

1 Governance Planning for Sustainable 2 Oceans in a Small Island State

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11 Abstract

12 Promoting the UN Sustainable Development Goals (SDGs) will require aligning government institutions
13 and must contend with the often siloed nature of institutions within organizations, making the
14 identification of cooperative institutional networks that promote SDGs a priority. We develop and apply
15 a method which combines SDG interlinkage analysis, which helps determine priorities and prerequisites
16 for SDG attainment, with the transition management framework, which aligns policy goals with
17 institutional designs and programs. Using Aruba as a model case study of a small island state with a
18 planning committee for SDG 14 and a current economic reliance on marine tourism, we show that
19 prioritizing increased benefits to SIDS from sustainable development of marine resources includine
20 tourism (SDG 14.7) provides the most direct co-benefits to other SDGs. When considering indirect co-
21 benefits, reducing marine pollution (SDG 14.1) emerged as an key supporting target to achieve other
22 important ocean targets. In order to support sustainable ocean development, we show that Aruba
23 depends on international support through mitigating climate change (SDG 13) and developing
24 international partnerships (SDG 17) as well as promoting sustainable economies (SDG 8), terrestrial
25 conservation (SDG 15), building strong institutions (SDG 16) and promoting sustainable consumption
26 and production practices (SDG 12) domestically. Using SDG interlinkages as a guide for institutional
27 cooperation, we find that the Aruban institutions with the most potential to coordinate action for
28 sustainable ocean development are those that coordinate economic, social, and international policy,
29 rather than institutions specifically focused on environmental policy. Our results provide insight for
30 sustainable development planning across small island states where ocean resources are key for
31 development priorities.

32 Introduction

33 The UN Sustainable Development Goals (SDGs) were envisioned as interrelated, recognizing the deeply
34 connected world we live in and that a transition to a sustainable society requires complementary
35 dynamics across natural, social, economic, and governance domains (UN 2015). However, the

36 development of planning protocols for strategically achieving the SDGs is elusive, and an emerging
37 major research theme in sustainability science is determining appropriate governance structures to
38 achieve such multi-attribute goals in the face of complex systems (Rotmans et al. 2016; Singh 2020). A
39 governance system dedicated to sustainable development must be organized to act in an
40 interconnected way, regulating the specific linkages among and within domains to promote co-benefits
41 and mitigate trade-offs among SDGs. Here, we propose and implement a governance planning
42 framework to strategically align policy priorities and governance actors to achieve the SDGs.

43 Siloed policy prescriptions that fail to adopt integrated perspectives across social-ecological systems can
44 be ineffective or counterproductive (Singh et al. 2017), as sustainable development requires cross-scale
45 and, importantly, for operational planning, cross-institutional cooperation (Rotmans et al. 2016;
46 Biermann et al. 2017). As an example of failing to integrate across social-ecological dimensions, policies
47 focused on protecting and growing natural capital can backfire if they enhance social inequalities and
48 ultimately undermine the legitimacy of institutions to resource users (Christie 2004). The importance of
49 social and governance considerations in effective, sustainable development projects is a particularly
50 important issue for the ocean and coastal systems where the top-down enforcement of large ocean
51 spaces can be capacity-limited and voluntary compliance is often essential (Gill et al. 2017). Conversely,
52 policies to decrease social inequity in resource-dependent communities can fail if policies do not
53 adequately account for resource supply and dynamics, such as when capacity-enhancing subsidies are
54 used to support fishing communities, and this contributes to long-term fisheries decline and collapse
55 (Cisneros-Montemayor et al. 2020). Though our comprehension and ability to represent the complexity
56 that underlies sustainability is increasing, our ability to translate this into effective policy planning and
57 implementation remains elusive.

58 Our planning method builds on and integrates the transition management framework and literature on
59 SDG interrelationships, two fields that are influential in sustainability studies but have thus far not been
60 integrated. Here, we focus on two scales within the transition management framework, i) strategic
61 scales – the priorities set at the level of values and visions, and ii) tactical scales – the institutions and
62 organizations mandated to achieve the visions (Loorbach 2007; Rotmans et al. 2016). The transition
63 management framework focuses on coordinating these multiple levels to increase the probability of
64 achieving desired outcomes and reduce the likelihood of misaligned and counterproductive results. The
65 SDG interrelationships research has been conducted across multiple countries and SDG areas, mainly
66 focusing on identifying synergies or trade-offs among SDGs, and the context in which they may occur.
67 (Nilsson et al. 2016; ICSU 2017; Nilsson et al. 2018; Singh et al. 2018). The transition management
68 framework thus provides a structure to plan sustainable development governance, and SDG interlinkage
69 analysis can “map out” the operating space that a governance system will need to function in (Singh
70 2020). We specifically focus on interlinkage frameworks first trialed for the ocean, that emphasize
71 categorical differences in kinds of interlinkages, and rely on structured expert elicitation and literature
72 review (Singh et al. 2018). We used a transdisciplinary approach combining academic methodologies
73 and local knowledge holders from Aruban civil service and local nonprofits. The categories of the
74 interlinkage framework differentiate where relationships among SDG targets are co-benefits or trade-offs,
75 where a target is a pre-requisite for another or if it is optional for another, and where a relationship
76 holds regardless of context or not. In this study, we identify the SDG targets that government agencies
77 are responsible for and devise collaborative institutional networks to regulate and manage the critical

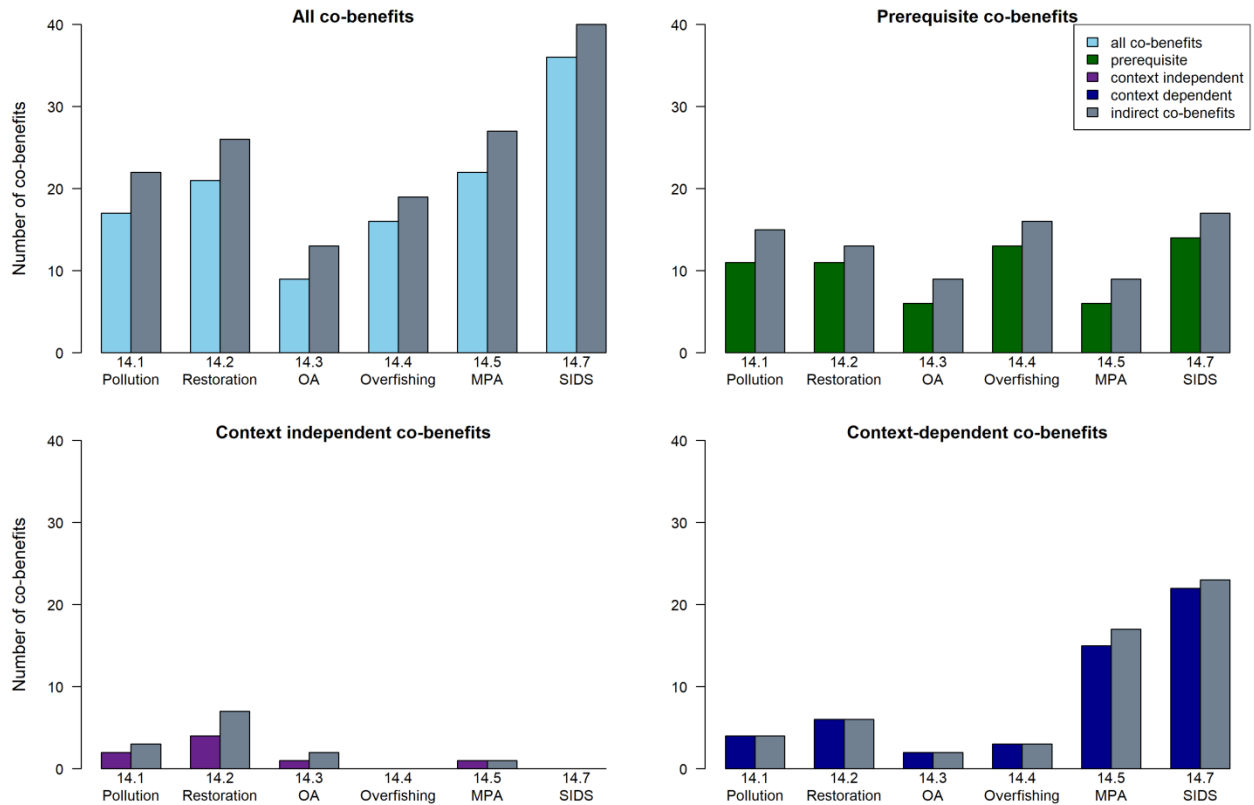
78 areas that promote or hinder specific SDG Ocean targets. The resulting network represents a new
79 governance system organized around prioritized SDGs and their interconnections.

80 We develop this planning method for sustainable development planning in Aruba, a Small Island
81 Developing State (SIDS) prioritized within SDG 10 focussing on equality across countries and within SDG
82 14 focusing on sustainable marine development. Additionally, Aruba has established a government
83 commission (SDG Commission of Aruba) to develop guidance towards achieving the SDGs in the country
84 by forming partnerships across government, non-governmental organizations, and private industry.
85 Around 99% of Aruba's total territory is ocean, which is central to Aruban culture and generates 90% of
86 economic activity through coastal tourism (Vaslet and Renoux 2016). Unsurprisingly, the Aruba SDG
87 commission has prioritized SDG 14: Life Below Water (the 'Oceans' Goal) as the SDG area of most
88 importance for directing national "Blue Economy" plans, and is the SDG topic that disproportionately
89 impacts Aruban industries and culture. Aruba's structured planning for the SDGs makes Aruba a model
90 study country to develop processes to help structure policy and governance systems to promote
91 sustainable development, especially for sustainable development planning in other SIDS.

92 Results

93 Prioritizing Ocean Targets

94 All ocean SDG targets have direct relationships across other SDGs, except for SDG 14.6: eliminating
95 harmful and capacity enhancing fisheries subsidies. Aruba did not provide capacity enhancing fishing
96 subsidies, so no additional consequences were expected from acting on this target. A supermajority of
97 experts identified no trade-off relationships from achieving any SDG ocean targets. Economic benefits to
98 SIDS (SDG 14.7) are associated with the largest number of co-benefits to other SDGs, including the
99 largest number of prerequisite and co-benefits/optional/context-dependent relationships, even when
100 including indirect relationships determined through IO models (Figure 1).

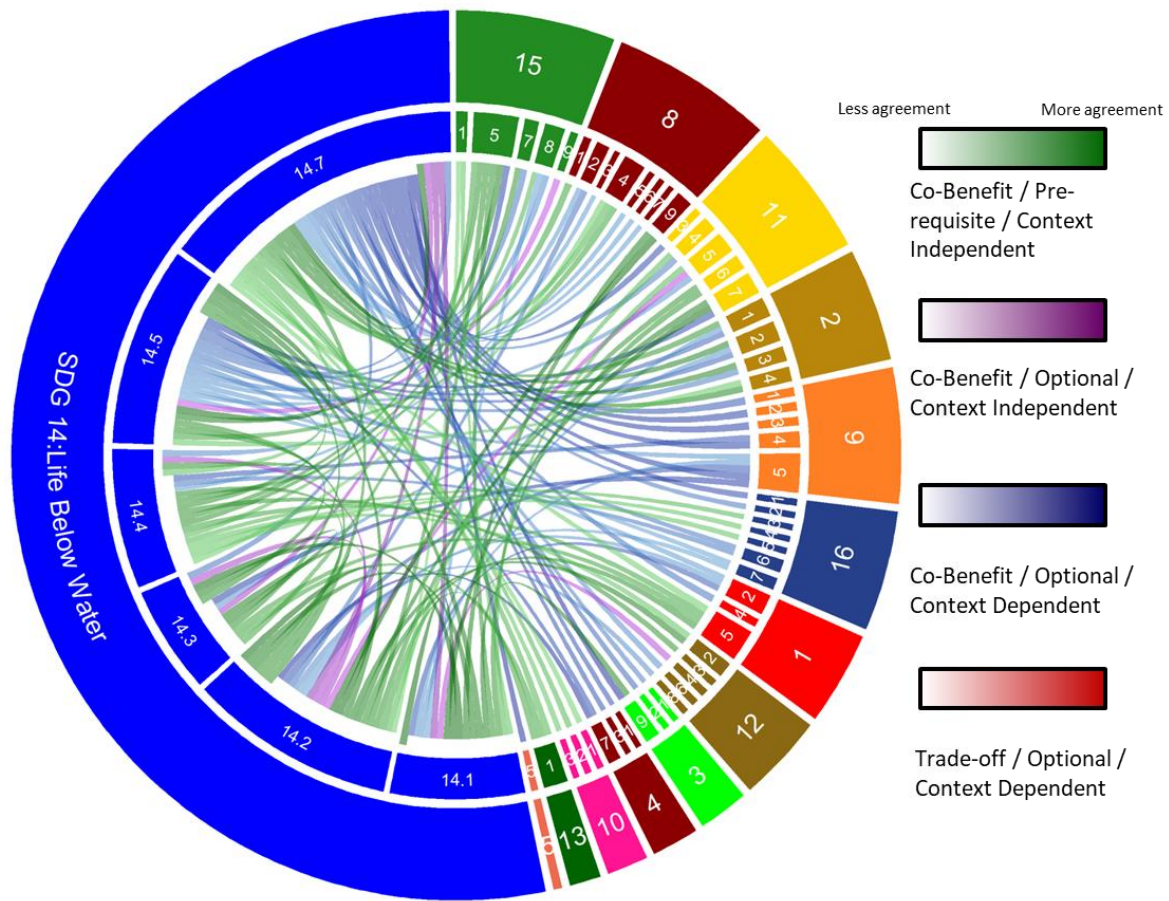


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102 Figure 1. The number of direct co-benefits from each SDG ocean target across all SDGs, and the total
 103 (direct + indirect) co-benefits of each SDG ocean target to all SDGs. This figure does not indicate the
 104 relationship from other SDGs to SDG ocean targets.

105

106 For Aruba, increasing economic benefits to SIDS (SDG 14.7) has direct co-benefits across the largest
 107 number of other SDGs (Figure 2), followed by protecting marine areas (SDG 14.5), restoring marine
 108 ecosystems (SDG 14.2), and reducing marine pollution (SDG 14.1). This pattern also holds when
 109 considering total co-benefits including indirect relationships (Figure 1). Experts determined that all SDG
 110 14 targets benefit from other SDG 14 targets being achieved. SDGs 1 (ending poverty), 15 (life on land),
 111 and 14 (life below water) are the only SDGs that benefit from co-beneficial relationships from all SDG
 112 Ocean targets (besides SDG 14.6). Experts indicated that governance context (e.g., policy
 113 implementation) was the most prominent factor regulating whether context-dependent co-benefits
 114 were realized (Figure S1).



115

116 Figure 2. Characterized relationships from SDG Ocean targets to all other SDGs. The width of the nodes
 117 indicates the number of relationships originating from or receiving relationships. The origin of a
 118 relationship between SDG targets are indented, and the receiving end of the relationship extends out
 119 further. Different colors represent different kinds of relationships, and darker shades represent greater
 120 agreement among experts. SDGs are ordered by the number of relationships received by SDG Ocean
 121 targets, with the SDG with the highest number of receiving co-benefits at the top of the figure and
 122 following SDGs ordered clockwise from there. Only relationships with at least 2/3 agreement are shown.

123

124 Though increased economic benefits to SIDS (SDG 14.7) was determined to be the most important SDG
 125 Ocean target producing co-benefits to other SDGs, through IO models we determined that reducing
 126 marine pollution (SDG 14.1) contributes the most towards SDG 14.7 co-benefits among the SDG Ocean
 127 targets, considering interdependencies among SDG 14 targets (Table S1). We also found that reducing
 128 marine pollution is important in contributing to co-benefits from marine protection (SDG 14.5) and
 129 restoration (SDG 14.2) (Table S1). In particular, reducing marine pollution is the most important
 130 prerequisite for producing co-benefits through marine restoration (SDG 14.2), reducing acidification
 131 impacts (SDG 14.3), and marine protection (SDG 14.5) (Table S2). Proper governance context (e.g., the

132 implementation of policy) was considered as the most prominent factor in regulating whether a co-
133 benefit/optional/context-dependent relationship was realized (Figure S1).

134 [Prioritizing SDGs for the Oceans](#)

135 While the previous analysis revealed the SDG Ocean targets that can contribute to all other SDG targets
136 (directly and indirectly), the SDG Ocean targets also benefit from other SDG targets (Figure 3). Aruba's
137 ability to mitigate impacts from ocean acidification (SDG 14.3) benefitted from the largest number of co-
138 benefits (including global efforts to address climate change, SDG 13), followed by marine restoration
139 (SDG 14.2), marine pollution (SDG 14.1), economic benefits to SIDS (SDG 14.7), and eliminating
140 overfishing (SDG 14.4). Importantly, marine restoration (SDG 14.2), mitigating impacts from ocean
141 acidification (SDG 14.3), and reducing marine pollution (SDG 14.1) require a large number of other SDGs
142 to be achieved (each benefit from ten or more prerequisite co-beneficial relationships). In contrast, the
143 remaining SDG Ocean targets require fewer other SDG targets to be achieved (each requiring five or
144 fewer SDG targets to be achieved). Finally, restoring marine habitats (SDG 14.2), reducing impacts from
145 ocean acidification (SDG 14.3), reducing marine pollution (SDG 14.1), and eliminating overfishing (SDG
146 14.4) received tradeoff relationships.

147 Agreed on by a supermajority of experts, 11 of the 17 SDGs have co-beneficial relationships with the
148 SDG ocean targets (Figure 3). Overall, SDG Ocean targets have the most co-beneficial relationships
149 among each other. Besides SDG Ocean targets, international climate action (SDG 13) and international
150 partnerships (SDG 17) having the most and second most co-beneficial relationships with the SDG Ocean
151 targets. Jobs and economy (SDG 8), conserving life on land (SDG 15), peace, justice, and strong
152 institutions (SDG 16), and sustainable consumption and production practices (SDG 12) also provide
153 many co-benefits for achieving ocean targets. Less prominent (in terms of the number of co-benefits)
154 were sustainable cities and communities (SDG 11), resilient infrastructure (SDG 9), clean energy systems
155 (SDG 7), and clean water and sanitation (SDG 6). Experts also identified the top two co-beneficial SDGs
156 (climate action and international partnerships) as the most essential prerequisites across the SDG Ocean
157 targets that contribute the most benefits across SDGs (14.7 – sustainable marine development, 14.1 –
158 reducing marine pollution, 14.2 – marine restoration, and 14.5 – marine protection).

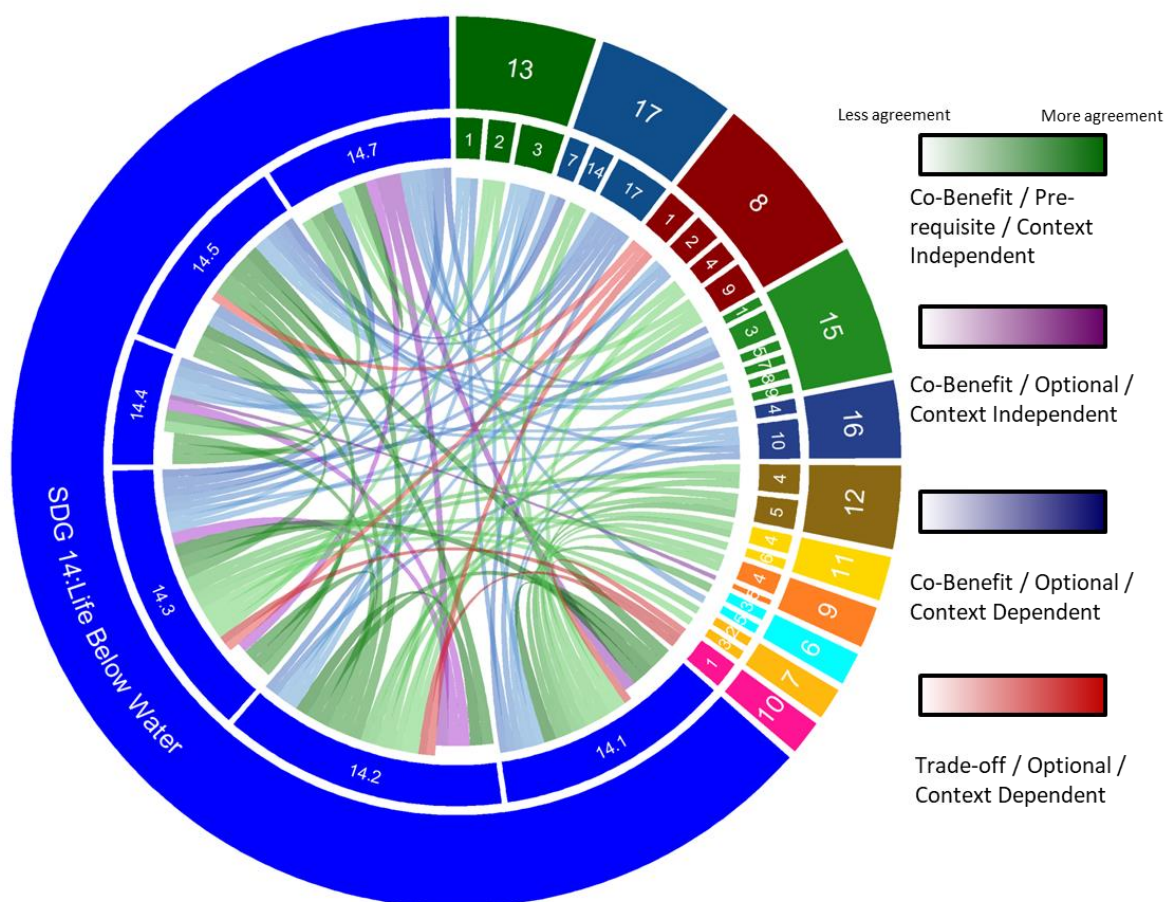
159 Ensuring sustainable consumption and production practices (SDG 12) and achieving decent jobs and
160 economic growth (SDG 8) have the largest number of prerequisite co-beneficial relationships with all
161 SDG Ocean targets. Sustainable cities and communities (SDG 11), conserving life on land (SDG 15),
162 international partnerships (SDG 17), sustainable infrastructure (SDG 9), clean energy (SDG 7), and clean
163 water and sanitation (SDG 6) also provided some co-benefit/prerequisite/context-independent
164 relationships with SDG Oceans targets. In particular, SDG Oceans targets are dependent on Aruban
165 economies developing resource efficiencies (SDG 8.4), promoting sustainable tourism (SDG 8.9),
166 reducing waste generation through reduction, recycling, waste prevention and reuse (SDG 12.5). While
167 no targets among SDG 16 (peace, justice, and strong institutions) were considered to be prerequisite for
168 SDG Ocean targets by a supermajority of experts, there was strong agreement among a supermajority
169 (agreement score 0.71) that achieving policy coherence (SDG 17.14) was a prerequisite condition for
170 reducing marine pollution and restoring marine habitats, and high agreement (agreement score
171 between 0.5 and 0.66) that it is a prerequisite condition for all other SDG Ocean targets.

172 Considering only co-benefit/optional/context-dependent relationships, international climate action
173 (SDG 13), international partnerships (SDG 17), peace, justice, and strong institutions (SDG 16), and

174 conserving life on land (SDG 15) provided the greatest number of relationships with SDG ocean targets.
 175 Other SDG Ocean targets, jobs, and economy (SDG 8), and clean water and sanitation (SDG 6) also
 176 provided context-dependent co-benefits with SDG Ocean targets. Experts indicated that governance
 177 context (e.g., policy implementation) was the most prominent factor regulating whether context-
 178 dependent co-benefits were realized (Figure S2).

179 Agreed on by a supermajority of experts, only two SDGs produced tradeoff/optional/context-dependent
 180 relationships with SDG Oceans targets: jobs and economy (SDG 8) and reducing inequalities (SDG 10).
 181 Sustaining per capita economic growth (SDG 8.1) and progressively achieving income growth of the
 182 bottom 40% of the population above national averages (SDG 10.1) were the two SDG targets with
 183 potential tradeoffs with minimizing ocean pollution (SDG 14.1), marine restoration (SDG 14.2),
 184 mitigating ocean acidification impacts (SDG 14.3), and effectively protecting marine areas (SDG 14.5). As
 185 with co-benefits, experts indicated that the governance context was the most prominent factor
 186 regulating whether tradeoffs could be avoided (Figure S2).

187



188
 189 Figure 3: Characterized relationships between all SDGs and SDG Ocean targets. The width of the nodes
 190 indicates the number of relationships originating from or receiving connections. Different colors

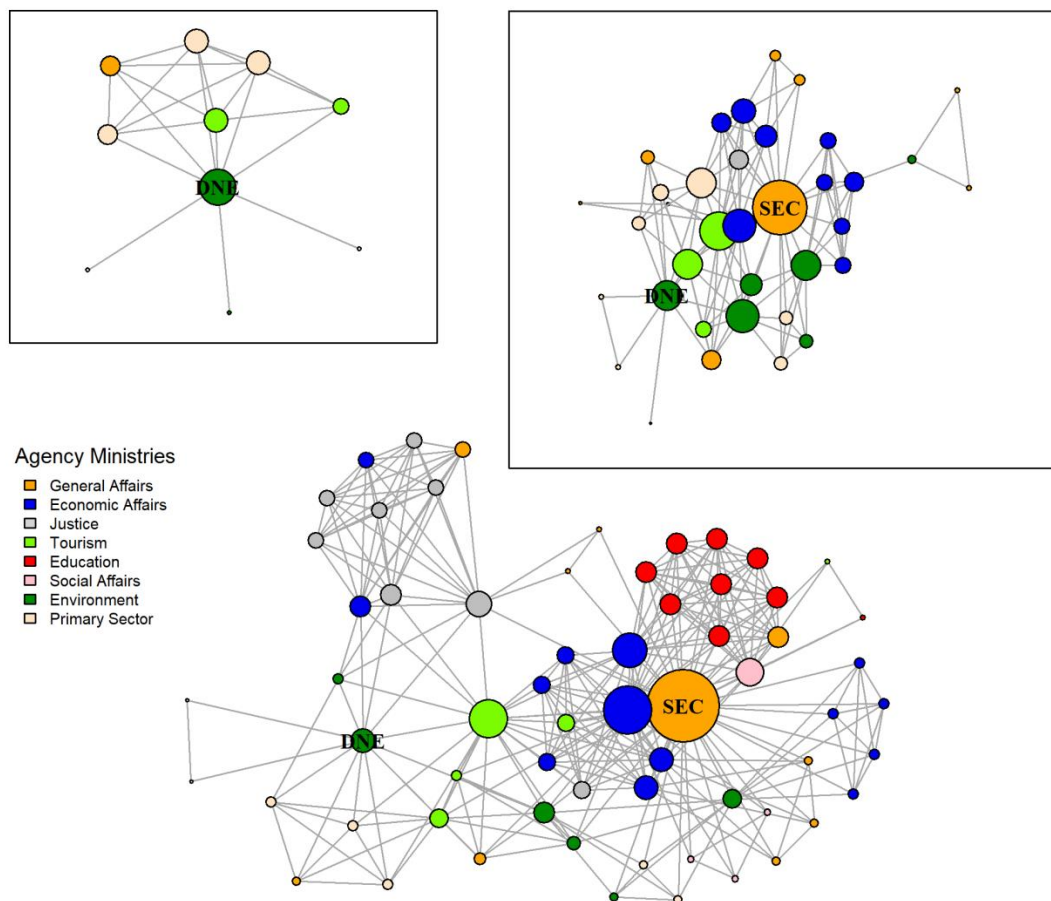
191 represent different kinds of relationships, and darker shades constitute greater agreement among
192 experts. SDGs are ordered by the number of co-benefits generated from each SDG to SDG Ocean
193 targets, starting from the top of the figure and moving clockwise. Only relationships with at least 2/3
194 agreement are shown.

195 Institutional Design

196 In a scenario where Aruban institution structure is guided by direct regulation of SDG ocean targets (no
197 SDG relationships guide design), ten agencies must coordinate (Figure 4). The Directorate of Nature and
198 Environment (DNE) is directly responsible for helping to regulate all SDG Ocean targets and is also
199 connected to the largest number of other institutions (9) also responsible for regulating SDG ocean
200 targets. Using a battery of network centrality measures to calculate the most important institution in
201 this scenario (assuming agency importance to be determined by the most connected agency), we find
202 that all the centrality measures indicate that the DNE is the most important institution to coordinate
203 achievement of the SDG Ocean targets (see Figure S4 and Table S7).

204 In a scenario where Aruban institution structure is guided by considerations of prerequisite relationships
205 where SDG Ocean targets require other SDG targets, 34 Aruban agencies must coordinate (Figure 4).
206 While the DNE is the only Aruban agency directly responsible for all the SDG Ocean targets in this
207 scenario, the Social and Economic Council (SEC) is directly responsible for the largest number of SDG
208 targets that are prerequisites for the SDG Ocean targets (6 SDG targets that are prerequisites).
209 Additionally, in this scenario, the SEC is connected to the largest number of other institutions (20) to
210 collaboratively regulate progress on all SDG targets needed to achieve SDG Ocean targets. Assuming
211 agency importance to be determined by the most connected agency, all the centrality measures indicate
212 that the SEC is the most important institution to coordinate the achievement of the SDG Ocean targets
213 (see Figure S5 and Table S8).

214 If the institutional structure is instead determined by considerations of all SDG relationships, including
215 gaining from all co-beneficial relationships and avoiding the potential of tradeoffs, 66 agencies must
216 coordinate (Figure 4). Similar to the last scenario, while the DNE is directly responsible for all SDG Ocean
217 targets, the SEC is responsible for the largest number of SDG targets that affect SDG Ocean targets (13
218 SDG targets), and centrality measures again indicate the SEC as the most important institution to
219 coordinate achievement of the SDG Ocean targets (coordinating 42 other agencies, see Figure S6 and
220 Table S9).



221
 222 Figure 4. Network diagrams of the institutional structures needed to manage SDG Ocean targets,
 223 considering only direct management (upper left inset), considering the SDG targets with co-
 224 benefit/prerequisite/context-independent relationships with SDG Ocean targets (top right inset), and
 225 considering all SDG target relationships (main figure). The size of the institute nodes is proportional to
 226 how many nodes each institution is linked to within each scenario. The Directorate of Nature and
 227 Environment (DNE) and the Social and Economic Council (SEC) are labeled in each scenario (though SEC
 228 is not part of the direct management scenario).

229 **Discussion**

230 Although we find that sustainable marine use (SDG 14.7) directly contributes the most co-benefits to
 231 achieving the SDGs overall in Aruba, considering indirect and cascading contributions shows reducing

232 pollution (SDG 14.1), restoring marine ecosystems (SDG 14.2), and marine protection (SDG 14.3) are also
233 important in providing diverse co-benefits across the SDGs. However, we also determine that these
234 same SDG Ocean targets receive the most co-benefits from achieving other SDGs. Importantly, these
235 SDG Ocean targets are most dependent (as determined by assessing prerequisite relationships) on
236 achieving other SDGs (including consumption and production systems and economic transformation,
237 SDGs 12 and 8, respectively) being realized. In consequence, we found that the most crucial Aruban
238 institution for coordinating regulations to achieve sustainable oceans was not an environmental agency
239 but a socioeconomic agency (the Social and Economic Council). Therefore, while our investigation into
240 the cascading roles of SDG Ocean targets show that environmentally focused targets underpin some of
241 the more economic goals – and in some ways support the frameworks for “environment-based”
242 sustainable development (Griggs et al. 2013; Reid et al. 2017) – we also found evidence against linear
243 models of sustainable development and particularly in an operational context. That is, it may not be
244 enough to consider the natural environment as the base of social and economic pillars of sustainable
245 development, but to consider reflexive or circular models whereby environmental pillars are dependent
246 on social and economic goals as well (Robinson 2004; Singh 2019).

247 Governance Planning in Small Island States

248 We found that the non-ocean SDGs with the highest number of co-benefits with SDG Ocean targets are:
249 climate action (13), international cooperation (11), peace, justice, and strong institutions (10), land
250 conservation (8), decent work and economic growth (8), and sustainable consumption and consumption
251 (6). These results showcase how important global cooperation is for Aruba to achieve ocean sustainable
252 development, given the scale of some key drivers of ocean environmental sustainability and industries
253 and the relative ability of small islands to mitigate their impacts. Aruban efforts to increase ocean
254 sustainability may significantly benefit by increased engagement in international diplomacy for climate
255 mitigation and international capacity development and technology transfer to Aruba (Keohane and
256 Victor 2016). Global efforts to address global ocean change and promote conditions necessary for
257 sustainable development are likely needed across multiple small island states (Bennett et al. 2019), and
258 such states have indeed taken initiatives to plan contextually appropriate actions and establish their
259 own needs and terms for international support (Keen et al. 2018). Proposals for a ‘Blue Economy’ that is
260 focused on self-identified goals and socially equitable and sustainable ocean industries could be a path
261 forward for national plans of small islands (who coined the term) and for global ocean development
262 (Cisneros-Montemayor et al. 2019). However, our results imply that lack of inclusive international action
263 may stall or even prevent sustainable ocean development in small island states (Bennett et al. 2019;
264 Cisneros-Montemayor et al. 2019).

265 Only two SDGs were thought to produce tradeoffs with SDG Ocean targets (SDG 8.1 – economic growth,
266 and SDG 10.1 – income growth for the bottom 40% of the population), and these were all
267 tradeoff/optional/context-dependent, meaning that they can be avoided. These relationships are
268 important to consider for policy coherence because if they are not held in check, they could destabilize
269 progress on SDG Ocean targets. Experts indicated governance, economic, and social context regulated
270 whether these relationships would be tradeoffs or not. In particular, they pointed to where investment
271 was directed (whether primary, secondary, or tertiary economic sectors were invested in for economic
272 and income growth), whether policies enforcing waste reduction, recycling, and cleaner production
273 practices were followed, and whether cleaner consumption practices could be encouraged and
274 followed. Given that Aruba has seen significant economic benefits from oil and gas refining in the near

275 past, as well as the construction of desalinization processing, Aruba may choose to reinvest economic
276 opportunities in these industries. The existing infrastructure and immediate economic promises (income
277 and employment) of these industries may provide too important for Aruba to avoid in the future.
278 Though tradeoffs between economic growth and sustainable ocean development may have the
279 potential to be avoided does not mean they are easy to avoid, and Aruba may have to accept the
280 compromises and make decisions on which SDG target is more important. Scientific analysis has an
281 important role to play here in helping inform evidence-based policy decisions.

282 [Designing Governance Institutions to Maximize the Potential of SDG Relationships](#)

283 For societies emphasizing the SDGs, institutional designs that increase the probability of SDGs being
284 achieved are relevant (Loorbach 2007; Singh 2020). We find that there are very different potential
285 institutional networks to support SDG Ocean targets in Aruba depending on whether SDG relationships
286 are considered or not, whether only co-benefit/prerequisite relationships are considered (the
287 connections required to achieve the priority desired SDGs), or whether all links are considered including
288 tradeoffs and co-benefits. Designing these institutional arrangements, however, requires an
289 understanding of which relationships exist and where, as well as the institutional flexibility to rearrange.

290 Achieving specific sustainable development goals will require active collaboration on the part of
291 governance institutions to contribute to the specific targets directly as well as promote co-beneficial
292 SDG targets (Kemp et al. 2005; Loorbach 2010). At the very least, the co-benefit/prerequisite/context-
293 independent relationships are needed to achieve the specific SDG targets, but avoiding or mitigating
294 tradeoffs can be critically important. We found that if SDG relationships were not considered,
295 governance institutions commonly associated with ocean management – for Aruba, this is the
296 Directorate of Nature and the Environment – was responsible for the most SDG ocean targets and also
297 most connected with other governance institutions. This scenario – with ocean and environment
298 agencies specifically regulating ocean use without clear collaboration with other economic and social
299 agencies – is a common system of ocean governance and management around the world (Halpern et al.
300 2010; Singh et al. 2020). However, when SDG relationships that support the SDG Ocean targets were
301 considered, then governance institutions not commonly associated with ocean sustainability – for
302 Aruba, this is the Social and Economic Council – was responsible for collaboratively connecting with the
303 largest number of other institutions in order to achieve sustainable ocean development. Given the
304 effects that economic development has on the ocean (through pollution, coastal development, and
305 others) and the growing recognition of the importance of the land-sea interface (Halpern et al. 2008;
306 Cottrell et al. 2019), we believe that similar situations may exist around the world – where economic
307 and social agencies can play central roles to ensure ocean sustainability. Designing an integrative and
308 coherent policy for ocean sustainability will require an explicit consideration of which institutions have
309 responsibilities across the suite of sustainable ocean targets, and which institutions are most centrally
310 collaborative across relevant institutions to collaboratively achieve sustainability goals.

311 The methodology in this study directly addresses the imperative need for institutional and program
312 integration as we increasingly recognize the need for cross-scale and multidisciplinary development
313 goals. This method may eventually require a re-imagining of institutional purviews and relationships but,
314 given historical institutional architectures and inertia, in practice, this implies in the short-term an
315 increased awareness of the implications of progress within one institutions' mandate on the outcomes
316 of another' (Loorbach 2010; Munck af Rosenschöld et al. 2014). Raising awareness of policy coordination

317 among institutions has been documented to be essential, though an insufficient component of
318 successful development policy, especially awareness-raising in institutions not traditionally considered
319 as development agencies (CEC 2009). The fundamental benefit of the approach in this study is thus its
320 explicit focus on co-creating a formal and highly detailed map of diverse policy mandates, the
321 institutions tasked with achieving them, and all of the relationships between them. Though our study
322 considered the SDG targets as written, this approach can be used for different interpretations of
323 sustainable development aspirations and policy as well. This approach, in effect, provides a high-level
324 vantage point of the governance operating space within which other methods can add more specific
325 actionable information. These methods can include strengths, weaknesses, opportunities, and threats
326 (SWOT) analysis, which focuses on within-group (or institution) capacity (Freire-Gibb et al. 2014), marine
327 spatial planning (MSP) to allocate and prioritize ocean space (Douvere 2008), and network analysis to
328 identify key stakeholders for implementing specific management strategies (Farmery et al. 2020).

329 As reflected in our results, governing transitions to sustainable oceans will likely require cohesive
330 planning among multiple governance institutions, which will introduce new challenges (Loorbach 2007;
331 Rotmans et al. 2016). We found that working towards SDG Ocean targets considering all SDG
332 relationships required collaboration across sixty-six institutions in eight ministries. Just accounting for
333 prerequisite, co-beneficial links required cooperation across thirty-four institutions in six ministries. By
334 contrast, only considering SDG Ocean targets directly (most like current ocean planning) required
335 collaboration across ten institutions in 2 ministries. Many governance institutions are siloed and are
336 concerned with institutional boundaries and responsibilities, so creating new collaborative structures
337 could be very difficult (Halpern et al. 2010; Fulton et al. 2014), however without bridging these
338 boundaries society's ability to achieve the SDGs may be limited or even impossible (as defined by
339 prerequisite relationships). Our scenario approach links all governance institutions with the
340 responsibility to a given SDG target (whether an SDG Ocean target or a target with a relationship to SDG
341 Ocean targets), knowing that having a full complement of links is unlikely. However, our emphasis was
342 to highlight the institutions with the greatest potential to connect with and collaborate across
343 institutions, given the goal of achieving the SDG Ocean targets. An alternative approach would be to
344 map the existing formal and informal connections between governance institutions and plan networks
345 of governance institutions to take advantage of existing relationships. However, this would be a
346 different aim from ours. Our study demonstrates a framework that delivers on the promise of SDG
347 interlinkages helping governments and agencies plan to address SDGs (Stafford-Smith et al. 2017; Singh
348 2020).

349 Conclusions

350 If transitioning to a sustainable future requires initiatives that work across social-ecological dimensions,
351 then nations around the world need to design coherent and integrative policy and collaborative
352 institutional structures to act across social-ecological dimensions. We argue that research needs to
353 move beyond merely identifying linkages (Singh 2020), towards aiding governance planning frameworks
354 such as the transition management framework to inform how governance institutions are related to
355 each other and can collaborate towards the SDGs. We show that, given the inherent bi-directional
356 nature of SDG relationships, prioritization of SDGs needs to consider the indirect contribution of SDGs
357 towards other SDGs. Additionally, despite research showing the contribution of the ocean towards other
358 SDGs (Singh et al. 2018), the SDG Ocean targets are dependent on a diverse set of SDGs.

359 Contrary to some arguments in the sustainable development literature, we find little evidence that the
360 relationship between environmental, social, and economic dimensions are linear and directional (with
361 the environment at the base) as has been proposed elsewhere (Folke et al. 2016; Reid et al. 2017).
362 Instead, we find evidence that while environmental targets influence social and economic dimensions,
363 they are themselves influenced by social and economic aspects—and policy goals—in a reflexive causal
364 structure (Robinson 2004; Singh 2019). Other proposed principles of sustainable development, that
365 highlight the existence of complex interrelationships (Roe 2012), the ability to resist shocks (Folke et al.
366 2002), and the need for a strategy to move from current conditions to preferred future conditions
367 (Broman and Robèrt 2017), are helpful but themselves not enough for effective planning. The SDGs can
368 be an aspirational as well as an operational set of guidelines, but the latter will require specific and
369 evidence-based connections between sustainability principles and governance planning to create
370 governance systems to achieve these goals.

371 Methods

372 Overview

373 This study follows three steps along the planning structure of the transition management framework.
374 First, we undertook an expert elicitation process to prioritize SDG Ocean targets based on each target's
375 contribution to other SDG targets, including direct, indirect, and cascading effects. Second, we
376 determine interrelationships between all other SDGs and SDG Ocean targets, paying particular attention
377 to SDG targets deemed necessary to achieve SDG 14 targets. This information effectively outlines the
378 strategic policy arena according to the transition management framework (Singh 2020) and indicates the
379 scope of social-ecological relationships that a governance system must be built around. Finally, we
380 identify the SDG areas that different Aruban government agencies are responsible for regulating action
381 towards and identify scenarios of institutional networks that are informed by SDG relationships. These
382 scenarios connect the strategic and tactical scales within the transition management framework (Singh
383 2020).

384 Aruba and the SDGs

385 Marine tourism is the main economic driver in Aruba. In 2018, total economic impacts (direct, indirect,
386 induced) from tourism were responsible for 98.3% of Aruba's GDP and 99.1% of total employment
387 (WTTC 2019). Revenue from tourism is used to pay for essential imports—including food and fuel—and
388 has raised the quality of life on the island, as measured by the Human Development Index (Ridderstaat
389 et al. 2016). Other (much smaller) industries on the island include other sectors of the ocean economy,
390 such as fisheries, wind energy, and desalinization plant, in addition to agriculture and an oil refinery.

391 Tourism has radically altered Aruba's coastline, with extensive hotel development along its west coast. A
392 large proportion of Aruba's island surface has been transformed for tourism infrastructure (Barendsen
393 et al. 2008). The recent development on the island has had consequences for Aruba's flora, with a
394 measured gradient of vegetation health related to distance from tourist density (Oduber et al. 2015).
395 Aruba's development to date has led to a need to address problems with marine pollution (SDG 14.1)
396 and coastal habitat loss (SDG 14.2), such as through mangrove removal. Ocean acidification (SDG 14.3)
397 affects marine life around Aruba, though there is little tourism based on charismatic marine habitats
398 such as coral reefs. Fisheries are a small industry in Aruba, and their management (SDG 14.4) is not seen
399 as a key challenge, and no capacity-enhancing subsidies are provided to fishers (in compliance with SDG

400 14.6). Aruba has a terrestrial national park that extends from its rugged north-eastern coast to the only
401 Ramsar site on the south-western coast. Since 2019 Aruba also has four multi-use protected areas, but
402 these protected areas do not extend into the ocean (SDG 14.5). Though marine tourism has such high
403 economic value, it currently is not necessarily sustainable (part of the focus of SDG 14.7) as tourism in
404 Aruba focuses on warm weather and clean, sandy white beaches instead of a healthy marine ecosystem.

405 Expert Elicitation Process

406 A workshop was convened to 1) prioritize SDG 14 targets based on maximizing the production of co-
407 beneficial relationships across all other SDG targets; and 2) determine the SDG targets that promote co-
408 beneficial relationships with ocean targets, while also identifying SDG targets that can act as tradeoffs
409 with ocean targets. While the first objective was set to determine ocean priorities, the second was to
410 understand the SDG support structure needed to ensure that ocean priorities can be met. Determining
411 the structure of Aruban institutions required to support ocean SDG priorities relies on this latter
412 objective being completed.

413 The workshop was held over ten days, with dedicated sessions on the relationships and effects of
414 progress on the SDG Ocean's targets to other SDG targets and vice versa. The beginning of the workshop
415 focused on assessing the contribution of the seven SDG 14 targets across the 169 SDG targets (across all
416 SDGs), and the second half of the workshop focused on determining the contribution of each of the 169
417 SDG targets to the seven SDG 14 targets. Each session lasted approximately one hour and utilized the
418 rapid assessment framework outlined in Singh et al. (2018). This framework uses a repeatable,
419 hierarchical decision process to identify up to seven types of directional relationships among SDG
420 targets. The seven relationships are:

- 421 • co-benefit prerequisite context-independent, whereby the first SDG target is required to achieve
422 the second target;
- 423 • co-benefit optional context-independent, whereby the first SDG target is not required but will
424 always contribute towards the achievement of the second SDG target;
- 425 • co-benefit options context-dependent, whereby the first SDG target may usually contribute
426 towards the second SDG target, but this co-benefit is dependent on a specific context;
- 427 • tradeoff prerequisite context-independent, whereby the first SDG target is a necessary condition
428 to detract from the second SDG target;
- 429 • tradeoff optional context-independent, whereby the first SDG target is not needed to detract
430 from the second SDG target, but if the first SDG target is progressed it always detracts from the
431 second SDG target;
- 432 • tradeoff optional context-dependent, whereby the first SDG target usually detracts from the
433 second SDG target, but this trade-off is dependent on other contextual conditions;
- 434 • Neutral, where no relationship is known.

435 The framework was applied to Aruba at a national scale, meaning sub-national variation in relationships
436 was not captured for this analysis. Temporally, we used the same time-lines as the SDGs, so if one SDG
437 target had a completion date of 2020 and a second SDG target had a completion date of 2030, we
438 considered the relationship from the first SDG target to the second including a 10-year lag. However,
439 when considering the reverse scenario, we contemplated the immediate consequence of the second
440 SDG target on the first regarding progress towards the second SDG target.

441 While the framework we use considers the SDG targets as written in the SDGs, workshoping SDG
442 relationships for Aruba also had other considerations. For example, we considered SDG 15.2 (on
443 conserving forests) to apply to the island's mangroves. Also, since Aruba is a small island state with little
444 effect on global climate processes, we considered progress towards the climate SDG (SDG 13) to include
445 what other countries are doing to combat climate change. That is, we were more interested in
446 understanding how global climate change efforts would affect Aruba rather than merely considering the
447 outcomes of national-level climate change reduction, adaptation, and mitigation efforts within Aruba.
448 Finally, SDG 14.7 is about increasing economic benefits to SIDS and least developed countries from the
449 sustainable use of marine resources (including tourism) on a global scale. Since Aruba is a SIDS nation,
450 this target was considered at a national scale for promoting sustainable marine development in
451 fisheries, aquaculture, and (importantly) tourism. In fact, many participants mainly considered growth in
452 sustainable tourism with regard to this target.

453 A total of 20 experts took part in the workshops, chosen based on their familiarity with at least one
454 (usually multiple) subject areas of the SDGs and how they intersect with the oceans in Aruba. Experts
455 were mainly from nonprofits and the civil service in various ministries of Aruba, including economic
456 development, parks, ministry of environment, as well as the Aruban SDG commission – a special
457 government commission set up explicitly to promote the SDGs within the country. Experts were chosen
458 with diverse backgrounds to prevent a particular viewpoint from dominating expert responses (Fish et
459 al. 2009) and to capture expertise across the SDG focus areas systematically. Beyond this systematic
460 approach, experts also nominated by other experts so that the final group of experts captures a large
461 proportion of recognized expertise for the intersection of oceans and development in Aruba (Ban et al.
462 2015).

463 At the start of the workshop, a practice and training round was conducted to ensure that experts had
464 familiarity with the method, and to allow experts a chance to ask questions and clarify points to reduce
465 linguistic uncertainty among experts. Having a training session with rapid feedback is known to increase
466 the reliability of expert knowledge (Martin et al. 2012). Additionally, after the workshop, when the data
467 was compiled, summary findings were presented back to the experts with an option to clarify or
468 challenge results (Brown 1968). Experts indicated agreement with the findings, providing extra
469 confidence in the results.

470 Our elicitation method is based on a strategy developed by Singh et al. (2017) involving groups of
471 experts, which builds off of an expert group elicitation protocol by Burgman et al. (2011). Each round of
472 elicitation had a group of experts discuss among each other which type of relationship exists between all
473 main SDG targets within specific SDG goals. Allowing for open discussion among diverse experts allows
474 for experts to productively challenge each other's views and prevents thought from a dominant
475 background or domain of expertise remain unchallenged (Burgman et al. 2011; Martin et al. 2012; Singh
476 et al. 2017). After a thorough round of discussion, experts provided specific answers confidentially on an
477 answer sheet. Providing personalized answers allowed experts to indicate their response without being
478 influenced by broader group processes (Burgman et al. 2011; Singh et al. 2017). Experts were divided
479 into groups of 8-12, with a facilitator in each group, and a roaming facilitator that moved across groups,
480 ensuring that concepts brought up in single groups were shared and discussed across all groups. While
481 splitting the experts into groups has the potential to lead to drastically separate discussions and
482 conclusions by the experts in the different groups, managing the size of groups allowed for input from
483 all expert members.

484 Additionally, the roving facilitator ensured that all major topics were at least considered in each group.
485 Finally, having experts separate in multiple groups also allows for an additional level of independence,
486 akin to increasing the degrees of freedom in the data, as the probability of groupthink dynamics leading
487 to homogenous responses across all experts is diminished (Burgman 2005; Singh et al. 2017). The effect
488 of having experts in multiple groups is that high agreement across experts is more robust, as there is
489 greater independence among the expert responses, akin to increasing the degrees of freedom in a
490 statistical design. Once all the experts provided their assessments, their answers were compiled to
491 generate maps of expert variation in responses.

492 Experts were asked to provide SDG target relationships, as well as indicate – whenever they showed an
493 optional/context-dependent relationship – the contextual element that regulated the relationship.
494 Experts were instructed to report whether the relationship was dependent on ecological factors
495 (defined as non-human biotic and abiotic conditions), economic factors (defined as the financial, market,
496 income, and labor conditions), social factors (defined as issues related to social norms, demographics,
497 and non-monetary social conditions), and governance factors (defined as institutions, policy, law, and
498 decision-making bodies).

499 [Quantifying Expert Variation in SDG relationships](#)

500 Once all expert responses were collected, they were compiled and coded through a winner-takes-all
501 system of classification (except when “neutral” relationships were most prevalent), with the level of
502 agreement quantified. For example, if out of 20 experts, 15 thought a relationship was co-
503 benefit/optional/context-dependent, while 3 of the other five thought the relationship was co-
504 benefit/optional/context-independent. The remaining two thought the relationship was co-
505 benefit/prerequisite/context-independent. The relationship was coded as co-benefit/optional/context-
506 dependent, with an agreed level of 0.75 (15/20). Similarly, if out of 20 experts, five experts thought a
507 relationship was co-benefit/optional/context-dependent, two thought the relationship was co-
508 benefit/optional/context-independent. The rest felt the relationship was neutral. The link was coded as
509 co-benefit/optional/context-dependent, with agreement level 0.25 (5/20).

510 To avoid the inclusion of spurious non-neutral relationships or non-neutral relationships with greater
511 expert disagreement than agreement, we set a threshold of agreement from which to continue our
512 analysis. We chose a supermajority of expert agreement (2/3 agreement) as a threshold to ensure that
513 our analysis focused only on those relationships with little disagreement. Once we determined our final
514 set of non-neutral relationships, we determined priority areas for both SDG ocean targets that are most
515 cross-cutting for all other SDGs as well as SDGs that are most related to the SDG ocean targets.

516 Quantifying the SDG ocean targets in terms of their contribution across other SDGs included an
517 additional step because we assessed the SDG ocean targets against each other, and therefore could
518 assess direct and secondary indirect relationships across SDGs. To calculate the total contribution of
519 achieving the SDG ocean targets across all other SDGs, we adopted Input-Output (IO) models. This
520 method is ordinarily used to estimate the contribution of specific economic sectors to the economy as a
521 whole by linking the production of each sector (or in this case, SDG target) to the consumption of others
522 (Leontief 1951). In this way, for example, the ripple effects of some industries can be particularly
523 important for an economy when their production is an essential input for other industries that may
524 themselves be important for still other industries. (For example, steel production used as input into ship
525 construction that is required for the shipping and trade industries). We adapt this method to calculate

526 the relative co-beneficial productive importance of each SDG ocean target, accounting for all ripple
527 effects stemming from interconnections among SDGs. We calculate the Leontief inverse using the
528 formula

$$x = (I - A)^{-1} \cdot d$$

529 where x is the relative co-beneficial productive importance of each SDG ocean target, accounting for the
530 sum of ripple effects from all other SDG ocean targets, I is the identity matrix, A is the matrix of
531 intermediate outputs (i.e., the proportion of SDG Ocean co-benefits from achieving a given SDG Ocean
532 target that leads to further co-benefits across the SDGs), and d is the total output (i.e., overall SDG
533 target benefits). Calculating the importance of interlinked SDG ocean targets was done for all co-
534 beneficial relationships, for only co-benefit/prerequisite relationships, and only co-
535 benefit/optional/context-dependent relationships. Co-benefit/prerequisite relationships are arguably
536 the most important, as other SDG targets cannot be achieved without the achievement of the specified
537 SDG ocean target. Co-benefit/optional/context-dependent relationships are potential co-benefits that
538 are realized if other conditions are met.

539 Quantifying the relationships of other SDGs to the SDG ocean targets were more straightforward, as we
540 could not consider their interaction/indirect contributions to the ocean targets, because we did not look
541 at how all other SDGs interacted with each other. We, therefore, summed the number of the different
542 kinds of co-beneficial and tradeoff relationships with the SDG ocean targets.

543 Once all SDG relationships were quantified, data summaries were prepared and sent out to the original
544 experts for vetting. This stage of elicitation was carried out over email. Experts were sent files with
545 graphics summarizing relationships and captions describing trends. Experts were asked to provide
546 feedback (particularly if they did not agree with some findings) or suggestions for describing prominent
547 results. During the vetting period, no experts identified disagreement with the findings, and some
548 provided extra context to describe findings. After vetting, we compiled our final dataset of SDG
549 relationships. SDG relationships were graphically represented in circos plots (using the R package
550 *circlize*, Gu 2014), a multivariate network graphing technique used often in genomics research to
551 organize nodes in nested structures (in our case nesting SDG targets within SDGs) and represent all links
552 between nodes.

553 All optional/context-dependent relationships, as determined by individual experts, were categorized as
554 dependent on environmental, social, economic, or governance dimensions. We tallied up all instances of
555 these considerations and determined what factor regulates context-dependent relationships. We
556 plotted the results using Sankey diagrams, using the R package *SanKey* (Csárdi and Weiner 2017).

557 [Institutional Identification and Network Building](#)

558 To determine the structure of government institutions informed by SDG interconnections to promote
559 sustainable oceans, we first categorized the Aruban government agencies based on the SDG area(s) they
560 are responsible for. To do this, first, we reviewed the websites for each government agency (grouped
561 under five distinct government ministries) and classified them as contributing to individual SDG targets
562 across all SDG goals. We organized the institutions based on the description of responsibilities, as stated
563 on the website for each institution. We did not include the SDG Commission of Aruba in this analysis
564 because they have no regulatory authority over the SDG areas but instead are responsible for
565 connecting with business and non-governmental organizations to promote the SDGs. This list was sent

566 to the experts from the earlier workshop (who collectively work in, or have considerable experience or
567 familiarity with, all the Aruban ministries), to vet the classification for accuracy. Vetting was done over
568 email, specifically asking experts if our classification system captured the role of Aruban institutions in
569 practice (Singh et al. 2018). Over two iterations, our database of Aruban institutions was refined and
570 finalized.

571 Because we were interested in building institutional structures organized by SDG relationships, we
572 created interaction matrices of institutions regulating SDG targets that have connections with the SDG
573 ocean targets (in that direction). We considered three scenarios of institutional arrangement: a situation
574 where only direct institutional regulation was considered (so no SDG relationships were taken into
575 account), a condition where co-benefit/prerequisite relationships were considered (as they are needed
576 to achieve the ocean SDG targets), and a case where all SDG relationships were considered. The case
577 where only direct institutional regulation was considered most strongly resembles the current situation.
578 The prerequisite situation models an institutional structure minimally needed to ensure the
579 achievement of the SDG ocean targets. Finally, the situation with all SDG relationships models an
580 institutional arrangement that will provide the highest potential to achieve the SDG ocean targets by
581 capitalizing on co-benefits (both through promoting context-independent co-benefits and implementing
582 policy to realize the potential of context-dependent co-benefits) and mitigating tradeoffs.

583 In every situation, we modeled an ideal situation where all institutions that help regulate a specific SDG
584 target are in communication with each other. This assumption may not be realistic, but we are
585 interested in how SDG interlinkages change institutional design rather than assessing existing
586 institutional collaboration. From the results, we determine the institutions most connected with SDG
587 targets and most-connected with other institutions. The first indicates a measure of how important the
588 institution is as a regulator for ocean sustainability across targets, and the second suggests a measure of
589 how important that institution is as a collaborating entity, ensuring consistent policy planning across
590 institutions. On top of these metrics, we use a battery of measures of network centrality to determine
591 the most crucial institution based on network structure. To select the centrality measures, we first use
592 principal components analysis (Husson et al. 2017) and t-Distributed Stochastic Neighbor Embedding
593 analysis (Van Der Maaten 2014) to determine the centrality measures that are most informative given
594 the institutional network structure (see Figure S4). We use the CINNA package in R to identify the proper
595 centrality measures (Ashtinani 2019). We use the resulting four centrality measures to establish the
596 most important institutions, and compare these results with our simple counts presented above.
597 Institutional networks were developed in the R package igraph (Csardi and Nepusz 2006).

598 [References](#)

- 599 Ashtinani, M. (2019). CINNA: Deciphering central informative nodes in network analysis, R package
600 version 1.1.53.
- 601 Ban, S. S., R. L. Pressey and N. A. Graham (2015). "Assessing the effectiveness of local management of
602 coral reefs using expert opinion and spatial Bayesian modeling." *PloS one* **10**(8): e0135465.
- 603 Bennett, N. J., A. M. Cisneros-Montemayor, J. Blythe, J. J. Silver, G. Singh, N. Andrews, A. Calò, P.
604 Christie, A. Di Franco and E. M. Finkbeiner (2019). "Towards a sustainable and equitable blue
605 economy." *Nature Sustainability*: 1-3.
- 606 Biermann, F., N. Kanie and R. E. Kim (2017). "Global governance by goal-setting: the novel approach of
607 the UN Sustainable Development Goals." *Current Opinion in Environmental Sustainability* **26**:
608 26-31.

609 Broman, G. I. and K.-H. Robèrt (2017). "A framework for strategic sustainable development." Journal of
610 Cleaner Production **140**: 17-31.

611 Brown, B. B. (1968). Delphi process: A methodology used for the elicitation of opinions of experts, RAND
612 Corp Santa Monica CA.

613 Burgman, M. (2005). Risks and decisions for conservation and environmental management, Cambridge
614 University Press.

615 Burgman, M. A., M. McBride, R. Ashton, A. Speirs-Bridge, L. Flander, B. Wintle, F. Fidler, L. Rumpff and C.
616 Twardy (2011). "Expert status and performance." PloS one **6**(7): e22998.

617 CEC (2009). EU 2009 report on policy coherence for development. Commission staff working document
618 accompanying the report of the Commission to the Council, European Union: 211 pp.

619 Christie, P. (2004). Marine protected areas as biological successes and social failures in Southeast Asia.
620 American fisheries society symposium, Citeseer.

621 Cisneros-Montemayor, A. M., M. Moreno-Báez, M. Voyer, E. H. Allison, W. W. L. Cheung, M. Hessian-
622 Lewis, M. A. Oyinlola, G. G. Singh, W. Swartz and Y. Ota (2019). "Social equity and benefits as the
623 nexus of a transformative Blue Economy: A sectoral review of implications." Marine Policy **109**:
624 103702.

625 Cisneros-Montemayor, A. M., Y. Ota, M. Bailey, C. C. Hicks, A. S. Khan, A. Rogers, U. R. Sumaila, J. Virdin
626 and K. K. He (2020). "Changing the narrative on fisheries subsidies reform: Enabling transitions
627 to achieve SDG 14.6 and beyond Andrés M. Cisneros-Montemayor." Marine Policy: 103970.

628 Cottrell, R. S., K. L. Nash, B. S. Halpern, T. A. Remenyi, S. P. Corney, A. Fleming, E. A. Fulton, S. Hornborg,
629 A. John and R. A. Watson (2019). "Food production shocks across land and sea." Nature
630 Sustainability **2**(2): 130-137.

631 Csardi, G. and T. Nepusz (2006). "The igraph software package for complex network research."
632 Interjournal, Complex Systems: 1695.

633 Csárdi, G. and J. Weiner (2017). Sankey: Illustrate the flow of information or material, R package version
634 1.0.2.

635 Douvere, F. (2008). "The importance of marine spatial planning in advancing ecosystem-based sea use
636 management." Marine Policy **32**(5): 762-771.

637 Farmery, A. K., L. Kajlich, M. Voyer, J. R. Bogard and A. Duarte (2020). "Integrating fisheries, food and
638 nutrition—Insights from people and policies in Timor-Leste." Food Policy: 101826.

639 Fish, R., M. Winter, D. M. Oliver, D. Chadwick, T. Selfa, A. L. Heathwaite and C. Hodgson (2009). "Unruly
640 pathogens: eliciting values for environmental risk in the context of heterogeneous expert
641 knowledge." Environmental Science & Policy **12**(3): 281-296.

642 Folke, C., R. Biggs, A. V. Norström, B. Reyers and J. Rockström (2016). "Social-ecological resilience and
643 biosphere-based sustainability science." Ecology and Society **21**(3).

644 Folke, C., S. Carpenter, T. Elmqvist, L. Gunderson, C. S. Holling and B. Walker (2002). "Resilience and
645 sustainable development: building adaptive capacity in a world of transformations." AMBIO: A
646 journal of the human environment **31**(5): 437-441.

647 Freire-Gibb, L. C., R. Koss, P. Margonski and N. Papadopoulou (2014). "Governance strengths and
648 weaknesses to implement the marine strategy framework directive in European waters." Marine
649 Policy **44**: 172-178.

650 Fulton, E. A., A. D. Smith, D. C. Smith and P. Johnson (2014). "An integrated approach is needed for
651 ecosystem based fisheries management: insights from ecosystem-level management strategy
652 evaluation." PloS one **9**(1): e84242.

653 Gill, D. A., M. B. Mascia, G. N. Ahmadi, L. Glew, S. E. Lester, M. Barnes, I. Craigie, E. S. Darling, C. M. Free
654 and J. Geldmann (2017). "Capacity shortfalls hinder the performance of marine protected areas
655 globally." Nature **543**(7647): 665-669.

656 Griggs, D., M. Stafford-Smith, O. Gaffney, J. Rockström, M. C. Öhman, P. Shyamsundar, W. Steffen, G.
657 Glaser, N. Kanie and I. Noble (2013). "Policy: Sustainable development goals for people and
658 planet." Nature **495**(7441): 305.

659 Gu, Z. (2014). "Circlize implements and enhances circular visualization in R." Bioinformatics **30**(19):
660 2811-2812.

661 Halpern, B. S., S. E. Lester and K. L. McLeod (2010). "Placing marine protected areas onto the ecosystem-
662 based management seascape." Proceedings of the National Academy of Sciences **107**(43):
663 18312-18317.

664 Halpern, B. S., S. Walbridge, K. A. Selkoe, C. V. Kappel, F. Micheli, C. D'Agrosa, J. F. Bruno, K. S. Casey, C.
665 Ebert and H. E. Fox (2008). "A global map of human impact on marine ecosystems." Science
666 **319**(5865): 948-952.

667 Husson, F., S. Lê and J. Pagès (2017). Exploratory multivariate analysis by example using R, Chapman and
668 Hall/CRC.

669 ICSU (2017). A guide to SDG interactions: from science to implementation, International Council for
670 Science, Paris.

671 Keen, M. R., A.-M. Schwarz and L. Wini-Simeon (2018). "Towards defining the Blue Economy: Practical
672 lessons from pacific ocean governance." Marine Policy **88**: 333-341.

673 Kemp, R., S. Parto and R. B. Gibson (2005). "Governance for sustainable development: moving from
674 theory to practice." International journal of sustainable development **8**(1-2): 12-30.

675 Keohane, R. O. and D. G. Victor (2016). "Cooperation and discord in global climate policy." Nature
676 Climate Change **6**(6): 570.

677 Leontief, W. W. (1951). "Input-Output Economics." Scientific American **185**(4): 15-21.

678 Loorbach, D. (2007). "Transition management." New mode of governance for sustainable development.
679 Utrecht: International Books.

680 Loorbach, D. (2010). "Transition management for sustainable development: a prescriptive, complexity-
681 based governance framework." Governance **23**(1): 161-183.

682 Martin, T. G., M. A. Burgman, F. Fidler, P. M. Kuhnert, S. Low-Choy, M. McBride and K. Mengersen
683 (2012). "Eliciting expert knowledge in conservation science." Conservation Biology **26**(1): 29-38.

684 Munck af Rosenschöld, J., J. G. Rozema and L. A. Frye-Levine (2014). "Institutional inertia and climate
685 change: a review of the new institutionalist literature." Wiley Interdisciplinary Reviews: Climate
686 Change **5**(5): 639-648.

687 Nilsson, M., E. Chisholm, D. Griggs, P. Howden-Chapman, D. McCollum, P. Messerli, B. Neumann, A.-S.
688 Stevance, M. Visbeck and M. Stafford-Smith (2018). "Mapping interactions between the
689 sustainable development goals: lessons learned and ways forward." Sustainability science **13**(6):
690 1489-1503.

691 Nilsson, M., D. Griggs and M. Visbeck (2016). "Policy: map the interactions between Sustainable
692 Development Goals." Nature News **534**(7607): 320.

693 Reid, A. J., J. L. Brooks, L. Dolgova, B. Laurich, B. G. Sullivan, P. Szekeres, S. L. Wood, J. R. Bennett and S.
694 J. Cooke (2017). "Post-2015 Sustainable Development Goals still neglecting their environmental
695 roots in the Anthropocene." Environmental Science & Policy **77**: 179-184.

696 Ridderstaat, J., R. Croes and P. Nijkamp (2016). "The Tourism Development–Quality of Life Nexus in a
697 Small Island Destination." Journal of Travel Research **55**(1): 79-94.

698 Robinson, J. (2004). "Squaring the circle? Some thoughts on the idea of sustainable development."
699 Ecological economics **48**(4): 369-384.

700 Roe, E. (2012). Taking complexity seriously: policy analysis, triangulation and sustainable development,
701 Springer Science & Business Media.

702 Rotmans, J., D. Loorbach and R. Kemp (2016). Complexity and Transition Management. Complexity and
703 Planning, Routledge: 195-216.

704 Singh, G. G. (2019). Can aspirations lead us to the oceans we want? Predicting Future Oceans, Elsevier:
705 405-416.

706 Singh, G. G. (2020). "Determining a path to a destination: pairing strategic frameworks with the
707 Sustainable Development Goals to promote research and policy." Evolutionary and Institutional
708 Economics Review.

709 Singh, G. G., A. M. Cisneros-Montemayor, W. Swartz, W. Cheung, J. A. Guy, T.-A. Kenny, C. J. McOwen, R.
710 Asch, J. L. Geffert and C. C. Wabnitz (2018). "A rapid assessment of co-benefits and trade-offs
711 among Sustainable Development Goals." Marine Policy **93**: 223-231.

712 Singh, G. G., I. M. S. Eddy, B. S. Halpern, R. Neslo, T. Satterfield and K. M. A. Chan (2020). "Mapping
713 cumulative impacts to coastal ecosystem services in British Columbia." PloS one **15**(5):
714 e0220092.

715 Singh, G. G., J. Sinner, J. Ellis, M. Kandlikar, B. S. Halpern, T. Satterfield and K. Chan (2017). "Group
716 elicitation yield more consistent, yet more uncertain experts in understanding risks to
717 ecosystem services in New Zealand bays." PloS one **12**(8): e0182233.

718 Singh, G. G., J. Sinner, J. Ellis, M. Kandlikar, B. S. Halpern, T. Satterfield and K. M. Chan (2017).
719 "Mechanisms and risk of cumulative impacts to coastal ecosystem services: An expert elicitation
720 approach." Journal of environmental management **199**: 229-241.

721 Stafford-Smith, M., D. Griggs, O. Gaffney, F. Ullah, B. Reyers, N. Kanie, B. Stigson, P. Shrivastava, M.
722 Leach and D. O'Connell (2017). "Integration: the key to implementing the Sustainable
723 Development Goals." Sustainability science **12**(6): 911-919.

724 UN (2015). "Transforming our world: The 2030 agenda for sustainable development." Resolution
725 adopted by the General Assembly.

726 Van Der Maaten, L. (2014). "Accelerating t-SNE using tree-based algorithms." The Journal of Machine
727 Learning Research **15**(1): 3221-3245.

728 Vaslet, A. and R. Renoux (2016). EU Outermost Regions and Overseas Countries and Territories, Regional
729 ecosystem profile - Caribbean Region., BEST: 261 pp+265 Appendices.

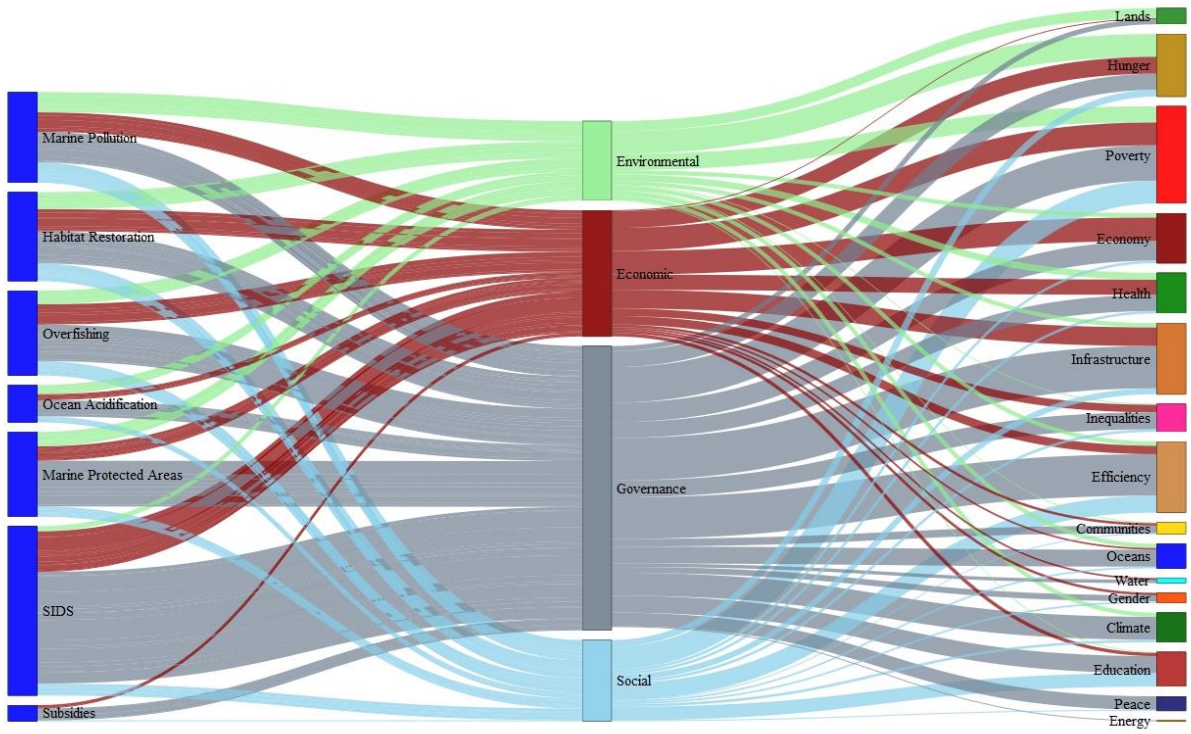
730 WTTC (2019). Aruba 2019 Annual Research: Key Highlights.

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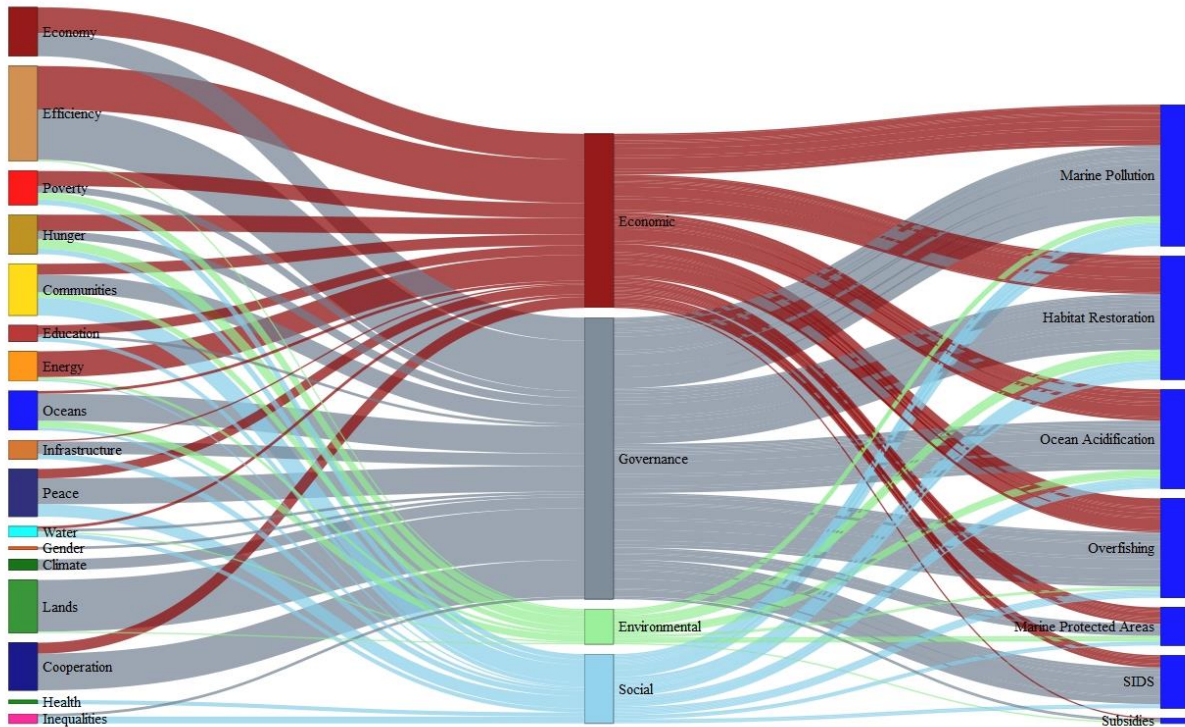
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736

737 Figure S1. The four dimensions (economic, governance, environmental, and social) that regulate
738 whether context-dependent relationships are realized from SDG Ocean targets to other SDGs

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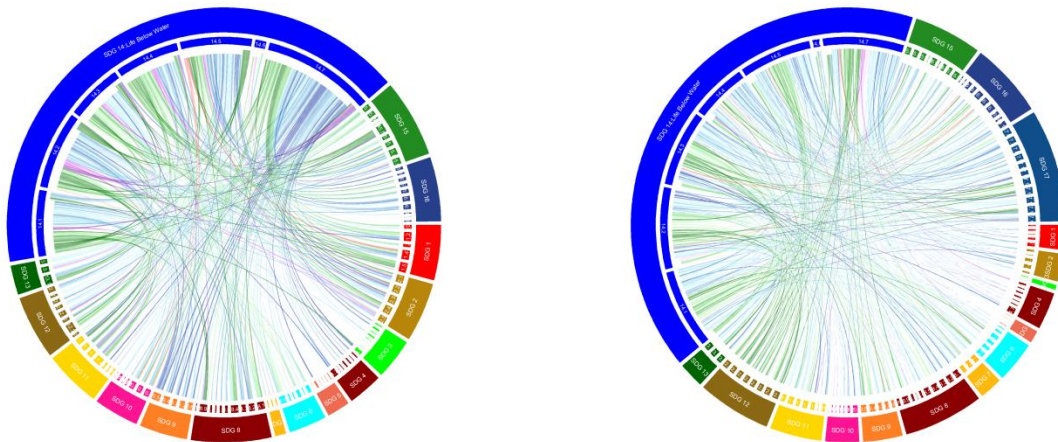


740

741 Figure S2. The four dimensions (economic, governance, environmental, and social) that regulate
 742 whether context-dependent relationships are realized from other SDGs to SDG Ocean targets

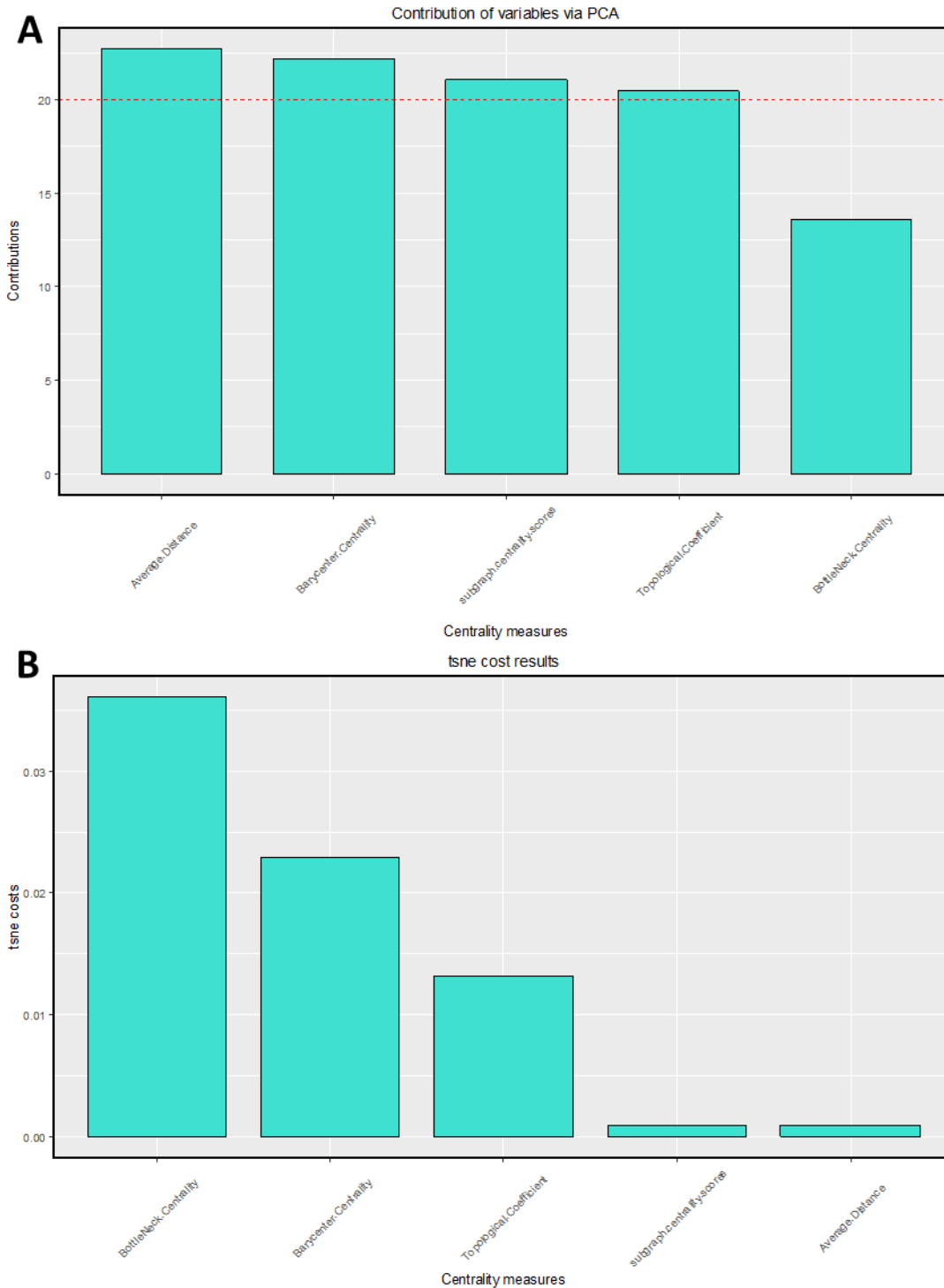
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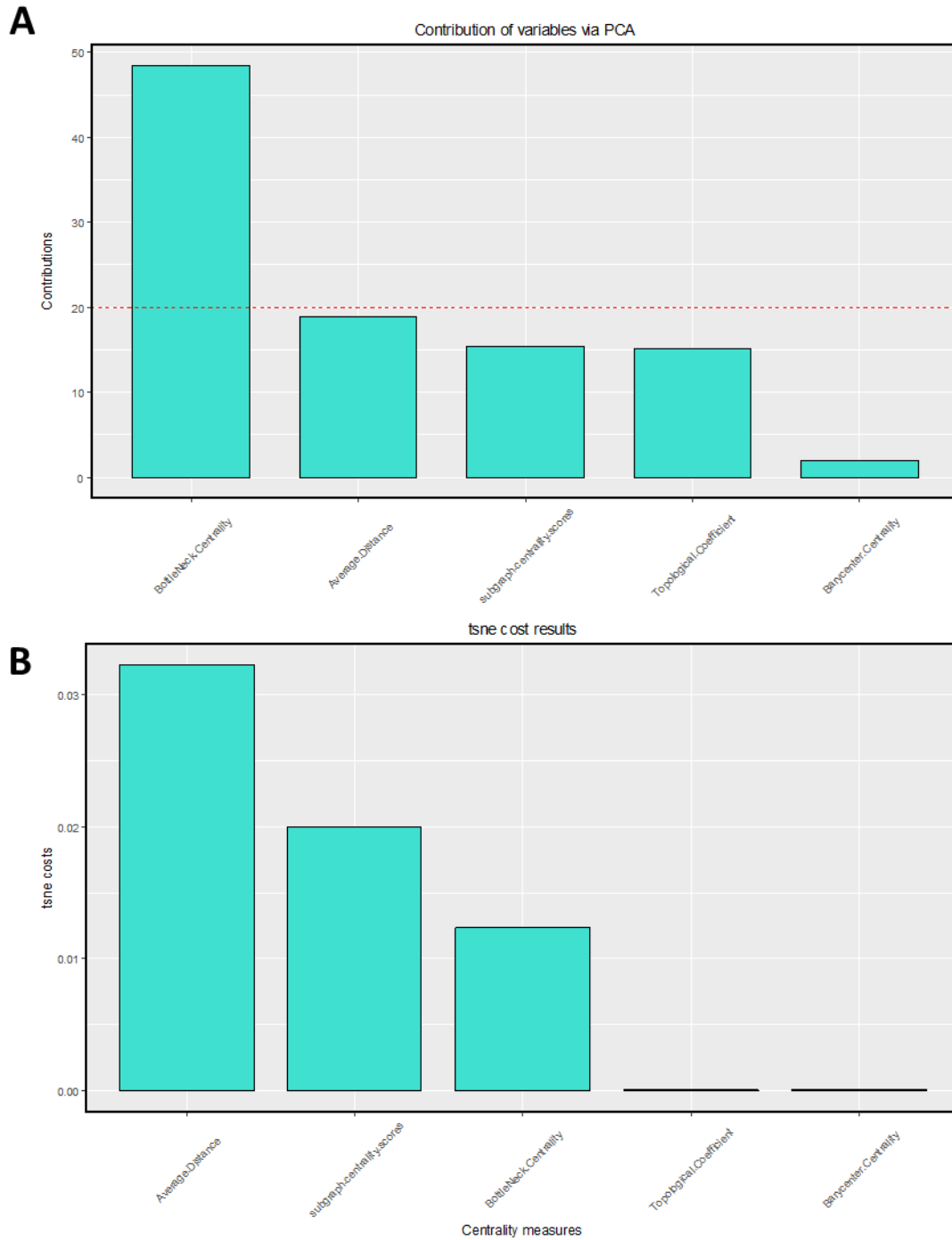
746 Figure S3. All relationships accounted for all expert input, including relationships with less than 2/3
 747 support. The left figure is from SDG Ocean targets to other SDGs, and the right is from other SDGs to
 748 SDG Ocean targets.



749

750 Figure S4. The centrality measures that were most informative for analyzing institutional metrics,
 751 according to A) PCA and B) t-Distributed Stochastic Neighbor Embedding analysis, in a scenario
 752 where no relationships between SDG targets and SDG Ocean targets are considered.

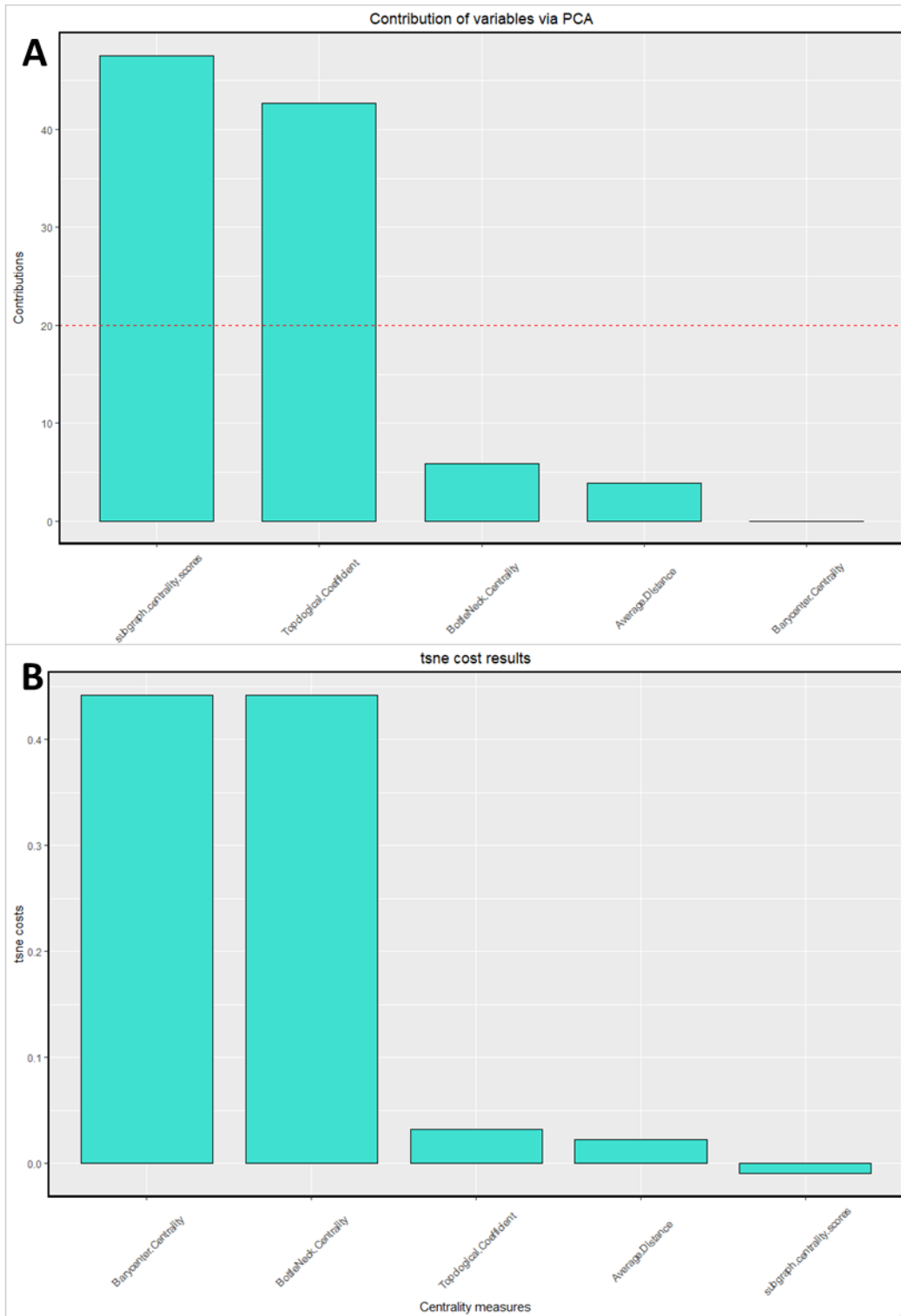
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754

755 Figure S5. The centrality measures that were most informative for analyzing institutional metrics,
 756 according to A) PCA and B) t-Distributed Stochastic Neighbor Embedding analysis, in a scenario
 757 where prerequisite relationships between SDG targets and SDG Ocean targets are considered.

758



759

760 Figure S6. The centrality measures that were most informative for analyzing institutional metrics,
 761 according to A) PCA and B) t-Distributed Stochastic Neighbor Embedding analysis, in a scenario
 762 where all co-benefits and tradeoffs between SDG targets are considered.

763 Table S1. Leontief inverse matrix of indirect co-benefit production for all co-benefits for SDG Ocean
 764 targets

	SDG1	SDG2	SDG3	SDG4	SDG5	SDG7
SDG1	1.047619	0.049226	0.097907	0.007071	0.046224	0.03182
SDG2	0	1.049332	0.093851	0.062567	0.046375	0.030501
SDG3	0	0.046988	1.093457	0.006749	0.044123	0.030374
SDG4	0	0.04453	0.007479	1.060542	0.04279	0.002431
SDG5	0	0.049332	0.093851	0.062567	1.046375	0.030501
SDG7	0	0.047505	0.090375	0.06025	0.00762	1.029372

765

766 Table S2. Leontief inverse matrix of indirect co-benefit production for prerequisite co-benefits for SDG
 767 Ocean targets

	SDG1	SDG2	SDG3	SDG4	SDG5	SDG7
SDG1	1.071429	0.116179	0.154905	0	0.167814	0
SDG2	0	1.096386	0.017403	0	0.139224	0
SDG3	0	0.108434	1.144578	0	0.156627	0
SDG4	0	0.102811	0.018563	1.066667	0.148505	0
SDG5	0	0.108434	0.144578	0	1.156627	0
SDG7	0	0.096436	0.002655	0.070833	0.021241	1.0625

768

769 Table S3. Leontief inverse matrix of indirect co-benefit production for all context-independent co-
 770 benefits for SDG Ocean targets

	SDG1	SDG2	SDG3	SDG4	SDG5	SDG7
SDG1	1	0	0	0	0	0
SDG2	0	1	0.5	0	0	0
SDG3	0	0	1	0	0	0
SDG4	0	0	0	0	0	0
SDG5	0	0	0	0	0	0
SDG7	0	0	0	0	0	0

771

772 Table S4. Leontief inverse matrix of indirect co-benefit production for all context-dependent co-benefits
 773 for SDG Ocean targets

	SDG1	SDG2	SDG3	SDG4	SDG5	SDG7
SDG1	1	0	0	0	0	0
SDG2	0	1	0	0	0	0
SDG3	0	0	1	0	0	0
SDG4	0	0	0	1	0	0
SDG5	0	0	0.021739	0.333333	1	0.043478
SDG7	0	0	0.5	0	0	1

Table S5. The number of direct relationships from each SDG to the SDG Ocean targets

	14.1				14.2				14.3				14.4				14.5				14.7			
SDG	benefit/ Pre- requisit e/cont ext- depend	benefit/ option al/cont ext- independ	benefit/ option al/cont ext- depend	Trade- off/opti onal/c ontext- depend	benefit/ Pre- requisit e/cont ext- depend	benefit/ option al/cont ext- independ	benefit/ option al/cont ext- depend	Trade- off/opti onal/c ontext- depend	benefit/ Pre- requisit e/cont ext- depend	benefit/ option al/cont ext- independ	benefit/ option al/cont ext- depend	Trade- off/opti onal/c ontext- depend	benefit/ Pre- requisit e/cont ext- depend	benefit/ option al/cont ext- independ	benefit/ option al/cont ext- depend	Trade- off/opti onal/c ontext- depend	benefit/ Pre- requisit e/cont ext- depend	benefit/ option al/cont ext- independ	benefit/ option al/cont ext- depend	Trade- off/opti onal/c ontext- depend	benefit/ Pre- requisit e/cont ext- depend	benefit/ option al/cont ext- independ	benefit/ option al/cont ext- depend	Trade- off/opti onal/c ontext- depend
1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
3	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
4	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
5	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
6	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	1
7	0	0	0	0	0	0	0	0	2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
8	1	0	1	0	1	0	1	1	2	0	1	1	0	0	0	0	0	0	0	1	1	0	0	0
9	1	0	0	0	0	0	0	0	1	0	0	0	0	1	0	0	0	0	0	0	0	0	0	0
10	0	0	0	1	0	0	0	1	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0
11	2	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
12	2	0	0	0	2	0	0	0	2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
13	1	0	2	0	0	0	2	0	1	0	2	0	0	0	1	0	0	0	0	0	1	0	1	0
14	1	0	0	0	6	0	0	0	3	1	1	0	2	1	1	0	5	0	0	0	1	3	1	0
15	0	0	0	0	2	0	0	0	0	0	2	0	0	0	0	0	0	0	3	0	0	0	1	0
16	0	0	2	0	0	0	1	0	0	0	1	0	0	0	2	0	0	0	1	0	0	0	0	0
17	1	0	1	0	1	0	1	0	0	0	1	0	0	0	1	0	0	0	2	0	0	0	2	0

Table S6. The Aruban institutions and their associated codes used in the network analysis

Institutions	Code
Directie Onderwijs,	I1
WEB NV. (Utilities Aruba N.V.)	I2
ELMAR NV.	I3
Advisory Board of Aruba (Raad van Advies)	I4
Air Navigation Services Aruba N.V. (ANSA N.V.)	I5
Aruba Airport Authority N.V. (AAA)	I6
Aruba Fire Department	I7
Aruba Free Zone	I8
Aruba Investment Agency	I9
Aruba Kingdom Games Foundation (SKA)	I10
Aruba Olympic Committee (COA)	I11
Aruba Police Force	I12
Aruba Ports Authority N.V.(APA)	I13
Aruba School of Music Rufo Wever	I14
Aruba Sports Union (ASU)	I15
Aruba Tourism Authority (ATA)	I16
Aruban National Archives	I17
Arubus N.V.	I18
Aruparking	I19
Biblioteca Nacional Aruba (BNA)	I20
Bureau City Inspector (BCI)	I21
Bureau European Union and Kingdom Relations,	I22
Bureau Intellectual Property (BIE)	I23
Bureau Landsbemiddelaar (BLB)	I24
Bureau of Addiction Care and Counselling (BOV)	I25
Bureau of Compulsory Education (BLP)	I26
Bureau Sostenemi (BSO)	I27
Bureau Traimerdia (BTm)	I28
Bureau Vrouwenzaken (BVZ)	I29
Cas di Cultura/Stichting Schouwburg Aruba (CdC/SSA)	I30
Central Audit Department (CAD)	I31
Central Bank van Aruba	I32
Centro pa Desaroyo di Aruba (CEDE Aruba)	I33
Civil Registry office (Dienst Burgerlijke Stand en Bevolkingsregister DBSB)	I34
Commission of Sports Subsidy (SSC)	I35
Correctional Institute Aruba (KIA)	I36
Crisis Management Office	I37
Departamento di Aduana (Douane)	I38
Departamento di Impuesto (DI)	I39
Departamento di Integracion, Maneho y Admision di Stranhero (DIMAS)	I40

Departamento di Progreso Laboral (DPL)	141
Departamento di Recurso Humano (DRH)	142
Departamento Meteorologico Aruba (DMA)	143
Department of Casino Affairs	144
Department of Civil Aviation Aruba (DCA)	145
Department of Economic Affairs, Commerce and Industry	146
Department of Education of Aruba (DO)	147
Department of Information Technology and Automation (DIA)	148
Department of Legislation and Legal Affairs	149
Directorate of Nature and Environment (DNE)	150
Department of Public Health (DVG)	151
Department of Public Transportation	152
Department of Rental & Consumer Affairs (DHC)	153
Department of Security	154
Dienst Landmeetkunde en Vastgoedregistratie (DLV)	155
Dienst Openbare Werken (DOW)	156
Dienst Technische Inspectie (DTI)	157
Directie Arbeid en Onderzoek (DAO)	158
Directie Cultuur Aruba (DCA)	159
Directie Financiën (DFIN)	160
Directie Infrastructuur en Planning (DIP)	161
Directie Landbouw, Veeteelt en Visserij en Markthallen (DLVV)	162
Directie Sociale Zaken (DSZ)	163
Directie Telecommunicatie Zaken (DTZ)	164
Directie Volks Gezondheid.,	165
Directie Voogdijraad (Guardianship Council)	166
Directorate of Shipping Aruba (DSV)	167
Enseñansa pa Empleo (EPE)	168
Financial Intelligence Unit Meldpunt Ongebruikelijke Transacties (FIU MOT)	169
Foreign Relations Directorate (DBB)	170
Fundacion Arubano Maneho di Facilidat Deportivo (FAMFD)	171
Fundacion Cas Pa Comunidad Arubano (FCCA)	172
Fundacion Centro di Pesca Hadicurari (Hadicurari)	173
Fundacion Facilidatnan Deportivo Frans Figaroa (FFDFF)	174
Fundacion Lotto pa Deporte (Lotto)	175
Fundacion Parke Nacional Arikok (FPNA)	176
Government Information Services (BUVO)	177
Health Inspection Aruba (Inspectie Volksgezondheid Aruba (IVA)	178
High Commissioner Aruba Financial Center (HCFC)	179
Inspectie Beveiliging Scheep- en Luchtvaart (IBSL)	180
Inspectorate of Education (IO)	181
Instituto Alarma y Seguridad Aruba (IASA)	182
Instituto Biba Saludabel y Activo (IBISA)	183

Instituto Pedagogico Arubano (IPA)	184
Joint Court of Justice of Aruba, Curaçao, Sint Maarten and of Bonaire, Saint Eustatius and Saba	185
Medical Institute San Nicolas (IMSAN)	186
Medical Laboratory Services Aruba Foundation (Fundacion Servicio Laboratorio Medico) Aruba (FSLMA)	187
Monuments Office Aruba	188
Museo Historico Arubano/Historisch Museum Aruba (MHA/HMA)	189
National Criminal Investigation Department (LR)	190
National Health Insurance Aruba (AZV)	191
Nationale 'United Nations Educational, Scientific and Cultural Organization' Commissie Aruba (UNESCO)	192
Objection Advisory Board	193
Office for Government Grant Coordination	194
Office Internal Services (BID)	195
Openbaar Onderwijs (OO)	196
Post Aruba N.V.	197
Public Prosecutor's Office	198
Refineria di Aruba N.V.	199
Royal Dutch Coast Guard	1100
Service Unit Public Schools (DPS)	1101
Servicio di Limpieza di Aruba (Serlimar)	1102
Setar N.V.	1103
Social and Economic Council (SEC)	1104
Social Security Bank of Aruba (SVB)	1105
Stichting Algemeen Pensioenfonds Aruba (APFA)	1106
Stichting Monumenten Fonds Aruba (SMFA)	1107
The Minister plenipotentiary of Aruba	1108
Union di Organisacionnan Cultural Arubano (UNOCA)	1109
University of Aruba (UVA)	1110
Veterinary Services (VET)	1111
Volkskredietbank van Aruba (VKB)	1112

Table S7. Centrality measures for the importance of Aruban institutions in regulating progress on the various SDG Ocean targets, in a scenario where relationships between SDG targets are not considered. The Social and Economic Council (SEC, institution code I104) is not included in this scenario. The topological coefficient is a relative measure for the extent to which a node shares nodes with other nodes, so low values here indicate that an institution is connected with other institutions that are not otherwise connected. We interpret that as suggesting that institutions with low topological coefficient scores are more important for coordinating activities across institutions that are otherwise not connected with the broader institutional system. The average distance is a measure of how far, on average, a node is from other nodes, so a lower number indicates a more central node.

Institution Code	Barycenter Centrality	Subgraph Centrality Scores	Topological Coefficient	Average Distance
------------------	-----------------------	----------------------------	-------------------------	------------------

I50	0.111111111	50.59247045	0.592592593	0.818181818
I13	0.083333333	42.42479989	0.648148148	1.090909091
I67	0.083333333	42.42479989	0.648148148	1.090909091
I80	0.083333333	42.42479989	0.648148148	1.090909091
I37	0.076923077	33.83334661	0.711111111	1.181818182
I43	0.076923077	33.83334661	0.711111111	1.181818182
I16	0.071428571	23.30942505	0.75	1.272727273
I76	0.058823529	2.883671299	1	1.545454545
I73	0.058823529	2.883671299	1	1.545454545
I62	0.058823529	2.883671299	1	1.545454545

Table S8. Centrality measures for the importance of Aruban institutions in regulating progress on the various SDG Ocean targets, in a scenario where prerequisite relationships from SDG targets to SDG Ocean targets are considered. The average distance is a measure of how far, on average, a node is from other nodes, so a lower number indicates a more central node.

Institution Code	Bottleneck Centrality	Average Distance	Subgraph Centrality Scores
I104	33	1.457142857	1525.380287
I16	24	1.628571429	1256.153312
I56	23	1.685714286	813.5010801
I80	23	1.714285714	730.9733276
I102	20	1.8	434.1955397
I50	20	2	385.4800844
I30	10	2.057142857	166.4691073
I57	9	2.857142857	6.090843572
I13	7	2	667.477462
I46	6	1.771428571	1040.936563
I61	4	1.885714286	539.6708255
I8	4	1.942857143	433.982441
I9	3	1.857142857	547.5386151
I22	1	2.285714286	105.8188317
I37	1	2.314285714	121.8309032
I43	1	2.314285714	121.8309032
I70	1	2.285714286	105.8188317
I107	0	2.142857143	161.3783791
I109	0	2.142857143	161.3783791
I18	0	2.057142857	154.6884178
I2	0	2.114285714	389.4212437
I23	0	1.914285714	458.1527561
I3	0	3.742857143	2.82858344
I44	0	1.914285714	458.1527561

I52	0	2.057142857	154.6884178
I55	0	2.057142857	154.6884178
I59	0	2.142857143	161.3783791
I6	0	2.228571429	318.4298999
I62	0	2.885714286	8.839093957
I67	0	2.257142857	205.4978634
I73	0	2.885714286	8.839093957
I76	0	2.914285714	6.447722789
I88	0	2.142857143	161.3783791
I99	0	3.742857143	2.82858344

Table S9. Centrality measures for the importance of Aruban institutions in regulating progress on the various SDG Ocean targets, in a scenario where all co-benefits and tradeoffs between SDG targets are considered. The topological coefficient is a relative measure for the extent to which a node shares nodes with other nodes, so low values here indicate that an institution is connected with other institutions that are not otherwise connected. We interpret that as suggesting that institutions with low topological coefficient scores are more important for coordinating activities across institutions that are otherwise not connected with the broader institutional system.

Institution Code	Subgraph Centrality Scores	Topological Coefficient	Barycenter Centrality	Bottleneck Centrality
I100	1402.92489	0.6888889	0.00617284	0
I101	48165.28615	0.3740741	0.00763359	0
I102	5062.57032	0.2114625	0.00775194	7
I104	160245.2346	0.1650246	0.01162791	62
I105	2506.03322	0.484127	0.00689655	0
I107	2256.04774	0.3055556	0.00704225	0
I108	4388.05916	0.3809524	0.00699301	2
I109	2256.04774	0.3055556	0.00704225	0
I110	48165.28615	0.3740741	0.00763359	0
I112	3943.49674	0.4333333	0.00719425	0
I12	6317.37529	0.1903226	0.00917431	43
I13	5856.40607	0.2536998	0.00757576	15
I16	46499.86058	0.207478	0.00980392	57
I18	2363.30758	0.326087	0.00740741	0
I2	4898.2664	0.3355482	0.00735294	3
I22	4388.05916	0.3809524	0.00699301	2
I23	99212.45073	0.2882353	0.00869565	9

I26	48165.28615	0.3740741	0.00763359	0
I28	48165.28615	0.3740741	0.00763359	0
I29	2506.03322	0.484127	0.00689655	0
I30	2256.04774	0.3055556	0.00704225	0
I32	28101.63704	0.3529412	0.008	0
I33	63571.22545	0.3222222	0.00787402	2
I34	1322.48095	0.3773585	0.00769231	0
I37	283.6938	0.5058824	0.00574713	3
I38	2892.83834	0.3142857	0.00719425	13
I40	1402.92489	0.6888889	0.00617284	0
I41	3943.49674	0.4333333	0.00719425	0
I43	373.34547	0.4705882	0.00578035	3
I44	28101.63704	0.3529412	0.008	0
I46	126099.178	0.2304582	0.00952381	35
I47	48165.28615	0.3740741	0.00763359	0
I48	48165.28615	0.3740741	0.00763359	0
I49	1402.92489	0.6888889	0.00617284	0
I50	3375.3943	0.2271062	0.0075188	37
I52	2363.30758	0.326087	0.00740741	0
I54	1402.92489	0.6888889	0.00617284	0
I55	2363.30758	0.326087	0.00740741	0
I56	12278.22642	0.2484848	0.00840336	17
I58	3943.49674	0.4333333	0.00719425	0
I59	2256.04774	0.3055556	0.00704225	0
I6	4382.49514	0.3577236	0.00719425	0
I60	28101.63704	0.3529412	0.008	0
I61	9478.83701	0.3278302	0.008	5
I62	28.27895	0.5714286	0.00518135	0
I67	942.56889	0.4102564	0.00649351	2
I69	1402.92489	0.6888889	0.00617284	0
I70	4388.05916	0.3809524	0.00699301	2
I73	28.27895	0.5714286	0.00518135	0
I75	28101.63704	0.3529412	0.008	0
I76	1247.34309	0.3857143	0.00689655	1
I77	1322.48095	0.3773585	0.00769231	0
I79	28101.63704	0.3529412	0.008	0
I8	39008.83326	0.289916	0.00826446	6
I80	942.56889	0.4102564	0.00649351	2
I82	1402.92489	0.6888889	0.00617284	0
I84	48165.28615	0.3740741	0.00763359	0
I85	1402.92489	0.6888889	0.00617284	0
I88	2256.04774	0.3055556	0.00704225	0
I9	39008.83326	0.289916	0.00826446	6

I90	2892.83834	0.3142857	0.00719425	13
I92	48165.28615	0.3740741	0.00763359	0
I96	48165.28615	0.3740741	0.00763359	0
