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1 **Conceptualising the drivers of ultra-processed food production and consumption and their** 2 **environmental impacts: a group model-building exercise**

3 **Abstract**

4 Using group model building we developed a series of causal loop diagrams identifying the
5 environmental impacts of ultra-processed food (UPF) systems, and underlying system drivers, which
6 was subsequently validated against the peer-reviewed literature. The final conceptual model
7 displays the commercial, biological and social drivers of the UPF system, and the impacts on
8 environmental sub-systems including climate, land, water and waste. It displays complex
9 interactions between various environmental impacts, demonstrating how changes to one
10 component of the system could have flow-on effects on other components. Trade-offs and
11 uncertainties are discussed. The model has a wide range of applications including informing the
12 design of quantitative analyses, identifying research gaps and potential policy trade-offs resulting
13 from a reduction of ultra-processed food production and consumption.

14 **Keywords**

- 15 • Ultra-processed foods
- 16 • Sustainable diets
- 17 • Group model building
- 18 • Food system transformation
- 19 • Environmental impact assessment

20 **Graphical abstract**

Conceptualising the drivers of ultra-processed food production and consumption and their environmental impacts: a group model-building exercise

Aim... to develop and validate a conceptual systems model of the environmental impacts of ultra-processed foods.

Model creation



Review of existing literature

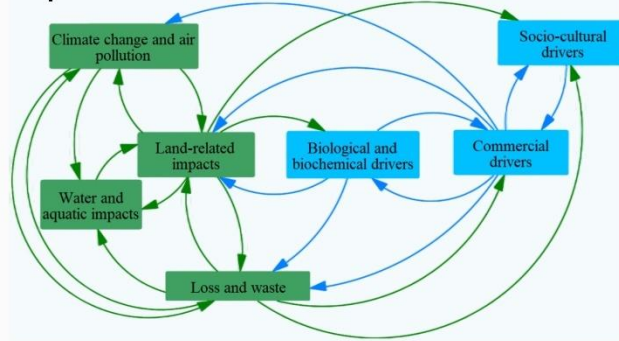


Model testing and expansion through group model building



Validation of new variables through scoping review

Results: Model of the drivers & environmental impacts of UPFs



21

22 1. Introduction

23 The global food system is a leading driver of environmental degradation (Tilman and Clark, 2014;
24 Willett et al., 2019). It is responsible for one-third of global greenhouse gas emissions (Crippa et al.,
25 2021), approximately 70% of freshwater use (Earthscan, 2007), is the largest driver of land and
26 marine ecosystem biodiversity loss (Benton et al., 2021), and threatens freshwater and marine
27 ecosystems through the excessive use of nitrogen and phosphorus-based production inputs (Diaz
28 and Rosenberg, 2008). Transitioning to a healthy and sustainable food system is essential to meet
29 global environmental targets, including the Paris Climate Agreement and the Sustainable
30 Development Goals (Chen et al., 2022; Rockström et al., 2020).

31 One approach to improve the sustainability of diets is to reduce the production and consumption of
32 ultra-processed foods (UPFs) (Fardet and Rock, 2020; Seferidi et al., 2020). UPFs form the fourth
33 group of the NOVA (a name, not an acronym) food classification system, which defines UPFs as
34 *'formulations of ingredients, mostly of exclusive industrial use, that result from a series of industrial*
35 *processes'* (Monteiro et al., 2019). Examples of UPFs include sugar-sweetened beverages,
36 confectionary, packaged snacks, ready-made infant foods, breakfast cereals and reconstituted meats
37 (Monteiro et al., 2019). The other three groups are unprocessed/ minimally processed foods (Group
38 1), processed culinary ingredients (Group 2) and processed foods (Group 3) (Monteiro et al., 2019).
39 NOVA groups 1-3 are collectively referred to as non-UPFs throughout the text. UPFs are associated
40 with multiple adverse health outcomes, such as cancer, type-2 diabetes and cardiovascular diseases
41 (Chen et al., 2020; Elizabeth et al., 2020; Lane et al., 2021; Pagliai et al., 2021). UPFs are
42 predominantly discretionary in nature, and easily overconsumed (Forde et al., 2020). UPFs comprise
43 a large proportion (10-60%) of total dietary energy intake in high-income countries (Marino et al.,
44 2021), with consumption rapidly rising in middle-income countries (Baker et al., 2020; Monteiro et
45 al., 2013). While reformulating these products to improve their nutrient composition may reduce
46 some adverse health impacts associated with their consumption, it does not necessarily transform

47 them into 'healthful' foods (Scrinis and Monteiro, 2018), and will not materially reduce their
48 environmental impacts. Therefore, a reduction in UPF production and consumption could reduce
49 environmental impacts from foods which are often superfluous to human needs (Hadjikakou, 2017).

50 Quantitative evidence on the environmental impact of UPFs is limited to two published studies from
51 Brazil (da Silva et al., 2021; Garzillo et al., 2022) and one from France (Kesse-Guyot et al., 2022).

52 These studies indicate that UPFs can significantly contribute to diet-related greenhouse gas
53 emissions, land-use, energy and water-footprints (Kesse-Guyot et al., 2022), driven primarily by
54 overconsumption (da Silva et al., 2021; Garzillo et al., 2022). Reviews of the literature suggest that
55 the production of UPFs may be associated with large-scale monoculture farming, high energy-inputs
56 for processing, lengthy transportation chains and excessive packaging (Anastasiou et al., 2022;
57 Fardet and Rock, 2020; Seferidi et al., 2020). As a result, relationships between UPF production and
58 biodiversity loss, greenhouse gas emissions, waste, land degradation and impacts on water quality
59 and scarcity have been proposed (Anastasiou et al., 2022; Fardet and Rock, 2020; Leite et al., 2022).

60 Understanding the environmental impacts of UPFs comes with challenges. First, all supply chain
61 stages must be included (Seferidi et al., 2020), and differentiated. Existing research has not
62 differentiated between the environmental impacts of primary processing (essential processes that
63 increase shelf-life or digestibility while preserving the original ingredients, such as milling or
64 fermentation) and ultra-processing, which is unessential. This is important because identifying
65 environmental impacts at key supply chain stages may enable more informed and effective
66 interventions.

67 Second, impacts are often measured in isolation, with limited consideration of the environmental
68 processes that link impacts across the system (Aldaya et al., 2021). Even empirical analyses that
69 consider more than one metric (e.g. greenhouse gas emissions, water-scarcity and biodiversity loss)
70 rarely consider how such environmental impacts may interact. This is important because ecosystems

71 and food systems are highly dynamic; changes in one part of the system can have significant flow-on
72 impacts and trade-offs with other system components (Campbell et al., 2018). The need for a more
73 cross-disciplinary food systems approach was emphasised in the 2021 UN Food Systems Summit and
74 recent reports (Rockström et al., 2020), which highlight the urgent need to achieve a food systems
75 transition and minimise systems trade-offs to meet global targets including the Paris Climate
76 Agreement (Zurek et al., 2022) and the Sustainable Development Goals (von Braun et al., 2021).

77 This study aims to develop and validate a conceptual model of the known and potential
78 environmental impacts across ultra-processed food systems. This study a) identifies key variables
79 that drive UPF systems; b) conceptualises the relationships between environmental impacts and
80 each stage of UPF systems and; c) differentiates the environmental, economic, social and biological
81 impacts of ultra-processed food systems relative to those producing non-UPFs.

82 **2. Methods**

83 Systems dynamics is a field of science used to understand complex behaviours of systems (Haji
84 Gholam Saryazdi et al., 2021), and can be used to address the limitations described in the
85 introduction. Group model building (GMB) is a soft systems method whereby a qualitative systems
86 model is developed and then tested via modelling workshops with experts and key stakeholders
87 (Vennix, 1996). Previous studies have identified that GMB enables diverse discussions of complex
88 social, economic and environmental phenomena (Valencia Cotera et al., 2022), while generating new
89 knowledge and sensitising stakeholders to a given issue (Rouwette et al., 2002).

90 Causal loop diagrams (CLDs) are ideal for displaying dynamic relationships between key variables in
91 complex systems (Purwanto et al., 2019). CLDs comprise of variables that can increase or decrease;
92 arrows containing a polarity indicator (+/-) that indicate the direction of the association, e.g. where a
93 positive polarity indicates that the variables are moving in the same direction; reinforcing loops
94 (shown as 'R' with a circular arrow), that indicate a positive feedback loop whereby both variables A

95 and B increase; and balancing loops (shown as 'B' with a circular arrow), that indicate a feedback
96 loop whereby one variable increases and the other decreases. This study used group model building
97 (GMB) to test and validate a CLD.

98 **2.1 Developing the initial causal loop diagram**

99 Following standard GMB practice (Haji Gholam Saryazdi et al., 2021), a preliminary CLD was
100 developed as follows. Initial variables were sourced from scientific papers and reports identified in a
101 recently published review (Anastasiou et al., 2022) on the characteristics of UPFs and relationships
102 with the natural environment. Key UPF supply chain stages were adapted from the published review
103 (see Appendix). After these resources were exhausted, searches of the peer-reviewed literature
104 were conducted in EbscoHost to ascertain if there were known relationships between each of the
105 initially identified variables. Studies were included if they described the relationships between two
106 variables (see Appendix). Reviews and reports which provided consensus statements from
107 authoritative organisations, such as the Food and Agriculture Organisation of the United Nations and
108 the Intergovernmental Panel on Climate Change, were prioritised. Where necessary, additional
109 variables were added to explain the pathways between variables previously identified.

110 **2.2 Group model building process**

111 For the GMB workshops, 19 experts on sustainable food systems were identified through published
112 literature, according to purposive sampling methods (Tongco, 2007). Of these, 11 participants from
113 Australasia, Asia, Europe, North America and South America consented and attended one of three
114 two-hour online workshops facilitated by the lead author. Three participants were from low or
115 middle-income countries. Reasons for not participating were unavailability (n=2) or no response to
116 the email (n= 6).

117 The workshops followed pre-established and tested GMB scripts (see Appendix). Each workshop
118 began with a presentation on the research aims, existing research, GMB process and model. The
119 preliminary CLD was edited in real-time using Vensim software (Ventana Inc.), based on group
120 discussion. Participants suggested variables, relationships and modifications to the CLD, and
121 discussed the impacts of UPF systems compared with an idealised healthy and sustainable food
122 system.

123 While participants usually agreed with each other regarding modelling decisions, occasionally
124 disagreements occurred. In these instances, discussion was encouraged to better understand the
125 rationale behind such differences in opinion which revealed differences in regional contexts or
126 assumptions. This led to additional variables, clarification of assumptions, or additional trade-offs
127 (see section 3.9).

128 After the workshops, the preliminary CLD was refined to reflect participant inputs and to ensure
129 consistent granularity of variables. Rigorous criteria, such as degree of removal from the supply
130 chain, and specificity to only one region, were applied to determine the exclusion of the variables
131 and relationships (see Appendix). Reinforcing and balancing loops overlooked during the workshops
132 were added at this stage.

133 **2.3 Validation of new variables and pathways, and evaluating the strength of the evidence**

134 Following the workshops, the model was consolidated, in accordance with standard practice (Haji
135 Gholam Saryazdi et al., 2021). We then cross-checked the new variables and pathways by conducting
136 an additional search for published literature and reports, and including literature suggested by
137 participants. Lines in the model were formatted to reflect the strength of the evidence by
138 distinguishing them according to three groups: (i) proposed, (ii) emerging, or (iii) established
139 (definitions in the Appendix).

140 After the variables were finalised, the model was divided thematically into seven subsystems: three
141 subsystems represent the drivers of UPF production (blue variables, subsystems 1-3) and another
142 four subsystems represent the environmental impacts of the system (green variables, subsystems 4-
143 7). Some variables and relationships appear in multiple subsystems, as subsystems do not exist in
144 isolation.

145 Participants were offered the opportunity to provide feedback on the final CLDs via the draft
146 manuscript, as a final consensus (Rouwette et al., 2002) and internal validity check. Ten participants
147 provided feedback and elected to become co-authors which acknowledged their contribution to the
148 model and manuscript. One participant opted out of the feedback and manuscript writing process
149 due to time constraints.

150 **3. Results**

151 The seven CLDs developed in this study illustrate the widescale drivers of UPF systems and
152 associated environmental impacts. Three CLDs display the drivers of UPF systems (Figures 1-3); four
153 CLDs display the environmental impacts (Figures 4-7). A full model displaying all impacts is available
154 in the Appendix. CLD variables include drivers and outcomes of the system, with changes to one part
155 of the system resulting in flow-on impacts throughout the system. The results present key variables
156 and interactions described by the CLD. Variables are differentiated in the manuscript text using
157 italics. Details on each relationship, supporting evidence, and grading methods are available (see
158 Appendix).

159 **3.1 Summary model**

160 The summary model displays the relationships between each subsystem, illustrating that the
161 subsystems do not exist in isolation. Instead, there are dynamic interactions among the variables

162 and pathways of the different CLDs; i.e. the full system is more than the sum of the individual
163 variables or subsystems.

164 The summary model also highlights key system drivers. For example, commercial drivers are core to
165 many of the other subsystems, largely because profit gains appear to drive commercial, biological
166 and socio-cultural systems (see R1, 2 & B1-4, Figure 1).

167 The summary model also demonstrates that the environmental subsystems are deeply connected;
168 each environmental subsystem is linked (Figure 1). This likely reflects the interconnected nature of
169 ecosystems. Also of note are the many reinforcing loops between land-related impacts and other
170 subsystems (R3-9). Thus, the land-related impacts, often initially stemming from agricultural
171 production of UPFs, are likely key drivers of UPF environmental degradation, reinforced by other
172 systems.

173 A full list and description of reinforcing and balancing loops, and a detailed integrated model
174 displaying all variables are available in the Appendix.

175 **[Insert Figure 1 here]**

176 Figure 1: Causal loop diagram displaying an overview of the relationships between each subsystem
177 in the model

178 Variables in blue are subsystems containing drivers of UPF production (subsystems 1-3), variables in green are
179 environmental impact subsystems (subsystems 4-7). 'R' denotes reinforcing loops, 'B' denotes balancing loops. Polarity of
180 relationships are not shown as there are both positive and negative polarities contained within the subsystems and
181 reinforcing loops, see subsystem models for more details.

182 **3.2 Subsystem 1: Commercial drivers of UPF systems**

183 This subsystem focuses on commercial drivers. Four reinforcing loops were identified, all of which
184 include the variable '*profitability*', indicating that it is a primary driver of this subsystem. *Profitability*

185 reflects the primacy of shareholders and the cost minimising and sales maximising tendencies of free
186 market capitalism (Wood et al., 2021a; Wood et al., 2021b). With a sustainable financial model,
187 *profitability* generates financial gains for shareholders and supports investments for ongoing growth
188 (Figure 2). Depending on market conditions, this can enable the accumulation of *greater material*
189 *resources and economic power* within food systems (Wood et al., 2021a). For example, corporations
190 producing UPFs can use these accumulating resources to support *foreign direct investment* and the
191 development of their global sourcing and distribution networks, and to grow through *mergers and*
192 *acquisitions* of competitors (Hawkes, 2005; Wood et al., 2021b) (Figure 2). These strategies can
193 result in *market concentration*, whereby fewer large companies own or influence a greater
194 proportion of UPF product markets, thereby reducing *market competition* and maximising profit
195 (Wood et al., 2021b). These are displayed in the reinforcing loops whereby increased economic
196 power enables further economic gains (R2, R12 & R13, Figure 2).

197 Accumulating *material resources and economic power*, can further support *corporate political*
198 *activities* intended to foster policy, regulatory and knowledge environments conducive to continuing
199 market growth. These activities include lobbying policy-makers, funding scientific research for
200 corporate benefit, and preferencing *public-private partnerships and self-regulation* over state-led
201 food systems governance and command-and-control regulation (Clapp and Scrinis, 2017; Moodie et
202 al., 2021). These are further described in the Appendix.

203 Reinforcing loop 13 displays that *corporate political activities* may also support *subsidies of*
204 *agricultural inputs and commodities* used as UPF ingredients (Orden and Zulauf, 2015), which is
205 enabled and reinforced via *profitability*, and the *economic power of the UPF industry* (Figure 2).

206 Reinforcing loop 1, which overlaps with subsystem 3, represents the intensive and sophisticated
207 *marketing* techniques, including product design, branding and packaging, and advertising in mass-

208 media and digital channels, which increase the *desirability of UPFs* and encourage *purchasing and*
209 *consumption* (Bailey, 2016; Moran et al., 2019).

210 In addition to the system drivers describe above, other factors act to further encourage UPF
211 purchasing and consumption. This includes *market competition* between food corporations, fast
212 food chains and supermarkets which may increase pressure to maintain low *costs of final products*
213 (Richards and Hamilton, 2006), and reinforce the reliance on low-cost commodity ingredients. A
214 small variety of these commodity ingredients can be used to create an apparent diversity of UPF
215 products, targeting different market segments.

216 ***Differentiating UPF system impacts from general food system impacts***

217 We hypothesise that the above factors are more prominent in UPF systems compared with non-UPF
218 systems. UPFs are often (but not exclusively) produced and sold by transnational organisations and
219 therefore are associated with transnational corporate power consolidation and growth, as described
220 above. However, more empirical evidence is needed to understand to what extent the political
221 economy driving UPF production differs from non-UPFs.

222 **[Insert Figure 2 here]**

223 Figure 2: Causal loop diagram of Subsystem 1: Commercial drivers relevant to UPF systems

224 Figure 2 Legend: Black boxes and arrows indicate the supply chain, blue boxes and arrows are system drivers and grey
225 arrows are used to denote links to other subsystems. 'R' denotes reinforcing loops, polarity of relationships are denoted by
226 +/- next to the arrow head. Dotted lines indicate that the relationship was proposed (no existing empirical evidence), and
227 solid lines denote that the evidence was established (supported by empirical evidence or reviews of empirical evidence).
228 Reinforcing loops, balancing loops and connections (arrows) in grey are described in subsequent subsystems. Other figures
229 display socio-cultural and biological drivers of UPF purchasing and consumption (Figure 3 & 4), climate change and air
230 pollution impacts (Figure 5), land-related impacts (Figure 6), water use and aquatic impacts (Figure 7), loss and waste
231 (Figure 8).

232 **3.3 Subsystem 2: Socio-cultural drivers of UPF purchasing and consumption**

233 Subsystem 2 displays the socio-cultural drivers of UPF purchasing and consumption (see Figure 3).

234 Variables were grouped under five of the six pillars of food security (access, availability, stability,
235 utilisation and agency) (HLPE, 2020). The sixth pillar, sustainability, is the focus of subsystems 4-7.

236 All reinforcing loops in this subsystem act by influencing consumers' *desirability for UPFs*.

237 *Profitability, successful marketing and access to UPFs* were proposed to work together to increase
238 *desirability of UPFs, purchasing and consumption*, creating reinforcing loops (R1, R14, Figure 3). Food
239 policies and regulation could act to reduce these effects (Macari et al., 2019), potentially decreasing
240 the profits and therefore economic power of the UPF industry (B1, Figure 3).

241 The *desirability of UPFs* may also be driven by their convenience, especially for individuals who lack
242 food literacy skills needed to *utilise non-UPFs* (Chak Leung Lam and Adams, 2017). The *ability to*
243 *utilise non-UPFs* may be further enabled or hindered through *agency* including self-efficacy,
244 employment status, *time pressures*, family commitments and financial constraints (Chang et al.,
245 2019; Contento et al., 2007; Davison et al., 2015; Jalambadani et al., 2017). This could be reinforced
246 by ongoing *purchasing and consumption of UPFs*, which eliminates the need to learn to prepare
247 meals and cuisines made from non-UPFs (R15, Figure 3).

248 ***Differentiating UPF system impacts from general food system impacts***

249 While the relationships described above are not necessarily exclusive to UPFs, impacts may be more
250 significant for these food products as they are often more accessible, available, easy to utilise and
251 require little agency to consume them compared with non-UPFs (Chak Leung Lam and Adams, 2017;
252 Chang et al., 2019; Contento et al., 2007; Davison et al., 2015; Jalambadani et al., 2017).

253 **[Insert Figure 3 here]**

254 Figure 3: Causal loop diagram of subsystem 2: Socio-cultural drivers relevant to UPF systems

255 Figure 3 Legend: Black boxes and arrows indicate the supply chain, blue boxes and arrows are system drivers and grey
256 arrows are used to denote links to other subsystems. 'R' denotes reinforcing loops, polarity of relationships are denoted by
257 +/- next to the arrow head. Dotted lines indicate that the relationship was proposed (no existing empirical evidence), and
258 solid lines denote that the evidence was established (supported by empirical evidence or reviews of empirical evidence).
259 Reinforcing loops, balancing loops and connections (arrows) in grey are described in subsequent subsystems. Other figures
260 display the commercial drivers of UPF systems (Figure 2), biological drivers of UPF purchasing and consumption (Figure 3 &
261 4), climate change and air pollution impacts (Figure 5), land-related impacts (Figure 6), water use and aquatic impacts
262 (Figure 7), loss and waste (Figure 8).

263 **3.4 Subsystem 3: Biological drivers of UPF purchasing and consumption**

264 This system displays changes in the composition of foods as they become ultra-processed, biological
265 drivers of consumption and human health impacts (Figure 4).

266 While no new reinforcing loops were identified, *purchasing and consumption* of UPFs (which drives
267 *profitability* and therefore encourages increased production of UPFs, see Subsystem 1), is likely
268 promoted via biological drivers.

269 ***Differentiating UPF system impacts from general food system impacts***

270 The majority of this subsystem is specific to UPFs. *Ultra-processing* enables changes in *nutrient*
271 *composition* and *degradation of the food matrix*, which act to increase *palatability* and decrease
272 *satiety* (Fardet et al., 2018). As a result, *palatability* (Almeida et al., 2018) and decreased *satiety* can
273 promote *purchasing* and *overconsumption* (Hall et al., 2019). Beginning during early childhood,
274 consumption of ultra-processed infant foods of homogenous flavours and textures may inhibit
275 development of taste preferences associated with healthy eating habits throughout life (Foterek et
276 al., 2015; García et al., 2013). The potentially *addictive* nature of UPFs, hypothesised to be driven by
277 product design characteristics such as *palatability* (Schulte et al., 2015), may also play a role in

278 encouraging excessive consumption of UPFs notably in adults and children who experience food
279 addiction (Filgueiras et al., 2019; Pursey et al., 2015).

280 Also encompassed in this subsystem are the *adverse health outcomes* associated with UPF
281 consumption and discussed extensively elsewhere (Elizabeth et al., 2020; Lane et al., 2021). Health
282 impacts may occur directly due to over-consumption of UPFs (Matos et al., 2021) or indirectly
283 through *dietary displacement of non-UPFs* (Martini et al., 2021).

284 **[Insert Figure 4 here]**

285 Figure 4: Causal loop diagram of Subsystem 3: Biological and biochemical drivers relevant to UPF
286 systems

287 Figure 4 Legend: Black boxes and arrows indicate the supply chain, blue boxes and arrows are system drivers and grey
288 arrows are used to denote links to other subsystems. 'R' denotes reinforcing loops, polarity of relationships are denoted by
289 +/- next to the arrow head. Dashed lines denote that evidence for the relationship was emerging (inconclusive empirical
290 evidence), and solid lines denote that the evidence was established (supported by empirical evidence or reviews of
291 empirical evidence). Reinforcing loops, balancing loops and connections (arrows) in grey are described in subsequent
292 subsystems. Other figures display the commercial drivers of UPF systems (Figure 2), socio-cultural drivers of UPF
293 purchasing and consumption (Figure 3 & 4), climate change and air pollution impacts (Figure 5), land-related impacts
294 (Figure 6), water use and aquatic impacts (Figure 7), loss and waste (Figure 8).

295 **3.5 Subsystem 4: Climate change and air pollution impacts from ultra-processed food systems**

296 Subsystem 4 examines the impact of UPF production on climate change and air pollution (Figure 5).
297 This subsystem is not closed but rather provides an overview of the flow-on impacts related to
298 climate change, because climate change affects a wide range of environmental systems (Figures 6-8).
299 Therefore, we focus here on an overview of how climate change and air pollution interact with the
300 subsequent environmental subsystems.

301 It was assumed by the lead authors and agreed by the participants that the energy used across the
302 supply chain is predominantly produced by burning fossil fuels, because fossil fuels remain the
303 dominant global energy source (Ritchie, 2020). *Energy created by burning fossil fuels drives air*
304 *pollution* (Balasubramanian et al., 2021; Domingo et al., 2021) and *greenhouse gas emissions*, the
305 major driver of *climate change* (IPCC, 2021) (Figure 5). *Fertiliser* and *pesticide use* also contribute to
306 *climate change* as they are produced using fossil fuels, and fertiliser application is associated with
307 nitrogen volatilisation (Shi et al., 2020).

308 *Climate change* has significant flow-on effects for elements in subsequent subsystems, including
309 *land and soil degradation, changes in types and locations of pests* (IPCC, 2022), *biodiversity loss*
310 (IPCC, 2021), *agrobiodiversity loss* (Fatima et al., 2020), changes in *water scarcity* (IPCC, 2021) and
311 *food loss and waste* (IPCC, 2022). For example, *climate change* may lead to *changes in types and*
312 *locations of pests*, which may increase *pesticide use* in certain regions (see Subsystem 5). As a result,
313 more *greenhouse gas* emissions may be released, which, if this occurs to a great enough extent,
314 could worsen *climate change* (R5, Figure 5).

315 Finally, inputs used in agricultural production such as fertilisers and pesticides, as well as agricultural
316 production processes such as field burning and livestock waste, contribute to *air pollution*
317 (Balasubramanian et al., 2021; Domingo et al., 2021), which in turn have impacts on *human health*
318 (Benka-Coker et al., 2020; Su et al., 2022).

319 ***Differentiating UPF system impacts from general food system impacts***

320 Core to the difference between UPFs and non-UPFs within this subsystem is the assumption that
321 UPFs are derived from large-scale industrial agricultural practices. Because wide use of fossil fuels
322 throughout the food system can enable the production of cheap agricultural commodities (Fuje,
323 2019; Kaur et al., 2015), it follows that ultra-processing may be used to convert these commodities
324 into profitable, palatable and marketable products (see subsystems 1-3). While it was generally

325 assumed that UPFs are inherently reliant on industrial production systems, evidence to support this
326 is needed and not all participants agreed on this assumption.

327 **[Insert Figure 5 here]**

328 Figure 5: Causal loop diagram of Subsystem 4: Climate change and air pollution relevant to UPF
329 systems

330 Figure 5 Legend: Black boxes and arrows indicate the supply chain, blue boxes and arrows are system drivers, green boxes
331 and arrows denote environmental drivers and outcomes, grey boxes indicate other system outcomes deemed relevant by
332 participants and grey arrows denote links to other subsystems. 'R' denotes reinforcing loops, polarity of relationships are
333 denoted by +/- next to the arrow head. All relationships in this subsystem were supported by empirical evidence, as
334 denoted by the solid lines connecting variables. Relationships where polarity was dependent on the region are denoted
335 with a question mark. Reinforcing loops, balancing loops and connections (arrows) in grey are described in subsequent
336 subsystems. Other figures display commercial drivers of UPF systems (Figure 2), socio-cultural and biological drivers of UPF
337 purchasing and consumption (Figure 3 & 4), land-related impacts (Figure 6), water use and aquatic impacts (Figure 7), loss
338 and waste (Figure 8).

339 **3.6 Subsystem 5: Land-related impacts from ultra-processed food systems**

340 Subsystem 5 describes the land-related impacts resulting from UPF production (see Figure 6). While
341 all stages of food production require land, participant discussions and existing studies have focused
342 on agricultural production as the predominant driver of land-related impacts (Hadjikakou, 2017;
343 Ridoutt et al., 2020; Willett et al., 2019).

344 Reinforcing loops were identified between *land and soil degradation* and *pesticide use, fertiliser use,*
345 *agrobiodiversity loss* and *land scarcity* (R16-19, R21 Figure 6). Pesticide-related impacts on
346 *agrobiodiversity loss* may be reinforced by changes in *types or locations of pests* and *pesticide use*
347 (Isaac et al., 2021) (R20, Figure 6). Furthermore, as mentioned in subsystem 4, fertilisers release
348 greenhouse gas emissions, driving climate change, which further degrades land and increases land
349 scarcity, potentially leading to a vicious cycle of higher fertiliser demands (R4, Figure 6).

350 Also included in the model is the role of *land conversion* and *land and soil degradation* in increasing
351 *land scarcity* (Jayasuriya, 2003). In theory, increased *fertiliser* and *pesticide use* could result in ‘land-
352 sparing’, as less farmland is required to produce the same yield (IFA and UNEP, 2000; Popp et al.,
353 2013). This is important as land sparing scenarios, where yields are increased through *fertiliser* and
354 *pesticide use*, produce less *greenhouse gas emissions* than those released from *land conversion* in
355 land sparing scenarios (Folberth et al., 2020). However, participants and previous literature have
356 noted that high-yielding farms often expand, which may incentivise deforestation and subsequently
357 increase *land scarcity* (Hertel et al., 2014). Thus, the question mark in the model highlights that,
358 without the addition of more detailed causal pathways or quantitative data, the impacts described
359 here are uncertain.

360 ***Differentiating UPF system impacts from general food system impacts***

361 The relationships between agricultural-production practices and land-related impacts are not
362 exclusive to UPFs. However, participants discussed that *ultra-processing* may exacerbate existing
363 issues in the food system. Many UPFs rely on *agricultural production* of high-yield, low-cost
364 ingredients, thus they may increase reliance on practices such as monoculture farming or intensive
365 livestock production (Fardet and Rock, 2020), which could contribute to additional *land and soil*
366 *degradation* (Olsson et al., 2019) (Figure 6). However, some features of this subsystem, e.g.
367 *agrobiodiversity loss*, have been ongoing, independent, trends in agriculture (FAO, 2007), thus any
368 impacts that may be caused by UPF production are additional to existing issues.

369 There are two reinforcing loops in this subsystem which relate specifically to UPFs. Participants
370 proposed a reinforcing loop between *ultra-processing* and *agrobiodiversity loss*, as decreased variety
371 of species may encourage creative processing methods to develop ‘exciting’ ‘new’ foods and UPFs
372 may encourage reliance on fewer, cheap ingredients (Fardet and Rock, 2020) (R21, Figure 6).
373 *Agrobiodiversity loss* also has flow-on impacts on *biodiversity loss* within neighbouring ecosystems

374 (FAO, 2019; Kremen and Miles, 2012). Changes in food supply diversity may also impact *food supply*
375 *stability* (Thrupp, 2000) and *diet diversity* (Oduor et al., 2019). It is also plausible that ongoing
376 production and consumption of UPFs could reduce diversity in the food system (R3, Figure 6).

377 **[Insert Figure 6 here]**

378 Figure 6: Causal loop diagram of Subsystem 5: Land-related impacts relevant to UPF systems

379 Figure 6 Legend: Black boxes and arrows indicate the supply chain, blue boxes and arrows are system drivers, green boxes
380 and arrows denote environmental drivers and outcomes, grey boxes indicate other system outcomes deemed relevant by
381 participants and grey arrows denote links to other subsystems. Dotted lines indicate that the relationship was proposed
382 (no existing empirical evidence), and solid lines denote that the evidence was established (supported by empirical evidence
383 or reviews of empirical evidence). 'R' denotes reinforcing loops, polarity of relationships are denoted by +/- next to the
384 arrow head. Impacts which may increase or decrease are denoted with a question mark instead of a +/- . Reinforcing loops,
385 balancing loops and connections (arrows) in grey are described in subsequent subsystems. Other figures display
386 commercial drivers of UPF systems (Figure 2), socio-cultural and biological drivers of UPF purchasing and consumption
387 (Figure 3 & 4), climate change and air pollution impacts (Figure 5), water use and aquatic impacts (Figure 7), loss and waste
388 (Figure 8).

389 **3.7 Subsystem 6: Water use and aquatic impacts from ultra-processed food systems**

390 This subsystem investigates the impact of water used during UPF production and impacts of UPF
391 systems on aquatic ecosystems (see Figure 7).

392 The reinforcing loops identified in this subsystem act together to impact *water scarcity*, *water*
393 *quality* and *biodiversity loss*. In this model, water is used at most stages of production, which may
394 lead to reduced availability of water in natural ecosystems, increasing *water scarcity* (Falkenmark,
395 2013). This is further impacted by *water quality*, as water resources that are polluted become less
396 valuable, increasing *water scarcity* (Dabrowski et al., 2009). Conversely, *water scarcity* can impact
397 *water quality*. For example, droughts are generally associated with poorer *water quality* due to a
398 build-up of pollutants (Hrdinka et al., 2012). However, whether *water quality* increases when *water*

399 *scarcity* decreases is uncertain and dependent on the region as higher rainfall can flush
400 contaminants and beneficial substances, as well as introduce new contaminants into waterways
401 (Hrdinka et al., 2012). This uncertainty is indicated by question marks in the model. Polarity could be
402 specified if the model is adapted to contain detailed, context-specific causal pathways.

403 Increased *water scarcity* and decreased *water quality* can lead to *land and soil degradation*,
404 *biodiversity loss* in aquatic and terrestrial ecosystems (Olsson et al., 2019) and *poor human health*
405 due to contamination (Li, 2018). *Biodiversity loss* can impact *water scarcity* and *water quality*
406 because native aquatic species often play a role in maintaining *water quality* (Worm et al., 2006)
407 (see Appendix). These relationships can reinforce each other, driving increasing damage to
408 ecosystems (see R6-8, Figure 7). Specifically, reinforcing loop (R8) shows how *water scarcity*, *land*
409 *degradation*, *eutrophication* and *poor water quality* can act together to worsen environmental
410 degradation (see figure 6).

411 Other components of this subsystem may worsen damage described above. For example, *fertilisers*
412 and *pesticides* can have further impacts on *water quality* and *biodiversity loss* via *eutrophication*
413 (Olsson et al., 2019) or *ecotoxicity* (Aktar et al., 2009; FAO, 2019).

414 ***Differentiating UPF system impacts from general food system impacts***

415 While much of the above description is applicable to all foods, processing and ultra-processing can
416 require substantial water inputs, depending on the product. A study analysing water used to
417 produce ultra-processed meat alternatives found that processing accounted for 63% of product
418 lifecycle water use (Fresán et al., 2019).

419 Additionally, impacts from fertilisers may be particularly relevant to UPFs as previous evidence
420 suggests that ‘sweets, snacks and drinks’ (which are often UPFs) accounted for 42% of diet-related
421 phosphorus use and 12% of diet-related nitrogen use in Sweden (Moberg et al., 2020). Overall

422 further research is needed to determine if there are different mechanisms or larger impacts relating
423 to water used for UPF production.

424 **[Insert Figure 6 here]**

425 Figure 7: Causal loop diagram of Subsystem 6: Water use and aquatic impacts relevant to UPF
426 systems

427 Figure 7 Legend: Black boxes and arrows indicate the supply chain, green boxes and arrows denote environmental drivers
428 and outcomes, grey boxes indicate other system outcomes deemed relevant by participants and grey arrows denote links
429 to other subsystems. Solid lines denote that the evidence was established (supported by empirical evidence or reviews of
430 empirical evidence). 'R' denotes reinforcing loops, polarity of relationships are denoted by +/- next to the arrow head.
431 Impacts which may increase or decrease are denoted with a question mark, rather than a polarity such as +/- . Reinforcing
432 loops, balancing loops and connections (arrows) in grey are described in subsequent subsystems. Other figures display
433 commercial drivers of UPF systems (Figure 2), socio-cultural and biological drivers of UPF purchasing and consumption
434 (Figure 3 & 4), climate change and air pollution impacts (Figure 5), land-related impacts (Figure 6), and loss and waste
435 (Figure 8).

436 **3.8 Subsystem 7: Loss and waste impacts from ultra-processed food systems**

437 This subsystem describes the relationship between the production of UPFs and loss or waste of
438 resources (see Figure 8).

439 One key driver of this subsystem is the assumption that *lost or wasted food* (which occurs at each
440 supply chain stage (Bajželj et al., 2020)) may drive *agricultural production* to compensate for the *lost*
441 *or wasted food* (de Gorter et al., 2021) (proposed link and R22, Figure 8). This results in *wasted food*
442 *system resources*.

443 Linked with this concept are the bi-directional relationships whereby *time pressures* to reduce *food*
444 *loss and waste* can be abated by *processing, ultra-processing* (Augustin et al., 2016) and *packaging*
445 (Marsh and Bugusu, 2007) (B2-4, Figure 8). Balancing loop B5 indicates how *processing, ultra-*

446 *processing* and *packaging* lead to increased *food durability*, thereby decreasing *food loss and waste*.
447 However, some level of *food loss and waste* still occurs as a result of these processes, as indicated by
448 the reinforcing loops (R22-24, Figure 8). Additionally, valorisation (where by-products are processed
449 or ultra-processed into food ingredients or products) may drive UPF production, as a UPF vessel may
450 be required to carry the valorised ingredients (Capozzi et al., 2021) (see R19, R20, Figure 7).

451 Impacts from poorly handled waste may amplify impacts seen in previous subsystems, such as
452 *biodiversity loss* (Azevedo-Santos et al., 2021), *poor water quality, land and soil degradation* (Chae
453 and An, 2018), and *greenhouse gas emissions* (Scialabba et al., 2013; Tabata, 2013). These feed into
454 reinforcing loops whereby more food is lost or wasted due to environmental events such as climate
455 change (IPCC, 2022) or changes in pests (Delgado et al., 2021) (R9-11).

456 ***Differentiating UPF system impacts from general food system impacts***

457 Impacts discussed above highlight that UPFs both cause and alleviate waste in the food system. One
458 UPF-specific impact relates to UPFs driving *overconsumption* (Hall et al., 2019). *Overconsumption*
459 may theoretically drive an oversupply of calories to some markets within the food system and
460 represent a *waste of food system resources* which could otherwise be spared or re-routed to
461 produce non-UPFs (Seferidi et al., 2020) (proposed relationship, Figure 8).

462 Also, *packaging* is inherent in UPF systems as UPFs are typically packaged, often in plastic. This
463 contributes to UPFs waste-related impacts (Andrades et al., 2016), and may distinguish them from
464 some non-UPFs, such as fresh foods. However, durable foods, such as UPFs, tend to be less wasted
465 in households than perishable non-UPFs (Reynolds et al., 2016; Reynolds et al., 2015). Quantitative
466 comparisons of the impact of UPF production and consumption on overconsumption, food loss and
467 waste and packaging waste would help clarify whether UPFs are associated with more or less waste
468 than non-UPFs.

469 **[Insert Figure 8 here]**

470 **Figure 8: Causal loop diagram of Subsystem 7: Loss and waste impacts relevant to UPF systems**

471 Figure 8 Legend: Dotted lines indicate that the relationship was proposed (no existing empirical evidence), and solid lines
472 denote that the evidence was established (supported by empirical evidence or reviews of empirical evidence). Black boxes
473 and arrows indicate the supply chain, blue boxes and arrows are system drivers, green boxes and arrows denote
474 environmental drivers and outcomes, grey boxes indicate other system outcomes deemed relevant by participants and
475 grey arrows denote links to other subsystems. 'R' denotes reinforcing loops, polarity of relationships are denoted by +/-
476 next to the arrow head. Reinforcing loops, balancing loops and connections (arrows) in grey are described in subsequent
477 subsystems. Other figures display commercial drivers of UPF systems (Figure 2), socio-cultural and biological drivers of UPF
478 purchasing and consumption (Figure 3 & 4), climate change and air pollution impacts (Figure 5), land-related impacts
479 (Figure 6), and water use and aquatic impacts (Figure 7).

480 **3.9 Transitioning to a healthy and sustainable food system**

481 Throughout the workshops, participants were prompted to discuss how the current UPF food system
482 may differ from an idealised food system producing non-UPFs. Participants acknowledged that the
483 production of non-UPFs can also cause environmental harm but re-iterated the importance of
484 comparing the UPF-based system to a vision of a healthy and sustainable future food system.
485 Therefore, the counterfactual was an idealised system producing non-UPFs, using environmentally
486 sustainable production methods, adapted to the local environment. In this system, a variety of crops
487 and livestock species would be farmed and bred for durability, flavour, nutrition and yield.

488 Determining the differences between the drivers and impacts within a UPF system compared with a
489 healthy and sustainable food system was challenging in the absence of quantitative data. Variables
490 that may be more prominent in a UPF system compared with an idealised food system are displayed
491 in the Appendix. When asked to compare the impacts of UPF versus an idealised food system,
492 participants often discussed potential trade-offs that could result from this transition. Some trade-
493 offs are described in Table 1.

Trade-offs	Description
Energy use versus food system efficiency	<p>UPFs can rely on high-energy inputs, but these energy inputs may enable efficiency, which may result in lowered energy demands at subsequent supply chain stages. For example, high energy demands for ultra-processing increase food durability, meaning energy-intense refrigerated transportation may not be required. It also could reduce the weight of the product through dehydration, or reducing bulk by converting grain to powder, which would further minimise transportation costs. Participants noted that in an idealised food system, energy inputs would need to be prioritised for foods that are essential for a healthy diet but that food system efficiency would need to be weighed against other environmental impacts from intense production processes, described previously in subsystems 4, 5 & 6.</p>
Land sparing versus land sharing	<p>Changing to less-intense production systems (e.g. pasture-raised livestock) may come at the cost of requiring more land to produce the same amount of foods. This may benefit agrobiodiversity but result in a loss of natural habitat for species living in the wider ecosystems (biodiversity loss), known broadly as the 'land-sharing versus land-sparing debate'.</p>
Diversity versus efficiency	<p>More diverse agricultural systems may encourage a variety of non-UPFs (and thus discourage industrially produced and homogenous UPFs) but may result in efficiency losses due to time and cost pressures for farmers, relating to increased physical labour and management. For example, due to the need to manage a wider variety of pests and harvesting systems or to determine additional buyers for each new crop or livestock product.</p>

Trade-offs	Description
Wasted food system resources versus food loss and waste	<p>UPFs can be perceived to waste resources because the scarce resources used to produce them are being used to produce foods which are superfluous to human nutritional requirements, and often encourage overconsumption. However, the production and consumption of UPFs instead of non-UPFs (which may be more perishable) may contribute to reduced food loss and waste in the system due to their durability and ability to utilise waste-reduction processes such as valorisation (see Subsystem 7). Thus, any food system transitions which decrease UPF production should consider unintended increases in food loss and waste.</p>
Food supply stability versus healthfulness	<p>Improving the healthfulness of the food supply by decreasing access and availability of UPFs may result in negative impacts on food supply stability. For example, in emergencies where access to fresh food is limited. UPFs are easy to consume (no preparation or ‘tools’ are required) and safe (due to their long shelf lives). However, because these foods are not “...of appropriate quality...” (as per the definition of food security (FAO, 2006)), they may have a negative influence on food and nutrition security.</p>
Prioritising sustainability and healthy outcomes versus cost	<p>Utilising a range of sustainable practices, including nutrient cycling, regenerative agriculture and more localised supply chains (where beneficial), as well as farming and breeding a wide variety of crops and livestock species for durability, flavour, nutrition and yield would likely lead to substantial cost increases. Changes would need to be complemented with the development of a range of new technologies, practices, and regulations, to avoid negative impacts on livelihoods and food security.</p>

Trade-offs	Description
Convenience versus healthfulness	Transitioning to healthy and sustainable food systems without accounting for convenient food products, may mean that those who are already time-poor and have limited cooking skills may be further disadvantaged. To account for this, food system transitions would need to consider accessibility to convenient non-UPF foods.

495 **4. Discussion**

496 Using group model building (GMB) and complemented with information from the peer-reviewed
 497 literature we developed a series of causal loop diagrams (CLDs) identifying drivers of the ultra-
 498 processed food (UPF) system and dynamic interactions with the environment.

499 Our approach to modelling impacts according to supply chain stages is supported by existing
 500 quantitative evidence showing significant variability between environmental impacts at each stage
 501 of food production (Crippa et al., 2021; Tubiello et al., 2021a; Tubiello et al., 2021b). The resulting
 502 model may be applied to guide the identification of system trade-offs, research activities and
 503 provide further insights for policy makers.

504 **4.1 Identification of system trade-offs**

505 This model highlights potential trade-offs associated with a reduction of ultra-processed foods (see
 506 examples in Table 1). While these trade-offs have been previously discussed in the peer-reviewed
 507 literature, the model can be used as a tool to enable further discussion of these trade-offs among
 508 researchers and policy-makers. For example, policies that reduce UPF accessibility should consider
 509 mitigating potential impacts on overall food access, particularly for those already experiencing food

510 insecurity. Potential impacts for those with limited cooking skills or who are time-poor, or resource-
511 poor would also need to be considered, due to the association between these factors and reliance
512 on convenient UPFs, particularly among disadvantaged populations (Moran et al., 2019). Energy
513 trade-offs should also be considered as industrial pre-cooking may be less energy intensive than
514 individual home cooking (Scott et al., 2021), but these benefits are possible without ultra-processing
515 (Davidou et al., 2022). Mitigating these risks is particularly important in the current climate of rising
516 costs of living, which are disproportionately affecting already disadvantaged populations in the wake
517 of the COVID pandemic and political unrest in key food-producing regions (Hawkes et al., 2022).

518 Food waste trade-offs may exist when transitioning from UPFs to a healthy and sustainable food
519 system (see Table 1). Mitigation strategies could include campaigns to reduce household food waste
520 (Aschemann-Witzel et al., 2017), and re-routing supply chain waste into animal feed (Truong et al.,
521 2019) or biofuels (Pour and Makkawi, 2021), instead of UPF production. Time pressures in the food
522 system would remain, however primary and secondary processing may alleviate some pressures
523 relating to shelf-life (Augustin et al., 2016). For example, processing could be prioritised to extend
524 shelf-life of nutrient dense and environmentally demanding, perishable products such as milk
525 powders and small fish.

526 **4.2 Potential policy implications**

527 While further research is needed to understand local contexts and more detailed interactions, causal
528 loop diagrams may be useful for policy design. Using policy to interrupt the reinforcing loops or
529 affect variables with many flow-on effects may impact the quantity of UPFs produced by the food
530 system and their subsequent environmental impacts. In this model, this includes variables such as
531 the corporate political activity of the UPF industry and their economic power, low costs of the final
532 product, access to UPFs, greenhouse gas emissions and climate change, land and soil degradation,
533 fertiliser and pesticide use, food loss and waste, and packaging waste. Reducing the load on these

534 systems through regulation may improve subsequent impacts such as overall production and
535 consumption, air pollution, water quality issues, biodiversity and waste impacts. Economic impacts,
536 such as price increases, could be added to the model and used to avoid unintended consequences of
537 systems change. Further analyses of trade-offs and uncertainties, adapting the model to local
538 contexts or specific food and beverage products, and adding delays to the model may help to
539 anticipate policy resistance and pre-emptively propose solutions, and ensure recommendations are
540 context specific.

541 **4.3 Informing future research activities**

542 This study could inform future quantitative analyses and qualitative models. While it was not the
543 explicit purpose of this study, the GMB process is well-suited to identifying the key parameters and
544 metrics to develop more comprehensive quantitative analyses of the food system (Laurenti et al.,
545 2014; Werner, 2005). Using our model to identify relevant supply chain stages and variables for
546 quantitative analyses may help overcome some of the challenges in quantifying the environmental
547 impacts of UPFs discussed in the introduction. The model could also be used to interpret
548 quantitative findings in the context of the broader food system.

549 The model could also be used to identify evidence gaps and research opportunities. The
550 relationships denoted with dashed or dotted lines in Figures 1-7 (such as market competition and
551 ultra-processing in Figure 1) have been proposed but, to the authors' knowledge, remain untested,
552 or evidence is inconclusive. Many of these highlighted relationships are key to understanding
553 complexities in the food system and inform solutions, including policies.

554 Finally, the model and accompanying description presented in this paper could be used as a basis for
555 modelling studies. To adapt this model to a healthy and sustainable food system, supply chain
556 stages, variables and relationships could be removed or added using the editable modelling file
557 provided in the Appendix. For example, variables could be added to enable a comparison with

558 alternative production systems, to understand impacts on workers' or animal rights, or to further
559 unpack complex interactions summarised in our model. A quantitative model could also better
560 differentiate between UPF and non-UPF impacts.

561 **4.4 Limitations**

562 The model developed in this study aimed to capture the key relationships between the UPF system
563 and the natural environment, including all system drivers. While we aimed to retain as much detail
564 as possible, the system does not capture every known or possible impact, which is an unavoidable
565 disadvantage of mapping complex food systems (von Braun et al., 2021). Many issues discussed in
566 the text are relevant to the food system generally, not just UPFs. While this made it difficult to
567 differentiate impacts from UPFs, it also makes the model more applicable to future studies on other
568 types of food. Included variables, relationships and how they were framed was ultimately subjective,
569 and dependent on the diversity of knowledge of modellers. To reduce the risk of bias, we grounded
570 the model in existing evidence, ensured that the participant size was appropriate for the method
571 (Rouwette and Vennix, 2020), and validated all participant suggestions using existing peer-reviewed
572 evidence. However, some evidence may have been missed in the searching process, as only the first
573 100 results were searched. In addition, we did not review the strength of the evidence according to
574 pre-established methods such as GRADE (Guyatt et al., 2008), but instead used a simplified ranking
575 method to distinguish between peer-reviewed empirical evidence, and proposed associations
576 between variables. We also recruited participants from a wide range of countries, however, not all
577 world regions were captured.

578 While there are many uses of the CLD described in this paper, there are limitations in its application.
579 Because it is a qualitative model, the strength of the relationships between variables, magnitude of
580 impacts, and correlation between environmental metrics were not tested. The model does not
581 account for region-specific impacts. The model is also not product or location specific. To analyse a

582 particular product, especially those with complex or unusual supply chains, such as cellular meat,
583 additional components and considerations may be required.

584 **5. Conclusion**

585 Our findings indicate multiple avenues through which UPFs impact the environment, driven by
586 commercial, biological and social influences on production and consumption, with multiple
587 interactions between and within subsystems. While some impacts are likely to be more prominent in
588 a UPF-based food system, there was some difficulty differentiating impacts from UPFs compared
589 with non-UPFs. Quantitative research is needed to better differentiate the impacts of UPFs
590 compared with non-UPFs. This work also identifies policy-relevant trade-offs which would need to
591 be mitigated if UPF production or consumption is reduced. Future improvements to the model could
592 include adding delays, including more disciplines, categorising evidence using pre-established
593 grading criteria, adapting it to local contexts or adapting the model to non-UPFs.

594 The model highlights research gaps and could be used to guide choices on supply chain stages, and
595 environmental impacts relevant to UPFs for quantitative studies, as well as to provide a guide for
596 interpreting quantitative findings in the context of complex and dynamic food systems.

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