1	<b>Revisiting the promise of carbon labeling</b>
2	
3	Khan M. R. Taufique <sup>1,2†</sup> , Kristian S. Nielsen <sup>3†*</sup> , Thomas Dietz <sup>4,5,6</sup> , Rachael Shwom <sup>7</sup> ,
4	Paul C. Stern <sup>8</sup> , & Michael P. Vandenbergh <sup>9</sup>
5	
6	<sup>1</sup> Oxford Brookes Business School, Oxford Brookes University, Oxford, United Kingdom.
7	<sup>2</sup> Department of Marketing, Curtin University, Miri, Sarawak, Malaysia.
8	<sup>3</sup> Department of Psychology, University of Cambridge, Cambridge, United Kingdom.
9	<sup>4</sup> Department of Sociology, Michigan State University, East Lansing, MI, USA.
10	<sup>5</sup> Environmental Science and Policy Program, Michigan State University, East Lansing, MI,
11	USA.
12	<sup>6</sup> Gund Institute for Environment, University of Vermont, Burlington, VT, USA.
13	<sup>7</sup> Department of Human Ecology and Rutgers Energy Institute, Rutgers University, New
14	Brunswick, New Jersey, USA
15	<sup>8</sup> Social and Environmental Research Institute, Shelburne Falls, MA, USA.
16	<sup>9</sup> Vanderbilt Law School, Vanderbilt University, Nashville, TN, USA
17	
18	† These authors share lead authorship.
19	* Corresponding author

20 Email: <u>ksn27@cam.ac.uk</u>

# 21 Abstract

22 Carbon labeling systems can inform individual and organizational choices, potentially reducing 23 the carbon footprints of goods and services. We review the ways labeling has been 24 conceptualized and operationalized and available evidence on effectiveness. The literature has 25 focused mainly on how labeling affects retail consumer behavior but much less on how labeling 26 affects the behavior of the organizations that produce, transport, and sell products despite 27 preliminary research suggesting that effects on corporate behavior may be significant even 28 absent strong consumer responses. We consider key challenges for carbon labeling systems 29 related to standard-setting, data collection and use, and label design. We summarize available 30 knowledge, identify key research questions, and identify steps toward achieving the promise of 31 carbon labeling.

32	Carbon labeling summarizes data on the greenhouse gases (GHG) emitted from the
33	production, distribution, and use ("carbon footprints") of a good or service in a simple indicator
34	presented at the point of purchase. The goal is to facilitate choices that can rapidly reduce GHG
35	emissions to meet the challenges posed by escalating anthropogenic climate change. Even
36	increasingly aggressive national emissions reduction commitments fall far short of the levels
37	needed to limit warming to 1.5°C or 2°C <sup>1</sup> . A commentary in the first volume of this journal <sup>2</sup>
38	advocated development of "a global private carbon-labeling system" as a low-cost, viable
39	initiative for reducing the carbon footprints of consumer goods and services (hereafter referred to
40	as products).
41	Feasibility is a primary rationale for carbon labeling. Unlike many other GHG mitigation
42	initiatives, information disclosure does not require government actions such as regulations,
43	taxation, or financial incentives, each of which faces barriers in many political systems <sup>2</sup> .
44	Emissions reductions from carbon labeling may also be more rapidly achievable than from many
45	technological innovations, which require time to develop, implement, and diffuse <sup>3–6</sup> .
46	Carbon labeling has also been advocated on the grounds of behavioral plasticity, the
47	extent to which the intended responders to an initiative take action <sup>7</sup> . The argument is that
48	information provided by well-designed labeling systems can, alone or combined with other
49	initiatives, increase responsiveness among the intended responders-households, companies, and
50	governments <sup>8–12</sup> . Labeling can help address several impediments to behavioral plasticity among
51	responders, such as: (1) limited or incorrect understanding of the direct GHG emissions
52	associated with products, sometimes misperceived by an order of magnitude or more <sup><math>13-16</math></sup> ; (2)
53	incomplete understanding of indirect GHG emissions, i.e., those produced by other actors in
54	product supply chains; and (3) difficulties finding or interpreting available information.

55 Policy analyses of climate mitigation initiatives often apply economic cost-benefit 56 analysis to assess feasibility without analyzing the political, social, and behavioral issues that 57 affect the feasibility of and response to these initiatives. This oversight may account for 58 disappointments with the uptake of many initiatives of the past, from nuclear power to time-of-59 use electricity pricing to carbon taxes. Future mitigation initiatives, such as negative emission 60 technologies, may suffer the same fate if behavioral plasticity and initiative feasibility are considered only narrowly or not at all<sup>17–20</sup>. These issues may also arise with carbon labels that 61 62 incorporate carbon offsets, as these suffer from well-known methodological challenges and 63 sometimes rely on unproven technologies that are poorly understood by most citizens and may 64 raise public opposition.

65

#### 66 Labeling relative to other disclosure initiatives

67 Like other kinds of environmental and social labeling (e.g., organic, fair trade, and animal 68 welfare), carbon labeling depends on collecting and presenting information in ways intended to 69 shape decisions<sup>21</sup>. The information collected to support carbon labeling of products can also be 70 used to support carbon taxes, carbon border adjustments, and supply chain contracting. Synergies 71 and economies of scale may thus derive from efforts to design carbon disclosure systems with all 72 these uses in mind and from building labeling systems on well-designed disclosure protocols. 73 Environmental labeling (sometimes referred to as eco-labeling) systems vary in the extent 74 to which they signal individual benefits (e.g., financial or health, as with energy and organic

- 75 labeling) or collective benefits (e.g., societal protection from climate change or wellbeing of
- 76 ecosystems, as with carbon and sustainability labeling). The benefits signaled by labels likely

have heterogenous effects on responders depending on their familiarity and engagement with the
 labeling system, thereby influencing the effectiveness of labels over time<sup>22</sup>.

79

Labeling systems also differ in whether they capture environmental footprints from the 80 production of the product (typical of carbon labels), from product use (typical of energy labels), 81 or from the entire product life cycle including production, use, and disposal. Some labels, such as 82 the Greenhouse Gas Protocol's CO<sub>2</sub>-Neutral label (https://www.co2-neutral-label.org/), also 83 include emissions offsets. The GHG emissions from the use of a company's products, often 84 called scope 3 emissions, the increased policy focus on reporting and reducing emissions 85 elsewhere in product life cycles, and the increased focus on net zero commitments suggest that 86 incentives to label may increase. Labels addressing full product life cycles thus may receive 87 greater emphasis.

88 Important insights may emerge from comparing labeling systems across environmental 89 domains and perhaps also from examining information disclosure initiatives in the health and 90 social domains of products. Nevertheless, we restrict our focus here to carbon footprint labeling. 91 We highlight important dimensions of developing and implementing new carbon labeling 92 systems or modifying existing systems. These dimensions include who develops the systems, 93 how system standards and criteria are negotiated, how and what information is presented, and the 94 heterogeneity of users and their needs. Much of our analysis also applies to energy labels, 95 although energy labels and carbon labels differ (e.g., whether they emphasize individual or 96 collective benefits). For simplicity, we refer to carbon labels unless making a specific distinction 97 between the two.

98 Carbon labeling systems may be sponsored or implemented by governmental, corporate,
99 or nonprofit organizations, or by collaborations of these organizations. They may target

100 consumer or organizational behavior and may influence users anywhere in product life cycles. 101 The validity and effectiveness of carbon labeling systems depend on the characteristics of the 102 targeted product or market; the availability and accuracy of data; the rules developed for 103 converting data into labels; and the procedures employed for developing rules, designing labels, 104 and modifying them as appropriate. The procedures often involve negotiation within and among 105 organizations and can influence trust in the system, which shapes the impact of labels on users' behavior<sup>23–25</sup>. Wide engagement of government, the private sector, and non-governmental 106 107 organizations can improve the accuracy and credibility of a labeling system. But labeling also 108 places a premium on technical expertise, and the distribution of power in negotiations has implications for the resulting labeling system<sup>26,27</sup>. Large organizations, through buying power, 109 110 can use emissions data to push suppliers to reduce emissions. However, such organizations may 111 also obstruct consensus or shape it toward their interests. These possibilities may affect trust in 112 labeling systems. In general, the dynamics by which labeling systems are adopted and revised 113 within and across organizations are complex and undoubtedly vary across jurisdictions and products<sup>28–30</sup>. 114

115 Labels may provide information in a variety of formats and at different levels of 116 resolution (see Fig. 1 and Supplementary Table 1). A certificate or seal of approval marks 117 labeled entities as meeting some standard; its absence signifies either failure to meet the standard 118 or to apply for certification. Certificates may attest that a product is carbon neutral, indicate that 119 its footprint is measured and certified (e.g., PAS 2050, ISO14067 standards), that its footprint is 120 being reduced year by year, or that it emits less CO<sub>2</sub> than comparable products<sup>31,32</sup>. Some labels 121 provide ordinal rating scales analogous to the Michelin star ratings for restaurants or traffic light 122 designations with products labeled as green, yellow, or red. One limitation of such ordinal scales

is that there is a tendency for efforts to stop at a point that just meets the criteria for a step on the scale<sup>33</sup>. Even finer resolution is offered by quantitative measures, such as fuel economy labels on automobiles or appliances. We argue that the most effective design may incorporate both ordinal and quantitative information to facilitate both simple and more detailed product comparisons (e.g., EU energy label) by diverse consumers (retail, corporate, and governmental) and corporate actors throughout product supply chains<sup>14,34,35</sup>.

129 Because label users differ in the amount of detail they want or can use, labeling systems 130 should offer a level of detail suited to their needs and capabilities. For example, retail consumers 131 have very little time, energy, capability, or interest in absorbing detailed information when 132 deciding on a can of beans or a lightbulb, so a simple certification or ordinal label may serve them well, presuming it is accurate and credible $^{36-39}$ . For larger purchases, such as a vehicle, 133 134 building, or appliance, retail consumers may use more detailed information, especially if it is 135 presented in a format that facilitates the kinds of comparisons being used in decision making (see 136 Fig. 1). For organizational consumers, retailers, producers and intermediaries in supply chains, 137 and governments, all of which have more at stake and more ability to use detailed information 138 than retail consumers, quantitative information may be critical. The precision of the underlying 139 data and information presented should reflect the function the carbon labeling system is serving 140 because acquiring and analyzing the necessary data can be costly. For products with large carbon 141 footprints, a high degree of precision may be useful to inform choices, but in other instances, less 142 precision may be preferable. A "good enough for the intended purpose" labeling approach may 143 have substantial benefits even as more refined efforts are developed<sup>40</sup>.

Although the responses of retail consumers to labels have been the main subject of
labeling research, consumers are not the only, or perhaps even the most promising, target for

146 carbon labels. Labeling can reduce GHG emissions without directly affecting retail consumers' 147 choices<sup>2</sup>, including by inducing changes in supply chains, production processes, and product mix to improve companies' reputations or to achieve efficiency gains<sup>40-42</sup>. Labels may also affect 148 149 governments, in their roles as regulators, standard setters, and consumers of products. Thus, 150 labels can have effects on organizational behavior beyond those arising from retail consumer 151 behavior. Labels, like other mitigation initiatives, can be assessed in terms of how much effect 152 they could ideally have, the feasibility of their adoption, and the degree to which they produce 153 intended responses when implemented<sup>3</sup>.

154

### 155 Carbon labeling efforts to date

156 Carbon labeling systems have been developed for a wide variety of products<sup>31</sup>. Ecolabel Index 157 (http://www.ecolabelindex.com/) reports 455 ecolabels in 199 countries across 25 different 158 sectors, including 31 carbon footprint labels. Carbon Trust, for example, has labeled hundreds of 159 thousands of products from cement to bank accounts. Some early efforts were undertaken by 160 large European retailers - such as Tesco, Casino, E.Leclerc, and RAISIO - which labeled thousands of products through self-initiated systems<sup>31,43,44</sup>. However, not all these efforts remain 161 162 in place. For example, Tesco announced plans to label all of its 70,000 products yet had to 163 abandon the project due to the high associated costs<sup>45</sup>. Casino's carbon label was gradually 164 replaced by a broader environmental index that considers products' life cycle GHG emissions, 165 water consumption, and aquatic pollution. Meanwhile, other actors in the food sector have 166 adopted labeling systems, including restaurants (e.g., Swedish burger chain, Max), food 167 producers (e.g., Unilever), and other corporations. Carbon labeling systems have also been implemented in domains such as tourism, hospitality, transport, and housing<sup>46–50</sup>. 168

169 The efforts of Tesco and Casino suggest the importance of avoiding the high cost of 170 attempting to label all products, even those with complex carbon footprints and low emissions. Shewmake et al.<sup>51</sup> suggested four criteria for selecting the most promising products for carbon 171 172 labeling: (1) the amount of GHG emissions, (2) the availability of data on life cycle emissions, 173 (3) the ability of companies to adjust their activities to reduce emissions, and (4) the 174 responsiveness of consumers by switching to lower-carbon products. To this list, we would add 175 (5) the responsiveness of corporations to reputational, efficiency, and other pressure to reduce 176 emissions.

177 Carbon and other environmental disclosure systems have increased market penetration in 178 some domains. For example, environmental and energy certification for commercial buildings 179 (e.g., LEED) in the largest US markets increased from about 5% in 2005 to about 40% in  $2014^{52}$ . 180 The Greenhouse Gas Protocol (https://ghgprotocol.org/) reports that 92% of Fortune 500 181 companies use the Protocol. Although most corporations report only emissions from their 182 facilities (called scope 1 emissions) and the off-site facilities that provide energy to them (scope 183 2), the Protocol includes a tool for calculating emissions "throughout their value chains" and 184 provides a basis for its CO<sub>2</sub>-Neutral label.

Carbon labeling, however, remains less widespread than energy labeling. Thanks to the implementation of mandatory energy labeling systems in the European Union, United States, and other areas, labels have long existed for many energy-consuming products and services (e.g., electric appliances, commercial buildings, housing, motor vehicles). Consequently, retail consumers generally report much greater familiarity with and usage of energy than carbon labels. For example, according to the Special Barometer 492 survey, the EU energy label is recognized by 93% of consumers, and 79% report considering the label when purchasing new electric

appliances<sup>53</sup>. Environmental and carbon labeling are dynamic areas with a great deal of ongoing
research, and many labeling systems are underway or in planning. For example, Foundation
Earth, a non-profit organization, is currently undertaking a pilot carbon labeling system using
traffic light "eco-scores" for food and drinks with a plan for Europe-wide rollout in 2022<sup>54</sup>. The
importance of environmental and carbon labeling for informed consumer, corporate, and
government procurement decisions is also getting increasing attention at the policy level in, for
example, the United Kingdom<sup>55</sup> and United States<sup>56,57</sup>.

199 The Internet may also increase opportunities for carbon labeling, and digital carbon 200 labeling may be cheaper, easier, and more effective than labeling for traditional bricks-and-201 mortar-based commerce<sup>58</sup>. For example, PANGAIA clothing has initiated a "digital passport" 202 (QR code and cloud-hosted digital twin) printed on clothing to indicate its carbon and water 203 footprints, and Sheep Inc uses a bio-based near-field communication tag detailing the carbon 204 footprint at each stage of the supply chain. Other recent advancements, such as block-chain 205 technology, may also improve tools for supply chain management and carbon footprinting<sup>59</sup>. 206 While digital carbon labeling is promising, further research is needed to explore how it can be 207 applied across an array of GHG-intensive production and consumption activities.

Retail consumers' responsiveness to labels may be limited unless enough products are labeled to enable consumers to readily compare among them. Nevertheless, corporations may gain an advantage by displaying a favorable carbon label that suggests to consumers, who are often using cognitive shortcuts, that the labeled product has lower emissions than an unlabeled product. In addition, as we discuss below, even absent major shifts in consumer behavior, the process of gathering and analyzing the data for labeling and the prospect of publicly disclosing product emissions can create corporate incentives for emissions reductions.

215

## 216 Evidence of effectiveness

217 An effective carbon label can be defined as one that decreases GHG emissions in a non-trivial, 218 cost-effective way compared with efforts that lack a labeling feature and that does not negatively 219 affect other mitigation initiatives. Carbon labels can increase behavioral plasticity among retail 220 consumers by encouraging them to select low-carbon products. Carbon labeling can also induce 221 retailers and others in the supply chain (e.g., corporate buyers, transporters, and producers) to 222 provide consumers with low-carbon products because attention to labeling data can make these 223 organizations more aware of GHG emissions and inefficiencies associated with their products or 224 more concerned about naming-and-shaming or reputation campaigns. The effects of labels may 225 vary over time, across types of products, and across types of producers and consumers. We 226 discuss behavioral plasticity for retail consumers and then turn to corporations and other actors. 227

228 Effectiveness with retail consumers. Many studies have examined the effectiveness of carbon labels on retail consumer choices<sup>46</sup> (Box 1 reviews work on vehicle labels; Box 2 examines 229 230 labeling of buildings and their effectiveness with both retail and organizational consumers). Our 231 broad review of such studies (see Supplementary Information) shows that consumer disposable 232 products have been most extensively studied. Most studies examining consumer responses or 233 behavioral plasticity find a small, positive effect of carbon labels in guiding consumer selection, purchase, or consumption toward lower-carbon products<sup>14,35,60–65</sup>. However, null effects are not 234 235 uncommon (see Supplementary Table 3 for summary of major findings over the last 10 years)<sup>66–</sup> 236 <sup>68</sup>. For energy labels on household equipment such as electrical appliances or light bulbs, the

evidence on behavioral plasticity similarly includes many studies reporting small positive
effects<sup>69-71</sup> with some reporting null effects<sup>50,67</sup>.

Evidence from numerous studies suggests that design features of a carbon label, including image, color, size, and location on product, can significantly influence visual attraction, comprehension, and ultimately engagement with the label<sup>8,10,14,72</sup>. However, the importance of different design features often varies across product types, decision environments, and the deliberateness of the decision-making process. For example, when consumers make decisions with limited deliberation and in stimulus-intensive environments, such as when grocery shopping, the label must attract visual attention and be easy to understand<sup>73,74</sup>.

246 For carbon labels on food products, several studies find that certificates (see Fig. 1) are 247 often not very effective in influencing behavior, whereas ordinal (e.g., traffic light) labels are more effective, particularly when coupled with quantitative information<sup>10,35,75,76</sup>. The observed 248 249 benefits of traffic light designations are often attributed to their visual attractiveness and 250 especially their ease of understanding and use for product comparisons<sup>38,48</sup>. A recent systematic 251 review of six studies also found that presenting GHG emissions information using both a logo 252 and text (e.g., a traffic light designation and quantitative information) was the most effective 253 design for influencing consumer choices<sup>60</sup>. Additionally, a recent qualitative study found carbon 254 labels more likely to be noticed when presented as a warning of an environmental hazard<sup>72</sup>, a finding consistent with evidence from health labeling<sup>77,78</sup>. Finally, studies on the EU energy label 255 indicate that shifting from the original A-G ordinal ranking to a A<sup>+++</sup>-D ranking reduced its 256 257 effectiveness among retail consumers by lowering the perceived importance of energy efficiency in product choices<sup>79,80</sup>. Consequently, the original A-G ranking was recently reinstated alongside 258 259 greater energy efficiency expectations for each ranking level.

260 Although research to date supports the promise of labeling, the literature has several 261 noteworthy limitations. Perhaps the most important is that the vast majority of studies have been conducted in artificial settings using hypothetical choice experiments<sup>10,35,60,69,73</sup>, small-scale field 262 experiments (e.g., in one canteen or restaurant<sup>55,56</sup>), or cross-sectional surveys<sup>8,81,82</sup>. The 263 264 generalizability of such evidence remains uncertain and estimated effects may not match real-265 world outcomes. Moreover, studies typically focus on a particular product (e.g., coffee, 266 tomatoes, light bulbs, washing machines) or product category (e.g., meat, dairy products, home 267 appliances, building materials), which permits assessing within-product (category) effects but not 268 substitution and spillover effects. Another important limitation is that most studies have 269 evaluated labeling effects as self-reported willingness to pay, purchase intention, noticeability or visual attention, and preference for label designs<sup>10,64,72,73,83</sup>. Limited evidence is available for 270 271 assessing the effects of carbon and energy labeling on actual purchasing and consumption 272 behavior for products with high technical potential to reduce emissions (e.g., air travel), perhaps 273 due to the difficulty of accessing actual sales data. Online purchasing may provide opportunities 274 for measurement of actual purchasing behavior and for experimentation with label design and consumer targeting<sup>58</sup>. Finally, the literature has examined how different labeling approaches 275 276 might appeal to different market segments. This includes the differing effect on consumer 277 segments of communicating individual versus collective benefits<sup>22</sup>, which plays a prominent role in the psychology of environmental decision making<sup>84</sup>. 278 279 Taken together, available evidence finds some effects of carbon and energy labels on

retail consumer purchases, over and above the effects of other initiatives. However, these effects are likely context- and actor-dependent. For example, effects may vary with the perceived importance of non-environmental product attributes, socioeconomic factors, political views,

environmental concern, business domain, presence of competing labels, or prevalence of norms
about purchases that might be signaled by labels. Information provision has been found effective
in influencing the selection phase of decision making, after a consumer has decided to choose
among particular products, and when the information source is highly credible to the consumer<sup>12</sup>.

Effectiveness with other life cycle actors. Relatively little research has focused on the impact of carbon labeling on the carbon footprint of retailers, producers, intermediaries, and wholesale consumers. Research has not yet systematically examined such effects, although some evidence from studies of other types of environmental labeling<sup>29,42,85</sup> and of corporate social responsibility indexes suggests that labeling can be effective in shifting corporate behavior even when consumer effects are modest<sup>86,87</sup>. Indeed, some types of environmental disclosures at the corporate level can have an effect on stock prices, and thus provide a powerful incentive<sup>40</sup>.

295 One possible influence pathway involves making producers or intermediaries more aware 296 of GHG-intensive inputs (i.e., fossil fuel energy, fertilizers) that are being managed inefficiently. 297 Thus, the mere assessment of GHG emissions from a product may draw attention to potential 298 cost savings from reducing inefficiencies in product life cycles. Although many businesses have 299 adopted carbon accounting, tracking indirect GHG emissions from the full life cycle of their 300 products and services has lagged and remains a challenge to organizational carbon accounting<sup>88,89</sup>. A study of 63 large Brazilian companies found that implementation of an 301 302 environmental management system was significantly related to reductions in GHG emissions, 303 suggesting that tracking and analyzing resource use can lead to emission reductions<sup>90</sup>. In addition, Li et al.<sup>91</sup> found that for the top 100 listed companies (2008-2012) in China, 304 305 environmental management systems were positively correlated with corporate green innovation.

Research remains scarce on whether the implementation of carbon information systems inparticular leads to similar improvements in GHG emissions.

308 Labeling also may induce some producers to reduce emissions in order to score well in 309 labeling systems and gain reputational benefits. Evidence shows that corporate reputation affects profits<sup>92,93</sup>. Lee et al.<sup>94</sup> report that supply chain managers identified "risk of brand damage" as 310 311 the primary motivation for measuring and addressing supply chain social and environmental 312 impacts. Although research is lacking, a reasonable hypothesis is that reputational risk might 313 drive product innovation and GHG intensity reduction. Darnall and Aragón-Correra<sup>42</sup> suggest 314 that reputational risk is what drove firms to reduce trans fats in food before nutrition labeling was 315 required. Similarly, corporations in the United States reduced their toxic chemical releases when 316 they were first required to publicly disclose emissions through the Toxic Release Inventory even though such reductions were not legally mandated<sup>95</sup>. 317

318 Carbon accounting in support of labeling systems can also increase corporate motivations 319 to require GHG emissions data and reductions from suppliers. Drawing on the experiences of Carbon Trust labeling efforts, van der Ven et al.<sup>96</sup> identify benefits from carbon labeling arising 320 321 from scaling (e.g., widespread global uptake of carbon assessment methodologies) and 322 entrenchment (e.g., identification of efficiencies in corporate supply chains). Carbon labeling and 323 supply chain contracting thus can be mutually reinforcing. Supply chain contracting 324 requirements can increase the ability of corporate buyers to obtain emissions information from 325 suppliers. In turn, the information gathered from supply chains to support carbon labeling 326 systems can bolster the motivations and ability of corporate buyers to press their suppliers to 327 reduce their carbon footprints.

328 Carbon labeling may also signal what will be required under future regulations and how 329 future regulations will affect product lines. For instance, in the United States, Energy Star 330 certification is usually set to identify the top 25% of energy performing products, but it is 331 expected that many current Energy Star standards will become future mandatory minimum standards for all products<sup>97</sup>. A label that discloses high GHG emissions also may indicate a 332 333 corporation's vulnerability if governments adopt climate regulations, carbon taxes, or border 334 adjustments or if corporate buyers include carbon requirements in supply chain contracts. The 335 information generated by labels also may facilitate the adoption of these types of public and 336 private climate governance requirements, signal the likelihood of future requirements, and lay 337 the groundwork for meeting the requirements.

Overall, carbon labeling systems provide data that can help corporations meet the growing demand for attention to environmental, social, and governance (ESG) goals. Moreover, the public nature of labeling systems allows corporations to signal their movement towards achieving these goals. We thus expect substantial synergies between labeling, pressure for supply chain and other scope 3 emissions reductions, ESG pressure from investors, and other processes that are encouraging broader consideration of lifecycle GHG emissions in corporate decision making.

345

#### 346 Challenges and paths forward

The most fundamental challenges to wider use of carbon labeling arise from an incomplete understanding of labeling systems, competing objectives for these systems, and the tendency to look for panaceas. The focus of research on retail consumers suggests that public and private entities creating labeling systems may assume that they are only valuable if they affect retail

351 consumer behavior when the effects on corporate and government behavior may be equally or 352 more important. Public and private policymakers might presume tradeoffs between labeling and 353 other policy initiatives, but there might be synergies<sup>98–101</sup>. Labeling systems generate information 354 about product-specific GHG emissions that can be used by corporations and governments to 355 support supply chain requirements and by governments to develop climate mitigation measures 356 such as border adjustments<sup>102</sup>.

357 The competing objectives of the producers and distributors of products create other 358 challenges. Many corporations' profits are greatest for products with the largest carbon 359 footprints, so these actors may be resistant to labeling. For example, the profits from an auto sale may be larger for fuel-intensive rather than fuel-efficient vehicles<sup>103</sup>. Such motives may also 360 361 prompt industry efforts to weaken labeling systems by making it too easy for products to look 362 environmentally friendly or by allowing for exceptions and evasion of accountability through 363 offshoring production or other means. The interplay between governments, corporations, and 364 non-governmental organizations is complex. In their study of environmental labeling, Darnall et 365 al.<sup>28</sup> find that independently sponsored environmental labels have the strongest rules while privately sponsored labels have the weakest. Bullock<sup>26</sup> demonstrates that the private sector can 366 367 be more powerful than the public sector in label standard-setting. Some have suggested that the dynamics of labeling are driven by competition across sectors<sup>104</sup>, first movers<sup>105</sup>, or the scope of 368 what is encompassed in labeling<sup>85,106</sup>. 369

Carbon labeling can be easily overlooked by public and private policymakers who do not account for the difficulties of adopting and implementing other climate mitigation initiatives or who seek panaceas. Although labeling systems can reduce GHG emissions and complement other climate initiatives, they are certainly not sufficient to achieve emissions reduction targets

374 on their own. But labeling may be more feasible because it may be seen as less restrictive or as 375 allowing more time to push product life cycles towards reduced emissions. Labeling can also be 376 implemented by the private sector where governments lack the political support to adopt 377 regulatory measures and can have effects that transcend national boundaries even absent 378 international agreements. The barriers to labeling may thus be weaker than the barriers to direct 379 government product regulation or carbon pricing. Labeling may also facilitate later government 380 adoption of these approaches. In evaluating mitigation initiatives, it is important to recognize that 381 a somewhat effective label will have greater impact than a stronger policy that is never adopted 382 or adopted at a much later date. The desire for mitigation panaceas should not block real progress 383 in reducing emissions.

384 Greater emphasis is needed on interactions between labeling and other mitigation 385 initiatives. Valid and credible quantification, whether or not included on labels, can support efforts to combat greenwashing<sup>107</sup> by providing a metric to evaluate companies' climate claims. 386 387 It can also inform corporations' efforts to use procurement policies to reduce suppliers' GHG emissions<sup>108,109</sup> and make it easier for suppliers to demonstrate compliance with those policies. 388 389 Detailed quantification will require disclosure of information that allows comparisons across 390 product categories by sophisticated consumers and facilitates development of supply chain 391 requirements. Such quantification may be limited by lack of data or access to proprietary data. 392 But although the data used to develop labels should be accurate enough to support informed 393 choices, it need not always be precise. The tradeoff between accuracy at higher cost and 394 imprecision at lower cost needs to be assessed based on how the accuracy, precision, and cost 395 tradeoffs influence the actions of consumers, producers, and other supply chain actors. Data

development and label design efforts should also prioritize products with GHG-intensive supplychains<sup>51</sup>.

398 Because a substantial portion of GHG emissions are embedded in international trade, 399 border adjustments are under active discussion in many countries, including in the European 400 Union where a border-adjustment scheme was recently adopted by the European Commission<sup>110,111</sup>. The information generated for carbon labeling may facilitate the 401 402 development, implementation, and defense of border adjustments<sup>112</sup>. For instance, an economy-403 wide labeling system could produce information that would permit more accurate assessment of 404 product-related GHG emissions for purposes of expanding border adjustments from energy-405 intensive sectors to other sectors. A labeling system that is tied to an eventual border adjustment 406 scheme also could improve the chances that the latter would be found to be nondiscriminatory by 407 the World Trade Organization<sup>102</sup>.

408 Challenges for labeling systems arise in meeting data needs, developing protocols for 409 converting data into labels, and creating effective and trustworthy procedures for developing 410 labeling rules, and designing and modifying labels. Effort is required to keep the processes used to develop labeling systems balanced between public and private interests<sup>113</sup>. To make labeling 411 412 systems widely credible and effective, decision processes should ideally engage the full range of 413 interested and affected parties, public and private<sup>114</sup>, across product life cycles from materials 414 extractors to final consumers and waste disposers. In practice, however, a search for full 415 engagement can impede incremental improvements on available information and can delay the 416 implementation of carbon labeling systems, so a balance between engagement and practicality is 417 needed. Procedures for making rules should consider the fact that deliberations about complex 418 technical issues tend to favor actors that have the resources for sustained involvement in the label

419 development process. Still, credible labeling systems need to account for the concerns of retail 420 consumers, small producers, intermediaries, and other actors who might be adversely affected by 421 labels. Given these challenges and the urgent need for action, we conclude that labeling systems 422 should be developed and modified incrementally through a learning process in which each round 423 of implementation is viewed as an experiment that can inform future improvements via social learning<sup>115</sup>. Ongoing programs, such as PAS 2050<sup>116</sup>, can serve as natural experiments that will 424 425 allow understanding of how labeling influences the actions of consumers, producers, and other 426 supply chain actors.

In 2011, Vandenbergh et al.<sup>2</sup> argued that it was time to try carbon labeling. That is
happening: private and government-implemented carbon and energy-labeling systems have
served as quiet but important components of climate mitigation strategies over the last decade.
The importance of these labeling systems has only increased with the urgency of the climate
threat and the difficulty of mobilizing adequate governmental responses.

432 Vandenbergh et al.<sup>2</sup> also argued for a shift in research emphasis from retail consumer 433 behavior to corporate behavior. This shift has not happened. Over the past decade, except for 434 research on buildings, labeling studies have focused almost exclusively on consumer behavior. 435 As noted, most of these studies are limited by the difficulty of studying actual consumer 436 behavior. Nevertheless, a large body of research now suggests that labels have some of the 437 desired effects on retail consumers, identifies some effective label attributes, provides increasing 438 support for the efficacy of ordinal (e.g., traffic light) labels, and supports a conclusion that 439 labels' effects depend on context.

440 Available research on corporate behavior, including responses to carbon labeling and 441 other environmental disclosures, suggests the potential for substantial impacts<sup>26</sup> from carbon

442 labeling and the need to prioritize corporate responsiveness in future work. The effects of carbon 443 labeling systems depend on more than retail consumer-facing labels. They rest on GHG 444 emissions data, which can inform choices by organizational suppliers and consumers as well as 445 retail consumers and can support other public and private mitigation measures such as carbon 446 taxes, border adjustments, and supply chain contracting requirements. Although the motivations 447 for corporations and other organizations to develop and respond to carbon labels have only 448 received limited attention, the available research suggests that the information generated and 449 disclosed in the labeling process may enable organizations to identify inefficiencies or induce 450 them to reduce the carbon footprints of their products because of brand or reputational concerns. 451 Quantitative emissions data may be of great value for these purposes, but more needs to be 452 known about corporations' responses to labeling and about the types of labels that may induce 453 corporations to change the products offered to retail consumers even if consumer responsiveness 454 is limited.

455 Available research suggests that a prudent near-term strategy is for carbon labeling 456 systems to focus on the most promising products, not all products, and to use labels that include 457 both ordinal and quantitative information. Adding quantitative information to a label can often be 458 done without undermining the simplicity and clarity of the ordinal rating (see Fig. 1, ordinal + 459 quantitative), and labels with these two features may increase the chance of driving 460 organizational as well as consumer behavior while the research gap on organizational behavior is 461 being filled. Useful insights may be drawn from comparative analyses that look at carbon 462 labeling across products and across countries and from research on other forms of labeling, such 463 as social justice or health labeling.

In short, the case made a decade ago by Vandenbergh et al.<sup>2</sup> for expanding carbon
labeling is even stronger today as the risks arising from climate change and the barriers to
comprehensive governmental action have become clearer. Carbon labeling is not a panacea, but
the search for panaceas should not distract from interim initiatives that can reduce emissions
promptly and complement more comprehensive climate mitigation measures as they become
feasible.

470	Refe	erences
471	1.	UNEP. Emissions Gap Report 2020. (2020); https://www.unep.org/emissions-gap-report-
472		2020.
473	2.	Vandenbergh, M. P., Dietz, T. & Stern, P. C. Time to try carbon labelling. Nat. Clim.
474		<i>Chang.</i> <b>1</b> , 4–6 (2011).
475		Commentary on how carbon labelling systems can help mitigate climate-policy gap
476		by influencing consumer and corporate behavior.
477	3.	Nielsen, K. S. et al. Improving climate change mitigation analysis: A framework for
478		examining feasibility. One Earth 3, 325-336 (2020).
479	4.	Goulder, L. H. Timing is everything: How economists can better address the urgency of
480		stronger climate policy. Rev. Environ. Econ. Policy 14, 143-156 (2020).
481	5.	Vandenbergh, M. P. & Gilligan, J. M. Beyond politics. (Cambridge University Press,
482		2017).
483		Demonstration of how private sector and household actions can complement
484		government actions and achieve major global carbon emissions reductions.
485	6.	Peng, W. et al. Climate policy models need to get real about people — here's how. Nature
486		<b>594</b> , 174–176 (2021).
487	7.	Dietz, T., Gardner, G. T., Gilligan, J., Stern, P. C. & Vandenbergh, M. P. Household
488		actions can provide a behavioral wedge to rapidly reduce U.S. carbon emissions. Proc.
489		Natl. Acad. Sci. 106, 18452–18456 (2009).
490	8.	Feucht, Y. & Zander, K. Consumers' preferences for carbon labels and the underlying
491		reasoning. A mixed methods approach in 6 European countries. J. Clean. Prod. 178, 740-
492		748 (2018).

493		Study on consumers' preferences for carbon label design and willingness to pay for
494		carbon labelled food products in 6 European countries.
495	9.	Gardner, G. T. & Stern, P. C. Environmental problems and human behavior. (Allyn &
496		Bacon, 1996).
497	10.	Meyerding, S. G. H., Schaffmann, A. L. & Lehberger, M. Consumer preferences for
498		different designs of carbon footprint labelling on tomatoes in Germany-does design
499		matter? Sustainability 11, 1–30 (2019).
500	11.	Stern, P. C. et al. The effectiveness of incentives for residential energy conservation. Eval.
501		<i>Rev.</i> <b>10</b> , 147–176 (1986).
502	12.	Wolske, K. S. & Stern, P. C. Contributions of psychology to limiting climate change. in
503		Psychology and Climate Change (eds. Clayton, S. & Manning, C.) 127-160 (Academic
504		Press, 2018).
505	13.	Attari, S. Z., Dekay, M. L., Davidson, C. I., Bruine, W. & Bruin, D. Public perceptions of
506		energy consumption and savings. Proc. Natl. Acad. Sci. 107, 16054–16059 (2010).
507	14.	Camilleri, A. R., Larrick, R. P., Hossain, S. & Patino-Echeverri, D. Consumers
508		underestimate the emissions associated with food but are aided by labels. Nat. Clim.
509		<i>Chang.</i> <b>9</b> , 53–58 (2019).
510		Study demonstrating consumers' underestimation of food system's emission where
511		well-designed carbon label aids consumers in purchasing low-carbon food
512		alternatives.
513	15.	Marghetis, T., Attari, S. Z. & Landy, D. Simple interventions can correct misperceptions
514		of home energy use. Nat. Energy 10, 874–881 (2019).
515	16.	Kantenbacher, J. & Attari, S. Z. Better rules for judging joules: Exploring how experts

516		make decisions about household energy use. Energy Res. Soc. Sci. 73, 101911 (2021).
517	17.	Rosa, E. A. et al. Nuclear waste: knowledge waste? Science. 329, 762-763 (2010).
518	18.	Anderson, K. & Peters, G. P. The trouble with negative emissions. Science. 354, 182–183
519		(2016).
520	19.	Creutzig, F. et al. Considering sustainability thresholds for BECCS in IPCC and
521		biodiversity assessments. GCB Bioenergy 13, 510–515 (2021).
522	20.	Carton, W., Asiyanbi, A. P., Beck, S., Buck, H. J. & Lund, J. F. Negative emissions and
523		the long history of carbon removal. Wiley Interdiscip. Rev. Clim. Chang. e671, 1-25
524		(2020).
525	21.	Torma, G. & Thøgersen, J. A systematic literature review on meta sustainability labeling -
526		What do we (not) know? J. Clean. Prod. 126194 (2021).
527	22.	Sarti, S., Darnall, N. & Testa, F. Market segmentation of consumers based on their actual
528		sustainability and health-related purchases. J. Clean. Prod. 192, 270–280 (2018).
529	23.	Schuitema, G., Aravena, C. & Denny, E. The psychology of energy efficiency labels:
530		Trust, involvement, and attitudes towards energy performance certificates in Ireland.
531		Energy Res. Soc. Sci. 59, 101301 (2020).
532	24.	Brécard, D. Consumer confusion over the profusion of eco-labels: Lessons from a double
533		differentiation model. Resour. Energy Econ. 37, 64-84 (2014).
534	25.	Janßen, D. & Langen, N. The bunch of sustainability labels-Do consumers differentiate?
535		J. Clean. Prod. 143, 1233–1245 (2017).
536	26.	Bullock, G. Independent labels? The power behind environmental information about
537		products and companies. Polit. Res. Q. 68, 46-62 (2015).
538	27.	Shwom, R. L. A middle range theorization of energy politics: the struggle for energy

- 639 efficient appliances. in *The Politics of Energy* 107–128 (Routledge, 2013).
- 540 28. Darnall, N., Ji, H. & Potoski, M. Institutional design of ecolabels: Sponsorship signals rule
  541 strength. *Regul. Gov.* 11, 438–450 (2017).
- 542 29. Bullock, G. Green grades: Can information save the earth? (MIT Press, 2017).
- 543 30. York, J. G., Vedula, S. & Lenox, M. J. It's not easy building green: The impact of public
  544 policy, private actors, and regional logics on voluntary standards adoption. *Acad. Manag.*545 *J.* 61, 1492–1523 (2018).
- 546 31. Liu, T., Wang, Q. & Su, B. A review of carbon labeling: Standards, implementation, and
  547 impact. *Renew. Sustain. Energy Rev.* 53, 68–79 (2016).
- 548 **Review on existing carbon labelling schemes focusing on the evolution of the**
- 549 labelling concept and different measurement methods and standards for carbon
- 550 labelling implemented in different countries with their potential impacts.
- 551 32. Carbon Trust. Product carbon footprint label. (2021); https://www.carbontrust.com/what552 we-do/assurance-and-certification/product-carbon-footprint-label.
- 553 33. Matisoff, D. C., Noonan, D. S. & Mazzolini, A. M. Performance or marketing benefits?
- 554 The case of LEED certification. *Environ. Sci. Technol.* **48**, 2001–2007 (2014).
- 555 34. Gadema, Z. & Oglethorpe, D. The use and usefulness of carbon labelling food: A policy
- 556 perspective from a survey of UK supermarket shoppers. *Food Policy* **36**, 815–822 (2011).
- 557 35. Thøgersen, J. & Nielsen, K. S. A better carbon footprint label. *J. Clean. Prod.* 125, 86–94
  558 (2016).
- 559 36. Marteau, T. M. Towards environmentally sustainable human behaviour: Targeting non-
- 560 conscious and conscious processes for effective and acceptable policies. *Philos. Trans. R.*
- 561 Soc. A Math. Phys. Eng. Sci. 375, 20160371 (2017).

- 562 37. Hollands, G. J. *et al.* The TIPPME intervention typology for changing environments to
  563 change behaviour. *Nat. Hum. Behav.* 1, 1–9 (2017).
- 564 38. Eijgelaar, E., Nawijn, J., Barten, C., Okuhn, L. & Dijkstra, L. Consumer attitudes and
- 565 preferences on holiday carbon footprint information in the Netherlands. J. Sustain. Tour.
- **24**, 398–411 (2016).
- 567 39. Kortelainen, M., Raychaudhuri, J. & Roussillon, B. Effects of carbon reduction labels:
  568 Evidence from scanner data. *Econ. Ing.* 54, 1167–1187 (2016).
- 569 40. Cohen, M. A. & Viscusi, W. K. The role of information disclosure in climate mitigation
  570 policy. *Clim. Chang. Econ.* 3, 1250020 (2012).
- 41. Plambeck, E. L. Reducing greenhouse gas emissions through operations and supply chain
  management. *Energy Econ.* 34, S64–S74 (2012).
- 573 42. Darnall, N. & Aragón-Correa, J. A. Can ecolabels influence firms' sustainability strategy
  574 and stakeholder behavior? *Organ. Environ.* 27, 319–327 (2014).
- 575 43. Boardman, B. Carbon labelling: Too complex or will it transform our buying?
- 576 *Significance* **5**, 168–171 (2008).
- 577 44. Schaefer, F. & Blanke, M. Opportunities and challenges of carbon footprint, climate or
- 578 CO 2 labelling for horticultural products. *Erwerbs-Obstbau* **56**, 73–80 (2014).
- 579 45. Vaughan, A. Tesco drops carbon-label pledge. (2012);
- 580 https://www.theguardian.com/environment/2012/jan/30/tesco-drops-carbon-labelling.
- 581 46. Zhao, R., Wu, D. & Patti, S. A bibliometric analysis of carbon labeling schemes in the
  582 period 2007–2019. *Energies* 13, (2020).
- 583 47. Wu, P., Xia, B. & Zuo, J. Achieving transparency in carbon labelling for construction
- 584 materials Lessons from current assessment standards and carbon labels. *Environ. Sci.*

585 *Policy* **44**, 11–25 (2014).

586 Study investigating the transparency requirements of carbon labeling for

587 construction materials by comparing five established carbon labeling schemes

588 implemented in five different countries.

- 589 48. Gössling, S. & Buckley, R. Carbon labels in tourism: Persuasive communication? J.
- 590 *Clean. Prod.* **111**, 358–369 (2016).
- 49. Haq, G. & Weiss, M. CO2 labelling of passenger cars in Europe: Status, challenges, and
  future prospects. *Energy Policy* 95, 324–335 (2016).
- 593 50. Andor, M. A., Gerster, A. & Götte, L. How effective is the European Union energy label?
  594 Evidence from a real-stakes experiment. *Environ. Res. Lett.* 14, (2019).
- 595 51. Shewmake, S., Cohen, M. A., Stern, P. C. & Vandenbergh, M. P. Carbon triage: A
- 596 strategy for developing a viable carbon labelling system. in *Handbook of research on*
- 597 sustainable consumption (eds. Reisch, L. A. & Thøgersen, J.) 285–299 (Edward Elgar
- 598 Publishing, 2015).
- 599 Examination of carbon labeling systems suggesting an analytical process for

600 identifying the most promising products for carbon labeling.

- 601 52. Holtermans, R. & Kok, N. On the value of environmental certification in the commercial
  602 real estate market. *Real Estate Econ.* 47, 685–722 (2019).
- 603 53. European Commission. Europeans' attitudes on EU energy policy. (2019);
- 604 https://op.europa.eu/en/publication-detail/-/publication/b891cfb7-d50f-11e9-b4bf-
- 605 01aa75ed71a1.
- 606 54. Cornall, J. Foundation Earth project to debut environmental scores on food labels. *Diary*607 *Reporter* (2021).

- 608 55. Iqbal, N. Traffic-light system of 'eco-scores' to be piloted on British food labels. The
- 609 *Guardian* (2021); https://www.theguardian.com/business/2021/jun/27/traffic-light-system-
- 610 of-eco-scores-to-be-piloted-on-british-food-labels.
- 611 56. United States Environmental Protection Agency. Recommendations of specifications,
- 612 standards, and ecolabels for federal purchasing. (2021);
- https://www.epa.gov/greenerproducts/epas-recommendations-specifications-standardsand-ecolabels-federal-purchasing-pdf.
- 615 57. U.S. Government Publishing Office. *Tackling the climate crisis at home and abroad*.
- 616 (2021); https://www.whitehouse.gov/briefing-room/presidential-
- 617 actions/2021/01/27/executive-order-on-tackling-the-climate-crisis-at-home-and-abroad/.
- 58. Isley, S. C., Stern, P. C., Carmichael, S. P., Joseph, K. M. & Arent, D. J. Online
- 619 purchasing creates opportunities to lower the life cycle carbon footprints of consumer
- 620 products. Proc. Natl. Acad. Sci. 113, 9780–9785 (2016).
- 621 Study exploring the potential of modern information technology in providing

# 622 customers with information about products' environmental footprints at the point of 623 purchase.

624 59. Liu, K.-H., Chang, S.-F., Huang, W.-H. & Lu, I.-C. The framework of the integration of

625 carbon footprint and blockchain: Using blockchain as a carbon emission management tool.

- 626 in Technologies and Eco-innovation towards Sustainability I (eds. Hu, A. H., Matsumoto,
- 627 M., Kuo, T. C. & Smith, S.) 15–22 (Springer, 2019).
- 628 60. Potter, C. et al. The effects of environmental sustainability labels on selection, purchase,
- 629 and consumption of food and drink products: A systematic review. *Environ. Behav.* 53,

630 891-925 (2021).

631	Systematic review providing preliminary evidence of ecolabels' effectiveness in
632	promoting the selection, purchase and consumption of more sustainable food and
633	drinks.

- 634 61. Brunner, F., Kurz, V., Bryngelsson, D. & Hedenus, F. Carbon label at a university
- 635 restaurant Label implementation and evaluation. *Ecol. Econ.* **146**, 658–667 (2018).
- 636 62. Visschers, V. H. M. & Siegrist, M. Does better for the environment mean less tasty?
- 638 satisfaction. *Appetite* **95**, 475–483 (2015).

637

639 63. Koistinen, L. et al. The impact of fat content, production methods and carbon footprint

Offering more climate-friendly meals is good for the environment and customer

- 640 information on consumer preferences for minced meat. *Food Qual. Prefer.* 29, 126–136
  641 (2013).
- 642 64. Echeverría, R., Moreira, V. H., Sepúlveda, C. & Wittwer, C. Willingness to pay for
  643 carbon footprint on foods. *Br. Food J.* 116, 186–196 (2014).
- 644 65. Choisdealbha, A. N., Timmons, S. & Lunn, P. D. Experimental evidence for the effects of
- 645 emissions charges and efficiency information on consumer car choices. *J. Clean. Prod.*646 **254**, 120140 (2020).
- 647 66. Slapø, H. B. & Karevold, K. I. Simple eco-labels to nudge customers toward the most
  648 environmentally friendly warm dishes: An empirical study in a cafeteria setting. *Front.*
- 649 Sustain. Food Syst. **3**, 1–9 (2019).
- 650 67. Meyerding, S. G. H. Consumer preferences for food labels on tomatoes in Germany-A
- comparison of a quasi-experiment and two stated preference approaches. *Appetite* 103,
  105–112 (2016).
- 653 68. Hornibrook, S., May, C. & Fearne, A. Sustainable development and the consumer:

- Exploring the role of carbon labelling in retail supply chains. *Bus. Strateg. Environ.* 24,
  266–276 (2015).
- 656 69. Sammer, K. & Wüstenhagen, R. The influence of eco-labelling on consumer behaviour -
- 657 Results of a discrete choice analysis for washing machines. *Bus. Strateg. Environ.* 15,
- 658 185–199 (2006).
- Newell, R. G. & Siikamäki, J. Nudging energy efficiency behavior: The role of
  information labels. J. Assoc. Environ. Resour. Econ. 1, 555–598 (2014).
- 661 71. Stadelmann, M. & Schubert, R. How do different designs of energy labels influence
- purchases of household appliances? A field study in Switzerland. *Ecol. Econ.* 144, 112–
  123 (2018).
- 664 72. Carrero, I., Valor, C., Estela, D. & Labajo, V. Designed to be noticed: A
- reconceptualization of carbon food labels as warning labels. *Sustainability* 13, 1581
  (2021).
- 667 73. Babakhani, N., Lee, A. & Dolnicar, S. Carbon labels on restaurant menus: do people pay
  668 attention to them? *J. Sustain. Tour.* 28, 51–68 (2020).
- 669 74. Sharp, A. & Wheeler, M. Reducing householders' grocery carbon emissions: Carbon
  670 literacy and carbon label preferences. *Australas. Mark. J.* 21, 240–249 (2013).
- 671 75. Osman, M. & Thornton, K. Traffic light labelling of meals to promote sustainable
  672 consumption and healthy eating. *Appetite* 138, 60–71 (2019).
- 673 76. Panzone, L. A., Sniehotta, F. F., Comber, R. & Lemke, F. The effect of traffic-light labels
- and time pressure on estimating kilocalories and carbon footprint of food. *Appetite* 155,
  104794 (2020).
- 676 77. Clarke, N. et al. Impact of health warning labels on selection and consumption of food and

- 677 alcohol products: Systematic review with meta-analysis. Health Psychol. Rev. (2020). 678 doi:10.1080/17437199.2020.1780147
- 679 78. Asbridge, S. C. M., Pechev, E., Marteau, T. M. & Hollands, G. J. Effects of pairing health 680 warning labels with energy-dense snack foods on food choice and attitudes: Online 681
- experimental study. Appetite 160, 105090 (2021).
- 682 79. Heinzle, S. L. & Wüstenhagen, R. Dynamic adjustment of eco-labeling schemes and 683 consumer choice - the revision of the EU energy label as a missed opportunity? Bus.
- 684 Strateg. Environ. 21, 60–70 (2012).
- 685 80. Ölander, F. & Thøgersen, J. Informing versus nudging in environmental policy. J.
- 686 Consum. Policy 37, 341–356 (2014).
- 687 81. Canavari, M. & Coderoni, S. Green marketing strategies in the dairy sector: Consumer-688 stated preferences for carbon footprint labels. Strateg. Chang. 28, 233–240 (2019).
- 689 82. Hartikainen, H., Roininen, T., Katajajuuri, J. M. & Pulkkinen, H. Finnish consumer
- 690 perceptions of carbon footprints and carbon labelling of food products. J. Clean. Prod. 73, 691 285–293 (2014).
- 692 83. Zhao, R. et al. University students' purchase intention and willingness to pay for carbon-
- 693 labeled food products: A purchase decision-making experiment. Int. J. Environ. Res.
- 694 Public Health 17, 7026 (2020).
- 695 Steg, L. Values, norms, and intrinsic motivation to act proenvironmentally. Annu. Rev. 84. 696 Environ. Resour. 41, 277–292 (2016).
- 697 85. Van der Ven, H. Beyond greenwash: Explaining credibility in transnational eco-labeling. 698 (Oxford University Press, 2019).
- 699 Assessment of the credibility of eco-labels across policy domains through the use of

- 700 accountability, inclusiveness, transparency, and other principles of good conduct.
- 701 86. Kitzmueller, M. & Shimshack, J. Economic perspectives on corporate social
- 702 responsibility. J. Econ. Lit. 50, 51–84 (2012).
- 703 87. Hoffman, A. J. & Ventresca, M. J. Organizations, policy and the natural environment:
- 704 *Institutional and strategic perspectives*. (Stanford University Press, 2002).
- 88. Sullivan, R. The management of greenhouse gas emissions in large European companies. *Corp. Soc. Responsib. Environ. Manag.* 16, 301–309 (2009).
- 707 89. Csutora, M. & Harangozo, G. Twenty years of carbon accounting and auditing–a review
  708 and outlook. *Soc. Econ.* 39, 459–480 (2017).
- 709 90. da Rosa, F. S., Lunkes, R. J. & Brizzola, M. M. B. Exploring the relationship between
- internal pressures, greenhouse gas management and performance of Brazilian companies. *J. Clean. Prod.* 212, 567–575 (2019).
- 712 91. Li, D., Tang, F. & Jiang, J. Does environmental management system foster corporate
- 713 green innovation? The moderating effect of environmental regulation. *Technol. Anal.*
- 714 *Strateg. Manag.* **31**, 1242–1256 (2019).
- 715 92. Gatzert, N. The impact of corporate reputation and reputation damaging events on
- 716 financial performance: Empirical evidence from the literature. *Eur. Manag. J.* **33**, 485–
- 717 499 (2015).
- 71893.De la Fuente Sabaté, J. M. & de Quevedo Puente, E. Empirical analysis of the relationship
- between corporate reputation and financial performance: A survey of the literature. *Corp.*
- 720 *Reput. Rev.* **6**, 161–177 (2003).
- 94. Lee, H. L., O'Marah, K. & John, G. The chief supply chain officer report 2012. SCM
  World 1–52 (2012).

723	95.	Konar, S. & Cohen, M. A. Information as regulation: The effect of community right to
724		know laws on toxic emissions. J. Environ. Econ. Manage. 32, 109-124 (1997).
725	96.	Van der Ven, H., Bernstein, S. & Hoffmann, M. Valuing the contributions of nonstate and
726		subnational actors to climate governance. Glob. Environ. Polit. 17, 1-20 (2017).
727	97.	Shwom, R. & Bruce, A. US non-governmental organizations' cross-sectoral
728		entrepreneurial strategies in energy efficiency. Reg. Environ. Chang. 18, 1309-1321
729		(2018).
730	98.	Andonova, L. B., Hale, T. N. & Roger, C. B. National policy and transnational
731		governance of climate change: Substitutes or complements? Int. Stud. Q. 61, 253-268
732		(2017).
733	99.	Lambin, E. F. & Thorlakson, T. Sustainability standards: Interactions between private
734		actors, civil society, and governments. Annu. Rev. Environ. Resour. 43, 369-393 (2018).
735	100.	Marques, J. C. & Eberlein, B. Grounding transnational business governance: A political-
736		strategic perspective on government responses in the Global South. Regul. Gov. (2020).
737	101.	Cashore, B., Knudsen, J. S., Moon, J. & van der Ven, H. Private authority and public
738		policy interactions in global context: Governance spheres for problem solving. Regul.
739		<i>Gov.</i> (2021).
740	102.	Condon, M. & Ignaciuk, A. Border carbon adjustment and international trade: A
741		literature review. (OECD Working Paper, 2013).
742	103.	De Rubens, G. Z., Noel, L. & Sovacool, B. K. Dismissive and deceptive car dealerships
743		create barriers to electric vehicle adoption at the point of sale. Nat. Energy 3, 501-507
744		(2018).
745	104.	Gulbrandsen, L. H. Sustainable forestry in Sweden: the effect of competition among

746		private certification schemes. J. Environ. Dev. 14, 338-355 (2005).
747	105.	Auld, G. Constructing private governance. (Yale University Press, 2014).
748	106.	Grabs, J. Selling sustainability short?: The private governance of labor and the
749		environment in the coffee sector. (Cambridge University Press, 2020).
750	107.	European Commission. Screening of websites for 'greenwashing'': half of green claims
751		lack evidence'. (2021);
752		https://www.eumonitor.eu/9353000/1/j9vvik7m1c3gyxp/vlfuhgbc38ut?ctx=vhsjhdfktnpb.
753	108.	CDP. Transparency to transformation: A chain reaction. (2021);
754		https://www.cdp.net/en/research/global-reports/transparency-to-transformation.
755	109.	Walmart. Walmart launches project gigaton to reduce emissions in company's supply
756		chain. (2017); https://corporate.walmart.com/newsroom/2017/04/19/walmart-launches-
757		project-gigaton-to-reduce-emissions-in-companys-supply-chain.
758	110.	Marcu, A., Mehling, M. & Cosbey, A. Border carbon adjustments in the EU: Issues and
759		options. (2021); https://ercst.org/border-carbon-adjustments-in-the-eu-issues-and-options/.
760	111.	European Commission. Carbon Border Adjustment Mechanism. (2021);
761		https://ec.europa.eu/taxation_customs/green-taxation-0/carbon-border-adjustment-
762		mechanism_en.
763	112.	Tucker, T. N. & Meyer, T. A green steel deal: Towards pro-jobs, pro-climate trans-
764		Atlantic cooperation on carbon border measures. (2021);
765		https://rooseveltinstitute.org/publications/a-green-steel-deal-towards-pro-jobs-pro-climate-
766		trans-atlantic-cooperation-on-carbon-border-measure/.
767	113.	Busch, L. Standards: Recipes for reality. (MIT Press, 2011).
768	114.	National Research Council. Public participation in environmental assessment and

- 769 *decision making*. (National Academies Press, 2008).
- 115. Henry, A. D. The challenge of learning for sustainability: A prolegomenon to theory.
- 771 *Hum. Ecol. Rev.* **16**, 131–140 (2009).
- 116. Greenhouse Gas Protocol. Quantifying the greenhouse gas emissions of products: PAS
- 2050 & the GHG Protocol Product Standard. (2021);
- https://ghgprotocol.org/sites/default/files/standards\_supporting/GHG%20Protocol%20PA
  S%202050%20Factsheet.pdf.
- 117. Cialdini, R. B. Influence: The psychology of persuasion. (Collins, 2007).
- 118. Brazil, W., Kallbekken, S., Sælen, H. & Carroll, J. The role of fuel cost information in
  new car sales. *Transp. Res. Part D Transp. Environ.* 74, 93–103 (2019).
- 779 119. Codagnone, C. *et al.* Labels as nudges? An experimental study of car eco-labels. *Econ.*780 *Polit.* 33, 403–432 (2016).
- 120. Andor, M. A., Gerster, A., Gillingham, K. T. & Horvath, M. Running a car costs much
  more than people think stalling the uptake of green travel. *Nature* 580, 453–455
  (2020).
- 121. Galarraga, I., Kallbekken, S. & Silvestri, A. Consumer purchases of energy-efficient cars:
- How different labelling schemes could affect consumer response to price changes. *Energy Policy* 137, 111181 (2020).
- Hille, S. L., Geiger, C., Loock, M. & Peloza, J. Best in class or simply the best? The
  impact of absolute versus relative ecolabeling approaches. *J. Public Policy Mark.* 37, 5–22
- 789 (2018).
- 790 123. Grover, C., Bansal, S. & Martinez-Cruz, A. L. Influence of social network effect and
- incentive on choice of star labeled cars in India: a latent class approach based on choice

792		experiment. Cent. Int. Trade Dev. Discuss. Pap. DP1805 1-42 (2018).
793	124.	Folkvord, F. et al. The effects of ecolabels on environmentally-and health-friendly cars:
794		an online survey and two experimental studies. Int. J. Life Cycle Assess. 25, 883-899
795		(2020).
796	125.	Sussman, R., Kormos, C., Park, C. & Cooper, E. Energy efficiency in real estate listings:
797		A controlled experiment. (2020); https://www.aceee.org/research-report/b2002.
798	126.	Elevate. Value for high-performing homes resources. (2021);
799		https://www.elevatenp.org/value-for-high-performing-homes-resources/.
800	127.	Devine, A. & Kok, N. Green certification and building performance: Implications for
801		tangibles and intangibles. J. Portf. Manag. 41, 151-163 (2015).
802	128.	Asensio, O. I. & Delmas, M. A. The effectiveness of US energy efficiency building labels.

803 *Nat. Energy* **2**, 1–9 (2017).

804 Study measuring the effectiveness of energy efficiency building labels on a large

805 sample of commercial buildings in the United States.

806 129. Brookstein, P. & Caracino, J. Making the value visible: A blueprint for transforming the

807 *high-performing homes market by showcasing clean and efficient energy improvements.* 

808 (2020); https://www.elevatenp.org/wp-content/uploads/Visible-Value-Blueprint-Final.pdf.

809

811	Acknowledgments
812	K. S. Nielsen was funded by the Carlsberg Foundation, grant number CF20-0285. T. Dietz's
813	contributions were supported in part by Michigan AgBio Research. M. Vandenbergh's
814	contributions were supported by the Climate Change Research Network and the Vanderbilt
815	Dean's Fund.
816	
817	Competing interests
818	The authors declare no competing interests.
819	
820	Author contributions
821	All authors contributed significantly to conceptualizing the research and to writing the
822	manuscript.





824 Fig. 1. Illustrative examples of levels of resolution offered by carbon labels. Labels at all 825 826 these levels of resolution are currently in use. Some examples are identified, with links, in 827 Supplementary Table 1. Certificate labels indicate that labeled products meet some standard; 828 ordinal ratings differentiate among several levels of carbon footprints of the same product; 829 quantitative labels offer numerical measurements of carbon footprints; and some labels combine 830 quantitative and ordinal ratings. The design of labels should be informed by research on what means of conveying information is most effective, particularly for retail consumers. Available 831 832 data are inadequate to choose among logo types (we use footprints here) or among ways of 833 representing ordinal differences (e.g., stars, letter grades). Research suggests that ordinal labels that employ the familiar red-yellow-green distinction in traffic lights may be effective for many 834 retail choices<sup>35</sup>. In the figure, we applied that insight by coloring the footprints green in the 835 836 ordinal representations to indicate low-footprint products. We would have used yellow or red to 837 indicate intermediate or high-footprint products. Icons Roselin Christina.S from 838 Nounproject.com.

## Box 1 | Responses to labels for motor vehicles

The choice of motor vehicles is one of the most climate consequential decisions for households and many organizations. It is also a complex decision, involving a relatively large financial commitment (among households, usually second only to the purchase of a home), a complex variety of practical and symbolic features of the vehicle, and efforts by the industry to shape decisions<sup>117</sup>. For many retail consumers, carbon or energy labels are not likely to be the dominant influence on a motor vehicle purchase decision. Nonetheless, the rise in popularity of hybrid and all-electric vehicles through a period of historically modest gasoline prices suggests that environmental impacts, including climate change concerns, do have substantial impact on vehicle purchases. Certainly, the stark contrasts among the carbon footprints of all-electric, hybrid, and conventional vehicles suggests that information on labels reflects something that matters to many retail consumers. But beyond that categorical distinction, do labels matter?

In many countries fuel efficiency labels on new vehicles are mandated. Since fuel efficiency translates rather directly into GHG emissions, these labels are a reasonable surrogate for carbon labels as an influence on vehicle purchases. Indeed, one could view carbon labels and fuel efficiency labels on vehicles as alternative ways of presenting essentially the same information to consumers, although fuel efficiency labels signal both individual and collective benefits, while carbon labels mainly signal collective benefits. Of course, with plug-in hybrid or all-electric vehicles the GHG emissions depend on the source of electricity.

Several studies document the effects of vehicle labels on retail consumer choice. Much of this literature relies on self-reports of behavioral intentions, so the usual cautions apply. It does seem clear that the way information is presented makes a difference. For example, Brazil et al.<sup>118</sup> find that information presented as monthly fuel cost has a larger impact on stated preferences than information presented as fuel consumption. In a direct comparison of fuel efficiency and cost information with environmental impact information, Codagnone et al.<sup>119</sup> found fuel efficiency labeling had the greatest impact (see also ref<sup>120</sup>). Galarraga et al.<sup>121</sup> found that both relative (compared to other vehicles) and absolute ratings of fuel efficiency can matter, but which matters depends on whether consumers are making choices within a class of vehicles (e.g., sedans) or across all classes, an indication of the complexities that have to be considered in designing effective labeling strategies (see also ref<sup>122</sup>). A variety of other studies find that labels can have an impact on willingness to spend more for a fuel-efficient vehicle but, again, the results are complex, with the effect of energy efficiency or carbon labels depending on factors such as the kind of benefits from low fuel consumption that were signaled<sup>123,124</sup>. The effects on manufacturers and dealers have been less studied; some reports show that dealers steer retail customers away from electric vehicles<sup>103</sup>, and this may suggest the need for research and policy initiatives that focus on these actors.

841

## Box 2 | Responses to building labels

The purchase, lease, or rental of a dwelling is the largest item in the budget of most households. The costs of buildings also represent an important expenditure for most organizations. It is therefore not surprising that building energy ratings and labels have a considerable history. Many jurisdictions have mandates for labels or rating and voluntary systems are also used extensively. As with the work on vehicles discussed in Box 1, this literature has evolved independently of the work on low-footprint consumer products that is the major focus of this section. Experiments with hypothetical real estate ads have suggested that energy ratings could influence home purchase decisions, although as with all results about labels, the impacts may vary across segments of the population<sup>125</sup>. There is also evidence that energy efficient homes and homes equipped with solar photovoltaics appraise and sell for higher prices, so labels may facilitate signaling these features of a home, at least in the places where they have been studied most, such as California<sup>126</sup>.

For commercial buildings, it appears that environmental certification (which includes energy efficiency but other factors as well) leads to increased rental prices, lower vacancy rates, greater occupant satisfaction<sup>52,127</sup>, and decreased energy use<sup>128</sup>. As with much of the literature on labeling, experiments that allow detailed assessments of the impact of a label mainly rely on hypothetical responses. Experiments using data from actual purchases or rentals assessing the impacts of a labeling or certification scheme over and above the features of the building itself are methodologically challenging. But we suggest that a labeling system may draw attention to and encourage improvements in building characteristics that might not otherwise be visible. For buildings as for vehicles, the most effective strategies for increasing the impact of labels may come from targeting key actors who influence consumer and producer decisions. For buildings, these include real estate agents, appraisers, corporate tenants, and mortgage lenders<sup>129</sup>.