



# How can neuroscience contribute to the science of inter-generational sustainability?

Ryuta Aoki

*Tokyo Metropolitan University*

Ayahito Ito

*Research Institute for Future Design, Kochi University of Technology*

Keise Izuma

*School of Economics and Management, Kochi University of Technology*

*Research Institute for Future Design, Kochi University of Technology*

Tatsuyoshi Saijo

*Research Institute for Humanity and Nature*

*Research Institute for Future Design, Kochi University of Technology*

3rd August, 2020

School of Economics and Management

Research Institute for Future Design

Kochi University of Technology

---

# **How can neuroscience contribute to the science of intergenerational sustainability?**

Ryuta Aoki<sup>1\*</sup>, Ayahito Ito<sup>2</sup>, Keise Izuma<sup>2,3</sup>, Tatsuyoshi Saijo<sup>2,4</sup>

<sup>1</sup>Graduate School of Humanities, Tokyo Metropolitan University, Tokyo, Japan

<sup>2</sup>Research Institute for Future Design, Kochi University of Technology, Kochi, Japan

<sup>3</sup>School of Economics and Management, Kochi University of Technology, Kochi, Japan

<sup>4</sup>Research Institute for Humanity and Nature, Kyoto, Japan

\*Correspondence should be addressed to: R. Aoki (raoki@tmu.ac.jp)

**Keywords:** intergenerational sustainability, neuroscience, transdisciplinary approach

**Author contributions:** R.A., A.I., K.I., and T.S. designed the study. R.A., A.I., K.I., and T.S. wrote the manuscript.

**Conflict of Interest:** The authors declare no competing financial interests.

**Acknowledgments:** This work was supported by a Grant-in-Aid for Scientific Research (A) to T. Saijo (17H00980).

23 **Abstract**

24 Intergenerational sustainability is an existential problem for humans, and coping with  
25 this issue requires large-scale cooperation extended across generations. However, recent  
26 empirical evidence suggests that people’s concern for future generations is typically low,  
27 which is rooted from human’s cognitive biases (e.g., temporal discounting and bounded  
28 empathy) and possibly exacerbated by modern social systems depreciating future  
29 generations’ rights and voices. To achieve sustainable society, we need to design and  
30 implement novel social institutions that leverage our concern for future generations. In  
31 this paper, we discuss how neuroscience can tackle this fundamental challenge in  
32 collaboration with other disciplines. We review psychological factors and neural  
33 substrates that may underlie decision-making regarding intergenerational sustainability.  
34 We also propose empirical approaches to study neural bases of  
35 intergenerationally-sustainable decision-making. Notably, neuroimaging research has  
36 potential to unveil “hidden” neurobiological processes that are difficult to identify by  
37 behavioral observations alone. In addition, neural data can be used to predict real-world  
38 outcomes, which complements behavioral and self-report measures that may not always  
39 reflect true motives behind decisions. Understanding the neurocognitive mechanisms  
40 would provide insights into effective institutions that promote concern for future  
41 generations. We prospect that future neuroscience research will accumulate evidence  
42 from both laboratory and field experiments, thereby contributing to policy making and  
43 the transformation toward sustainable society.

44

45 **1. Introduction**

46 Intergenerational sustainability is an issue about the very existence of our species. Of  
47 particular importance on this topic is climate change, which is now considered as an  
48 existential threat for humans (Lenton et al., 2019). Environmental and ecological  
49 scientists have long been alerting to devastating effects of climate change on future  
50 generations (Rockström et al., 2009). Researchers in diverse fields (e.g., biology,  
51 economics, and philosophy), along with citizens, have been actively involved in  
52 collaborative actions to combat this issue. An interest in climate change has also been  
53 emerging in neuroscience (Aron, 2019; Aron et al., 2020; Langenbach et al., 2019).  
54 However, in the field of neuroscience, this is still sporadic movements by a small  
55 number of researchers. To date, there is no coherent trend of incorporating neuroscience  
56 into the transdisciplinary framework for sustainability science.

57 This article aims to discuss how neuroscience can contribute to solving this  
58 fundamentally challenging issue. The problem at the heart of intergenerational  
59 sustainability issues is the inescapable conflicts between the current and future  
60 generations (Saijo, 2015). We first argue that difficulties associated with  
61 intergenerational issues arise from several psychological factors. Next, we review neural  
62 substrates for these psychological factors, which may provide insight into human  
63 behavior regarding intergenerational sustainability. Third, we propose empirical  
64 approaches to examine brain processes supporting sustainable behavior. Lastly, we  
65 present open questions that should be addressed in future research.

66

67

68 **2. Climate change as an issue of intergenerational sustainability**

69 **2-1. Why important: impacts on future generations**

70 Climate change during the past 50 years is overwhelming (Steffen et al., 2007, 2015).  
71 This rapid acceleration in environmental changes is paralleled by explosive increases in  
72 socioeconomic indices such as global population and real GDP (Fig. 1A). Now we are  
73 living in an era called Anthropocene (Crutzen, 2002), where we ourselves substantially  
74 affect the Earth's ecosystems.

75 Climate change will induce global warming, sea level rise, and other changes  
76 in ecosystems (IPCC, 2014). It will also increase the risks of extreme weather events  
77 and outbreaks of deadly infectious diseases (Shuman, 2010; Stott, 2016; Wu et al.,  
78 2016). These changes may adversely impact future generations' life (e.g., industry,  
79 agriculture) and well-being. In fact, sea level rise has already affected citizens in island  
80 nations (e.g., Tuvalu), and recent extreme weather events (such as heatwaves, hurricanes,  
81 floods, droughts and wildfires) have caused huge damages in several countries. If  
82 climate change becomes worse, future generations will suffer more frequently and  
83 severely from these events. Accumulating evidence suggests that global climate change  
84 is man-made, meaning that our generation is critically responsible for well-being of  
85 future generations. Although the precise mechanisms of climate change remain unclear,  
86 human activity is the most plausible and parsimonious account, which is widely  
87 accepted among environmental scientists (IPCC, 2014).

88 The problem is that people often systematically underestimate the importance  
89 of intergenerational issues, in part due to human's cognitive biases. However, forecasts  
90 on economic impacts due to climate change may urge us to calibrate our perception.  
91 According to a recent report by International Labour Organization (Kjellstrom et al.,  
92 2019), the annual global economic cost of the productivity loss due to global heating

93 (e.g., heat stress in daylight working) is expected to become ~2.4 trillion USD in 2030,  
94 which is a surge from 0.3 trillion USD in 1995. In addition, a recent estimation based on  
95 an economic growth model predict that the global GDP would reduce, if no effective  
96 measure on climate change is taken, by 2.5% in 2050 (roughly corresponding to US\$ 5  
97 trillion, assuming that global GDP in 2050 is US\$ 200 trillion) and by 7.2% in 2100  
98 (Kahn et al., 2019). If we consider long-term effects, economic damages induced by  
99 climate change are likely comparable to or even greater than those by mental disorders  
100 or by a pandemic (Bloom et al., 2011; World Bank, 2020). These estimates suggest that  
101 climate change will become a new plague for future generations, unless our generation  
102 takes immediate collective action.

103

#### 104 **2-2. Why challenging: psychological barriers**

105 Despite the substantial importance, issues regarding intergenerational sustainability are  
106 fundamentally difficult to solve. Voices advocating immediate actions are rapidly  
107 glowing across the world, especially among younger generations. However, public  
108 opinions on climate change are divided, and attempts of international collaboration  
109 often fail (e.g., the US withdrawal from the Paris agreement). These facts show us that  
110 solving climate issues is quite challenging. Why is it so difficult? We discuss the  
111 possible reasons in below, focusing on psychological factors hampering our concern for  
112 future generation.

113 First, coping with intergenerational issues needs long-horizon goals spanning  
114 over a few generations (e.g., by year 2100). This inevitably causes temporal discounting  
115 (Frederick et al., 2002). If we assume a yearly discount rate of 3%, the subjective value  
116 of goods in 2050 is discounted to 41.2% relative to the value at present (in 2020). This

117 means that an asset priced at \$50 now is preferred over an asset priced at \$100 thirty  
118 years later. Moreover, if one would not expect to live in 2100, she or he might consider  
119 the subjective value of goods in 2100 as zero (according to the *homo economicus* view).  
120 Second, humans have a limited ability to vividly imagine (or prospect) the far future.  
121 This perceived vagueness and psychological distance may reduce our  
122 naturally-occurring empathy towards future generations. Third, the inherent uncertainty  
123 of the future may elicit unrealistic optimisms (Sharot et al., 2011), offering excuses of  
124 not taking actions (e.g., “all problems will disappear by technological innovations”).  
125 These psychological factors may also be relevant to intragenerational issues, but likely  
126 be exaggerated in intergenerational issues.

127         Another critical factor is intergenerational conflict (Kamijo et al., 2017; Saijo,  
128 2015), which has several common features with intergroup conflict (Fiske, 2002).  
129 Intergenerational issues arise from conflicts between the current and future generations  
130 (e.g., chasing economic growth versus pursuing sustainability). These conflicts may not  
131 have existed until recently (before the Industrial Revolution), but have become more  
132 stark as human activity reaches to the “planetary boundaries” (O’Neill et al., 2018;  
133 Rockström et al., 2009), i.e., the thresholds that define safe operating space for  
134 humanity on Earth (Fig. 1). If intergenerational conflict is overly emphasized, for  
135 instance by mass media messages, it may trigger antagonistic attitudes against future  
136 generations among a subset of people in the current generation. This response is  
137 irrational, in light of intergenerational sustainability, but probably congruent with the  
138 automatic tendency that humans often manifest in (intragenerational) intergroup  
139 contexts such as when competing over limited resources and soils. The antagonistic  
140 attitudes may further spill over towards members of the current generation who are in

141 support of future generations, resulting in ideological polarizations within the current  
142 generation.

143           Importantly, the fact that psychological factors limit our concern for future  
144 generations suggests that better understandings of these factors offer clues for  
145 overcoming the limitations. Therefore, we expect that behavioral sciences (e.g.,  
146 psychology, experimental economics, and neuroscience) for clarifying the mechanisms  
147 of human behavior will provide insights into solutions of intergenerational issues.

148

### 149 **2-3. What we need: leveraging concern for future generations**

150 So far we have argued that solving intergenerational issues is important but challenging,  
151 and that psychological barriers hamper our motivation to cooperate with future  
152 generations. What do we need to break the barriers?

153           Unfortunately, relying on “naturally-grown” empathy and self-control is an  
154 unlikely solution. Empathy is a key ingredient for altruism and prosocial behavior  
155 (Decety et al., 2016; Klimecki et al., 2016), but it might have evolved in small-size  
156 groups, and often is reduced for outgroups compared with ingroups (Cikara & Fiske,  
157 2011). In addition, prosocial motivation (e.g., other-regarding preferences) decays as  
158 psychological distance increases (Strombach et al., 2015). Because we usually feel a  
159 greater psychological distance to the future proportional to its temporal distance, the  
160 spontaneous levels of empathy and prosocial behavior toward future generations are  
161 likely degraded. Self-control is the ability to resist temptations of sooner-but-smaller  
162 rewards and prioritize long-term benefits (Frederick et al., 2002). However, behavioral  
163 economic studies have clearly shown that humans on average have limited levels of  
164 self-control (Thaler & Benartzi, 2004), often resulting in suboptimal choices in term of



165 intertemporal rationality in everyday situations (e.g., dietary choices, pension plans).  
166 Critically, dilemmas involved in intergenerational-sustainability issues are often much  
167 harder to resolve compared with those involved in personal intertemporal choices,  
168 because delay periods are much longer (e.g., over generations) and recipients of  
169 long-term benefits (i.e., future generations) are not those who exert patience (i.e., the  
170 current generations). Because of these reasons, the empathy we naturally feel to future  
171 generations, as well as the self-control we exert for future generations, might be limited.

172           Consequently, the most important goal for achieving  
173 intergenerationally-sustainable society is to develop and implement novel social  
174 systems (or “institutions”) that effectively leverage the current generation’s concern for  
175 future generations. Otherwise the current generation would overexploit  
176 intergenerational common pools and put future generations into a crisis. The role of  
177 neuroscience, together with other fields in behavioral sciences, is to accumulate  
178 empirical evidence for effects and mechanisms (e.g., biological underpinnings) of such  
179 institutions, thereby contributing to policy making for sustainable societies. It is obvious,  
180 however, that the entire issues of sustainability cannot be solved by neuroscience alone.  
181 We need a transdisciplinary framework that facilitates close collaboration among  
182 diverse research fields as well as with citizens and policy makers.

183

184

### 185 **3. Insights from existing neuroscience studies**

186 What can neuroscience exactly do? Identifying brain regions involved in  
187 intergenerationally-sustainable behavior would be a starting point (if not a goal). To date,  
188 neural substrates for intergenerationally-sustainable behavior remain poorly understood.

189 However, findings from existing neuroscience research may provide useful insights.  
190 Here we review past neuroimaging (e.g., functional magnetic resonance imaging  
191 [fMRI]) studies on related topics. We particularly emphasize that neuroimaging studies,  
192 if combined with appropriate experimental designs, may offer useful insights into  
193 psychological processes that cannot be obtained by behavioral observations alone.

194

### 195 **3-1. Prospecting the future**

196 The ability to think about future generations relies on our ability to vividly imagine and  
197 simulate the future with episodic details. This cognitive function is referred to as  
198 “prospection” or “episodic future thinking” (Gilbert & Wilson, 2007; Schacter et al.,  
199 2017), and considered as unique to humans (Suddendorf et al., 2018). Previous  
200 neuroimaging studies have shown that brain regions such as the medial prefrontal cortex  
201 (mPFC), precuneus, and temporoparietal junction (TPJ) are involved in prospection,  
202 with especially important roles of the anterior PFC (aPFC; also called the frontopolar  
203 cortex) in representing future goals (Brown et al., 2016; Doll et al., 2015). These brain  
204 regions are overlapping with the so-called default-mode networks (DMN). Interestingly,  
205 the DMN is also implicated in creative thinking (Beaty et al., 2018), probably because  
206 both prospection and creative thinking requires counterfactual thinking and imagination  
207 (Hassabis et al., 2007).

208

### 209 **3-2. Prosocial behavior**

210 Intergenerationally-sustainable behavior is by nature prosocial, because it benefits  
211 future generations while (typically) imposes costs on the current generation  
212 (Langenbach et al., 2019; Saijo, 2015). Neuroimaging studies over the past two decades

213 have revealed sets of brain regions involved in prosocial behavior (J. K. Rilling &  
214 Sanfey, 2011; Ruff & Fehr, 2014). Intergenerationally-sustainable behavior is likely  
215 mediated by similar brain regions, although this should be empirically tested. These  
216 brain regions include those involved in value-based decision-making (i.e., decisions  
217 made on the basis of subjective value—such as when you consider which of “receiving  
218 \$10 now” or “receiving \$20 after a month” you prefer), and those involved in social  
219 cognition, such as the ability of inferring others’ mental states (Fig. 2).

220 An important issue is whether certain treatments/interventions can leverage  
221 prosocial behavior within individuals, so as to know if a given institution can promote  
222 prosocial behavior at the societal (collective) level. Past neuroimaging studies have  
223 shown that prosocial behavior can be enhanced via multiple distinct neural pathways. A  
224 key implication here is that, even if two treatments yield behaviorally similar effects,  
225 the neural mechanisms underlying these effects could be distinct. For instance, Hein et  
226 al. (2016) showed that experimental treatments inducing “empathy-driven altruism” and  
227 “reciprocity-driven altruism” promote prosocial decisions (i.e., giving money to others  
228 at the cost of self-interest in a laboratory decision-making task) to an equivalent extent,  
229 but their effects are mediated by different brain mechanisms. In their fMRI study,  
230 “empathy-driven altruism” was operationally defined as increased prosocial decisions  
231 after observing another person who received painful electrical shocks (“I help you  
232 because you are suffering”). On the other hand, “reciprocity-based altruism” was  
233 defined as increased prosocial decisions after observing another person who did a kind  
234 act to the study participant (“I help you because you helped me”). The two treatments  
235 elicited distinct patterns of fMRI signals among key brain regions supporting prosocial  
236 decisions (the ventral striatum, anterior insula, and dorsal anterior cingulate cortex).

237 This finding gives an exemplar case where neuroimaging can distinguish different  
238 psychological motives (i.e., empathy and reciprocity) behind behaviorally  
239 indistinguishable prosocial decisions.

240 It is worth noting that the terms “empathy” and “reciprocity” are multi-facet  
241 concepts. Social psychology and neuroscience have investigated how these concepts are  
242 comprised of distinct factors, each of which may have different effects on behavior.  
243 Empathy can be divided into “affective empathy” and “cognitive empathy,” which are  
244 subserved by distinct brain systems (Shamay-Tsoory et al., 2009). Affective empathy is  
245 the ability to share emotion with others (e.g., “emotional contagion”). This function is  
246 often automatic and accompanied by visceral responses (Decety et al., 2016). For  
247 instance, when we observe another person who is wounded and bleeding, we  
248 spontaneously feel the pain that the person would feel. Cognitive empathy is our ability  
249 to infer others’ mental states (e.g., intentions and beliefs), which is also referred to as  
250 “theory of mind (ToM)” or “mentalizing” (Frith & Frith, 2003). ToM is critical for  
251 cooperative behavior (by allowing us to share intentions with others) from hunting in  
252 human ancestry societies to resolving international conflicts in the modern world, while  
253 it is also critical for strategic behavior such as bargaining (by enabling us to predict and  
254 outsmart others’ intentions).

255 Likewise, reciprocity can be divided into several distinct concepts. One basic  
256 distinction is between direct reciprocity and indirect reciprocity, with the latter  
257 considered to be indispensable for large-scale cooperation among genetically unrelated  
258 individuals (Rand & Nowak, 2013). Indirect reciprocity can be further divided into  
259 upstream (or “pay-it-forward”) reciprocity and downstream (or “reputation-based”)   
260 reciprocity. An fMRI study showed that upstream and downstream reciprocities have

261 different neural substrates (Watanabe et al., 2014), which is another exemplar case  
262 where neuroimaging provides evidence for dissociations between behaviorally similar  
263 concepts. It remains unclear whether the two types of indirect reciprocity are relevant to  
264 intergenerationally-sustainable behavior. Intuitively, only upstream reciprocity would  
265 contribute to intergenerationally-sustainable behavior, as downstream (reputation-based)  
266 reciprocity do not work between (non-overlapping) generations because of the  
267 asymmetry of time. An intriguing open question is whether an extended version of  
268 reputational concerns, such as motivations for leaving a legacy (Wade-Benzoni et al.,  
269 2010), plays roles in facilitating intergenerationally-sustainable decisions.

270           Diverse concepts and sub-concepts are relevant to human prosocial behavior,  
271 but they may have different effects on intergenerationally-sustainable behavior. Careful  
272 distinctions between these concepts are especially important in transdisciplinary  
273 research, because misuse of the terminology may result in confusion. For example, one  
274 may want to claim that “empathy promotes intergenerational cooperation.” However, a  
275 certain kind of empathy may increase cooperation within a small group but may  
276 simultaneously enhance aggression toward outgroups (Bernhard et al., 2006; Bruneau et  
277 al., 2017). If this is the case, this type of empathy (i.e., parochial empathy) may not be  
278 beneficial for (or even backfire) large-scale cooperation required for intergenerational  
279 sustainability. A more rigorous behavioral and neuroscientific research for clarifying  
280 these inter-related concepts to avoid such confusions.

281           Neuroimaging could be useful to predict prosocial behavior especially when  
282 self-report measures are not reliable predictors of actual behavior. There are several  
283 reasons that self-report measures do not necessarily tap into true motives behind  
284 behavior. Social decisions and evaluations are often influenced by implicit brain

285 processes (Stolier & Freeman, 2016). If an individual is not aware of these implicit  
286 processes, she or he may not be able to report the true motives behind decisions. In  
287 addition, self-report measures are susceptible to reporting biases such as demand  
288 characteristics. For instance, self-reported intentions of engaging in real-world  
289 sustainable behavior (e.g., using carpools) may not reflect actual behavior (Kristal &  
290 Whillans, 2020). In such cases, neural data may outperform self-report measures in  
291 predicting actual prosocial behavior.

292

### 293 **3-3. Intertemporal decision-making**

294 Neuroimaging studies have revealed brain mechanisms involved in intertemporal choice  
295 (Kable & Glimcher, 2007; McClure, 2004), although these studies mostly deal with  
296 decisions concerning self alone (e.g., trade-offs between the present self and the future  
297 self, with no relevance to other persons). A key brain region is the dorsolateral  
298 prefrontal cortex (dlPFC), a region important for self-control in decision-making (Fig.  
299 2). Experimentally modulating dlPFC activity by brain stimulation techniques (such as  
300 transcranial magnetic or current stimulations) influence temporal discounting, such that  
301 diminished dlPFC activity makes individuals more impulsive (Figner et al., 2010).  
302 Another brain region implicated in intertemporal decision-making is the aPFC, a region  
303 important for metacognition and prospection (Fleming et al., 2010; Gilbert & Wilson,  
304 2007). An fMRI study showed that the aPFC is activated when people are aware of the  
305 temptation of sooner-but-smaller rewards and precommit to restrict the access to the  
306 tempting options (Crockett et al., 2013). Another line of studies has shown that episodic  
307 future thinking (e.g., prompting people vividly imagine future events) can decrease  
308 temporal discounting (Peters & Büchel, 2010), possibly by reducing perceived distance

309 and ambiguity of the future. These mechanisms relying on self-control,  
310 metacognition/prospection, and imagination may serve as distinct (but inter-related)  
311 pathways by which people can make intertemporal rational decisions (Bulley &  
312 Schacter, 2020).

313 As noted above, these findings are derived from studies that examine  
314 intertemporal decisions involving rewards for self alone. It remains to be addressed  
315 whether any of these mechanisms promote intergenerationally rational choice, which  
316 involved tradeoffs between the present self and the future others. For instance, it could  
317 be the case that self-control alone is not sufficient for intergenerationally sustainable  
318 decisions (Langenbach et al., 2019), but stimulating people's imagination about the  
319 future opens the gate for self-control to exert effects on sustainable decisions (i.e., an  
320 interaction between imagination and self-control). This hypothesis is in line with the  
321 hierarchical organization of the brain, where the aPFC sits upstream of the  
322 dlPFC (Koechlin, 2003).

323

#### 324 **3-4. Intergroup conflict**

325 Although how the brain reacts to intergenerational conflict remains unknown,  
326 neuroimaging research has studied the mechanisms underlying intergroup conflict.  
327 These studies typically focus on racial/ethnic groups (or supporters of different  
328 political/sport teams), and examine neural correlates of intergroup behavior (e.g.,  
329 ingroup favoritism and outgroup hate). Brain regions implicated in automatic emotional  
330 responses (e.g., the amygdala), social cognition (e.g., dmPFC), and affective judgment  
331 (e.g., vmPFC) underpin negative attitudes toward outgroups such as prejudice and  
332 discrimination (Amodio, 2014). These neural substrates may provide mechanistic

333 explanations of why people tend to fear outgroups (often automatically) and  
334 unfavorably evaluate them (e.g., less trustworthy, less competent). For example, the  
335 amygdala is known to play a key role in fear learning (an association between neutral  
336 and aversive stimuli), and fear learning is considered as an underlying mechanism of  
337 how prejudice toward an outgroup is acquired in a real world (Phelps et al., 2000).  
338 Consistent with this idea, we recently showed that activation patterns in the left  
339 amygdala were significantly associated with implicit evaluations (i.e., prejudice) toward  
340 an ethnic outgroup (Izuma et al., 2019). Notably, behavioral and neural biases against  
341 outgroups emerge even with experimentally created groups (e.g., by minimal group  
342 procedures). This may raise the possibility that excessively emphasizing the border  
343 between the current and future generations elicits negative attitudes (e.g., decreased  
344 empathic care and neglect) toward future generations. Instead, messages emphasizing  
345 continuity between the current and future generations (e.g., by emphasizing that the act  
346 of our generation will be bequeathed to future generations as legacies) may reduce the  
347 tensions between generations. This idea could be tested in an experiment that contrasts  
348 treatments emphasizing competition (vs. continuity) between generations.

349 Intergroup conflicts between races and ethnicities in the real world seem to be  
350 harsh and robust. Can we reduce it by interventions? An fMRI study showed that  
351 receiving helps from outgroup members promotes empathy toward the outgroup, which  
352 possibly relieves intergroup conflicts (Hein, Engelmann, et al., 2016). This effect was  
353 underpinned by a prediction error signal (in a reinforcement learning process) observed  
354 in the anterior insula, consistent with the region's role in affective empathy. Similar  
355 processes likely occur in the real world, for example when immigrants interact with  
356 local residents. However, the same process may not work in intergenerational situations,



357 because the current generation has no opportunity to be helped by (remote) future  
358 generations. Reducing intergenerational conflicts may thus be more difficult compared  
359 with reducing intergroup conflicts within a generation, and necessitate novel methods of  
360 interventions.

361

### 362 **3-5. Connecting the dots**

363 It is important to note that brain regions work together as distributed systems. For  
364 instance, previous work has shown that the TPJ exhibits “functional connectivity” (a  
365 term indicating statistical dependence of fMRI time series between distant brain  
366 regions) with regions involved in value-based decision-making such as the striatum and  
367 vmPFC (Park et al., 2017), and this functional connectivity underpins prosocial  
368 motivation called warm glow (Andreoni, 1990). Functional orchestration among  
369 different brain regions is critically important for decision making. For instance, the  
370 vmPFC shows functional connectivity with regions such as the TPJ, dlPFC, and aPFC  
371 in context-dependent manners during decision making tasks (Baumgartner et al., 2011;  
372 De Martino et al., 2013; Hill et al., 2017). To better understand neural bases of  
373 intergenerationally-sustainable decisions, we need to examine how multiple brain  
374 regions work in concert as distributed brain networks.

375

376

### 377 **4. Possible empirical approaches**

378 How can we empirically study neural bases supporting intergenerationally-sustainable  
379 behavior? Here we propose two types of approaches that would be useful in future  
380 research.

381

**382 4-1. Using economic games: decision-making in laboratory settings**

383 The first approach is to use behavioral economic games designed to study  
384 intergenerationally-sustainable decision-making, and incorporate them into  
385 neuroimaging experiments. In this approach, participants make decisions regarding  
386 intergenerational sustainability while their brain activity is measured using  
387 neuroimaging techniques. Previous neuroimaging studies have used similar approaches  
388 to examine neural bases of social decision-making. For instance, economic games such  
389 as the trust game, prisoner's dilemma game, and ultimatum game have been used to  
390 study trust, cooperation, and inequality aversion, respectively (McCabe et al., 2001; J.  
391 Rilling et al., 2002; Sanfey et al., 2003).

392 The advantage of this approach is that it can examine neural responses in  
393 well-controlled laboratory settings. Behavioral economic games allow researchers to  
394 systematically manipulate experimental variables, such as the cost and efficiency of  
395 sustainable decisions, as well as to examine effects of certain treatments versus  
396 well-matched control conditions. This is particularly useful when combined with  
397 computational modeling (Behrens et al., 2009), which enables to decompose a decision  
398 process into distinct components and identify how experimental manipulations (e.g., a  
399 treatment) affect each component.

400 A few behavioral economic games suitable to study intergenerational  
401 sustainability have been proposed (Fischer et al., 2004; Hauser et al., 2014; Kamijo et  
402 al., 2017; Langenbach et al., 2019; Sherstyuk et al., 2016). In these games, a group of  
403 players (or an individual player in some studies) represents a "generation," and  
404 decisions are made successively from one generation to another (Figure 3A). Of note, a

405 decision made by a generation affects only later generations, but not the other way  
406 around. This mirrors the unidirectional nature of intergenerational dependencies  
407 between the past and future generations in the real world (i.e., the time flows only from  
408 the past to the future).

409         The essential characteristic of these games is that they embed intergenerational  
410 sustainability dilemmas (i.e., trade-offs between the current and future generations'  
411 benefits) into the game structure. For instance, in the Intergenerational Goods Game  
412 used by Hauser et al. (2014), each generation consisting of five players makes a  
413 collective decision (on the basis of median voting) as to how much they extract a  
414 resource from an intergenerational common pool. If the extraction by the current  
415 generation is under a predetermined threshold, the pool will be replenished and the next  
416 generation will play the game in the same way as the current generation does. On the  
417 other hand, if the extraction level exceeds the threshold, the pool will be exhausted and  
418 the following generations will lose the opportunity to play the game. Thus, an  
419 overexploitation of the intergenerational common pool benefits the current generation,  
420 but harms the future generations. In the Intergenerational Sustainability Dilemma Game  
421 (ISDG) used by Kamijo et al. (2017), each generation consisting of three players makes  
422 a collective decision (on the basis of conversations among the players within each  
423 generation) between "Option A" and "Option B" (corresponding to "unsustainable" and  
424 "sustainable" options, respectively). Although the current generation receives a larger  
425 payoff by choosing Option A compared with Option B (say, \$36 vs. \$27), if the current  
426 generation chooses Option A, the next generation will face a similar decision between  
427 Option A and Option B but with reduced payoffs for both options (e.g., \$27 vs. \$18). On  
428 the other hand, if the current generation chooses Option B, the next generation will face

429 a binary decision with the payoffs maintained for both options (i.e., \$36 vs. \$27). This  
430 means that the pool gradually decreases and eventually is depleted if many generations  
431 choose Option A, whereas it is sustainable as long as all generations choose Option B.  
432 Thus, each generation face at a dilemma between self-interest (i.e., choosing Option A)  
433 and sustainability (i.e., choosing Option B). The game used by Langenbach et al. (2019)  
434 also entails a similar feature of intergenerational sustainability dilemma (i.e., forgoing  
435 self-interest to achieve intergenerational sustainability), although the specific  
436 implementation differs from the other games.

437         There are some important variations among the games used in the previous  
438 studies (Figure 3B). These games typically implement intergenerational dependencies as  
439 Markov processes (i.e., the payoff structure of generation  $t+1$  is solely determined by  
440 the decision of generation  $t$ , irrespective of the decisions of generations  $t-1$ ,  $t-2$ , ...),  
441 and the current generation is not provided with the information about past generations.  
442 Therefore, the players' decisions would be influenced by "prospective" factors (i.e.,  
443 how their decisions affect the next generation), but not by "retrospective" factors (i.e.,  
444 how the past generations have made decisions). This simplifies the structure of the  
445 games, but misses the important aspect of the intergenerational decisions in the real  
446 world—that is, the decisions of the current generation are influenced by the history  
447 made by the past generations. A notable exception is the ISDG (Kamijo et al., 2017). In  
448 the ISDG, each generation is provided with the full history of the past generations'  
449 decisions. This allows researchers to examine effects of retrospective factors (i.e., the  
450 history) in addition to those of prospective factors. For instance, a player's decision may  
451 conform to past generations' decisions, because the choices made by the past  
452 generations may serve as a reference point or set a "norm" (Xiang et al., 2013).

453 Alternatively, some players may want to “break off bad habits” and behave benevolently  
454 to the future generations if several past generations have consecutively chosen  
455 unsustainable options. Although the effects of past generations’ decisions on the current  
456 generation’s decision could be complicated, investigating such retrospective factors  
457 would provide important insights into understanding intergenerational decisions in the  
458 real world.

459 Another unique aspect of Kamijo et al. (2017) is that it allowed conversations  
460 among the players within each generation (but not between generations) before they  
461 make a collective decision. This is unlike the studies done by Hauser et al. (2014) or  
462 Langenbach et al. (2019), where participants were prohibited to make communications.  
463 Conversations and communications are indispensable parts of policy-making processes  
464 in the real world (e.g., deliberative democracy and procedural justice). However, their  
465 effects on collective decisions remain unclear, for instance whether communications  
466 among individuals lead to collective wisdom (Bahrami et al., 2010; Navajas et al., 2018)  
467 or induce phenomena such as risky shift and group polarization (Lord et al., 1979). In  
468 particular, it is possible that conversations alone cannot facilitate  
469 intergenerationally-sustainable decisions without additional institutions (Timilsina et al.,  
470 2017). Thus, how conversations and communications affect collective decisions  
471 regarding intergenerational sustainability is worth investigating. Letting participants  
472 freely converse with others in the MRI scanner involves technical difficulties, because it  
473 induces head motions and decreases fMRI signal quality (if not impossible; e.g., Chen  
474 et al., 2017). Instead, experimenters can let participants converse with others under  
475 certain conditions (which serves as experimental treatments) outside the scanner, and  
476 then let them perform decision-making tasks (without conversations) in the scanner.

477 This allows researchers to examine how neural responses during the decision-making  
478 task is affected by prior experience of conversations (under a certain condition).

479 A major concern of the approach using economic games is whether behavior  
480 observed in laboratory experiments translates to real-world sustainable behavior (from  
481 purchasing green products and using reusable bags to expressing support for  
482 pro-environmental policies). Because the games to study intergenerational sustainability  
483 are developed relatively recently, research ensuring ecological validity is still lacking or  
484 scarce. For other economic games widely used in past research (e.g., the dictator game,  
485 ultimatum game, and trust game), intensive efforts have been made to ensure their  
486 ecological validity—that is, decisions in these games reflect real-world behavior  
487 regarding generosity, fairness, and trust (Franzen & Pointner, 2013). Similar efforts are  
488 needed to establish the correspondence between behavior in the laboratory games  
489 concerning intergenerational sustainability and real-world sustainable behavior.

490 We also emphasize that a central goal of research is to develop institutions that  
491 are effective in real-world situations. Some experimental treatments used in laboratory  
492 settings may not work in the real world. For instance, Hauser et al. (2014) showed that  
493 median voting is effective in sustaining intergenerational common pools in a laboratory  
494 setting. However, median voting may not work if the majority of voters prefer  
495 self-interest over sustainability and the median exceeds a limit of sustainable resource  
496 provision. In fact, when we look around the real world, most countries are not even  
497 close to heading toward sustainable societies (Wackernagel et al., 2017). As a result,  
498 agreements reached in international conferences such as the Conference of the Parties to  
499 the United Nations Framework Convention on Climate Change (COP) and the World  
500 Economic Forum (WEF) are often not sufficient to achieve sustainability (Steffen et al.,

501 2018), and criticized as putting future generations still under risk. This may suggest that  
502 different types of institutions are needed to uplift concerns for future generations.

503

#### 504 **4-2. Using naturalistic stimuli: predicting real-world outcomes**

505 The second approach focuses more on predicting real-world outcomes from brain data  
506 (Fig. 4). This approach uses naturalistic stimuli, such as movies and media articles that  
507 deliver persuasive messages promoting certain sustainable behaviors (e.g., purchasing  
508 green products, using carpools, and reducing air travel). Participants are presented with  
509 naturalistic stimuli inside the scanner, like when they watch TV commercials or read  
510 new articles in everyday life. The aim of research is to associate neural responses with  
511 behavioral/attitude changes induced by persuasive messages. Similar approaches have  
512 been used to predict behavioral changes induced by health messages (e.g., quitting  
513 smoking, using sunscreens) from neural responses (Chua et al., 2011; Falk et al., 2010).  
514 Recent advances in spatiotemporal analysis of fMRI signals have enhanced the utility of  
515 naturalistic stimuli. For instance, voxelwise encoding models allow to investigate neural  
516 representations of various low-level perceptual (e.g., audiovisual) features and semantic  
517 contents included in naturalistic stimuli (Huth et al., 2016). In addition, analyses  
518 looking at brain synchrony among individuals (e.g., inter-subject correlations of fMRI  
519 time series) allow to capture temporal dynamics of neural responses in data-driven  
520 manners, without requiring pre-specified stimulus onsets (Sonkusare et al., 2019).

521 This approach can be used in two distinct ways. The first way is to predict  
522 individual differences in behavioral changes. The same message may induce different  
523 degrees of behavioral changes across individuals, and the inter-individual variations  
524 might be associated with neural responses in specific brain regions. Previous studies

525 have shown that activation in brain regions processing personal relevance of stimuli  
526 (e.g., the mPFC and precuneus) is associated with individual differences in behavioral  
527 changes (Falk et al., 2010). Using brain data to predict behavioral changes is  
528 particularly useful when self-reported intentions of changing behavior are biased by  
529 confounding factors (e.g., social desirability) and not reliable predictors of actual  
530 behavioral changes.

531         The second way is to predict collective outcomes in the real world using brain  
532 data obtained by laboratory neuroimaging experiments. In other words, using neural  
533 responses observed in “neural focus group” to forecast population-level behavior in  
534 large-scale social groups (Falk et al., 2012). Previous studies have shown that brain data  
535 obtained from small sample-size groups (e.g., around 40 participants) can predict  
536 population-level outcomes such as viral sharing of news articles on social networking  
537 services and aggregate view frequency of YouTube videos (Scholz et al., 2017; Tong et  
538 al., 2020). These studies suggest that activations in brain regions implicated in  
539 processing of personal relevance (e.g., the mPFC) and reward values (e.g., the striatum)  
540 are predictive of population-level outcomes. Such approaches may also be useful to  
541 examine effects of institutions aiming to promote sustainable behavior at the collective  
542 level.

543

544

## 545 **5. Future directions**

546 In this section, we present important open questions that can be addressed using  
547 neuroscientific approaches. We also introduce an emerging transdisciplinary framework  
548 that can potentially bridge laboratory experiments and practices in the real world.



549

**550 5-1. What are neural bases of persistent behavioral changes?**

551 For an institution to be effective in the real world, behavioral changes induced by the  
552 institution has to be persistent (i.e., long-lasting) (van der Linden, 2017). To examine  
553 long-term effects of experimental treatments on real-world sustainable behavior, we  
554 need to longitudinally collect real-world behavioral measures over certain periods of  
555 time (e.g., a few months). This can be done by occasional follow-up data collections, for  
556 instance via online experiments or smartphone apps monitoring daily sustainable  
557 behavior. An interesting question is what brain regions can predict long-term behavioral  
558 changes. If persistent behavioral changes induced by an experimental treatment are  
559 supported by implicit brain processes (e.g., emotional processing subserved by brain  
560 regions such as the amygdala), brain data could be a better predictor of long-term  
561 behavioral changes than self-report measures. It is also possible that some brain regions  
562 predict both immediate and long-term behavioral changes whereas other regions predict  
563 only immediate behavioral changes.

564

**565 5-2. Are macroscopic changes of brain structure involved?**

566 Another interesting neuroscientific question is what structural changes of the brain (i.e.,  
567 brain plasticity) support behavioral changes related to intergenerational sustainability. If  
568 behavioral changes induced by a treatment are long-lasting, they should be accompanied  
569 by changes in the brain structure, either at a microscopic (e.g., synapses and spines) or  
570 macroscopic (e.g., cortical thickness of widespread areas) level. If the structural changes  
571 are macroscopic and large enough, they could be detected by structural MRI.  
572 Traditionally, intensive training of visuoperceptual or sensorimotor tasks has shown to

573 induce macroscopic changes in task-relevant brain area (Zatorre et al., 2012). Recent  
574 studies have further revealed that interventional training aiming at enhancing cognitive  
575 ability (e.g., attention) and prosocial motivations (e.g., compassion) induces widespread  
576 changes in cortical thickness (Valk et al., 2017). In addition, cultural and environmental  
577 factors such as socioeconomic status (SES) modulate cortical thickness in widespread  
578 areas (even after controlling for genetic factors), which mediates effects of SES on  
579 cognitive ability such as executive functions (Noble et al., 2015). This raises the  
580 possibility that an immersive exposure to interventional training or educational  
581 programmes aiming at enhancing concern for future generations may induce widespread  
582 structural changes, particularly in regions implicated in social cognition and/or  
583 intertemporal decisions. Testing such possibility would provide useful insight into  
584 neural underpinnings underlying sustainable behaviour.

585

### 586 **5-3. Can neuroscience offer better understandings of distinct prosocial** 587 **motivations?**

588 As we described before, prosocial motivations are multifaceted, and some of them may  
589 contribute to intergenerationally-sustainable decisions while others may not. Although  
590 we have argued that naturally-grown empathy might not be enough for achieving  
591 sustainability at the collective level, related (but possibly distinct) prosocial motivations  
592 such as compassion and loving-kindness may be enhanced with training (Lutz et al.,  
593 2008), which may promote concern for future generations by transcending perceived  
594 distances. In addition, impartiality (as opposed to parochialism) may play key roles in  
595 making intergenerationally-rational decisions (Baumgartner et al., 2013; Everett et al.,  
596 2018), which may counteract our natural biases toward the current generation.

597 Neuroimaging may allow us to clarify common and distinct substrates for these  
598 interrelated prosocial motivations, and help to understand neurocognitive components  
599 particularly important for intergenerationally-sustainable decisions.

600

601 **5-4. Transdisciplinary research bridging laboratory experiments and real-world**  
602 **practices**

603 Throughout this paper, we have emphasized the importance of developing and  
604 implementing social institutions to leverage concern for future generations that are  
605 effective in real-world situations. To achieve this challenging goal, we need to  
606 accumulate empirical evidence in both laboratory settings and real-world practices in a  
607 translatable manner. An emerging transdisciplinary framework, called “Future Design”  
608 (Saijo, 2015), aims at this goal by facilitating collaborations among researchers and  
609 citizens (including policy makers). For instance, Kamiyo et al. (2017) showed that an  
610 institution called an “imaginary future generation” promotes  
611 intergenerationally-sustainable decisions in a laboratory setting (i.e., the ISDG). In an  
612 imaginary future generation treatment, some players in the current generation take the  
613 perspective of future generations, and discuss with other members in the current  
614 generation on behalf of future generations. Importantly, the essentially same institution  
615 has recently been used in practices in several local governments in Japan (Hara et al.,  
616 2019). This may offer a useful opportunity to examine effects of certain institutions in  
617 both well-controlled laboratory settings and real-world practices in actual  
618 policy-making processes. Future neuroscience research may take the advantage of such  
619 situations, for example by inviting the same participants and/or using the same  
620 institutions for both laboratory neuroimaging experiments and real-world practices for

621 policy making. A key concept in Future Design is “futurability,” which is defined as the  
622 ability to derive happiness from deciding and acting to forego current benefits in order  
623 to enrich future generations (Saijo, 2015). Empirical research using neuroimaging may  
624 clarify the neurobiological underpinnings of this concept. For the conceptual uniqueness  
625 and recent progresses in Future Design, see Saijo (2020).

626

627

## 628 **6. Conclusions**

629 Intergenerational sustainability dilemmas lie at the heart of pressing issues in the  
630 contemporary society such as climate change. To solve these dilemmas, we need novel  
631 social systems to enhance the current generation’s concern for future generations,  
632 thereby achieving the transformation toward sustainable societies. Neuroscience may  
633 play unique roles in advancing the transdisciplinary research for intergenerational  
634 sustainability.

635

636 **References**

- 637 Amodio, D. M. (2014). The neuroscience of prejudice and stereotyping. *Nature Reviews*  
638 *Neuroscience*, 15(10), 670–682. <https://doi.org/10.1038/nrn3800>
- 639 Andreoni, J. (1990). Impure Altruism and Donations to Public Goods: A Theory of  
640 Warm-Glow Giving. *The Economic Journal*, 100(401), 464.  
641 <https://doi.org/10.2307/2234133>
- 642 Aron, A. R. (2019). The Climate Crisis Needs Attention from Cognitive Scientists.  
643 *Trends in Cognitive Sciences*, 23(11), 903–906.  
644 <https://doi.org/10.1016/j.tics.2019.08.001>
- 645 Aron, A. R., Ivry, R. B., Jeffery, K. J., Poldrack, R. A., Schmidt, R., Summerfield, C., &  
646 Urai, A. E. (2020). How Can Neuroscientists Respond to the Climate  
647 Emergency? *Neuron*, 106(1), 17–20.  
648 <https://doi.org/10.1016/j.neuron.2020.02.019>
- 649 Bahrami, B., Olsen, K., Latham, P. E., Roepstorff, A., Rees, G., & Frith, C. D. (2010).  
650 Optimally Interacting Minds. *Science*, 329(5995), 1081–1085.  
651 <https://doi.org/10.1126/science.1185718>
- 652 Bartra, O., McGuire, J. T., & Kable, J. W. (2013). The valuation system: A  
653 coordinate-based meta-analysis of BOLD fMRI experiments examining neural  
654 correlates of subjective value. *NeuroImage*, 76, 412–427.  
655 <https://doi.org/10.1016/j.neuroimage.2013.02.063>
- 656 Baumgartner, T., Knoch, D., Hotz, P., Eisenegger, C., & Fehr, E. (2011). Dorsolateral  
657 and ventromedial prefrontal cortex orchestrate normative choice. *Nature*  
658 *Neuroscience*, 14(11), 1468–1474. <https://doi.org/10.1038/nn.2933>
- 659 Baumgartner, T., Schiller, B., Hill, C., & Knoch, D. (2013). Impartiality in humans is

- 660 predicted by brain structure of dorsomedial prefrontal cortex. *NeuroImage*, *81*,  
661 317–324. <https://doi.org/10.1016/j.neuroimage.2013.05.047>
- 662 Beaty, R. E., Kenett, Y. N., Christensen, A. P., Rosenberg, M. D., Benedek, M., Chen, Q.,  
663 Fink, A., Qiu, J., Kwapil, T. R., Kane, M. J., & Silvia, P. J. (2018). Robust  
664 prediction of individual creative ability from brain functional connectivity.  
665 *Proceedings of the National Academy of Sciences of the United States of*  
666 *America*, *115*(5), 1087–1092. <https://doi.org/10.1073/pnas.1713532115>
- 667 Behrens, T. E. J., Hunt, L. T., & Rushworth, M. F. S. (2009). The computation of social  
668 behavior. *Science (New York, N.Y.)*, *324*(5931), 1160–1164.  
669 <https://doi.org/10.1126/science.1169694>
- 670 Bernhard, H., Fischbacher, U., & Fehr, E. (2006). Parochial altruism in humans. *Nature*,  
671 *442*(7105), 912–915. <https://doi.org/10.1038/nature04981>
- 672 Bloom, D. E., Cafiero, E., Jané-Llopis, E., Abrahams-Gessel, S., Bloom, L. R., Fathima,  
673 S., Feigl, A. B., Gaziano, T., Mowafi, M., Pandya, A., Prettner, K., Rosenberg, L.,  
674 Seligman, B., Stein, A., & Weinstein, C. (2011). *The global economic burden of*  
675 *noncommunicable diseases*. World Economic Forum.
- 676 Brown, T. I., Carr, V. A., LaRocque, K. F., Favila, S. E., Gordon, A. M., Bowles, B.,  
677 Bailenson, J. N., & Wagner, A. D. (2016). Prospective representation of  
678 navigational goals in the human hippocampus. *Science*, *352*(6291), 1323–1326.  
679 <https://doi.org/10.1126/science.aaf0784>
- 680 Bruneau, E. G., Cikara, M., & Saxe, R. (2017). Parochial Empathy Predicts Reduced  
681 Altruism and the Endorsement of Passive Harm. *Social Psychological and*  
682 *Personality Science*, *8*(8), 934–942. <https://doi.org/10.1177/1948550617693064>
- 683 Bulley, A., & Schacter, D. L. (2020). Deliberating trade-offs with the future. *Nature*

- 684 *Human Behaviour*, 4(3), 238–247. <https://doi.org/10.1038/s41562-020-0834-9>
- 685 Chen, J., Leong, Y. C., Honey, C. J., Yong, C. H., Norman, K. A., & Hasson, U. (2017).  
686 Shared memories reveal shared structure in neural activity across individuals.  
687 *Nature Neuroscience*, 20(1), 115–125. <https://doi.org/10.1038/nn.4450>
- 688 Chua, H. F., Ho, S. S., Jasinska, A. J., Polk, T. A., Welsh, R. C., Liberzon, I., & Strecher,  
689 V. J. (2011). Self-related neural response to tailored smoking-cessation messages  
690 predicts quitting. *Nature Neuroscience*, 14(4), 426–427.  
691 <https://doi.org/10.1038/nn.2761>
- 692 Cikara, M., & Fiske, S. T. (2011). Bounded Empathy: Neural Responses to Outgroup  
693 Targets' (Mis)fortunes. *Journal of Cognitive Neuroscience*, 23(12), 3791–3803.  
694 [https://doi.org/10.1162/jocn\\_a\\_00069](https://doi.org/10.1162/jocn_a_00069)
- 695 Crockett, M. J., Braams, B. R., Clark, L., Tobler, P. N., Robbins, T. W., & Kalenscher, T.  
696 (2013). Restricting temptations: Neural mechanisms of precommitment. *Neuron*,  
697 79(2), 391–401. <https://doi.org/10.1016/j.neuron.2013.05.028>
- 698 Crutzen, P. (2002). Geology of mankind. *Nature*, 415(3).
- 699 De Martino, B., Fleming, S. M., Garrett, N., & Dolan, R. J. (2013). Confidence in  
700 value-based choice. *Nature Neuroscience*, 16(1), 105–110.  
701 <https://doi.org/10.1038/nn.3279>
- 702 Decety, J., Bartal, I. B.-A., Uzefovsky, F., & Knafo-Noam, A. (2016). Empathy as a  
703 driver of prosocial behaviour: Highly conserved neurobehavioural mechanisms  
704 across species. *Philosophical Transactions of the Royal Society B: Biological*  
705 *Sciences*, 371(1686). <https://doi.org/10.1098/rstb.2015.0077>
- 706 Doll, B. B., Duncan, K. D., Simon, D. A., Shohamy, D., & Daw, N. D. (2015).  
707 Model-based choices involve prospective neural activity. *Nature Neuroscience*,

- 708 18(5), 767–772. <https://doi.org/10.1038/mn.3981>
- 709 Everett, J. A. C., Faber, N. S., Savulescu, J., & Crockett, M. J. (2018). The costs of  
710 being consequentialist: Social inference from instrumental harm and impartial  
711 beneficence. *Journal of Experimental Social Psychology*, 79, 200–216.  
712 <https://doi.org/10.1016/j.jesp.2018.07.004>
- 713 Falk, E. B., Berkman, E. T., & Lieberman, M. D. (2012). From Neural Responses to  
714 Population Behavior: Neural Focus Group Predicts Population-Level Media  
715 Effects. *Psychological Science*, 23(5), 439–445.  
716 <https://doi.org/10.1177/0956797611434964>
- 717 Falk, E. B., Berkman, E. T., Mann, T., Harrison, B., & Lieberman, M. D. (2010).  
718 Predicting Persuasion-Induced Behavior Change from the Brain. *Journal of*  
719 *Neuroscience*, 30(25), 8421–8424.  
720 <https://doi.org/10.1523/JNEUROSCI.0063-10.2010>
- 721 Figner, B., Knoch, D., Johnson, E. J., Krosch, A. R., Lisanby, S. H., Fehr, E., & Weber,  
722 E. U. (2010). Lateral prefrontal cortex and self-control in intertemporal choice.  
723 *Nature Neuroscience*, 13(5), 538–539. <https://doi.org/10.1038/mn.2516>
- 724 Fischer, M.-E., Irlenbusch, B., & Sadrieh, A. (2004). An intergenerational common pool  
725 resource experiment. *Journal of Environmental Economics and Management*,  
726 48(2), 811–836. <https://doi.org/10.1016/j.jeem.2003.12.002>
- 727 Fiske, S. T. (2002). What We Know Now About Bias and Intergroup Conflict, the  
728 Problem of the Century. *Current Directions in Psychological Science*, 11(4),  
729 123–128. <https://doi.org/10.1111/1467-8721.00183>
- 730 Fleming, S. M., Weil, R. S., Nagy, Z., Dolan, R. J., & Rees, G. (2010). Relating  
731 introspective accuracy to individual differences in brain structure. *Science*,



- 732 329(5998), 1541–1543. <https://doi.org/10.1126/science.1191883>
- 733 Franzen, A., & Pointner, S. (2013). The external validity of giving in the dictator game.  
734 *Experimental Economics*, 16(2), 155–169.  
735 <https://doi.org/10.1007/s10683-012-9337-5>
- 736 Frederick, S., Loewenstein, G., & O’donoghue, T. (2002). Time discounting and time  
737 preference: A critical review. *Journal of Economic Literature*, 40(2), 351–401.
- 738 Frith, U., & Frith, C. D. (2003). Development and neurophysiology of mentalizing.  
739 *Philosophical Transactions of the Royal Society of London. Series B: Biological*  
740 *Sciences*, 358(1431), 459–473. <https://doi.org/10.1098/rstb.2002.1218>
- 741 Gilbert, D. T., & Wilson, T. D. (2007). Propection: Experiencing the future. *Science*,  
742 317(5843), 1351–1354.
- 743 Hara, K., Yoshioka, R., Kuroda, M., Kurimoto, S., & Saijo, T. (2019). Reconciling  
744 intergenerational conflicts with imaginary future generations: Evidence from a  
745 participatory deliberation practice in a municipality in Japan. *Sustainability*  
746 *Science*, 14(6), 1605–1619. <https://doi.org/10.1007/s11625-019-00684-x>
- 747 Hassabis, D., Kumaran, D., & Maguire, E. A. (2007). Using Imagination to Understand  
748 the Neural Basis of Episodic Memory. *Journal of Neuroscience*, 27(52),  
749 14365–14374. <https://doi.org/10.1523/JNEUROSCI.4549-07.2007>
- 750 Hauser, O. P., Rand, D. G., Peysakhovich, A., & Nowak, M. A. (2014). Cooperating  
751 with the future. *Nature*, 511(7508), 220–223.  
752 <https://doi.org/10.1038/nature13530>
- 753 Hein, G., Engelmann, J. B., Vollberg, M. C., & Tobler, P. N. (2016). How learning  
754 shapes the empathic brain. *Proceedings of the National Academy of Sciences*,  
755 113(1), 80–85. <https://doi.org/10.1073/pnas.1514539112>

- 756 Hein, G., Morishima, Y., Leiberg, S., Sul, S., & Fehr, E. (2016). The brain's functional  
757 network architecture reveals human motives. *Science*, *351*(6277), 1074–1078.  
758 <https://doi.org/10.1126/science.aac7992>
- 759 Hill, C. A., Suzuki, S., Polania, R., Moisa, M., O'Doherty, J. P., & Ruff, C. C. (2017). A  
760 causal account of the brain network computations underlying strategic social  
761 behavior. *Nature Neuroscience*, *20*(8), 1142–1149.  
762 <https://doi.org/10.1038/nn.4602>
- 763 Huth, A. G., de Heer, W. A., Griffiths, T. L., Theunissen, F. E., & Gallant, J. L. (2016).  
764 Natural speech reveals the semantic maps that tile human cerebral cortex. *Nature*,  
765 *532*(7600), 453–458. <https://doi.org/10.1038/nature17637>
- 766 IPCC. (2014). *Climate change 2014: Synthesis report. Contribution of Working Groups*  
767 *I, II and III to the fifth assessment report of the Intergovernmental Panel on*  
768 *Climate Change*. IPCC, Geneva, Switzerland.
- 769 Izuma, K., Aoki, R., Shibata, K., & Nakahara, K. (2019). Neural signals in amygdala  
770 predict implicit prejudice toward an ethnic outgroup. *NeuroImage*, *189*, 341–352.  
771 <https://doi.org/10.1016/j.neuroimage.2019.01.019>
- 772 Kable, J. W., & Glimcher, P. W. (2007). The neural correlates of subjective value during  
773 intertemporal choice. *Nature Neuroscience*, *10*(12), 1625–1633.  
774 <https://doi.org/10.1038/nn2007>
- 775 Kahn, M. E., Mohaddes, K., Ng, R. N., Pesaran, M. H., Raissi, M., & Yang, J.-C. (2019).  
776 *Long-term macroeconomic effects of climate change: A cross-country analysis*  
777 (No. 0898–2937). National Bureau of Economic Research.
- 778 Kamijo, Y., Komiya, A., Mifune, N., & Saijo, T. (2017). Negotiating with the future:  
779 Incorporating imaginary future generations into negotiations. *Sustainability*

- 780 *Science*, 12(3), 409–420. <https://doi.org/10.1007/s11625-016-0419-8>
- 781 Kjellstrom, T., Maître, N., Saget, C., Otto, M., & Karimova, T. (2019). *Working on a*  
782 *warmer planet: The effect of heat stress on productivity and decent work.*  
783 [http://www.ilo.org/global/publications/books/WCMS\\_711919/lang--en/index.ht](http://www.ilo.org/global/publications/books/WCMS_711919/lang--en/index.htm)  
784 [m](http://www.ilo.org/global/publications/books/WCMS_711919/lang--en/index.htm)
- 785 Klimecki, O. M., Mayer, S. V., Jusyte, A., Scheeff, J., & Schönberg, M. (2016).  
786 Empathy promotes altruistic behavior in economic interactions. *Scientific*  
787 *Reports*, 6(1), 31961. <https://doi.org/10.1038/srep31961>
- 788 Koechlin, E. (2003). The Architecture of Cognitive Control in the Human Prefrontal  
789 Cortex. *Science*, 302(5648), 1181–1185.  
790 <https://doi.org/10.1126/science.1088545>
- 791 Kristal, A. S., & Whillans, A. V. (2020). What we can learn from five naturalistic field  
792 experiments that failed to shift commuter behaviour. *Nature Human Behaviour*,  
793 4(2), 169–176. <https://doi.org/10.1038/s41562-019-0795-z>
- 794 Langenbach, B. P., Baumgartner, T., Cazzoli, D., Müri, R. M., & Knoch, D. (2019).  
795 Inhibition of the right dlPFC by theta burst stimulation does not alter sustainable  
796 decision-making. *Scientific Reports*, 9(1), 1–8.
- 797 Lenton, T. M., Rockström, J., Gaffney, O., Rahmstorf, S., Richardson, K., Steffen, W.,  
798 & Schellnhuber, H. J. (2019). Climate tipping points—Too risky to bet against.  
799 *Nature*, 575(7784), 592–595. <https://doi.org/10.1038/d41586-019-03595-0>
- 800 Lord, C. G., Ross, L., & Lepper, M. R. (1979). Biased assimilation and attitude  
801 polarization: The effects of prior theories on subsequently considered evidence.  
802 *Journal of Personality and Social Psychology*, 37(11), 2098–2109.  
803 <https://doi.org/10.1037/0022-3514.37.11.2098>

- 804 Lutz, A., Brefczynski-Lewis, J., Johnstone, T., & Davidson, R. J. (2008). Regulation of  
805 the Neural Circuitry of Emotion by Compassion Meditation: Effects of  
806 Meditative Expertise. *PLOS ONE*, 3(3), e1897.  
807 <https://doi.org/10.1371/journal.pone.0001897>
- 808 McCabe, K., Houser, D., Ryan, L., Smith, V., & Trouard, T. (2001). A functional  
809 imaging study of cooperation in two-person reciprocal exchange. *Proceedings of*  
810 *the National Academy of Sciences*, 98(20), 11832–11835.  
811 <https://doi.org/10.1073/pnas.211415698>
- 812 McClure, S. M. (2004). Separate Neural Systems Value Immediate and Delayed  
813 Monetary Rewards. *Science*, 306(5695), 503–507.  
814 <https://doi.org/10.1126/science.1100907>
- 815 Navajas, J., Niella, T., Garbulsky, G., Bahrami, B., & Sigman, M. (2018). Aggregated  
816 knowledge from a small number of debates outperforms the wisdom of large  
817 crowds. *Nature Human Behaviour*, 2(2), 126–132.  
818 <https://doi.org/10.1038/s41562-017-0273-4>
- 819 Noble, K. G., Houston, S. M., Brito, N. H., Bartsch, H., Kan, E., Kuperman, J. M.,  
820 Akshoomoff, N., Amaral, D. G., Bloss, C. S., Libiger, O., Schork, N. J., Murray,  
821 S. S., Casey, B. J., Chang, L., Ernst, T. M., Frazier, J. A., Gruen, J. R., Kennedy,  
822 D. N., Van Zijl, P., ... Sowell, E. R. (2015). Family income, parental education  
823 and brain structure in children and adolescents. *Nature Neuroscience*, 18(5),  
824 773–778. <https://doi.org/10.1038/nn.3983>
- 825 O'Neill, D. W., Fanning, A. L., Lamb, W. F., & Steinberger, J. K. (2018). A good life for  
826 all within planetary boundaries. *Nature Sustainability*, 1(2), 88–95.  
827 <https://doi.org/10.1038/s41893-018-0021-4>

- 828 Park, S. Q., Kahnt, T., Dogan, A., Strang, S., Fehr, E., & Tobler, P. N. (2017). A neural  
829 link between generosity and happiness. *Nature Communications*, 8(1), 15964.  
830 <https://doi.org/10.1038/ncomms15964>
- 831 Peters, J., & Büchel, C. (2010). Episodic Future Thinking Reduces Reward Delay  
832 Discounting through an Enhancement of Prefrontal-Mediotemporal Interactions.  
833 *Neuron*, 66(1), 138–148. <https://doi.org/10.1016/j.neuron.2010.03.026>
- 834 Phelps, E. A., O'Connor, K. J., Cunningham, W. A., Funayama, E. S., Gatenby, J. C.,  
835 Gore, J. C., & Banaji, M. R. (2000). Performance on Indirect Measures of Race  
836 Evaluation Predicts Amygdala Activation. *Journal of Cognitive Neuroscience*,  
837 12(5), 729–738. <https://doi.org/10.1162/089892900562552>
- 838 Rand, D. G., & Nowak, M. A. (2013). Human cooperation. *Trends in Cognitive Sciences*,  
839 17(8), 413–425. <https://doi.org/10.1016/j.tics.2013.06.003>
- 840 Rilling, J., Gutman, D., Zeh, T., Pagnoni, G., Berns, G., & Kilts, C. (2002). A neural  
841 basis for social cooperation. *Neuron*, 35(2), 395–405.  
842 [https://doi.org/10.1016/s0896-6273\(02\)00755-9](https://doi.org/10.1016/s0896-6273(02)00755-9)
- 843 Rilling, J. K., & Sanfey, A. G. (2011). The Neuroscience of Social Decision-Making.  
844 *Annual Review of Psychology*, 62(1), 23–48.  
845 <https://doi.org/10.1146/annurev.psych.121208.131647>
- 846 Rockström, J., Steffen, W., Noone, K., Persson, Å., Chapin, F. S., Lambin, E. F., Lenton,  
847 T. M., Scheffer, M., Folke, C., Schellnhuber, H. J., Nykvist, B., de Wit, C. A.,  
848 Hughes, T., van der Leeuw, S., Rodhe, H., Sörlin, S., Snyder, P. K., Costanza, R.,  
849 Svedin, U., ... Foley, J. A. (2009). A safe operating space for humanity. *Nature*,  
850 461(7263), 472–475. <https://doi.org/10.1038/461472a>
- 851 Ruff, C. C., & Fehr, E. (2014). The neurobiology of rewards and values in social

- 852 decision making. *Nature Reviews Neuroscience*, 15(8), 549–562.  
853 <https://doi.org/10.1038/nrn3776>
- 854 Saijo, T. (2015). Future design: Concept for a ministry of the future. *Social Design*  
855 *Engineering Serie*.
- 856 Saijo, T. (2020). *Future Design: Bequeathing Sustainable Natural Environments and*  
857 *Sustainable Societies to Future Generations*.  
858 <http://www.souken.kochi-tech.ac.jp/seido/wp/SDES-2020-5.html>
- 859 Sanfey, A. G., Rilling, J. K., Aronson, J. A., Nystrom, L. E., & Cohen, J. D. (2003). The  
860 neural basis of economic decision-making in the Ultimatum Game. *Science*  
861 *(New York, N.Y.)*, 300(5626), 1755–1758.  
862 <https://doi.org/10.1126/science.1082976>
- 863 Schacter, D. L., Benoit, R. G., & Szpunar, K. K. (2017). Episodic future thinking:  
864 Mechanisms and functions. *Current Opinion in Behavioral Sciences*, 17, 41–50.  
865 <https://doi.org/10.1016/j.cobeha.2017.06.002>
- 866 Scholz, C., Baek, E. C., O'Donnell, M. B., Kim, H. S., Cappella, J. N., & Falk, E. B.  
867 (2017). A neural model of valuation and information virality. *Proceedings of the*  
868 *National Academy of Sciences*, 114(11), 2881–2886.  
869 <https://doi.org/10.1073/pnas.1615259114>
- 870 Schurz, M., Radua, J., Aichhorn, M., Richlan, F., & Perner, J. (2014). Fractionating  
871 theory of mind: A meta-analysis of functional brain imaging studies.  
872 *Neuroscience & Biobehavioral Reviews*, 42, 9–34.  
873 <https://doi.org/10.1016/j.neubiorev.2014.01.009>
- 874 Shamay-Tsoory, S. G., Aharon-Peretz, J., & Perry, D. (2009). Two systems for empathy:  
875 A double dissociation between emotional and cognitive empathy in inferior

- 876 frontal gyrus versus ventromedial prefrontal lesions. *Brain*, 132(3), 617–627.  
877 <https://doi.org/10.1093/brain/awn279>
- 878 Sharot, T., Korn, C. W., & Dolan, R. J. (2011). How unrealistic optimism is maintained  
879 in the face of reality. *Nature Neuroscience*, 14(11), 1475–1479.  
880 <https://doi.org/10.1038/nn.2949>
- 881 Sherstyuk, K., Tarui, N., Ravago, M.-L. V., & Saijo, T. (2016). Intergenerational Games  
882 with Dynamic Externalities and Climate Change Experiments. *Journal of the*  
883 *Association of Environmental and Resource Economists*, 3(2), 247–281.  
884 <https://doi.org/10.1086/684162>
- 885 Shuman, E. K. (2010). Global climate change and infectious diseases. *New England*  
886 *Journal of Medicine*, 362(12), 1061–1063.
- 887 Sonkusare, S., Breakspear, M., & Guo, C. (2019). Naturalistic Stimuli in Neuroscience:  
888 Critically Acclaimed. *Trends in Cognitive Sciences*, 23(8), 699–714.  
889 <https://doi.org/10.1016/j.tics.2019.05.004>
- 890 Steffen, W., Broadgate, W., Deutsch, L., Gaffney, O., & Ludwig, C. (2015). The  
891 trajectory of the Anthropocene: The great acceleration. *The Anthropocene*  
892 *Review*, 2(1), 81–98.
- 893 Steffen, W., Crutzen, P. J., & McNeill, J. R. (2007). The Anthropocene: Are humans  
894 now overwhelming the great forces of nature. *AMBIO: A Journal of the Human*  
895 *Environment*, 36(8), 614–621.
- 896 Steffen, W., Rockström, J., Richardson, K., Lenton, T. M., Folke, C., Liverman, D.,  
897 Summerhayes, C. P., Barnosky, A. D., Cornell, S. E., Crucifix, M., Donges, J. F.,  
898 Fetzer, I., Lade, S. J., Scheffer, M., Winkelmann, R., & Schellnhuber, H. J.  
899 (2018). Trajectories of the Earth System in the Anthropocene. *Proceedings of the*

- 900           *National Academy of Sciences*, 115(33), 8252–8259.  
901           <https://doi.org/10.1073/pnas.1810141115>
- 902       Stolier, R. M., & Freeman, J. B. (2016). Neural pattern similarity reveals the inherent  
903       intersection of social categories. *Nature Neuroscience*, 19(6), 795–797.  
904       <https://doi.org/10.1038/nn.4296>
- 905       Stott, P. (2016). How climate change affects extreme weather events. *Science*,  
906       352(6293), 1517–1518.
- 907       Strombach, T., Weber, B., Hangebrauk, Z., Kenning, P., Karipidis, I. I., Tobler, P. N., &  
908       Kalenscher, T. (2015). Social discounting involves modulation of neural value  
909       signals by temporoparietal junction. *Proceedings of the National Academy of*  
910       *Sciences*, 112(5), 1619–1624. <https://doi.org/10.1073/pnas.1414715112>
- 911       Suddendorf, T., Bulley, A., & Miloyan, B. (2018). Propection and natural selection.  
912       *Current Opinion in Behavioral Sciences*, 24, 26–31.  
913       <https://doi.org/10.1016/j.cobeha.2018.01.019>
- 914       Thaler, R. H., & Benartzi, S. (2004). Save More Tomorrow™: Using Behavioral  
915       Economics to Increase Employee Saving. *Journal of Political Economy*, 112(S1),  
916       S164–S187. JSTOR. <https://doi.org/10.1086/380085>
- 917       Timilsina, R., Kotani, K., Nakagawa, Y., & Saijo, T. (2017). *Can deliberative*  
918       *democracy resolve intergenerational sustainability dilemma?* 35.
- 919       Tong, L. C., Acikalin, M. Y., Genevsky, A., Shiv, B., & Knutson, B. (2020). Brain  
920       activity forecasts video engagement in an internet attention market. *Proceedings*  
921       *of the National Academy of Sciences*, 117(12), 6936–6941.  
922       <https://doi.org/10.1073/pnas.1905178117>
- 923       Valk, S. L., Bernhardt, B. C., Trautwein, F.-M., Böckler, A., Kanske, P., Guizard, N.,

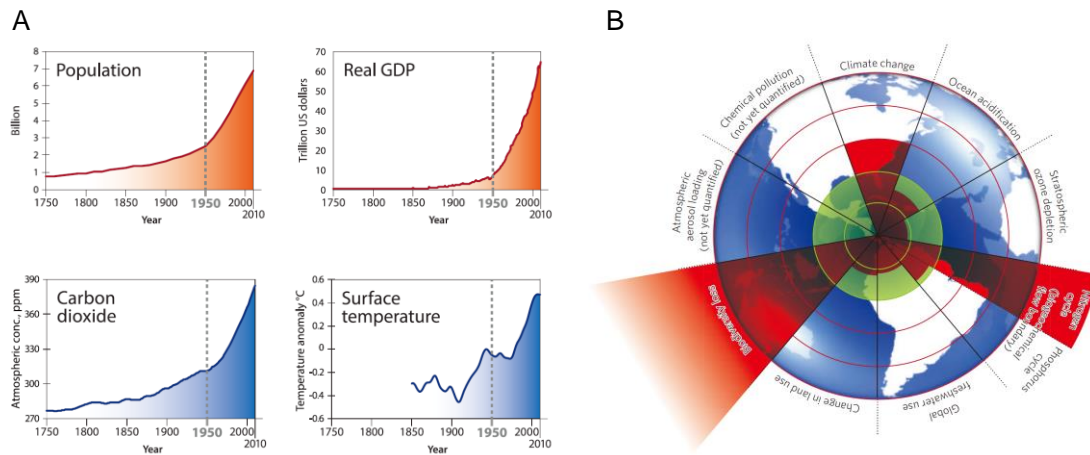


- 924 Collins, D. L., & Singer, T. (2017). Structural plasticity of the social brain:  
 925 Differential change after socio-affective and cognitive mental training. *Science*  
 926 *Advances*, 12.
- 927 van der Linden, S. (2017). The nature of viral altruism and how to make it stick. *Nature*  
 928 *Human Behaviour*, 1(3), 0041. <https://doi.org/10.1038/s41562-016-0041>
- 929 Wackernagel, M., Hanscom, L., & Lin, D. (2017). Making the Sustainable Development  
 930 Goals Consistent with Sustainability. *Frontiers in Energy Research*, 5.  
 931 <https://doi.org/10.3389/fenrg.2017.00018>
- 932 Wade-Benzoni, K. A., Sondak, H., & Galinsky, A. D. (2010). Leaving a Legacy:  
 933 Intergenerational Allocations of Benefits and Burdens. *Business Ethics*  
 934 *Quarterly*, 20(1), 7–34.
- 935 Watanabe, T., Takezawa, M., Nakawake, Y., Kunimatsu, A., Yamasue, H., Nakamura,  
 936 M., Miyashita, Y., & Masuda, N. (2014). Two distinct neural mechanisms  
 937 underlying indirect reciprocity. *Proceedings of the National Academy of*  
 938 *Sciences*, 111(11), 3990–3995. <https://doi.org/10.1073/pnas.1318570111>
- 939 World Bank. (2020). *Global Economic Prospects, June 2020*. DOI:  
 940 10.1596/978-1-4648-1553-9.
- 941 Wu, X., Lu, Y., Zhou, S., Chen, L., & Xu, B. (2016). Impact of climate change on  
 942 human infectious diseases: Empirical evidence and human adaptation.  
 943 *Environment International*, 86, 14–23.  
 944 <https://doi.org/10.1016/j.envint.2015.09.007>
- 945 Xiang, T., Lohrenz, T., & Montague, P. R. (2013). Computational substrates of norms  
 946 and their violations during social exchange. *The Journal of Neuroscience: The*  
 947 *Official Journal of the Society for Neuroscience*, 33(3), 1099–1108a.

948 <https://doi.org/10.1523/JNEUROSCI.1642-12.2013>  
949 Zatorre, R. J., Fields, R. D., & Johansen-Berg, H. (2012). Plasticity in gray and white:  
950 Neuroimaging changes in brain structure during learning. *Nature Neuroscience*,  
951 *15*(4), 528–536. <https://doi.org/10.1038/nn.3045>  
952  
953

954 **Figure legends**

955

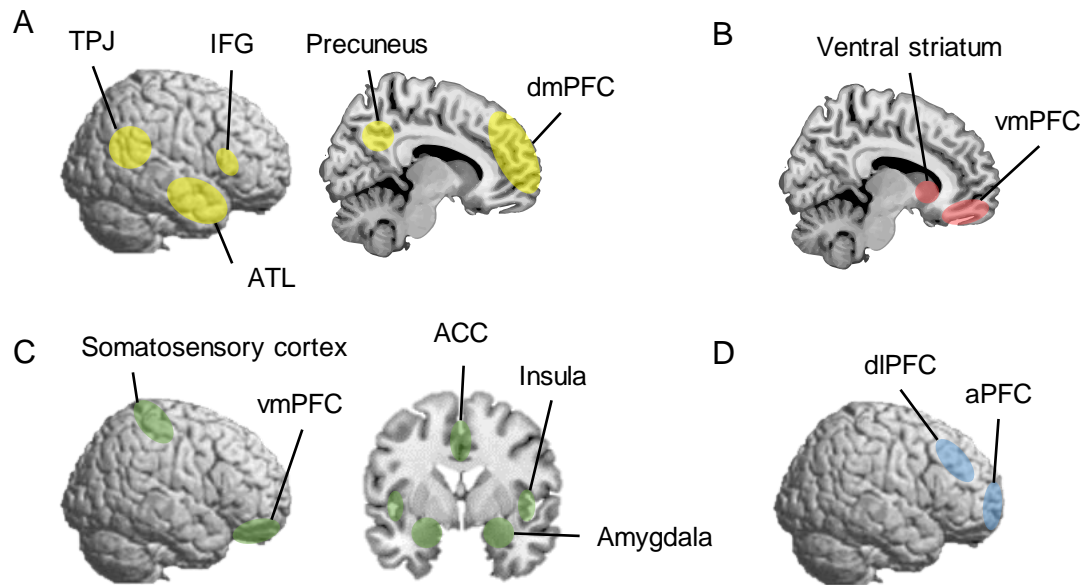


956

957 **Figure 1. Scientific facts about climate change**

958 A. Great acceleration. Increases in several socioeconomic indices (e.g., global  
 959 population and real GDP) have rapidly accelerated after 1950 (upper panels). Changes  
 960 in ecological indices (e.g., carbon dioxide in atmosphere and surface temperature)  
 961 mirror this acceleration (lower panels). For a broader coverage of socioeconomic and  
 962 ecological indices, see Steffen et al. (2015). Climate researchers generally agree with  
 963 high confidence that the recent climate change is caused by human activity (IPCC,  
 964 2014). B. Planetary boundaries. Crossing certain biophysical thresholds may induce  
 965 irreversible changes in the Earth's environment and endanger sustainability of humanity.  
 966 The green area represents "safe operating space." The figure illustrates that human  
 967 activity is approaching to or has already crossed the threshold in several domains of the  
 968 Earth's ecosystem. The figures are adapted with permission from Steffen et al. (2015)  
 969 and Rockström et al. (2009).

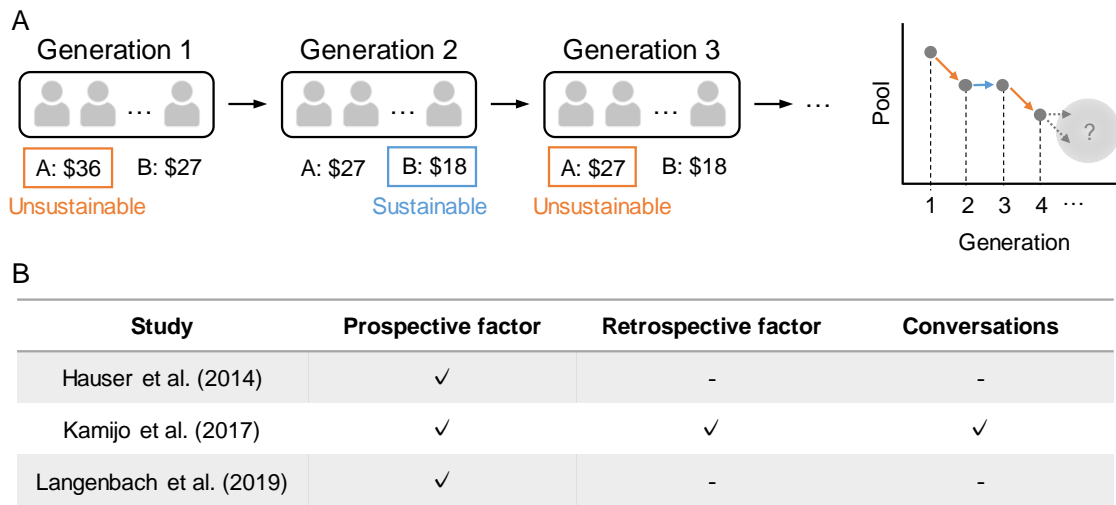
970



971  
 972 **Figure 2. Possible neural substrates for intergenerationally-sustainable**  
 973 **decision-making**

974 A. Brain regions implicated in theory of mind (based on Schurz et al., 2014). B. Brain  
 975 regions implicated in value-based decision-making and reward processing (based on  
 976 Bartra et al., 2013). C. Brain regions implicated in affective empathy (based on Decety  
 977 et al., 2016). D. Brain regions implicated in intertemporal decision-making and  
 978 self-control (based on Crockett et al., 2013). Note that some regions appear in multiple  
 979 panels (e.g., vmPFC), because a single brain region is often involved in multiple  
 980 cognitive processes. TPJ: temporoparietal junction; IFG: inferior frontal gyrus; dmPFC:  
 981 dorsomedial prefrontal cortex; vmPFC: ventromedial prefrontal cortex; ACC: anterior  
 982 cingulate cortex; dlPFC: dorsolateral prefrontal cortex; aPFC: anterior prefrontal cortex.

983



984

985

**Figure 3. Behavioral economic games**

986

A. Illustration of a typical economic game (Kamijo et al., 2017) designed to study

987

intergenerationally-sustainable decision-making. A group of players represents a

988

generation, and makes a collective decision that involves an

989

intergenerational-sustainability dilemma (e.g., a trade-off between the current and future

990

generations' benefits). The decision made by the current generation influences

991

subsequent (i.e., future) generations but not previous (i.e., past) generations, reflecting

992

the asymmetry of time in the real world. In this example, Generation 2 chooses the

993

sustainable option, whereas Generation 1 and 3 choose the unsustainable option (which

994

reduces the resources in the intergenerational common pool). B. Comparison among

995

different games (Hauser et al., 2014; Kamijo et al., 2017; Langenbach et al., 2019).

996

“Prospective factor” indicates whether players are informed about how their decisions

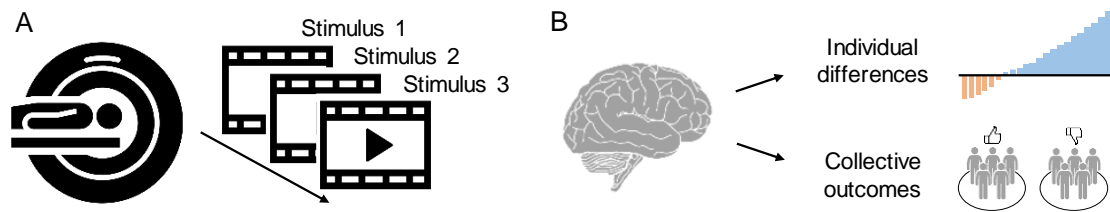
997

affect future generations. “Retrospective factor” indicates whether players are informed

998

about the history of decisions made by past generations.

999



1000

1001

**Figure 4. Predicting real-world outcomes from neural data**

1002

A. Participants are presented with naturalistic stimuli (e.g., movie clips that deliver

1003

messages promoting sustainable behavior or political announcements on sustainable

1004

policies) while their brain activity is measured. B. Patterns of neural responses (e.g.,

1005

local activation, functional connectivity, and inter-subject correlation) could be related

1006

to either individual differences (e.g., behavioral changes induced by certain treatments)

1007

or collective outcomes (e.g., population-level responses to certain treatments).

1008

Short-term (immediate) and long-term (persistent) effects of a given treatment could be

1009

associated with differential patterns of neural responses.