>	<ul style="list-style-type: none"> <li>• Consistently low levels of trust towards information provided by all sources post-Fukushima</li> </ul>
214 2024	Fusion energy	United States <i>N</i> = 2016	<ul style="list-style-type: none"> <li>• University scientists</li> <li>• National Academy of Sciences</li> <li>• US National Laboratories</li> <li>• US Nuclear Regulatory Commission</li> <li>• US Department of Energy</li> <li>• US Environmental Protection Agency</li> <li>• R&amp;D companies</li> <li>• Environmental advocacy groups</li> <li>• News media</li> </ul>	<ul style="list-style-type: none"> <li>• <i>M</i> = 6.74</li> <li>• <i>M</i> = 6.57</li> <li>• <i>M</i> = 6.27</li> <li>• <i>M</i> = 6.15</li> <li>• <i>M</i> = 6.10</li> <li>• <i>M</i> = 6.10</li> <li>• <i>M</i> = 6.07</li> <li>• <i>M</i> = 5.64</li> <li>• <i>M</i> = 4.39</li> </ul> > 11-Point Likert scale
185 2007	Carbon capture and storage	Netherlands  <i>N</i> = 103	<ul style="list-style-type: none"> <li>• Environmental NGOs</li> <li>• Government</li> <li>• Industry</li> </ul>	<ul style="list-style-type: none"> <li>• <i>M</i> = 3.74, <i>SD</i> = 0.99</li> <li>• <i>M</i> = 2.81, <i>SD</i> = 1.06</li> <li>• <i>M</i> = 2.03, <i>SD</i> = 0.96</li> </ul> > 5-Point Likert scale <sup>a</sup>
257 2016	Carbon capture and storage	China  <i>N</i> = 349	<ul style="list-style-type: none"> <li>• Researchers</li> <li>• Environmental organisations</li> <li>• Government institutions</li> <li>• Enterprises</li> <li>• Scientists</li> </ul>	<ul style="list-style-type: none"> <li>• 29.2%</li> <li>• 26.1%</li> <li>• 24.4%</li> <li>• 20.3%</li> <li>• ~80%</li> </ul>
211 2021	Low-carbon transportation policies <sup>b</sup>	Canada  <i>N</i> = 1552	<ul style="list-style-type: none"> <li>• Environmental groups</li> <li>• Federal government</li> <li>• Provincial government</li> <li>• Car manufacturers</li> <li>• Producers of low-carbon jet fuels</li> </ul>	<ul style="list-style-type: none"> <li>• ~55%</li> <li>• ~41%</li> <li>• ~39%</li> <li>• ~36%</li> <li>• <i>M</i> = 3.55, <i>SD</i> = 0.79</li> </ul>
258 2022	Sustainable commercial aviation	United Kingdom  <i>N</i> = 1008	<ul style="list-style-type: none"> <li>• Scientific community</li> <li>• Policymakers</li> </ul>	<ul style="list-style-type: none"> <li>• <i>M</i> = 3.25, <i>SD</i> = 0.76</li> <li>• <i>M</i> = 2.97, <i>SD</i> = 0.87</li> </ul> > 5-Point Likert scale
45 2021	Hydrogen for domestic use and export	Australia  <i>N</i> = 3020	<ul style="list-style-type: none"> <li>• CSIRO<sup>c</sup></li> <li>• Universities</li> <li>• Environmental NGOs</li> <li>• State government</li> <li>• Federal government</li> <li>• Local government</li> <li>• Electricity generation companies</li> <li>• The media</li> </ul>	<ul style="list-style-type: none"> <li>• <i>M</i> = 5.43, <i>SD</i> = 1.33</li> <li>• <i>M</i> = 5.24, <i>SD</i> = 1.32</li> <li>• <i>M</i> = 5.18, <i>SD</i> = 1.42</li> <li>• <i>M</i> = 4.94, <i>SD</i> = 1.51</li> <li>• <i>M</i> = 4.89, <i>SD</i> = 1.64</li> <li>• <i>M</i> = 4.84, <i>SD</i> = 1.47</li> <li>• <i>M</i> = 4.35, <i>SD</i> = 1.65</li> <li>• <i>M</i> = 4.33, <i>SD</i> = 1.54</li> </ul>



Table 2 (Contd.)

Source and year	Technology	Country context and sample size	Actors and stakeholders	Results and measurement scale for public trust
249	Green hydrogen to supply power at outdoor events	Scotland	<ul style="list-style-type: none"> <li>• Fuel/gas supply companies</li> <li>• Academic or research institutions</li> </ul>	<ul style="list-style-type: none"> <li>• <math>M = 4.08</math>, <math>SD = 1.76</math></li> <li>• <math>&gt; 7</math>-point Likert scale</li> <li>• <math>M = 4.50</math></li> </ul>
2023		$N = 340$	<ul style="list-style-type: none"> <li>• Scottish government</li> <li>• Energy industry corporations</li> <li>• Alternative media</li> <li>• UK Government</li> <li>• Social media</li> </ul>	<ul style="list-style-type: none"> <li>• <math>M = 3.07</math></li> <li>• <math>M = 2.92</math></li> <li>• <math>M = 2.65</math></li> <li>• <math>M = 2.49</math></li> <li>• <math>M = 2.29</math></li> <li>• <math>&gt; 5</math>-Point Likert scale<sup>d</sup></li> </ul>

<sup>a</sup> The results held consistent when considering the perceived intentions and competence of each actor. <sup>b</sup> The results are reported for 'generalised trust'. <sup>c</sup> Commonwealth Scientific and Industrial Research Organisation. <sup>d</sup> Measuring perceived trust for communicating accurate and reliable information.

integrity-based trust, with results proving equivalent for bio-refineries and aquaponics as evaluated *via* a 7-point Likert scale ( $M = 3.90$ ).<sup>239</sup>

Lee and Reiner<sup>213</sup> found that UK ( $N = 2016$ ) respondents who prefer solar and wind energy over nuclear power and biomass tend to view companies as a playing a more significant role than government in addressing climate change. Public trust in the government's ability to address climate change ( $\beta = 0.068$ ,  $p < 0.014$ ) and their historical response to climate change ( $\beta = 0.092$ ,  $p < 0.004$ ) predicted support for biomass, whereas confidence in the ability of companies to address the climate change challenge had a significant effect on support for solar energy ( $\beta = 0.120$ ,  $p < 0.001$ ) and wind power ( $\beta = 0.153$ ,  $p < 0.001$ ).<sup>213</sup> In the German context, public trust proved a stronger predictor of social acceptance for gas-fired power compared to solar, wind, nuclear, and hydro-power,<sup>240</sup> which could imply a critical role for trust in hydrogen-based energy futures.

Engaging with leadership groups in South Korea ( $N = 267$ ), Choi *et al.*<sup>241</sup> identified the explanatory factors of public fear regarding nuclear power to be a lack of information provision by the press and media, insufficient communication and public relations by experts, and government mistrust, whereas mistrust of nuclear technology was negligible. Surveying the US public ( $N = 2016$ ), Gupta *et al.*<sup>214</sup> identified a direct positive relationship between trust and support for nuclear fusion, which was highest for technology companies involved in research and development (R&D), followed by university scientists, and the US Nuclear Regulatory Commission, but lower for news media and environmental advocacy groups. Critically, respondents with high levels of trust in the government<sup>††</sup> proved significantly more supportive of fusion energy compared to respondents with lower trust levels.<sup>214</sup>

In their recent investigation of social acceptance for natural-resource management in California, Eriksson *et al.*<sup>227</sup> found that both the public ( $N = 931$ ) and professionals ( $N = 216$ ) have much higher trust towards people ( $M = 67\%$ ,  $M = 68\%$ )

compared to the federal government ( $M = 59\%$ ,  $M = 51\%$ ), and state government ( $M = 48\%$ ,  $M = 32\%$ ). Moreover, in a multi-national study focused on climate behaviours and individual support for climate change policies across 35 countries ( $N = \sim 39\,000$ ), Smith and Mayer<sup>242</sup> observed that social trust is a stronger and more consistent predictor than institutional trust. Furthermore, Jordan and colleagues<sup>243</sup> cautioned that the public may lack confidence in the ability of democratic processes and political representatives to deliver effective climate change policy, whereas intermediaries such as charities, businesses, and non-governmental organisations (NGOs) may be considered more trustworthy for enacting deep decarbonisation.

**4.2.1 Public trust in national hydrogen economies.** In the context of social acceptance for hydrogen energy infrastructure in Germany ( $N = 512$ ), Schönauer and Glanz<sup>244</sup> found trust in civic stakeholders (NGOs and consumer associations) to be highest, followed by scientific stakeholders, whereas trust in political stakeholders (EU, federal, and local government) measured significantly lower, while energy companies emerged as the least trustworthy group.<sup>244</sup> Analysing the acceptance of hydrogen fuelling stations (HFSs) among Germans ( $N = 409$ ) *via* covariance-based structural equation modelling, Emmerich *et al.*<sup>245</sup> found that trust in one's municipality and industry positively predicts general and local acceptance. In subsequent analysis, Baur and colleagues<sup>246</sup> reported that trust in one's municipality was marginally higher compared to industry, however, 25% and 28% of respondents were undecided in each case. In the context of green hydrogen production in Germany, Buchner *et al.*<sup>247</sup> reported higher levels of public trust in project managers ( $M = 3.99$ ,  $SD = 0.76$ ) compared to plant safety ( $M = 3.66$ ,  $SD = 0.87$ ), as evaluated using a 5-point Likert scale for a large sample ( $N = 1203$ ) between 2022 and 2023 (*i.e.* coinciding with data collection for this study).

Among Dutch respondents, Huijts *et al.*<sup>248</sup> found that trust in one's municipality ( $M = 3.28$ ,  $SD = 0.97$ ) and in energy industry ( $M = 4.01$ ,  $SD = 0.73$ ) were significantly higher among supporters of a HFS ( $N = 679$ ) compared to opponents ( $N = 137$ ):

†† *i.e.* above 7.00 on an 11-point Likert scale.



$M = 2.58$ ,  $SD = 1.15$ ;  $M = 3.33$ ,  $SD = 1.07$ ), as reported using a 5-point Likert scale. Smith *et al.*<sup>249</sup> evaluated public trust in the novel context of using green hydrogen to supply power at outdoor events. Respondents had higher levels of (integrity-based) trust in academicians and researchers for supporting a sustainable future ( $M = 4.44$ ), with the Scottish government ( $M = 3.13$ ) outperforming the UK government ( $M = 2.29$ ), while the energy industry was viewed neutrally ( $M = 3.00$ ),<sup>249</sup> according to results from a 5-point Likert scale.†† Similar findings have been reported in the Australian context,<sup>44,250</sup> wherein Martin *et al.*<sup>45</sup> evaluated public trust in different organisations for acting in the best interest of consumers for driving the country's hydrogen economy (see Table 2).

Regarding the option of blending a percentage of hydrogen into the gas grid, Scott and Powells<sup>96</sup> found that UK respondents ( $N = 742$ ) had higher trust levels in evidence provided by the Health and Safety Executive (HSE), which was also considered a more trustworthy entity compared to the government, industry, and universities. Nevertheless, scientific evidence was also highly valued, whereas national and local media were considered as highly unreliable sources of information and untrustworthy entities. Notably, trust levels were somewhat lower for both the national government and local authorities, while 62% of respondents had 'no trust' or 'little trust' in their local Member of Parliament (MP). While the gas industry was perceived somewhat neutrally overall, 37.7% of respondents also expressed a lack of trust.<sup>96</sup> Furthermore, qualitative responses to this online survey ( $N = 1213$ ) underscored a sense of mistrust in the government and energy industry regarding their commitment towards fairness and equity in the transition to hydrogen homes.<sup>251</sup>

The impact of social media narratives has also been illustrated by Uniyal and Nayak<sup>252</sup> in capturing Twitter's 'pulse' on hydrogen energy between 2013–2022. Relevant to this national case study, the study showed a strong Twitter presence from the UK, accounting for 9.43% of tweets during the time-period and ranking third globally behind Japan (32.96%) and the US (19.31%).<sup>252</sup> Notably, the importance of 'social trust' for supporting the green hydrogen economy featured prominently in COP28 discussions, defined by panel experts as "the level of confidence individuals have in other stakeholders and the belief that others will act with integrity."<sup>253</sup> Panelists further stressed the role of trust in shaping supply chains, demand creation, and the underlying diffusion of (green) hydrogen into global energy systems.<sup>253</sup>

Although a rich evidence base has been presented spanning diverse studies, trust-related research in the context of residential energy acceptance and adoption remains far from saturated. Moreover, a multi-dimensional conceptualisation of public trust is particularly pertinent to the social acceptance and adoption intention throughout the early phase of transitioning to hydrogen homes.<sup>33,106</sup> Against this background, the following hypotheses are formulated to explore trust dynamics

from a sufficiency and necessity perspective, while distinguishing explicitly between social trust and public trust.

H1a: trust in the government will have a positive influence on public trust in the domestic hydrogen transition.

H1b: trust in the government is a precondition for enabling public trust in the domestic hydrogen transition.

H2a: trust in the energy sector will have a positive influence on public trust in the domestic hydrogen transition.

H2b: trust in the energy sector is a precondition for enabling public trust in the domestic hydrogen transition.

H3a: trust in product and service quality will have a positive influence on public trust in the domestic hydrogen transition.

H3b: trust in product and service quality is a precondition for public trust in the domestic hydrogen transition.

H4a: trust in research and development will have a positive influence on public trust in the domestic hydrogen transition.

H4b: trust in research and development is a precondition for enabling public trust in the domestic hydrogen transition.

H5a: social trust will have a positive influence on public trust in the domestic hydrogen transition.

H5b: social trust is a precondition for enabling public trust in the domestic hydrogen transition.

**4.2.2 The mediating role of public trust.** The energy transitions literature suggests that public (or social) trust indirectly influences attitudinal and behavioural acceptance *via* perceived benefits or risks.<sup>235,245,259,260</sup> For example, Bronfman *et al.*<sup>186</sup> tested a trust-acceptability model for electricity generation sources in the Chilean context ( $N = 243$  university students), wherein social acceptance was predicted both directly and indirectly (*via* perceived risks and benefits) by social trust in regulatory institutions. The proposed model demonstrated stronger explanatory power for established energy sources (*i.e.* fossil fuels, hydropower, and nuclear) compared to renewable energy sources (*i.e.* solar, wind, geothermal, and tidal).<sup>186</sup>

Similar trust-based models have demonstrated explanatory power when evaluating public acceptance for nuclear power,<sup>256,261,262</sup> CCS,<sup>185,260</sup> hydrogen-powered transportation,<sup>248,263</sup> and other environmental contexts such as wastewater reuse schemes.<sup>259</sup> For example, Terwel and co-authors<sup>264</sup> explored CCS acceptance among a small sample of undergraduate students from Leiden University ( $N = 73$ ). Modelling results showed that competence-based trust had a positive and significant effect on perceived benefits ( $\beta = 0.880$ ,  $p < 0.01$ ), while the effect of integrity-based trust was marginally significant ( $\beta = 0.340$ ,  $p = 0.10$ ).<sup>264</sup>

In the Malaysian context ( $N = 509$ ), social trust in key players (scientists, producers, and policymakers) measured 4.90 (7-point Likert scale), leading to a significant effect on perceived benefits of biodiesel ( $\beta = 0.370$ ,  $p < 0.001$ ).<sup>265</sup> Among two groups of citizens in North-Rhine Westphalia, results from PLS-SEM indicated a positive relationship between social trust and local acceptance for biorefineries ( $\beta = 0.09$ ,  $p = 0.031$ ;  $\beta = 0.130$ ,  $p = 0.001$ ) but not for aquaponics ( $\beta = 0.03$ ,  $p = 0.397$ ;  $\beta = 0.06$ ,  $p = 0.175$ ), with a more pronounced effect observed for the region without structural change (Rheinische Revier).<sup>239</sup> However, the relationship between social trust and perceived benefits proved non-significant across all models.<sup>239</sup>

†† The results reported in this analysis are reverse coded for consistency.



Despite some non-significant findings, the potential for public (or social) trust to shape perceived benefits remains widely acknowledged by technology acceptance research and energy transitions scholars. In this study, public trust is theorised to consist of at least five dimensions including social trust, as described in Section 5. Each aspect is hypothesised to positively predict how consumers perceive the local economic, social, and environmental benefits of domestic hydrogen *via* the higher-order construct, public trust, as specified in H6a–H6e:

H6a: public trust in the domestic hydrogen transition will positively mediate the relationship between trust in the government and perceived community benefits.

H6b: public trust in the domestic hydrogen transition will positively mediate the relationship between trust in the energy sector and perceived community benefits.

H6c: public trust the domestic hydrogen transition will positively mediate the relationship between trust in product and service quality and perceived community benefits.

H6d: public trust the domestic hydrogen transition will positively mediate the relationship between trust in research and development and perceived community benefits.

H6e: public trust the domestic hydrogen transition will positively mediate the relationship between social trust and perceived community benefits.

### 4.3 Perceived benefits of emerging technologies

Perceived benefits is among the foremost variables composing technology acceptance models,<sup>254,266–268</sup> playing a critical role across a range of contexts such as mobile banking adoption,<sup>269</sup> use of online health services,<sup>270</sup> technology-enhanced learning.<sup>271</sup> Critically, a recent systematic review found that approximately 93% of studies ( $N = 42$ ) operationalised perceived benefits as an antecedent of domestic energy acceptance, which also held true for around 73% of studies on hydrogen technology acceptance ( $N = 33$ ).<sup>103</sup> Notably, Schulte *et al.*<sup>272</sup> observed that perceived benefits is the most critical factor determining adoption intention for residential solar PV. Other analyses suggest that perceived benefits may exert the strongest influence on predicting social acceptance for renewable electricity generation,<sup>186</sup> CCS,<sup>267</sup> and nuclear power,<sup>254,268</sup> in addition to low-carbon heating technologies.<sup>273,274</sup>

Perceived benefits can be measured at different levels according to the technology context. For example, when evaluating nanotechnology acceptance, Chen and colleagues<sup>266</sup> developed a multi-dimensional construct by accounting for economic, social, health, and environmental aspects across six measurement items. In line with the rationale of this study, public trust had a significant effect on the perceived benefits of nanotechnology among the Taiwanese population ( $\beta = 0.464$ ,  $p < 0.001$ ).<sup>266</sup> Amin and colleagues<sup>265</sup> measured the perceived benefits of biodiesel according to its perceived usefulness to Malaysian society, ability to help solve challenging societal problems, and in terms of outweighing perceived risks. Macht *et al.*<sup>239</sup> evaluated the perceived benefits of biorefineries according to reduction in resource use, promotion of local economies, job creation, and utility for using waste streams,

with German respondents scoring around 5.31 on a 7-point Likert scale, whereas the perceived benefits of aquaponics was marginally lower ( $M = 5.07$ ).

Merk and Pönitzsch<sup>238</sup> combined three measures of perceived environmental benefits and a single measure of economic benefits in the context of stratospheric aerosol injection technologies, which returned a moderately positive result ( $M = 2.46$ ,  $SD = 0.73$ ), *vis-à-vis* a 4-point Likert scale. Notably, public trust had a strong direct effect on perceived benefits ( $\beta = 0.150$ ,  $p < 0.001$ ), as well as a significant indirect effect on social acceptance ( $\beta = 0.250$ ,  $p < 0.001$ ).

Arning *et al.*<sup>275</sup> focused exclusively on perceived environmental benefits when evaluating the social acceptance of carbon capture utilisation (CCU) in Germany ( $N = 509$ ) *via* PLS-SEM. The five measures composing the construct reflected moderately positive expectations for environmental benefits ( $M = 3.80$ ,  $SD = 1.10$ ), as judged by a 6-point Likert scale. Additionally, respondents considered CCU to be a somewhat sustainable and environmentally-friendly technology ( $M = 5.60$ ,  $SD = 2.40$ ;  $M = 5.20$ ,  $SD = 2.50$ ), but viewed the technology to be immature ( $M = 4.60$ ,  $SD = 2.30$ ), as measured *via* a 10-point scale. Foremost, perceived environmental benefits had a strong positive effect on affective benefits ( $\beta = 0.679$ ,  $p < 0.01$ ).<sup>275</sup>

Examining perceptions of electricity generation sources in Chile, Bronfman and colleagues<sup>186</sup> assessed perceived benefits for society, at the individual level, and for the environment. In the Japanese context, Park and Ohm<sup>262</sup> evaluated the perceived benefits of renewable energy technologies according to improving the environment, developing an industrial competitive advantage, and addressing social issues. The study found that public trust in the renewable energy industry positively predicts perceptions of perceived benefits (from renewables), with the effect increasing in the aftermath of the Fukushima nuclear accident of April 2011 ( $N = 2102$ :  $\beta = 0.201$ ,  $p < 0.001$ ;  $N = 1429$ :  $\beta = 0.281$ ,  $p < 0.001$ ).<sup>262</sup>

Xu *et al.*<sup>258</sup> found that the perceived benefits of low-carbon jet fuel were similar for the economy and society ( $M = 3.68$ ,  $SD = 0.85$ ) and environmental protection ( $M = 3.69$ ,  $SD = 0.89$ ), but marginally lower for reducing dependency on foreign oil ( $M = 3.61$ ,  $SD = 0.81$ ) and conventional jet fuel dependence ( $M = 3.63$ ,  $SD = 0.81$ ), according to a 5-point Likert scale. The least positive perception was associated with GHG emissions reduction as compared to other reduction measures in aviation ( $M = 3.38$ ,  $SD = 0.79$ ).<sup>258</sup> Additionally, evidence provided to the UK government by Cadent Gas as part of its 2023 hydrogen heating village trial application entailed a three-fold focus on community benefits at the economic, social and environmental level.<sup>276</sup> Joshi and Rahman<sup>277</sup> also articulate that sustainable consumption involves awareness of environmental, societal, and fair-trade concerns, which may be enacted *via* adoption of low-carbon energy technologies.<sup>278</sup>

**4.3.1 Perceived community benefits of domestic hydrogen.** Community benefits, associated with job security, energy security, and environmental protection,<sup>250</sup> is a significant driver of support for developing national and local hydrogen economies.<sup>45,279</sup> The perceived community benefits of domestic hydrogen have been evaluated *via* IMPA for this dataset.<sup>34</sup>



Critically, perceived environmental benefits ( $\beta = 0.121$ ,  $p < 0.001$ ) proved more influential than economic benefits ( $\beta = 0.100$ ,  $p < 0.001$ ) or social benefits ( $\beta = 0.104$ ,  $p < 0.001$ ). Qualitative responses validated these trends, since environmental benefits were cited over four times more (8.2% of coding results) than energy security benefits (2.0%), while social benefits were the least mentioned dimension (1.5%).<sup>251</sup> Furthermore, in a prior survey study conducted by Scott and Powells in the North of England ( $N = 700$ ),<sup>280</sup> 69.9% of respondents anticipated positive impacts for the environment, whereas economic benefits were less expected (23.4%) in view of largely neutral expectations (73.9%).

Notably, perceived environmental benefits emerged as a critical predictor of support for green hydrogen production among Norwegians,<sup>281</sup> while information provision about potential environmental benefits has been shown to increase hydrogen support among citizens in the North of England<sup>280</sup> and Australia.<sup>45</sup> Specifically, Martin *et al.*<sup>45</sup> found that environmental messaging had a small but statistically significant effect on increasing support for hydrogen among Australians, whereas economic messaging also raised support levels but non-significantly. Compared to results collected in 2018, national survey results from Australia in 2021 revealed stronger public perceptions of hydrogen's contribution to climate protection (2021:  $M = 5.55$ ,  $SD = 1.30$ ; 2018:  $M = 4.76$ ,  $SD = 1.28$ ), alongside more support for the use of hydrogen for domestic energy supply (2021:  $M = 5.75$ ,  $SD = 1.22$ ; 2018:  $M = 5.06$ ,  $SD = 1.23$ ), with respondents associating hydrogen with reduction of GHG emissions (2021:  $M = 5.74$ ,  $SD = 1.22$ ),<sup>§§</sup> as calculated *via* 7-point Likert scale.<sup>45</sup>

Additionally, in respect to determining willingness to use hydrogen for residential purposes, the 2021 survey ( $N = 1507$ ) found that safety ranked as the most important determinant ( $M = 4.50$ ,  $SD = 0.83$ ), followed by reliability of energy supply ( $M = 4.27$ ,  $SD = 0.87$ ), and health benefits such as no carbon monoxide emissions ( $M = 4.21$ ,  $SD = 0.94$ ), as gauged *via* a 5-point Likert scale.<sup>45</sup> By contrast, the technological dimension associated with choosing between gas or electricity for cooking proved comparatively less important ( $M = 3.64$ ,  $SD = 1.08$ ), as did flame colour/visibility ( $M = 3.42$ ,  $SD = 1.24$ ), with both factors proving less relevant than in 2018 ( $p < 0.05$ ). However, the environmental dimension linked to net-zero emissions proved more influential ( $M = 3.98$ ,  $SD = 1.05$ ) than in 2018 ( $M = 3.89$ ,  $SD = 1.02$ ), which also reflected a statistically significant increase ( $p < 0.05$ ).<sup>45</sup>

Previous analysis testing the STEEP Framework operationalised a hybrid construct merging perceived community benefits and willingness to adopt hydrogen homes as a proxy for measuring 'perceived adoption potential'.<sup>33</sup> From a sufficiency perspective, it was shown that safety perceptions ( $\beta = 0.193$ ,  $p < 0.001$ ), technology perceptions ( $\beta = 0.179$ ,  $p < 0.001$ ), production perceptions ( $\beta = 0.241$ ,  $p < 0.001$ ), and foremost, positive emotions ( $\beta = 0.376$ ,  $p < 0.001$ ) are significant (positive) predictors, with each factor functioning as a necessary

condition with a medium effect size.<sup>33</sup> However, to date, no study has combined the use of PLS-SEM and NCA to evaluate perceived benefits in the context of energy technology acceptance. The following hypotheses are developed to address this research gap based on the premise that perceived community benefits will entail economic, social, and environmental dimensions,<sup>276,282</sup> which may be influenced by public trust, alongside technology, safety, and environmental perceptions:

H7a: public trust in the domestic hydrogen transition will have a positive influence on the perceived community benefits of transitioning to hydrogen homes.

H7b: public trust in the domestic hydrogen transition is a precondition for perceiving the potential community benefits of hydrogen homes.

H8a: technology perceptions will have a positive influence on the perceived community benefits of transitioning to hydrogen homes.

H8b: positive technology perceptions is a precondition for perceiving the potential community benefits of hydrogen homes.

H9a: safety perceptions will have a positive influence on the perceived community benefits of transitioning to hydrogen homes.

H9b: positive safety perceptions is a precondition for perceiving the potential community benefits of hydrogen homes.

H10a: production perceptions will have a positive influence on the perceived community benefits of transitioning to hydrogen homes.

H10b: positive production perceptions is a precondition for perceiving the potential community benefits of hydrogen homes.

**4.3.2 The mediating role of perceived benefits.** Traditionally, perceived benefits is conceptualised as an antecedent of consumer attitude and decision-making, as operationalised *via* perceived usefulness within the TAM.<sup>283</sup> For example, Lee<sup>284</sup> found that perceived benefits positively predicts consumer attitude towards internet banking ( $\beta = 0.240$ ,  $p < 0.05$ ), in addition to influencing behavioural intention ( $\beta = 0.320$ ,  $p < 0.05$ ). In the context of the construction industry, perceived benefits had the largest effect on willingness to participate in electronic bidding ( $\beta = 0.262$ ).<sup>¶¶</sup> Wang and Qualls<sup>285</sup> also posited a positive relationship between perceived benefits and technology adoption behaviour among hospitality organisations. Additionally, the model hypothesised that perceived benefits mediates the relationship between perceived ease of adoption and behaviour, in addition to serving as a mediator between strategic orientation, information processing characteristics, supplier marketing strategies and adoption behaviour.<sup>285</sup> Notably, Gong and colleagues<sup>270</sup> showed that perceived benefits mediates the relationship between trust in online health consultation services and adoption intention.

Based on a narrative literature review ( $N = 17$ ), Gordon *et al.*<sup>102</sup> identified public trust as a 'significant' determinant of

§§ This specific metric was not assessed in the 2018 survey.

¶¶ *i.e.* the electronic issuing and receipt of any bid documentation in electronic format as part of the procurement process.<sup>407</sup>



domestic hydrogen acceptance, alongside safety perceptions and environmental perceptions. Prior research employing this dataset established that perceived community benefits is the most significant predictor of domestic hydrogen acceptance ( $\beta = 0.276, p < 0.001$ ), among constructs composing the DHAM.<sup>34</sup> In addition, production perceptions had a positive and significant effect on social acceptance ( $\beta = 0.214, p < 0.001$ ), followed by public trust ( $\beta = 0.198, p < 0.001$ ), and safety perceptions ( $\beta = 0.058, p < 0.004$ ).<sup>34</sup>

This study retains the path between perceived community benefits and domestic hydrogen acceptance (PCB  $\rightarrow$  DHA) as specified in H11a, in addition to testing the relationship from a necessity logic, as expressed in H11b. Furthermore, an alternative model is specified wherein public trust, in addition to technology, safety, and production perceptions, predict perceived community benefits (see Section 4.3.1), which also mediates each path relationship with domestic hydrogen acceptance, as formalised in H12a–H12d:

H11a: the perceived community benefits of transitioning to hydrogen homes will positively influence domestic hydrogen acceptance.

H11b: perceiving potential community benefits in the transition to hydrogen homes is a precondition for enabling domestic hydrogen acceptance.

H12a: the perceived community benefits of transitioning to hydrogen homes will positively mediate the relationship between public trust and domestic hydrogen acceptance.

H12b: the perceived community benefits of transitioning to hydrogen homes will positively mediate the relationship between technology perceptions and domestic hydrogen acceptance.

H12c: the perceived community benefits of transitioning to hydrogen homes will positively mediate the relationship between safety perceptions and domestic hydrogen acceptance.

H12d: the perceived community benefits of transitioning to hydrogen homes will positively mediate the relationship between production perceptions and domestic hydrogen acceptance.

#### 4.4 Interactions between perceived community benefits, social acceptance and adoption intention

To date, specific models have been tested to assess social acceptance and perceived adoption potential for hydrogen homes *vis-à-vis* the DHAM<sup>34</sup> and STEEP Framework,<sup>33</sup> with the latter being modified and further evaluated through a multi-group perspective.<sup>104</sup> The DHAM accounted for 66.9% of the observed variance in social acceptance,<sup>34</sup> while the STEEP Framework explained 61.2% of the variance in perceived adoption potential.<sup>33</sup> However, the critical link between acceptance and adoption intention remains underexplored, while the role of perceived community benefits in shaping each outcome is yet to be integrated into a single model.

The literature reflects the importance of examining such relationships before policy decisions are taken regarding the scope and scale of technology deployment. For example, Xu *et al.*<sup>258</sup> recently concluded that perceived benefits increases

consumer willingness to pay for sustainable commercial aviation,<sup>258</sup> which represents an emblematic long-term technology transition.<sup>286</sup> Chen *et al.*<sup>266</sup> found that the perceived benefits of nanotechnology applications positively predicts social acceptance in Taiwan ( $\beta = 0.675, p < 0.001$ ), while perceived benefits also proved the most importance predictor of attitude towards biodiesel in Malaysia ( $\beta = 0.800, p < 0.001$ ).<sup>265</sup>

The perceived benefits of renewable energy technologies demonstrated a strong effect on public acceptance in Japan, both prior to and after the Fukushima incident ( $\beta = 0.834, p < 0.001$ ;  $\beta = 0.775, p < 0.001$ ), which in turn predicted intention to use renewables ( $\beta = 0.297, p < 0.001$ ;  $\beta = 0.857, p < 0.001$ ).<sup>256</sup> Notably, adoption intention for renewables increased significantly post-Fukushima, reflecting heightened risk perceptions of nuclear power as observed in other national contexts such as China.<sup>256</sup> Across six models measuring general and local acceptance for two technologies (biorefineries and aquaponics) in two areas of Germany (transition and non-transition regions of North-Rhine Westphalia), Macht *et al.*<sup>239</sup> found that perceived benefits positively and consistently predicts social acceptance ( $\beta = 0.220\text{--}0.320, p < 0.001$ ), with the exception of aquaponics in the transition region ( $\beta = 0.100, p = 0.076$ ).

In the German context, perceived benefits had a strong effect on the social acceptability of stratospheric aerosol injection ( $\beta = 0.300, p < 0.001$ ).<sup>238</sup> Perceived environmental benefits also predicted general acceptance ( $\beta = 0.167, p < 0.05$ ) and local acceptance ( $\beta = 0.123, p < 0.05$ ) for CCU in Germany.<sup>275</sup> Furthermore, perceived benefits, as evaluated through a single measure of job creation, had a positive effect on wind energy acceptance among the German population (onshore wind:  $\beta = 0.110, p < 0.01$ ; offshore wind:  $\beta = 0.140, p < 0.01$ ; and local wind farm:  $\beta = 0.080, p < 0.01$ ).<sup>237</sup>

In response, additional hypotheses are formulated to examine the relationship between acceptance and adoption intention for hydrogen homes through a sufficiency-based lens<sup>167</sup> and *via* necessity-based logic.<sup>120</sup> In line with research highlighting perceptual shifts between the attitude formation and decision-making phase of technology adoption,<sup>287</sup> the final part of the trust-based model also examines whether social acceptance mediates the relationship between perceived community benefits and adoption intention:

H13a: domestic hydrogen acceptance will positively influence willingness to adopt a hydrogen home.

H13b: domestic hydrogen acceptance is a precondition for willingness to adopt hydrogen heating and cooking technologies.

H14: domestic hydrogen acceptance will positively mediate the relationship between perceived community benefits and willingness to adopt a hydrogen home.

## 5 Conceptual framework

Based on insights from literature review and stated hypotheses, Fig. 5 develops a conceptual framework to ground the empirical analysis. The novelty of the conceptual contribution emerges from the multi-dimensional focus on public trust and its antecedents. Whereas prior research typically selects social trust or





Fig. 5 Trust-based framework for examining the dynamics of domestic hydrogen acceptance and adoption intention.

public trust as its point of interest, which may span a focus on several stakeholders and aspects of competence-based and integrity-based trust<sup>264</sup> (see Section 4), this study demarcates explicitly between social and public trust,<sup>|||</sup> while examining four additional dimensions: trust in the government (GOV); trust in the energy sector (NRG); trust in product and service quality (QUAL); and trust in research & development (R&D).

The institutionally-oriented dimension of public trust is captured by measuring three levels, namely, trust in the central government, regional authorities, and local councils. An industry-oriented framing is represented by incorporating three measures related to the energy sector, namely, trust in fuel/gas supply companies, electricity and/or gas suppliers, and renewable energy producers. Additionally, a supply chain-oriented focus is transmitted by measuring trust in trade bodies, boiler manufacturers, and engineers and technicians, as a way of gauging consumer expectations regarding product and service quality for hydrogen home appliances. A knowledge-oriented lens is applied by accounting for trust in NGOs, universities, and other research institutions, thereby engaging with perceptions of R&D-related activities.

Finally, social trust refers to the expectation that entities involved in aspects such as regulation, safety, communication, and financing for hydrogen homes will act competently, ethically, and openly, which is evaluated according to trust in the Office of Gas and Electricity Markets (Ofgem), the media, Gas Distributions Network Operators (GDNs), and financial institutions. Accordingly, social trust can be considered as a broad measure which is systems-oriented and representative of a mix of competence-based and ethically-driven levers.

Through a multi-dimensional paradigm, the trust-based model incorporates aspects of institutional, organisational,

interpersonal, epistemic, and social trust by measuring consumer confidence in policy makers, industry representatives, human capital, technology innovation, and other entities shaping social capital. In total, the proposed model consists of 12 constructs including public trust, which is composed of five sub-constructs and specified as a reflective-formative, higher-order construct.<sup>288</sup> The following question was formulated to support the proposed conceptualisation of public trust: how much trust do you have in the following stakeholders for supporting a cost-effective, efficient, and fair transition to hydrogen homes?

In contrast to constructs operationalised within the DHAM<sup>34</sup> and STEEEP Framework,<sup>33</sup> this study explores mediating relationships to discern more intricate insights into the dynamics of hydrogen acceptance and adoption intention,<sup>134,245,263</sup> as realised in prior research on public perceptions of nuclear power,<sup>289</sup> and public trust and acceptance of CCS.<sup>257</sup> While technology, safety, and production perceptions serve as exogenous constructs (predicting perceived community benefits), public trust, perceived community benefits, and domestic hydrogen acceptance operate as mediators,<sup>290,291</sup> with willingness to adopt a hydrogen home completing the model as the final endogenous construct (see Fig. 5).

## 6 Results

### 6.1 Public trust in the domestic hydrogen transition

Prior to conducting PLS-SEM, descriptive data analysis was carried out with a primary focus on the trust-based component of the model. In previous research, descriptive results for other constructs are reported for the STEEEP Framework<sup>33,104</sup> and DHAM,<sup>34</sup> which operationalised five measures of public trust-\*\*\* Across the 16 indicators composing the public trust

||| The Scopus literature review showed that public trust is more commonly referred to than social trust in the literature, which further motivated the use of the former as the umbrella term and the latter as one of its derivatives.

\*\*\* *i.e.* four measures of social trust (*i.e.* trust in GDNs, financial institutions, Ofgem, and the media), in addition to trust in renewable energy producers.





Fig. 6 Mean score for indicators predicting public trust in the domestic hydrogen transition. Red = trust in the government (GOV); blue = trust in the energy sector (NRG); brown = trust in product and service quality (QUAL); mauve = trust in R&D; grey = social trust (ST).

construct, a mean score of 5.16 was recorded ( $SD = 2.43$ ), as measured on an 11-point Likert scale. Trust in the government ( $M = 4.41$ ,  $SD = 2.50$ ) and social trust ( $M = 4.92$ ,  $SD = 2.48$ ) fell below the mean value, while trust in R&D ( $M = 5.70$ ,  $SD = 2.26$ ), trust in product and service quality ( $M = 5.64$ ,  $SD = 2.20$ ), and to a lesser extent, trust in the energy sector ( $M = 5.21$ ,  $SD = 2.45$ ) exceeded the mean score.

Notably, trust in the government proved lowest at the central level ( $M = 3.97$ ,  $SD = 2.62$ ), and highest at the local level ( $M = 4.74$ ,  $SD = 2.47$ ), followed by the regional level ( $M = 4.53$ ,  $SD = 2.33$ ). A lack of social trust originated primarily from low confidence in the media for supporting a cost-effective, efficient, and fair transition to hydrogen homes ( $M = 4.03$ ,  $SD = 2.46$ ), which proved near equivalent to trust in the central government. Respondents were somewhat sceptical of financial institutions as potential 'trustbrokers' ( $M = 4.95$ ,  $SD = 2.37$ ), but comparatively more trustworthy of Ofgem ( $M = 5.47$ ,  $SD = 2.45$ ) and to a lesser degree GDNOs ( $M = 5.23$ ,  $SD = 2.38$ ).

At the positive end of the trust spectrum, consumers expressed higher levels of confidence in gas engineers and technicians ( $M = 5.99$ ,  $SD = 2.19$ ), universities ( $M = 5.95$ ,  $SD = 2.28$ ), other research institutes or organisations ( $M = 5.91$ ,  $SD = 2.23$ ), renewable energy producers ( $M = 5.82$ ,  $SD = 2.45$ ), and to a lesser extent, boiler manufacturers ( $M = 5.64$ ,  $SD = 2.18$ ). The results provide an initial snapshot of the potential actors responsible for shaping public trust in domestic hydrogen futures (see Fig. 6), which will entail raising consumer confidence levels across multiple dimensions.

At the sub-sample level, the trust dynamics associated with the domestic hydrogen transition present significant findings in terms of consumer heterogeneity (see Table 3). Foremost, consumers belonging to the VEG express higher levels of trust across all dimensions and indicators compared to respondents composing the FSG and BLG (see Fig. 7 and SN4†). Compared to the mean trust level across the full sample ( $M = 5.16$ ), the VEG holds the highest level of public trust ( $M = 6.11$ ), followed by the MEG ( $M = 5.30$ ), while the FSG ( $M = 4.82$ ) and BLG ( $M = 4.79$ ) proved near equivalent. While the groups diverge according to technology and environmental engagement levels, the variance across different trust dimensions is comparable between groups ( $SD = 0.62$ – $0.68$ ).

Trust perceptions are highly consistent between segments, since all groups share least trust for the government, while social trust ranks second to last at the construct level. Additionally, trust in the energy sector ranks third across all groups, which can be traced to stronger confidence in the role of renewable energy producers. In the case of the BLG, trust in product and service quality ( $M = 5.29$ ) is marginally stronger than trust in R&D ( $M = 5.28$ ), whereas across all other groups the latter outranks the former by a small margin. Consequently, the trust dynamics explored within this study exhibit high levels of conformity across the sample at the indicator level (and by proxy, the construct level), but deviate in magnitude according to specific segmentation characteristics.

Among the five constructs composing public trust, trust in the government had the largest variance across the sub-groups



Table 3 Kruskal–Wallis H test results for sub-constructs of public trust<sup>a</sup>

	BLG	MEG	VEG	FSG
<b>Trust in the government</b>				
BLG				
MEG	<0.001 (0.31***)			
VEG	<0.001 (0.30***)	1.000 (0.02*)		
FSG	1.000 (0.01*)	<0.001 (0.30***)	<0.001 (0.31***)	
<b>Trust in the energy sector</b>				
BLG				
MEG	<0.001 (0.16**)			
VEG	<0.001 (0.26**)	0.005 (0.12**)		
FSG	1.000 (0.01*)	<0.001 (0.17**)	<0.001 (0.29)	
<b>Trust in product and service quality</b>				
BLG				
MEG	<0.001 (0.13**)			
VEG	<0.001 (0.29***)	<0.001 (0.18**)		
FSG	1.000 (0.00)	0.001 (0.13**)	<0.001 (0.32***)	
<b>Trust in research and development</b>				
BLG				
MEG	<0.001 (0.16**)			
VEG	<0.001 (0.32***)	<0.001 (0.18**)		
FSG	1.000 (0.01*)	<0.001 (0.16**)	<0.001 (0.34)	
<b>Social trust</b>				
BLG				
MEG	0.017 (0.09**)			
VEG	<0.001 (0.31***)	<0.001 (0.23**)		
FSG	1.000 (0.01*)	0.112 (0.08**)	<0.001 (0.33***)	

<sup>a</sup>  $p$ -Values are reported for each comparison, while the effect size given in parentheses. \*\*\*Large effect size. \*\*Moderate effect size. \*Small effect size.

composing the sample (GOV:  $t = 177.60$ ), followed by trust in R&D (R&D:  $t = 131.52$ ), social trust (ST:  $t = 110.97$ ), trust in production and service quality (QUAL:  $t = 107.37$ ), and trust in the energy sector (NRG:  $t = 93.34$ ), with all results proving highly significant ( $p < 0.001$ ). Post-hoc tests confirm that the BLG and FSG are highly homogenous in terms of perceived trust across all dimensions. Furthermore, high levels of consistency are observed since the rank order (VEG, MEG, FSG, BLG) was the same across all metrics except NRG, whereby the BLG (Md = 829) ranks marginally ahead of the FSG (Md = 820). While this difference fails to reflect a statistically significant finding, it is nevertheless noteworthy that conditions of fuel stress heighten mistrust in the energy sector.

Regarding trust in the government, the MEG and VEG ( $r = 0.02$ ) conform alongside the BLG and FSG ( $r = 0.01$ ), while all remaining pairwise comparisons display a large effect size ( $r = 0.30$ – $0.31$ ). Considering trust in the energy sector, the largest divergence corresponds to the VEG and FSG ( $r = 0.29$ ), while other pairwise comparisons excluding the BLG and FSG return a moderate effect size ( $r = 0.12$ – $0.26$ ). Trust in product and service quality reflects two large effect sizes for the BLG and VEG ( $r = 0.29$ ) alongside the VEG and FSG ( $r = 0.32$ ), while three results have a moderate effect ( $r = 0.13$ – $0.18$ ).

A similar pattern is observed for trust in R&D, with group-specific differences attributed foremost to the BLG and VEG ( $r = 0.32$ ) and VEG and FSG ( $r = 0.34$ ), whereas other sub-groups excluding the BLG and FSG are defined by a moderate effect size of similar magnitude ( $r = 0.16$ – $0.18$ ). Finally, in terms of social trust, similar results are observed between the BLG and VEG ( $r = 0.31$ ) and VEG and FSG ( $r = 0.33$ ) as compared to other trust dimensions. However, the MEG and VEG also diverge to a larger extent ( $r = 0.23$ ), whereas the difference between the BLG and



Fig. 7 Mean score for constructs predicting public trust in the domestic hydrogen transition by consumer sub-group.



MEG, as well as the MEG and FSG proves more modest ( $r = 0.08-0.09$ ).

Public trust in domestic hydrogen transition could be strongly influenced by corresponding levels of technology and environmental engagement across the UK population, while individual dimensions of trust may also operate distinctly from one another across consumer segments. Table 4 complements the findings on public trust by reporting descriptive results across each construct and its indicators, wherein different levels of variance are observed across metrics.

## 6.2 Partial least squares structural equation modelling

Model-specific estimates were employed to validate sample size requirements for conducting PLS-SEM.<sup>292</sup> Given the parameters of the trust-based model, a sample size of 1845 was more than adequate for detecting a small effect size ( $f^2 = 0.02$ ) at a 95% significance level ( $\rho < 0.05$ ), as confirmed *via* G-Power software

analysis<sup>293,294</sup> (see SN6†). Common method bias was checked for using Harman's single factor test,<sup>295</sup> which returned an overall variance of 36.65%, comfortably under the threshold value of 50% (see SN7†). As a further check for CMB,<sup>296</sup> the model was rerun with a new random variable functioning as the (sole) endogenous construct,<sup>297</sup> which returned variance inflation factor (VIF) scores below the threshold of 3.0.<sup>296</sup> Finally, normality was assessed by measuring skewness and kurtosis tests,<sup>298,299</sup> which adhered to the recommended threshold of  $\pm 1$  (see SN8†). As a result, the initial checks validated data integrity, supporting the decision to conduct PLS-SEM (see SN9†).

**6.2.1 Measurement model assessment.** The trust-based component of the model is composed of five lower-order (exogenous) constructs which together shape public trust, while the remainder of the model consists of six constructs (three exogenous: PP, SP, and TP; and three endogenous: PCB, DHA, and WTA). Each construct is measured reflectively since

Table 4 Summary of descriptive statistics for model constructs and indicators

Construct and scale	Indicators and question framing	Mean	Standard deviation
Technology perceptions 11-point	➤ Perceived performance compared to a natural gas boiler or a natural gas hob		
	• TP1: higher level of thermal comfort from a hydrogen boiler	6.69	2.45
	• TP2: higher energy efficiency from a hydrogen boiler	7.83	2.43
	• TP3: smarter heating system provided by a hydrogen boiler	7.33	2.51
	• TP4: more efficient performance from a hydrogen hob	6.75	2.40
	• TP5: smarter cooking system provided by a hydrogen hob	6.32	2.38
Safety perceptions 11-point	➤ Compared to natural gas		
	• SP1: hydrogen boilers	5.93	2.01
	• SP2: hydrogen hobs	5.92	2.04
	• SP3: hydrogen pipeline transport	5.80	2.03
	• SP4: underground hydrogen storage	5.68	2.14
	• SP5: overall safety level	5.96	1.94
Production perceptions 11-point	➤ Support for hydrogen production pathways over different time-horizons		
	• PP1: blue hydrogen up to 2030	5.57	2.00
	• PP2: blue hydrogen after 2030	6.78	2.04
	• PP3: green hydrogen up to 2030	7.28	2.06
	• PP4: green hydrogen after 2030	6.44	1.74
	• PP5: the twin-track production approach	5.68	1.82
Perceived community benefits 11-point	➤ In locations that switch to hydrogen homes		
	• PCB1: economic benefits such as job opportunities and income security	6.28	2.02
	• PCB2: social benefits such as reduced level of energy poverty and improved health	6.23	2.13
	• PCB3: environmental benefits such as lower carbon emissions and better air quality	7.02	2.07
Domestic hydrogen acceptance 11-point	➤ Socio-political, community, and household-level acceptance		
	• DHA1: hydrogen becoming a critical part of the UK's energy future	6.43	2.10
	• DHA2: hydrogen replacing natural gas in your local area before 2030	6.34	2.23
	• DHA3: switching your home to both hydrogen heating and cooking before 2030	6.38	2.28
Willingness to adopt a hydrogen home 5-point	➤ Before the year 2030		
	• WTA1: hydrogen boiler	2.94	1.00
	• WTA2: hydrogen hob	2.90	1.01
	• WTA3: hydrogen home	2.87	1.04



Table 5 Assessment of reliability, convergent validity, and multicollinearity<sup>a</sup>

Construct	CA	CR ( $\rho_A$ )	CR ( $\rho_C$ )	AVE	VIF
Trust in the government (GOV)*	0.889	0.893	0.932	0.819	2.370
Trust in energy sector (NRG)*	0.887	0.890	0.931	0.818	3.645
Trust in product service and quality (QUAL)*	0.862	0.863	0.916	0.784	2.784
Trust in research and development (R&D)*	0.832	0.833	0.899	0.749	1.978
Social trust (ST)*	0.842	0.846	0.894	0.678	4.854
Public trust (PT)** <sup>b</sup>	0.916	0.928	0.936	0.747	1.437
Technology perceptions (TP)	0.810	0.824	0.868	0.569	1.219
Safety perceptions (SP)	0.918	0.920	0.939	0.754	1.463
Production perceptions (PP)	0.816	0.843	0.871	0.578	1.302
Perceived community benefits (PCB)	0.808	0.808	0.886	0.722	1.000
Domestic hydrogen acceptance (DHA)	0.922	0.923	0.951	0.865	1.000
Willingness to adopt H2 home (WTA)	0.934	0.934	0.958	0.883	n/a

<sup>a</sup> \*Lower-order constructs. \*\*Higher-order construct. <sup>b</sup> Results for validating the higher order construct (PT) are reported in SN5.

all indicators are affected by an individual latent construct.<sup>144,300</sup> For the higher-order construct, public trust, the repeated indicators approach is employed.<sup>145,301</sup> When assessing reflective constructs, the following four conditions should be met, while acknowledging that indicators of each construct should be closely correlated:<sup>143</sup> item reliability, internal consistency reliability, convergent validity, and discriminant validity.<sup>300</sup>

Item reliability was established since the proposed constructs explain more than half of the variance in their respective indicators,<sup>141</sup> as reflected by Cronbach Alpha (CA) values above 0.708 (see Table 5).<sup>141,302</sup> In two cases (TP1 = 0.657; PP1 = 0.555), CA fell below the more stringent threshold but still exceeded the guideline of 0.50 for exploratory research.<sup>143,303</sup> Both indicators were incorporated into the model to uphold content validity, since other reliability and validity requirements were satisfied. Internal consistency reliability is achieved when composite reliability (CR) values exceed 0.70,<sup>143</sup> which was satisfied for all constructs (see Table 5). Although four constructs (DHA, PT, TP, WTA) exceeded the preferred threshold of 0.90, indicator redundancy was ruled out since each CR ( $\rho_A$ ) value fell below 0.95.<sup>141</sup>

Next, convergent validity was supported given that the average variance extracted (AVE) exceeded 0.50 for all constructs (Table 5),<sup>143,304</sup> which suggests each construct explains the variance of its indicators.<sup>141</sup> Lastly, discriminant validity was satisfied in view of the heterotrait-monotrait (HTMT) ratio of

correlations (all values <0.80),<sup>305</sup> as well as the Fornell Larcker criterion<sup>306</sup> (see SN10†), thereby verifying that each construct could be considered empirically distinct (see Table 6).<sup>141</sup>

With the exception of components of the trust model (NRG = 3.645; ST = 4.854), VIF scores were below the recommended threshold of 3.0 (see Table 5), which indicated limited risk of multicollinearity issues.<sup>302</sup> For trust in the energy sector (NRG), the VIF value was well below the more stringent threshold of 5.0, while social trust (ST) presented a higher value but still within limits, as reported in SN11.†

**6.2.2 Structural model assessment.** Hypotheses formulated in Section 4 were tested using the bootstrapping procedure (10 000 sub-samples) in SmartPLS 4.1. Each path relationship proved highly significant ( $p < 0.001$ ) and demonstrated a positive effect, with complementary partial mediation supported where tested.<sup>307,308</sup> Firstly, all predictors of public trust (PT) had a strong influence, ranging from  $\beta = 0.205$  for trust in R&D to  $\beta = 0.263$  for social trust ( $M = 0.230$ ), which confirmed H1a–H1e. Additionally, H2a–H2e were supported since PT positively and significantly mediated the relationship between each trust dimension and perceived community benefits (PCB), as reported in Table 7.

PT had a small effect on PCB ( $\beta = 0.173$ ,  $f^2 = 0.047$ ), whereas technology perceptions (TP) had a moderate effect ( $\beta = 0.354$ ,  $f^2 = 0.234$ ). Production perceptions (PP:  $\beta = 0.277$ ,  $f^2 = 0.135$ ) proved more significant than safety perceptions (SP:  $\beta = 0.232$ ,  $f^2 = 0.084$ ) and PT, but less influential than TP. As a result, H7a–H10a were supported, while PCB had a large effect on domestic hydrogen acceptance (DHA:  $\beta = 0.674$ ,  $f^2 = 0.833$ ). PCB also positively mediated the relationship between PT, TP, SP, and PP in predicting DHA, thus confirming H12a–H12d, in addition to H11a. Compared to the direct effect of PT, TP, SP, and PP on PCB, the indirect effect of each construct on DHA decreases by ~32%.

Finally, DHA had a large effect on willingness to adopt a hydrogen home (WTA) ( $\beta = 0.628$ ,  $f^2 = 0.650$ ). Consequently, DHA positively mediates the relationship between PCB and WTA ( $\beta = 0.423$ ,  $p < 0.001$ ), confirming support H13a and H14.

Table 6 Heterotrait-monotrait results for assessment of discriminant validity

	DHA	PCB	PP	PT	SP	TP	WTA
DHA							
PCB	0.779						
PP	0.673	0.638					
PT	0.631	0.574	0.508				
SP	0.518	0.640	0.413	0.516			
TP	0.437	0.692	0.333	0.290	0.453		
WTA	0.675	0.514	0.418	0.389	0.368	0.278	



Table 7 Results of path analysis and hypothesis testing for PLS-SEM<sup>a</sup>

Hypothesis	$\beta$ coefficient (SD)	<i>t</i> -Statistic	$\rho$ -Value	$f^2$	Result
H1a: GOV $\rightarrow$ (+) PT	0.214 (0.003)	65.892	<0.001	n/a	Supported
H2a: NRG $\rightarrow$ (+) PT	0.236 (0.003)	74.764	<0.001	n/a	Supported
H3a: QUAL $\rightarrow$ (+) PT	0.233 (0.003)	68.683	<0.001	n/a	Supported
H4a: R&D $\rightarrow$ (+) PT	0.205 (0.003)	59.609	<0.001	n/a	Supported
H5a: ST $\rightarrow$ (+) PT	0.263 (0.003)	90.284	<0.001	n/a	Supported
H6a: GOV $\rightarrow$ PT $\rightarrow$ (+) PCB	0.037 (0.005)	7.968	<0.001	n/a	Supported
H6b: NRG $\rightarrow$ PT $\rightarrow$ (+) PCB	0.041 (0.005)	7.953	<0.001	n/a	Supported
H6c: QUAL $\rightarrow$ PT $\rightarrow$ (+) PCB	0.040 (0.005)	7.841	<0.001	n/a	Supported
H6d: R&D $\rightarrow$ PT $\rightarrow$ (+) PCB	0.035 (0.005)	7.726	<0.001	n/a	Supported
H6e: ST $\rightarrow$ PT $\rightarrow$ (+) PCB	0.045 (0.006)	7.969	<0.001	n/a	Supported
H7a: PT $\rightarrow$ (+) PCB	0.173 (0.022)	7.890	<0.001	0.047*	Supported
H8a: TP $\rightarrow$ (+) PCB	0.354 (0.022)	16.272	<0.001	0.234**	Supported
H9a: SP $\rightarrow$ PCB	0.232 (0.022)	10.537	<0.001	0.084*	Supported
H10a: PP $\rightarrow$ PCB	0.277 (0.021)	13.172	<0.001	0.135*	Supported
H11a: PCB $\rightarrow$ (+) DHA	0.674 (0.016)	43.138	<0.001	0.833***	Supported
H12a: PT $\rightarrow$ PCB (+) $\rightarrow$ DHA	0.117 (0.015)	7.582	<0.001	n/a	Supported
H12b: TP $\rightarrow$ PCB (+) $\rightarrow$ DHA	0.238 (0.015)	16.020	<0.001	n/a	Supported
H12c: SP $\rightarrow$ PCB $\rightarrow$ DHA	0.157 (0.016)	10.087	<0.001	n/a	Supported
H12d: PP $\rightarrow$ PCB $\rightarrow$ DHA	0.187 (0.015)	12.297	<0.001	n/a	Supported
H13a: DHA $\rightarrow$ (+) WTA	0.628 (0.015)	41.656	<0.001	0.650***	Supported
H14: PCB $\rightarrow$ DHA (+) $\rightarrow$ WTA	0.423 (0.015)	27.511	<0.001	n/a	Supported

<sup>a</sup> \*\*\*Large effect size ( $f^2 \geq 0.35$ ). \*\*Moderate effect size ( $0.15 \leq f^2 < 0.35$ ). \*Small effect size ( $0.02 \leq f^2 < 0.15$ ).

The modelling approach provides a robust theoretical and empirical starting point for understanding the dynamics of domestic hydrogen acceptance and adoption, as supported by graphical outputs displayed in Fig. 8a and b (see SN12<sup>†</sup>).

**6.2.3 In-sample predictive power.** The coefficient of determination ( $R^2$ ) measures how much variance is explained by all predictors in relation to the outcome variable, thus providing a measure of in-sample predictive power.<sup>298,309</sup> Guidelines in the literature suggest  $R^2$  values of 0.25, 0.50, and 0.75 represent weak, moderate, and substantial effect sizes.<sup>310</sup> However, substantial effect sizes are less common when examining novel research areas such as hydrogen energy acceptance, therefore, conclusions should be drawn according to the technology case.<sup>311,312</sup>

In predicting perceived community benefits, the trust-based model demonstrated moderate levels of explanatory predictive power ( $R^2 = 0.561$ ). However, in-sample predictive power was somewhat lower for domestic hydrogen acceptance ( $R^2 = 0.454$ ) and willingness to adopt a hydrogen home ( $R^2 = 0.394$ ). By comparison, the DHAM demonstrated stronger predictive power by operationalising ten exogenous constructs ( $R^2 = 66.9\%$ ), as did the STEEEP Framework when measuring perceived adoption potential *via* five exogenous predictors and a higher-order construct for technology perceptions ( $R^2 = 61.2\%$ ). However, both frameworks incorporated the emotional dimension into the modelling approach, among other constructs, which largely explains the discrepancy in results. Overall, the trust-based model performs comparably or outperforms similar approaches in the literature,<sup>287</sup> as further discussed in Section 7.

**6.2.4 Out-of-sample predictive power.** In addition to evaluating explanatory predictive power, measuring out-of-sample predictive power helps establish whether the modelling

results can reliably inform decision-making processes.<sup>137</sup> Shmueli and colleagues<sup>313</sup> developed the PLS<sub>predict</sub> tool, which employs a blindfolding procedure<sup>†††</sup> to calculate the Stone-Geisser's  $Q^2$  value for each endogenous construct.<sup>314,315</sup>  $Q^2$  measured 0.558 for perceived community benefits, suggesting substantial predictive relevance (*i.e.*  $>0.50$ ), whereas predictive relevance proved moderate for domestic hydrogen acceptance ( $Q^2 = 0.434$ ) and small for willingness to adopt a hydrogen home ( $Q^2 = 0.178$ ).<sup>141</sup>

The cross-validated predictive ability test (CVPAT)<sup>‡‡‡</sup> is a recommended technique for statistically assessing out-of-sample predictive power.<sup>137</sup> The trust-based model demonstrated predictive validity by outperforming the indicator average (IA) prediction benchmark, as reflected by a negative and significant difference for all endogenous constructs and the overall model (see Table 8).<sup>137</sup> However, refinements are needed to raise predictive accuracy since the model failed to outperform the more conservative linear model (LM) prediction benchmark,<sup>316</sup> following a positive average loss difference in all cases. Accordingly, research innovations are required to increase the predictive power of trust-based, hydrogen technology acceptance models, as highlighted in Section 7.

### 6.3 Results from importance-performance map analysis

To further examine the antecedents of public trust in the domestic hydrogen transition, importance-performance map

<sup>†††</sup> A holdout-sample-based procedure that generates case-level predictions on an item or a construct level to reap the benefits of predictive model assessment in PLS-SEM.<sup>313</sup>

<sup>‡‡‡</sup> The CVPAT performs "a pairwise comparison between theoretically derived competing models," and then selects "the model with the highest predictive power based on a prespecified statistical significance level".<sup>137</sup>





Fig. 8 (a) Structural model path coefficients and indicator loadings. (b) Structural model path coefficients and  $t$ -statistics.

analysis (IMPA) is undertaken at both the construct and indicator level (see Fig. 9). Following the structural model, social trust has the largest effect size (*i.e.* importance) while trust in R&D has least importance, as reflected by a degree of separation on the matrix.

In terms of both importance and performance, there is negligible difference between trust in the energy sector and trust in product and service quality. However, trust in R&D outperforms trust in the government, therefore, more resources should be allocated towards improving trust in the central government, regional authorities, and local councils, as compared to trust in NGOs, universities, and other research institutes or organisations.

At the indicator level, alongside trust in the central government (LV = 39.653), trust in the media (LV = 40.336) has the lowest performance. By comparison, the mean performance level across all 16 indicators is 51.609 (SD = 6.38), with seven indicators falling below the mean (3 for GOV, 2 for NRG, 2 for ST). However, there is less variance in terms of importance ( $M = 0.082$ ,  $SD = 0.006$ ). The largest effect sizes are attributed to trust in boiler manufacturers ( $\beta = 0.091$ ), electricity and/or gas suppliers ( $\beta = 0.089$ ), and fuel/gas supply companies ( $\beta = 0.088$ ). The finding signals the importance of raising confidence in the energy sector and supply chain to support the deployment of hydrogen home appliances.



Table 8 CVPAT benchmark and results for predictive ability test

Target construct	PLS-SEM vs. indicator average (IA)				
	PLS loss	IA loss	Average loss difference	t-Value	p-Value
Domestic hydrogen acceptance	3.046	4.874	-1.828	18.541	<0.001
Perceived community benefits	2.580	4.316	-1.736	17.55	<0.001
Public trust	2.346	5.534	-3.188	30.878	<0.001
Willingness to adopt H2 home	0.875	1.039	-0.164	11.875	<0.001
Overall	2.282	4.769	-2.488	31.798	<0.001

Target construct	PLS-SEM vs. linear model (LM)				
	PLS loss	LM loss	Average loss difference	t-Value	p-Value
Domestic hydrogen acceptance	3.046	2.471	+0.575	9.491	<0.001
Perceived community benefits	2.580	2.433	+0.146	5.796	<0.001
Public trust	2.346	0.000	+2.346	52.707	<0.001
Willingness to adopt H2 home	0.875	0.823	+0.052	4.539	<0.001
Overall	2.282	0.687	+1.594	52.819	<0.001

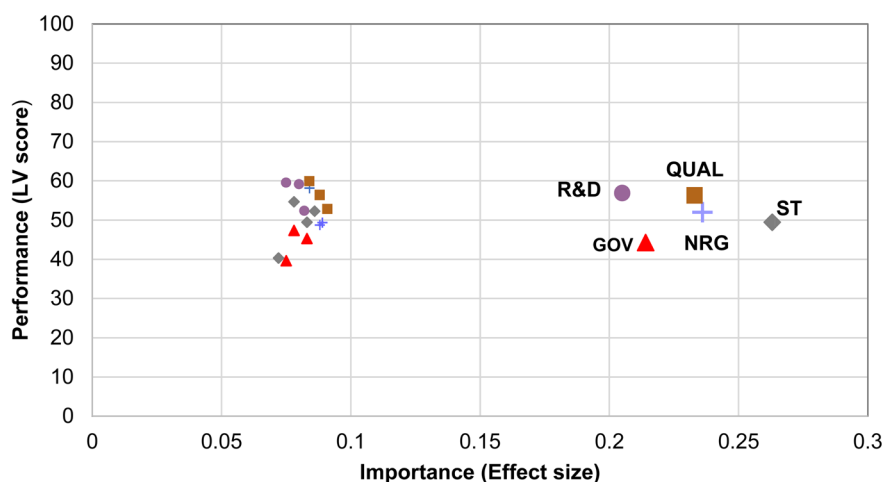


Fig. 9 Importance-performance map analysis for public trust. Blue = trust in the energy sector (NRG); red = trust in the government (GOV); brown = trust in product and service quality (QUAL); mauve = trust in R&D; grey = social trust (ST).

Additionally, improving the credibility of the media would help support the domestic hydrogen transition through stronger public trust. Furthermore, raising social trust calls for a combined strategy to improve public perceptions of GDNOs, financial institutions, and Ofgem. Overall, the systems-

oriented dimension of public trust should be raised first and foremost (*i.e.* ST), followed by the industry-, supply-chain-, institutionally-, and knowledge-oriented dimensions (*i.e.* NRG, QUAL, GOV, and R&D).

Table 9 NCA parameters for public trust in the domestic hydrogen transition (CR-FDH line)<sup>a</sup>

Construct	Accuracy (%)	Number of observations above ceiling zone	Slope	Intercept	Effect size
H1b: GOV	99.512	9	0.410	58.58	0.184*
H2b: NRG	99.187	18	0.655	35.89	0.293*
H3b: QUAL	98.753	23	0.751	26.76	0.337**
H4b: R&D	98.916	20	0.712	33.42	0.291*
H5b: ST	99.079	17	0.629	36.67	0.296*

<sup>a</sup> \*\*Medium effect size. \*Small effect size.





Table 10 Bottleneck tables showing percentile results for enabling public trust (CR-FDH)

Target outcome	Failure rate per construct (%)				
	GOV	NRG	QUAL	R&D	ST
PT					
0	NN	NN	NN	NN	NN
10	NN	NN	NN	NN	NN
20	NN	NN	NN	NN	NN
30	NN	NN	0.76	NN	NN
40	NN	2.44	3.14	1.62	1.70
50	NN	8.29	8.29	4.93	7.97
60	NN	21.79	21.52	12.79	22.06
70	18.65	38.21	45.37	28.67	45.31
80	49.49	67.86	70.35	56.48	76.59
90	85.47	88.40	91.76	81.90	94.91
100	99.19	98.48	98.37	96.59	99.78

While the variance between trust factors is similar at the 60–80% level of public trust (60%:  $M = 15.63\%$ ,  $SD = 9.57$ ; 70%:  $M = 35.24\%$ ,  $SD = 11.53$ ; 80%:  $M = 64.15\%$ ,  $SD = 10.96$ ), critical thresholds begin to converge more closely at the 90% level ( $M = 88.49\%$ ,  $SD = 5.11$ ). At this level, social trust is the most important prerequisite for securing public trust (FR = 94.91%), while trust in R&D is the least important precondition (FR = 81.90%).

In summary, it emerges that public trust in the domestic hydrogen transition will be disabled when social trust, in addition to trust in the government, energy sector, product and service quality, or R&D are absent. At present, achieving a medium-to-high level of public trust is constrained by a substantial deficit across each of the five dimensions presented Fig. 7, which operate as both should-have and must-have

factors for enabling public trust in domestic hydrogen futures,<sup>33,106</sup> as described in Table 11.

**6.4.2 Preconditions for enabling perceived community benefits in the transition to hydrogen homes.** The results for necessary condition hypotheses examining perceived community benefits show a split outcome: H8b and H10b are supported, while H7b and H9b are unsupported, as reported in Table 12. Foremost, perceived community benefits rests on how the public perceives respective hydrogen production pathways ( $d = 0.143$ ,  $p < 0.001$ ), while technology perceptions has a small effect size on the target outcome ( $d = 0.106$ ,  $p < 0.001$ ). By contrast, consumers may perceive community benefits in the absence of safety perceptions ( $d = 0.083$ ,  $p < 0.001$ ). Additionally, public trust is not a precondition for establishing public perceptions of local socio-economic and environmental benefits in the context of the domestic hydrogen transition ( $d = 0.061$ ,  $p < 0.001$ ). Consequently, the largest empty space in the upper left of the NCA scatterplots corresponds to production perceptions, followed by technology perceptions, safety perceptions, and lastly, public trust (see Fig. 12a–d).

To further unpack the dynamics for enabling specific levels of perceived community benefits, Table 13 presents the bottleneck results for each construct. Firstly, it emerges that no specific level of public trust, technology perceptions, safety perceptions or production perceptions is needed to enable perceived community benefits up to the 20% level (see SN14†). However, by the 30% level, a fraction of respondents fail to satisfy the required threshold for safety and production perceptions to enable perceived community benefits. However, technology perceptions only becomes critical to enabling the 60% level, while public trust is influential at the 70% level, which reflects the insignificant finding in Table 12.



Fig. 11 Bottleneck charts for public trust in the domestic hydrogen transition.



Table 11 Results for combined use of PLS-SEM and NCA for public trust

Construct	PLS-SEM results (path coefficient; <i>p</i> -value)	NCA results ( <i>d</i> ; <i>p</i> -value)	Combined result
Trust in the government (GOV)	H1a: significant determinant (0.214; <0.001)	H1b: necessary condition (0.184; <0.001)	• Significant determinant and a necessary condition
Trust in the energy sector (NRG)	H2a: significant determinant (0.236; <0.001)	H2b: necessary condition (0.293; <0.001)	• Significant determinant and a necessary condition
Trust in product and service quality (QUAL)	H3a: significant determinant (0.233; <0.001)	H3b: necessary condition (0.337; <0.001)	• Significant determinant and a necessary condition
Trust in research and development (R&D)	H4a: significant determinant (0.205; <0.001)	H4b: necessary condition (0.291; <0.001)	• Significant determinant and a necessary condition
Social trust (ST)	H5a: significant determinant (0.263; <0.001)	H5b: necessary condition (0.296; <0.001)	• Significant determinant and a necessary condition

Table 12 NCA parameters for perceived community benefits of transitioning to hydrogen homes

Construct	Accuracy (%)	Number of observations above ceiling zone	Slope	Intercept	Effect size
H7b: PT	99.675	6	1.340	60.19	0.061
H8b: TP	99.675	6	0.766	59.78	0.106*
H9b: SP	98.621	7	3.439	24.94	0.083
H10b: PP	98.729	5	1.986	22.02	0.143**

In view of these dynamics, Fig. 13 presents the bottleneck chart results for the 70% level of perceived community benefits through to the maximum level. By visualising the bottleneck results, areas of convergence and divergence can be highlighted. For example, the average failure rate at the 70% level is comparable across all metrics ( $M = 1.10\%$ ,  $SD = 0.13$ ), while the difference remains negligible at the 80% level ( $M = 2.10$ ,  $SD = 0.59$ ). However, at the 90% level, the failure rate is above the mean ( $M = 4.37$ ,  $SD = 2.23$ ) for public trust (FR = 6.40%) and technology perceptions (FR = 6.18%). At the maximum level of perceived community benefits, this pattern is partially preserved since public trust (FR = 10.57%) and technology perceptions (FR = 17.51%) fall above the mean value ( $M = 9.20$ ,  $SD = 6.32$ ).

Accordingly, bottleneck analysis provides a more nuanced interpretation of the role of public trust, technology, safety, and production perceptions in shaping perceived community benefits. While the permutation test indicates that production perceptions and technology perceptions have a small effect size, the significance of public trust and safety perceptions should not be overlooked outright since both factors constrain the potential for maximising perceived community benefits.

Notably, compared to production perceptions, close to twice as many respondents fell short of the required threshold level of public trust to maximise the target outcome. Most strikingly, more than three times as many cases failed for technology perceptions compared to production perceptions, which demonstrates the necessity for improving consumer attitudes towards the technological dimension of hydrogen heating and cooking. Nevertheless, it should be emphasised that other factors can potentially compensate for the absence of public trust and positive safety perceptions, which emerge as should-have factors. By contrast, positive technology and production

perceptions are preconditions for facilitating perceived community benefits, as summarised in Table 14.

**6.4.3 Combined importance-performance map analysis for perceived community benefits.** Integrating the bottleneck results for 100% perceived adoption potential (see Fig. 13) alongside dimensions of importance and performance for perceived community benefits (see SN15†) yields Fig. 14. In terms of increasing the perceived socio-economic and environmental benefits of transitioning to hydrogen homes, the technological dimension carries the most importance, followed by the environmental and safety dimensions, while public trust has the least influence.

Additionally, and supplementing the path analysis (see Fig. 8), the four constructs present a linear relationship in terms of performance whereby technology perceptions outperforms public trust by a significant margin (+17.625). Nevertheless, there is still relatively large scope to improve technology perceptions (LV = 69.627), which should be the foremost policy and managerial priority, followed by raising production perceptions (LV = 63.849). While public trust contributes comparatively less significantly to perceived community benefits, decision-makers should nevertheless recognise the underlying opportunity to raise consumer confidence in the prospect of hydrogen homes through awareness campaigns and public engagement.

Accordingly, strengthening public trust may be viewed as a more long-term strategic intervention for fuelling hydrogen futures, which is necessary to counteract risk perceptions and community concerns.<sup>317</sup> Importantly, at the maximum level of perceived community benefits, public trust presents a larger bottleneck than production and safety perceptions, reflecting the dynamics observed in Fig. 6 and 7.



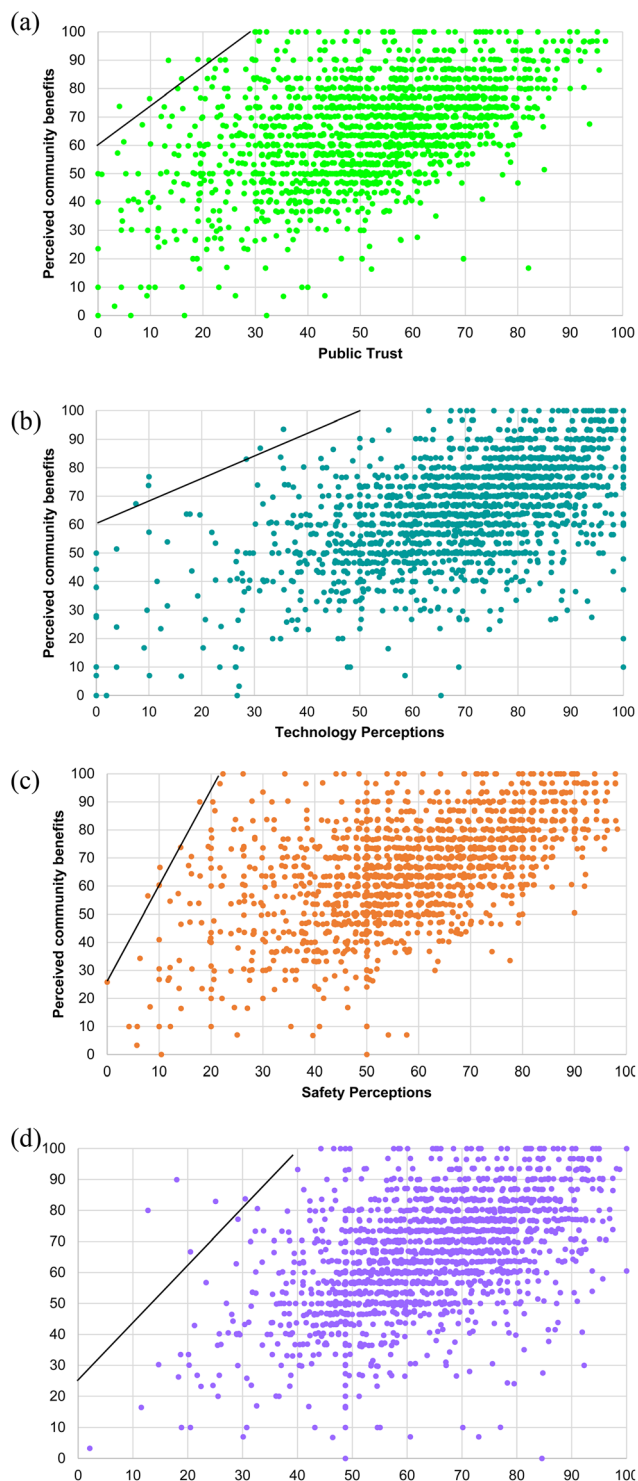


Fig. 12 (a) NCA scatterplot for public trust as a predictor of perceived community benefits. (b) NCA scatterplot for technology perceptions as a predictor of perceived community benefits. (c) NCA scatterplot for safety perceptions as a predictor of perceived community benefits. (d) NCA scatterplot for production perceptions as a predictor of perceived community benefits.

**6.4.4 Preconditions for enabling domestic hydrogen acceptance and willingness to adopt hydrogen homes.** Necessary condition analysis demonstrates that perceived community

Table 13 Bottleneck tables showing percentile results for enabling perceived community benefits of transitioning to hydrogen homes (CR-FDH)

Target outcome (%)	Failure rate per construct (%)				
	PCB	PT	TP	SP	PP
0	NN	NN	NN	NN	NN
10	NN	NN	NN	NN	NN
20	NN	NN	NN	NN	NN
30	NN	NN	NN	0.05	0.05
40	NN	NN	NN	0.11	0.05
50	NN	NN	NN	0.27	0.16
60	NN	0.49	0.76	0.43	0.43
70	1.19	1.19	1.08	0.92	0.92
80	2.93	2.06	1.57	1.84	1.84
90	6.40	6.18	2.01	2.87	2.87
100	10.57	17.51	3.31	5.42	5.42

benefits plays an enabling role in supporting domestic hydrogen acceptance ( $d = 0.104, p < 0.001$ ), confirming support for H11b. However, in comparative terms, domestic hydrogen acceptance is a stronger prerequisite for facilitating willingness to adopt a hydrogen homes ( $d = 0.147, p < 0.001$ ), which confirms the final necessary conditions hypothesis, H13b (see Table 15). Accordingly, the empty space in the upper left scatterplot is smaller in Fig. 15 than 16.

The bottleneck analysis expounds the dynamics of each relationship, as captured in Table 16 (see SN16<sup>†</sup>). Perceived community benefits becomes a precondition for enabling social acceptance at the 60% level, while social acceptance is required to facilitate adoption willingness at the 50% level. In response, the bottleneck charts presented in Fig. 17 focus on the 60% level of each target outcome through to the maximum level. The following dynamics are observed: the failure rate for domestic hydrogen acceptance as an enabler of adoption willingness is 7.6, 5.1, 4.3, 2.6, and 2.4 times greater at the 60, 70, 80, 90, and 100 percent level than for perceived community benefits as an enabler of domestic hydrogen acceptance. This translates to 27.0% of respondents failing to meet the threshold for social acceptance to maximise adoption willingness, compared to 11.4% for perceived community benefits when maximising social acceptance.

The combined use of PLS-SEM and NCA suggests that perceived community benefits is both a should-have ( $\beta = 0.674, p < 0.001$ ) and must-have factor ( $d = 0.104, p < 0.001$ ) if domestic hydrogen acceptance is to manifest across society. The same holds true when considering the role of domestic hydrogen acceptance in shaping adoption prospects, however, the sufficiency relationship is marginally weaker ( $\beta = 0.628, p < 0.001$ ) compared to PCB  $\rightarrow$  DHA, while the necessity relationship is somewhat stronger ( $d = 0.147, p < 0.001$ ).

These observations enable key stakeholders to reflect on the relative importance of securing economic, social, and environmental benefits for local communities directly involved in the transition to hydrogen homes. In parallel, the results underline



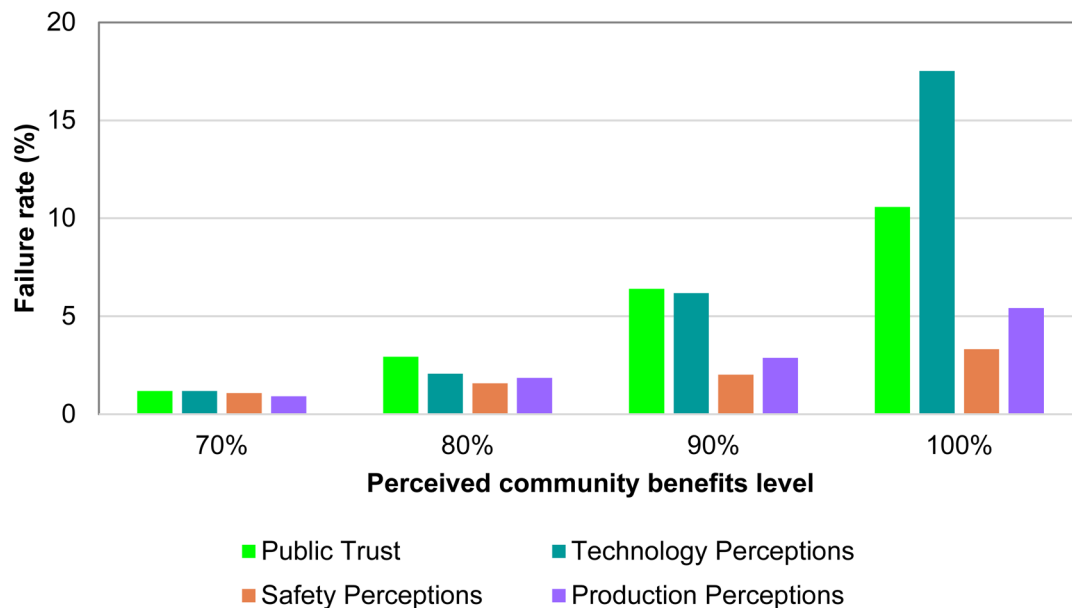


Fig. 13 Bottleneck charts for perceived community benefits of transitioning to hydrogen homes.

the importance of social acceptance as a stepping-stone towards market acceptance and potential technology diffusion.

## 7 Discussion

This study set out to answer four distinct research questions by examining the antecedents of domestic hydrogen acceptance and adoption *via* a sufficiency- and necessity-based perspective. The presented evidence bridges a research gap on the dynamics of public trust, while consolidating understanding on the interactions between perceived (community) benefits, social acceptance, and potential technology adoption for supporting the energy transition.

### 7.1 Unpacking the antecedents of public trust in hydrogen homes

Regarding the first research question, the modelling results underscore the extent to which public trust is an inherently multi-dimensional process, shaped by aspects of institutionally-, industry-, supply-chain-, knowledge-, and systems-oriented trust (see Fig. 5). NCA suggests trust in product and service quality for

hydrogen appliances is the most important precondition for enabling public trust. This result is validated within the model since technology perceptions has the largest influence on shaping perceived community benefits (see Fig. 8), in addition to functioning as a necessary condition (see Fig. 12b). While trust in the hydrogen supply chain presents a potentially critical bottleneck to establishing public trust, institutional trust is comparatively less imperative (see Table 12). However, in terms of increasing public trust, the systems-oriented dimension carries the most weight (see Fig. 8) and presents the largest bottleneck (see Fig. 11).

It follows that building social trust, as characterised within the context of this study (see Section 5), is the most direct measure for increasing public trust in hydrogen homes, which aligns to the multi-country findings captured by Smith and Mayer<sup>242</sup> when examining public engagement with climate change. Nevertheless, public trust is also contingent upon sufficient levels of trust in the energy sector, and to a lesser degree, entities involved in R&D-related activities. Importantly, Emmerich and colleagues<sup>245</sup> highlighted that trust in industry is significant for generating both general and local acceptance in

Table 14 Results for combined use of PLS-SEM and NCA for perceived community benefits

Construct	PLS-SEM results (path coefficient; <i>p</i> -value)	NCA results ( <i>d</i> ; <i>p</i> -value)	Combined result
Public trust (PT)	H7a: significant determinant (0.173; <0.001)	H7b: not a necessary condition (0.061; <0.001)	• Significant determinant but not a necessary condition
Technology perceptions (TP)	H8a: significant determinant (0.354; <0.001)	H8b: necessary condition (0.106; <0.001)	• Significant determinant but not a necessary condition
Safety perceptions (SP)	H9a: significant determinant (0.232; <0.001)	H9b: not a necessary condition (0.083; <0.001)	• Significant determinant but not a necessary condition
Production perceptions (PP)	H10a: significant determinant (0.277; <0.001)	H10b: necessary condition (0.143; <0.001)	• Significant determinant but not a necessary condition





Fig. 14 Combined importance-performance map analysis for 100% level of perceived community benefits. Construct's average importance = 0.259. Constructs' average performance = 61.036. Bubble size = percentage of cases that have not met the critical threshold.

Table 15 NCA parameters for perceived community benefits of transitioning to hydrogen homes

Construct	Accuracy (%)	Number of observations above ceiling zone	Slope	Intercept	Effect size
H11b: PCB (→DHA)	99.837	3	1.022	53.798	0.104
H13b: DHA (→WTA)	99.837	3	1.065	43.989	0.147

HFSs across the German population. The crucial role of the energy sector as brokers of public trust is reflected in the modelling results since production perceptions emerged as the most important precondition of enabling perceived community

benefits. Relatedly, in the UK context, Lee and Reiner<sup>213</sup> observed that pro-renewable respondents assign more importance to the role of companies compared to the government when it comes to addressing climate change.



Fig. 15 NCA scatterplot for perceived community benefits as a predictor of domestic hydrogen acceptance.



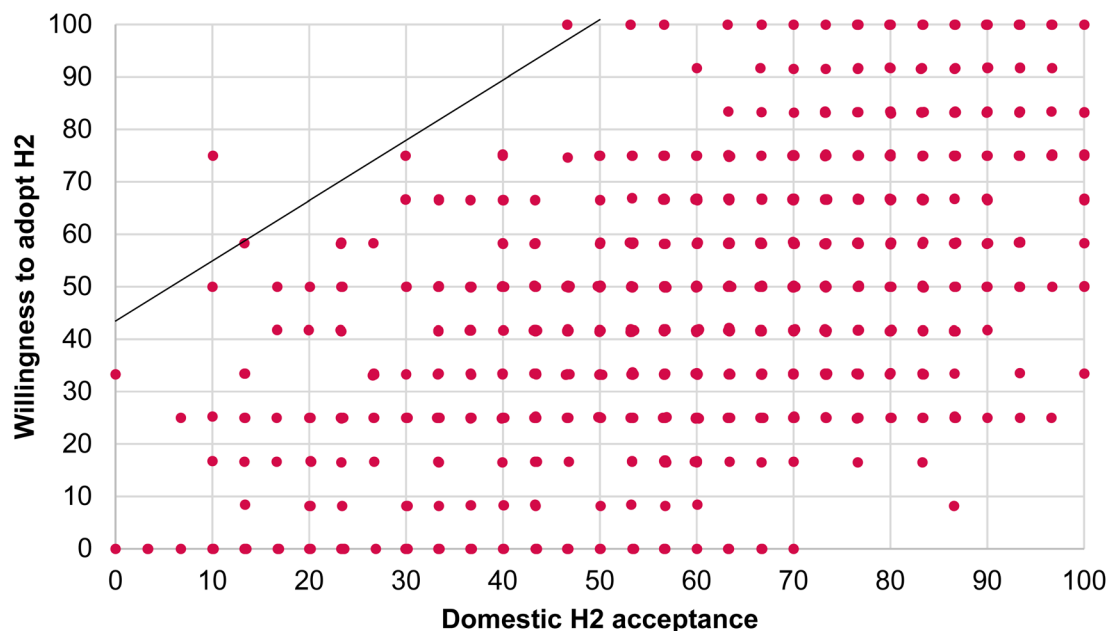


Fig. 16 NCA scatterplot for domestic hydrogen acceptance as a predictor of willingness to adopt a hydrogen home.

Notably, the largest deficits in public trust stem from negative perceptions of the central government and media (see Fig. 6), which is consistent with national survey data collected in 2022 ( $N = 3162$ )<sup>318</sup> and reflective of the political challenges facing deep decarbonisation.<sup>243</sup> Consolidating social trust will hinge on both sets of actors, since national media coverage frequently reflects the sub-par performance of the UK government and its energy policy representatives.<sup>319–321</sup> It follows that media narratives and discourses may impede public trust in the domestic hydrogen transition.<sup>322–324</sup>

**7.1.1 Recent trends in the UK based on the Edelman Trust Barometer.** Empirical insights gathered *via* the Edelman Trust Barometer<sup>325–327</sup> further validate the findings of this study. Edelman's barometer categorises a score of 1–49 as corresponding to 'distrust', 50–59 as 'neutral', and 60–100 as 'trust',

which applied to just one datapoint between January 2020 and November 2023 for the UK (Government trust = 60 in May 2020). Coinciding with the timing of this study, data collected by the Edelman Trust Institute reports notable levels of distrust in both the government and media (37/100), while this study reported respective scores of 3.97 and 4.03 on an 11-point scale (see Fig. 6). On the other hand, Edelman's tracker showed moderately higher levels of trust in the business sector and NGOs, which is also consistent with the results of this study.

Fig. 18 relays the extent to which trust in the government, and by proxy public support for net-zero technologies such as hydrogen appliances, may be contingent on the political cycle and macro-economic events.<sup>64</sup> It can be deduced that trust in the government and media is quite closely correlated, although historically the UK public has proved more trusting of the government. Recent trends caution that political mistrust may present a significant bottleneck to enacting net-zero mandates,<sup>79</sup> while public trust in the business sector and NGOs has declined slightly since 2020.

Interestingly, average trust levels were lowest in February 2022 ( $M = 33$ ), likely due to the ramifications of COVID-19 alongside the energy crisis but recovered somewhat by November 2022 ( $M = 43$ ) before declining again in 2023 ( $M = 37$ ). Overall, November 2022 is closely representative of the four-year period ( $M = 42.0$ ,  $SD = 5.7$ ; interquartile range (IQR) = 37.0–44.5), highlighting the relevance of analysing the current dataset (*i.e.* also collected in Q4 of 2022). Moreover, public trust levels were higher between 2020 and 2021 ( $M = 47$ ,  $M = 44$ ), which coincided with a period of relative political momentum towards advancing hydrogen homes (see Fig. 1). By contrast, the collapse of planned village trials for the North of England transpired during a year of underlying distrust. Extrapolating these observations, it can be concluded that trialling hydrogen

Table 16 Bottleneck tables showing percentile results for enabling domestic hydrogen acceptance and willingness to adopt a hydrogen homes (CR-FDH)

Target outcome (%)	Failure rate	Target outcome (%)	Failure rate (%)
DHA	PCB	WTA	DHA
0	NN	0	NN
10	NN	10	NN
20	NN	20	NN
30	NN	30	NN
40	NN	40	NN
50	NN	50	0.71
60	0.33	60	2.49
70	1.03	70	5.20
80	2.01	80	8.62
90	4.82	90	12.74
100	11.38	100	26.99





Fig. 17 Bottleneck charts for domestic hydrogen acceptance and willingness to adopt a hydrogen home.

homes may prove more socio-politically feasible under conditions of stronger public trust.

**7.1.2 International trends observed via the Edelman Trust Barometer.** As argued by Gupta *et al.*<sup>214</sup> in the emerging context of nuclear fusion energy, institutional trust is a powerful indicator of public support for emerging technologies, which may be strengthened *via* transparent and adaptive regulatory processes. Regarding institutional trust, this study indicates that the UK public has comparatively higher levels of confidence in local councils, followed by regional authorities for steering the domestic hydrogen transition (see Fig. 6). This pattern deviates from the Australian context where ‘public trust for acting in the best interests of consumers if a hydrogen economy were to develop’ proved highest at the State government level ( $M = 4.94$ ) and lowest at the local government level ( $M = 4.84$ ), with the Federal government falling in between ( $M = 4.89$ ).<sup>45</sup>

Kitt *et al.*<sup>211</sup> also found higher levels of competence-based and integrity-based trust in the Federal government compared to the provincial government when evaluating public attitudes towards low-carbon transportation policies in Canada. Whereas trust in the nationwide energy transition among Dutch homeowners<sup>¶¶¶</sup> fell more comfortably above the mid-point ( $M = 3.96$  on a 7-point scale),<sup>328</sup> this study reveals lower levels of public trust in hydrogen homes across the UK population. Given the evidence presented in Section 4.2, this study further motivates the need for cross-national comparative research on trust mechanisms shaping hydrogen-fuelled futures.<sup>329,330</sup>

Given that the Edelman Trust Barometer<sup>331</sup> ranked the UK as having the fourth lowest (43/100 points) and lowest trust ranking (39/100 points) out of 28 countries for 2023 and 2024, respectively, this analysis reflects trust dynamics in the hydrogen transition under unfavourable socio-political conditions (see Fig. 18). Notably, ten other countries in addition to

the UK were allocated a ‘distrust’ rating for 2023 and 2024 (Sweden, Ireland, United States, France, South Africa, Germany, Spain, Argentina, Japan, and the Republic of Korea).<sup>331</sup> Alongside the UK, most of this group has advanced national hydrogen strategies, with several members taking a leadership position in the emerging global hydrogen economy.<sup>|||||</sup><sup>25</sup>

Fig. 19 provides additional comparative insights by incorporating average trust ratings for the six countries reviewed in Section 2, wherein three countries qualify for the ‘neutral’ category (*i.e.* trust index  $>50$ ), namely, the Netherlands ( $M = 57$ ), Canada ( $M = 54$ ), and Australia ( $M = 51$ ). Alongside the UK ( $M = 43$ ), Japan and Germany correspond to the ‘distrust’ category. Japan ranks below the UK ( $M = 40$ ), while Germany performs marginally better ( $M = 47$ ). Cumulatively, the small sample averages a distrust rating of 48.5 (SD = 6.7; IQR = 43.0–54.0), while Edelman<sup>331</sup> report higher levels of public trust in developing countries ( $M = 63$ ) compared to developed countries ( $M = 49$ ). Foremost, China ( $M = 80$ ) and India ( $M = 75$ ) enter the ‘trust’ category, although China had a democracy index of 2.1 in 2023 compared to 7.2 for India, reflecting the pronounced political distinction between the world’s most populous countries.

The countries composing the small sample rank closely on the 2023 Democracy Index ( $M = 8.7$ , SD = 0.3; IQR = 8.4–8.9), while the Kendall’s tau-b ( $\tau_b$ ) (non-parametric) correlation test returns a statistically insignificant result when evaluating the association between democracy and public trust ( $\tau_b = 0.527$ ,  $\rho = 0.207$ ). Although the two variables hold a weak positive association (inferring that stronger democracies may partially encouraging higher levels of public trust), the non-significant finding is supported in view of China’s leading position in the

||||| Notably, among the hydrogen frontrunners, Australia also ranked in the distrust category in 2023 (48 points) but reached the neutral category in 2024 (52 points).

¶¶¶ In the context of willingness to invest in a sustainable heating system.



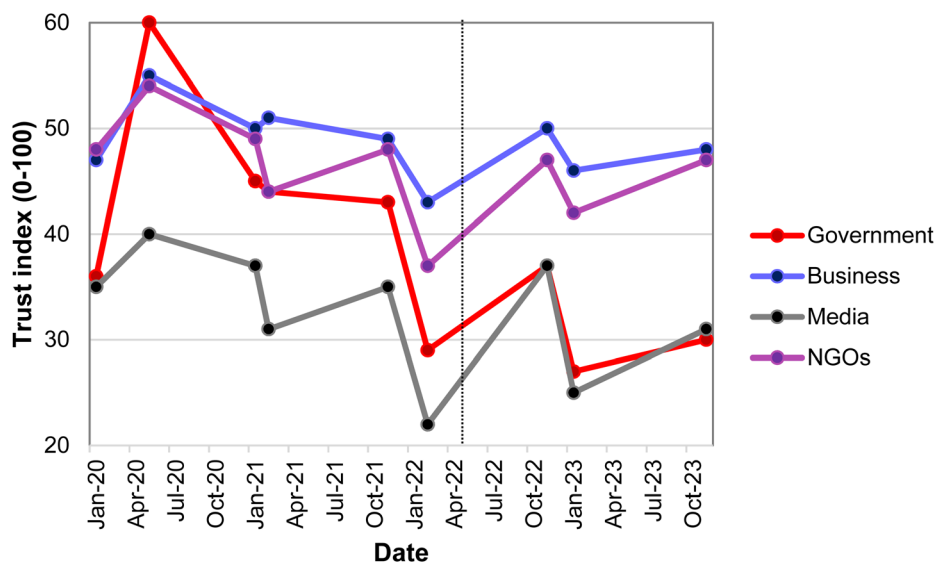


Fig. 18 UK trust index, January 2020 to October 2023. Source: authors' illustration based on Edelman Trust Barometer.<sup>325–327</sup> Dotted black line = time of data collection for this study (Oct–Dec 2022).

Edelman Trust Barometer and also aligns with Jordan *et al.*'s perspective of public trust in climate policy.<sup>243</sup>

While the Edelman Trust Barometer is but one source of information and not without its limitations,<sup>332</sup> it is notable that Japan and South Korea were the first countries to launch national hydrogen strategies<sup>67</sup> but continue to face social acceptance challenges in this domain.<sup>22,333</sup> In April 2020, the Netherlands became the first European country to publish its national hydrogen strategy and like the UK has ambitious plans for developing an industrially-based hydrogen economy.<sup>334</sup>

Notably, hydrogen acceptance research has been pioneered by Dutch scholars since the early 2000s<sup>335,336</sup> and substantially extended thereafter.<sup>248,337,338</sup> Crucially, the Netherlands has experienced greater success in trialling hydrogen homes compared to the UK.<sup>339,340</sup> Given that UK government funding has also supported social science research on hydrogen acceptance,<sup>280,341,342</sup> one explanatory factor for this divergence could be public trust (see Fig. 19).

**7.1.3 Comparative insights based on observations in the literature.** As emphasised in the preceding sub-sections, public



Fig. 19 Edelman Trust Index, 2019–2024. Source: authors' illustration based on the Edelman Trust Barometer.<sup>331,343–346</sup>



Table 17 Comparative assessment of public trust in hydrogen actors and stakeholders across different national jurisdictions, 2014–2023

Actor/stakeholder	NL, 2014 (H2 supporters) <sup>248</sup>	NL, 2014 (H2 opponents) <sup>248</sup>	AU, 2018 (ref. 44)	AU, 2019 (ref. 250)	AU, 2021 (ref. 45)	DE, 2020	DE, 2023 (ref. 347)	GB-SCT, 2023 (ref. 249)	This dataset (GB, 2022)	Sample mean	Difference (this dataset-mean)
Central government	n/a	n/a	6.64	6.22	7.06	n/a	6.00 <sup>c</sup>	5.56 <sup>c</sup>	4.33	5.97	-1.64
Regional authorities	n/a	n/a	6.64	n/a	6.99	n/a	5.98 <sup>c</sup>	n/a	4.94	6.14	-1.20
Local councils	8.02	6.66	6.46	n/a	6.91	7.29	5.98 <sup>c</sup>	n/a	5.17	6.64	-1.47
Fuel/gas supply companies	6.56	5.16	5.94	n/a	5.83	n/a	7.32 <sup>d</sup>	5.84 <sup>f</sup>	5.32	6.00	-0.67
Electricity/gas suppliers	n/a	n/a	5.98	n/a	6.19	n/a	7.32 <sup>d</sup>	5.84 <sup>f</sup>	5.39	6.14	-0.75
Trade bodies	n/a	n/a	7.18	n/a	n/a	n/a	n/a	n/a	5.76	6.47	-0.71
H2 appliance manufacturers	n/a	n/a	6.30	6.82	6.43	7.34	n/a	n/a	6.15	6.61	-0.46
NGOs	n/a	n/a	n/a	7.44	7.40 <sup>b</sup>	n/a	6.24	n/a	5.72	6.70	-0.98
Universities	n/a	n/a	7.28	9.10	7.49	n/a	5.34	9.00	6.49	7.45	-0.96
Other research institutions	n/a	n/a	7.62	8.99 <sup>d</sup>	7.76	n/a	4.62	9.00	6.45	7.41	-0.96
Independent organisation	n/a	n/a	n/a	8.12	n/a	n/a	n/a	n/a	5.97	7.04	-1.08
Media	n/a	n/a	6.04	5.46	6.21	n/a	6.00	4.94 <sup>f</sup>	4.40 <sup>g</sup>	5.51	-1.11
<b>Mean</b>	<b>7.29</b>	<b>5.91</b>	<b>6.54</b>	<b>7.42</b>	<b>6.83</b>	<b>7.32</b>	<b>6.09</b>	<b>6.70</b>	<b>5.51</b>	<b>6.48</b>	<b>-0.97</b>

<sup>a</sup> Calculated by taking the average for trust in research organisations ( $M = 8.96$ ) and other publicly funded research agencies ( $M = 9.02$ ). <sup>b</sup> Specifically, environmental-NGOs. <sup>c</sup> In the German context, these measures refer to 'European institutions', 'federal politicians', and 'local politicians', respectively. <sup>d</sup> Denotes 'larger companies', whereas small and medium-sized companies are less trusted ( $M = 5.54$ ). <sup>e</sup> Calculated by taking the average for trust in the UK government ( $M = 4.98$ ) and Scottish government ( $M = 6.14$ ). <sup>f</sup> Denotes 'energy industry corporations'. <sup>g</sup> Calculated by taking the average for trust in alternative media ( $M = 5.30$ ) and social media ( $M = 4.58$ ).

trust in hydrogen-based energy futures is yet to be explored at the cross-national level, motivating recourse to secondary sources such as the Edelman Trust Barometer to help situate the results of this study beyond the UK context. Nevertheless, as demonstrated in Section 4.2.1 (see Table 2), some initial comparative insights can be gleaned from the literature to further evaluate trust-related dynamics. However, deriving the results presented in Table 17 is not without its limitations. For example, while trust is measured in relation to 16 actors and stakeholders in this analysis (see Fig. 6), four items are dropped for the purpose of comparative analysis due to data limitations (*i.e.* for trust in renewable energy producers, gas engineers and technicians, gas distribution network operators, and financial institutions).

Additionally, only four countries compose the small sample, namely, Australia ( $N = 3$ ), Germany ( $N = 2$ ), the Netherlands ( $N = 1$ ), and Scotland ( $N = 1$ ), leaving a specific research gap on public trust dynamics in Canada and Japan. Whereas over-representation from Australia provides a longitudinal evidence base on trust in hydrogen between 2018–2021,<sup>44,45,250</sup> the Dutch study dates to 2014 and provides just two data points, albeit for both hydrogen 'supporters' and 'opponents' of fuelling stations.<sup>248</sup> Critically, trust in industry (fuel station owner and supplier) and in the municipality is significantly higher among supporters, reflecting the positive relationship between public trust and hydrogen acceptance.<sup>248</sup>

Overall, from a maximum potential of 108 data points, only 60 measures are provided across the sample (~55.6%) and no study engages directly with residential hydrogen as an end-use. A further drawback is the use of a range of Likert scales, which deviate in their descriptions by incorporating options such as 'neither agree nor disagree' or 'don't know' as mid-points, whereas this study employs an 11-point scale measuring from 'No trust' (0) to 'Total trust' (10). Accordingly, all results have been converted to a 10-point scale (1–10) for uniformity.

At the national level, Table 17 shows that public trust in various stakeholders is highest, on average, in Australia ( $M = 6.93$ ), followed by Germany and Scotland ( $M = 6.70$ ), and the Netherlands ( $M = 6.60$ ), compared to a mean score of 5.51 for this dataset. Put into context, the results suggest comparatively higher levels of public trust under the following conditions: (1) stakeholder communication regarding the risks and benefits of hydrogen in Australia, as gauged during 2018;<sup>44</sup> (2) whether key actors will act in the best interest of consumers in respect to developing Australia's hydrogen economy, as measured in 2019 and 2021.<sup>45,250</sup> In the German context, the earlier study (similar to the Dutch example) takes HFSS as its use case, while the more recent study asked respondents to evaluate the "extent to which they consider different actors to be generally trustworthy sources of information about energy technologies", as framed to the context of green hydrogen production.<sup>347</sup>

Finally, the Scottish study<sup>249</sup> focuses on green hydrogen as a power source for outdoor festivals, while also adopting a generic approach by asking survey respondents to evaluate "trust in organisations to communication with the public reliable and accurate information about energy technologies." Thus, the comparative results provide initial proxies for judging whether public trust in hydrogen-based energy futures may



differ according to socio-economic and cultural dynamics, and other contextual factors. While serving as useful indicators, the results should not be extrapolated beyond reason given the significant variance in time-periods, research designs, and hydrogen use cases, which may also vary in terms of their current activities in each country (see Section 2).

In summary, the following patterns can be observed in the data when considering how the UK public compares internationally (including Scotland as a single entity): (1) the trust deficit is most pronounced in relation to trust in the government, which is consistently higher across all three levels; (2) trust in the media is also significantly lower in the UK; (3) independent organisations in other countries are more trusted compared to Ofgem in the context of this study; (4) trust in R&D is also lower but varies minimally between NGOs, universities, and other research institutions ( $M = -0.97$ ,  $SD = 0.01$ ); (5) trust in fuel/gas suppliers, electricity/gas suppliers, and trade bodies is lower and clustered closely, but less pronounced by comparison ( $M = -0.71$ ,  $SD = 0.04$ ); and finally, (6) there is limited difference regarding trust levels in different hydrogen appliance manufacturers (*i.e.* boiler industry and car industry). The latter observation suggests trust in industry remains slightly higher compared to trust in the energy sector, which aligns with the results presented in Fig. 7.

One of the key takeaways is that public trust across different regions of the UK may differ substantially, with evidence suggesting that hydrogen applications may encounter less social resistance in Scotland<sup>348,349</sup> compared to England and Wales.<sup>324,350,351</sup> Similar dynamics could also prevail between different autonomous regions in other countries, motivating the need to evaluate trust dynamics at the sub-national level in future research.

## 7.2 Insights on public trust from a multigroup perspective

The need to account for distinct consumer profiles has been emphasised by Huan *et al.*<sup>317</sup> when examining risk perceptions of hydrogen infrastructure in the Japanese context. Specifically, the researchers performed a multigroup comparison between accident-aware and accident-unaware groups, which detected five statistically significant differences from 14 hypotheses. However, the path relationships involving trust in hydrogen technology failed to demonstrate group-specific differences.<sup>\*\*\*\*</sup> By contrast, in respect to the second research question, evidence suggests that the antecedents of public trust vary significantly across parts of the UK population, as represented within this sample (see Section 3.1).

The multigroup analysis presented in Section 6.1 underscores the degree to which higher levels of technology and environmental engagement strengthens consumer confidence across all five sub-dimensions of public trust. Moreover, given the consistency of the trends observed in Fig. 7, it is suggested that fuel stressed citizens are not distinct from non-fuel-

stressed citizens, provided both sub-groups have a less than moderate level of engagement in technology and the environment.

The observed disparity between specific sub-groups may support the notion that income inequality diminishes the capacity for trust,<sup>352</sup> since the VEG had a higher proportion of respondents with an annual income greater than £41 500 (+13.4%) compared to the sample average and foremost the FSG (−6.9%).<sup>††††</sup> The literature has also identified a largely universal pattern regarding the positive effect of age on generalised trust, which could translate to the current context since the FSG was significantly under-represented by respondents aged 55+ (−7.4%), whereas both the MEG (+5.7%) and VEG (+2.8) were over-represented compared to the sample average and the BLG (−1.1%).

While several variables could potentially moderate the trust-based relationships in domestic hydrogen futures, the modelling results suggest public perceptions regarding the role of different stakeholders in supporting ‘a cost-effective, efficient, and fair transition to hydrogen homes’ may depend on pre-existing levels of climate change awareness, engagement in renewable energy technologies, and consumer innovativeness. In response, policy makers and key actors including GDNOs can respond more directly to the underlying deficit in public trust<sup>101</sup> by targeting improvements across specific areas such as trust in the central government and energy industry, while ensuring direct outreach towards fuel stressed households is prioritised.

The presented findings have marked implications for deepening understanding of trust dynamics in hydrogen futures<sup>353</sup> and associated governance mechanisms pertaining to public trust.<sup>354</sup> The findings motivate further investigation regarding the mediating effect of technology and environmental engagement in shaping trust levels and social acceptance. Optimally, researchers should test the combined and individual effect of technology engagement and environmental engagement to discern clearer insights, while recognising the need to gather longitudinal evidence on how trust and social acceptance dynamics change over time,<sup>355,356</sup> in line with macro-level events such as political elections and economic crises.<sup>101</sup>

Ultimately, further research should be conducted to verify the extent to which raising technology and environmental engagement levels across the general population may precipitate increased trust and optimism towards domestic hydrogen futures.<sup>91,357</sup> A case in point is the laggard diffusion of smart meters in the UK (~57% in 2023),<sup>358</sup> which has seen the 2019 target for nationwide deployment missed by a sizeable margin.<sup>359</sup> In response, the government has extended legislative powers up to 2028 for enacting the smart meter rollout.<sup>360,361</sup> To date, consumer resistance has originated from a lack of perceived benefits and heightened financial concerns for at-risk consumers, which has instilled a sense of scepticism and mistrust in the rollout.<sup>359,362</sup> In the context of this research, the foremost priority should be to extract lessons from the smart meter rollout for navigating deployment challenges in the

\*\*\*\* Objective knowledge → (+) trust in hydrogen technology (TH); subjective knowledge → TH; TH → (+) positive feelings towards neighbouring HFSS; TH → negative feelings towards neighbouring HFSS.

†††† The MEG was marginally over-represented, while the BLG was under-represented (−3.5%) for annual income above £41 500.



residential context,<sup>363</sup> while broadening the cross-national evidence base on the relationship between energy transition-related consumer engagement, public trust, and (domestic) hydrogen acceptance.

### 7.3 Unpacking the antecedents of perceived community benefits in hydrogen homes

Tackling the third research question, this study suggests the perceived community benefits of domestic hydrogen will be shaped strongly by technology and production perceptions, and to a lesser extent safety perceptions and public trust. However, production perceptions is the foremost necessary condition for manifesting perceived community benefits, followed by technology perceptions. By contrast, safety perceptions and public trust, while having a small effect size from an NCA perspective, are not prerequisites for facilitating perceived community benefits. By integrating PLS-SEM and NCA, the study elucidates critical insights regarding the antecedents of perceived economic, social, and environmental benefits, which are crystallised *via* cIMPA (see Fig. 14).

It follows that perceptions of hydrogen boiler and hob performance translate strongly into how consumers view potential socio-economic and environmental benefits, which may be anticipated due to presumed energy efficiency improvements and reduced carbon emissions. Relatedly, public support for hydrogen production pathways – *vis-à-vis* the twin-track production approach – contributes towards expectations for better air quality and improved health, which may be associated with boosting local (hydrogen) economies, reducing energy insecurity, and alleviating fuel poverty pressures. Safety is paramount to deploying hydrogen homes,<sup>33</sup> with positive attitudes towards hydrogen appliances, pipeline transport, and underground storage serving to strengthen perceived community benefits, thus bolstering social acceptance.<sup>34</sup> Nevertheless, safety perspectives are non-essential to securing perceived community benefits as a target objective. As highlighted in Table 14, the same relationship holds true for public trust, despite its underlying contribution towards raising domestic hydrogen acceptance.<sup>34</sup>

A likely explanation for the dichotomy observed in Fig. 14 is the lower extent to which safety-related aspects and public trust map directly on to socio-economic or environmental benefits at the community (or individual) level. While both factors constrain perceived community benefits to an extent, neither safety perceptions nor public factor is essential for ensuring the target outcome. Thus, alongside technology and production perceptions, other factors can compensate for the absence of positive safety perceptions and public trust regarding hydrogen homes. It is probable that perceptions of procedural and distributional justice will play a critical role in shaping and strengthening the perceived community benefits of hydrogen homes,<sup>102,251</sup> as recognised in the context of low-carbon retrofitting in Wales,<sup>364</sup> HFSs in the Netherlands and Germany,<sup>245,248</sup> and CCS,<sup>365,366</sup> among other technologies and contexts.<sup>367–369</sup>

In view of the presented evidence base, stakeholders should dedicate resources towards solidifying the environmental

credentials of the twin-track production approach. However, this important course of action may call for clearer distinction between the merits of a blue and green hydrogen production pathway when relaying policy plans and decarbonisation targets to local communities.<sup>25,99</sup> The technological and environmental dimensions of domestic hydrogen futures are inextricably linked,<sup>33</sup> motivating energy suppliers, appliance manufacturers, and other supply-chain actors to take stock of whether converting to hydrogen homes can secure a relative advantage over natural gas,<sup>103</sup> in addition to supporting net-zero ambitions.<sup>14,15</sup> Absent of overcoming well-documented techno-economic barriers,<sup>84,86,91</sup> the stark reality is that hydrogen heating and cooking technologies will continue to face seemingly insurmountable social acceptance challenges to being trialled in UK homes.

Prior research has distinguished between the perceived individual and collective benefits shaping behavioural acceptance for low-carbon energy technologies.<sup>105,370–372</sup> Surveying the German public, Korcaj *et al.*<sup>373</sup> found that collective benefits (perceived environmental benefit and perceived economic benefit) and individual benefits (perceived social status benefit, perceived autarky benefit, perceived financial benefit, and perceived overall cost) explained 68% of the variance in consumer attitude towards solar PV. However, attitude, subjective norm, and perceived behavioural control explained no more than 42% of the variance in purchase intention. A more recent model applying an extended theory of planned behaviour (TPB) approach explained 63.3% and 46.6% of the variance in behavioural attitude towards solar PV and adoption intention.<sup>287</sup> By contrast, while behavioural attitude was explained to a similar extent for energy efficient appliances (66.4%), the model explained just 25.2% of the variance in adoption intention, underlining the need to move beyond a TPB-based research lens. Accordingly, this study further highlights the challenge posed by the behaviour-intention gap, while drawing attention to the importance of perceived individual and collective benefits in shaping technology acceptance and adoption.

### 7.4 Distilling the dynamics of domestic hydrogen acceptance adoption potential

Regarding the remaining research question, perceived community benefits explains 45.4% of the observed variance in domestic hydrogen acceptance, which in turn explains close to 40% of the variation in willingness to adopt a hydrogen home (see Fig. 8). Thus, when operationalised as a mediator within the trust-based framework, the influence of perceived community benefits ( $\beta = 0.674$ ,  $f^2 = 0.833$ ) increases substantially compared to the DHAM ( $\beta = 0.276$ ,  $f^2 = 0.111$ ).<sup>34</sup> Additionally, this study aligns to prior results in finding perceived environmental benefits to be a more significant predictor than perceived socio-economic benefits, while further underscoring that social acceptance and adoption intention will be strongly shaped by individual motivations.<sup>373</sup>

Crucially, if perceived community benefits for hydrogen homes fail to materialise, domestic hydrogen acceptance will



not transpire. Similarly, and to a more significant extent, social acceptance must be secured to enable prospects for technology acceptance, as demonstrated across a range of energy deployment contexts.<sup>187,214,238,248,263,266</sup> At the dimensional level, it follows that community acceptance must first be established *vis-à-vis* perceive benefits to facilitate the trialling of hydrogen homes. Community acceptance would help reinforce the necessary conditions for enabling social acceptance, which is a prerequisite for realising market deployment and behavioural acceptance.<sup>341</sup>

A priority list of actionable steps or 'target interventions' for increasing domestic hydrogen acceptance is detailed in Gordon *et al.*,<sup>104</sup> which should be internalised by policymakers and key stakeholders alongside the presented findings on public trust. Ultimately, ahead of prescribing measures to help build public trust and community-level support for emerging hydrogen technologies, it is necessary to firstly evaluate how trust dynamics are unfolding across the actor-network,<sup>91,101,102</sup> as advanced within this analysis. Adopting a holistic perspective of how trust mechanisms operate across multiple dimensions (see Fig. 6 and 7) can help support a two-fold objective: (1) increasing the feasibility of achieving a more optimal allocation of resources to support the national hydrogen economy by strategically strengthening trust deficits; (2) enacting measures to correct areas that undermine social trust and thus leveraging opportunities to strengthen hydrogen acceptance by tackling these 'at risk' dimensions.

## 8 Conclusion

Following several years of policy interest in converting the natural gas grid to hydrogen, the UK government is approaching a critical juncture for deciding whether hydrogen homes should support net-zero ambitions in some capacity. Alongside industrial decarbonisation,<sup>13,14</sup> reducing household emissions in gas-dependent nations is among the most challenging aspects of the net-zero agenda. Hydrogen technologies could yet prove fundamental to delivering climate change objectives in countries such as the UK, but this possibility will remain highly precarious if public resistance persists. Failure to secure social acceptance for community-level trials in the North of England has cast significant doubt over the future of domestic hydrogen, which can be seen to reflect a climate of public mistrust in the government and energy sector.<sup>101</sup>

This study enhances the discourse on trust mechanisms underlying domestic hydrogen futures by capturing consumer perceptions following the release of the UK Hydrogen Strategy<sup>26</sup> and subsequent British Energy Security Strategy;<sup>374</sup> but prior to the collapse of planned hydrogen trials for Whitby village<sup>93</sup> and Redcar,<sup>94</sup> which has curtailed momentum for deploying hydrogen homes.<sup>92</sup> It follows that public trust in the domestic hydrogen transition may have decreased since the end of 2022 (see Fig. 18), which should be verified in follow-up research.

The results are noteworthy in demonstrating areas of convergence and divergence when evaluating trust dynamics in a novel context, wherein multiple stakeholders and actors shape public trust levels.<sup>214</sup> It follows that social acceptance should be

prioritised to a similar level as techno-economic factors (*e.g.* low capital costs and net energy gain),<sup>375</sup> while neutral intermediaries may be needed to engender public trust in emerging technical solutions to environmental challenges.<sup>376</sup> As argued by Hanusch and Schad,<sup>377</sup> "expertise on the societal effects of the hydrogen transition is in its infancy," but will prove indispensable to realising desirable visions for national hydrogen economies,<sup>378–380</sup> as underscored by industry, policy, and research experts.<sup>381</sup>

Public trust may partly determine the trajectory of national energy transitions,<sup>382</sup> which are shaped by systemic drivers<sup>383</sup> and countervailing forces.<sup>384</sup> Evidently, a deficit in institutional trust is somewhat pervasive in the UK, with national survey data indicating that 49% of the population do not trust the national government, compared to 35% expressing trust, whereas average trust levels are somewhat higher across the Organisation for Economic Cooperation and Development (OECD).<sup>318</sup> As a globally-relevant mechanism shaping the clean energy transition (see Table 2),<sup>187,243</sup> researchers should aim to dissect how different components of public trust can be restored, preserved, and strengthened over time. Accordingly, a future research agenda grounded in the approach of this study should incorporate a direct focus on key technologies such as heat pumps and electric vehicles, alongside other use cases beyond the domain of the hydrogen economy.

Although rich in data analysis and supported by an explicit conceptual foundation grounded in the literature, this study is not without its limitations. As noted, survey responses were gathered during a specific time-period (October to December 2022) to support a cross-sectional study engaging with a potential scenario of hydrogen adoption before 2030. It is well documented in the literature that consumer attitudes, perceptions, and intentions may fail to translate into specific real-world behaviours<sup>385,386</sup> such as low-carbon technology adoption.<sup>105,387</sup> Nevertheless, an interim opportunity for enhancing the evidence base lies with surveying the residents of Whitby village and Redcar following the cancellation of planned hydrogen trials.

Insights from citizens previously engaged in, affected by, or simply exposed to and familiar with hydrogen-related developments in such locations would shed clearer insights on the dynamics of public trust under examination in this study. As already established to a degree in Japan<sup>22</sup> and Australia,<sup>45</sup> disseminating such studies to the public domain would add momentum towards developing a more explicit longitudinal evidence base, which can be targeted directly in subsequent research projects. Expounding this evidence base has time-sensitive implications, as a hydrogen village trial for Fife in East-central Scotland remains under development,<sup>388,389</sup> while similar activities are underway internationally,<sup>390–392</sup> as identified in Section 2.

In the context of climate change risk perception, Smith and Mayer<sup>242</sup> recognise that trust may entail non-linear dynamics (see Fig. 18 and 19), which warrants significant attention in the context of emerging low-carbon energy technologies such as domestic hydrogen. In response, a public trust tracker is recommended for monitoring citizen perceptions of national



hydrogen economies. Qualitative research engagement with different segments of the population is also needed to enrich observations extracted from quantitatively-driven analysis, thereby maximising the benefits of a mixed-methods research paradigm.<sup>386,393</sup>

Regarding the technological dimension, this study incorporated a dual focus on hydrogen heating and cooking, as reflected by three and two measurement items, respectively. An alternative approach lies with evaluating each aspect independently or otherwise ensuring that an equal number of indicators are employed to support a more balanced representation of hydrogen boilers and hobs in the model. The predictive capabilities of the proposed framework can be further enhanced by integrating additional constructs such as perceived financial benefits<sup>287,373</sup> and emotional response<sup>239,394,395</sup> into the modelling approach. Supporting this direction, Scheller *et al.*<sup>287</sup> found that product-specific benefits (perceived financial benefits and perceived environmental benefits) had the strongest influence in shaping attitudes and intentions toward low-carbon technologies in the German context. Furthermore, as homeowners progress through the innovation-decision making process,<sup>106</sup> perceived financial benefits proved a more salient predictor of adoption intention than perceived environmental benefits for each technology case (rooftop photovoltaic systems, energy efficient appliances, and green electric tariffs),<sup>287</sup> which has been observed in related case studies.<sup>396–398</sup>

Future research should also explore different loci of hydrogen trust and validate new measurement items to improve the predictive performance of the model. Alternative models can be explored and compared in follow-up studies, which may include examining the relationship between cognitive factors (objective and subjective knowledge), trust in hydrogen technology, emotional response (positive and negative affect), safety perceptions, and behavioural response, as discussed in the context of HFSS.<sup>317</sup> Critically, Huan *et al.*<sup>317</sup> also underlined the importance of supporting “a continuous and constructive civic discourse to address public concerns and cultivate a milieu of trust for all relevant stakeholders” involved in the Japanese transition to HFCVs, which is a clear imperative for deploying hydrogen homes in the UK.

In addition to pursuing the outlined research direction in the UK context, resources should be allocated towards establishing a cross-national evidence base on public perceptions of the hydrogen homes in relevant countries such as the Netherlands. To date, research on the societal dimensions of hydrogen remains scarce, as well as fragmentary in terms of its geographical scope.<sup>377</sup> This trajectory would mark an important step towards understanding cultural differences in perceptions of hydrogen technologies for the residential sector<sup>399,400</sup> and can be expanded to compare attitudes across different use cases such as road transport, aviation, and industry, as initiated to an extent in Table 17.

Leveraging a multi-stage empirical analysis, this study enriches the body of knowledge on the trust dynamics of low-carbon energy futures,<sup>353</sup> enhances awareness of the need for common but differentiated consumer engagement strategies,<sup>401</sup> develops critical insights on the role of perceived community

benefits in shaping energy acceptance,<sup>402</sup> and advances understanding of the innovation-decision process shaping technology adoption.<sup>106,287</sup> By virtue of its scope, novelty and rigour,<sup>403</sup> this analysis contributes towards recent efforts to advance a balanced representation of developments in the global hydrogen economy.<sup>14,91,404</sup> As tensions in the energy transition continue to be navigated,<sup>405,406</sup> accounting for parallel tensions in public trust and associated implications for social acceptance will prove fundamental to fuelling hydrogen-based energy futures.

## Data availability

The data supporting this article have been included as part of the ESI.† Survey data is available at the Cranfield Online Research Data (CORD) Repository: <https://dspace.lib.cranfield.ac.uk/items/aa4d197c-fa88-4acb-9b84-d67a5acbd574>.

## Author contributions

Joel A. Gordon: conceptualization, investigation, data curation, data analysis, visualization, theoretical framework, writing – original draft, writing – review & editing. Nazmiye Balta-Ozkan: conceptualization, funding acquisition, supervision, review & editing. Anwar Haq: theoretical framework, review & editing. Seyed Ali Nabavi: conceptualization, funding acquisition, supervision, review & editing.

## Conflicts of interest

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

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