

1 Mapping the potential for payments for ecosystem services
2 schemes to improve water quality in agricultural catchments:
3 a multi-criteria approach based on the supply and demand
4 concept

5
6 William M Roberts^{1, 2*}, Laurence B Couldrick³, Gareth Williams⁴, Dawn Robins¹, Dave Cooper¹

7 ¹University of Chichester Business School, Bognor Regis Campus, Upper Bognor Road, Bognor
8 Regis, West Sussex, PO21 1HR

9 ²Currently at: Rothamsted Research, North Wyke, Okehampton, Devon, EX20 2SB

10 ³Westcountry Rivers Trust, Rain-Charm House, Kyl Cober Parc, Stoke Climsland,
11 Cornwall, PL17 8PY

12 ⁴Environment Agency, Guildbourne House, Chatsworth Road, Worthing, West Sussex, BN11 1LD

13 *Corresponding author email: william.roberts@rothamsted.ac.uk

14
15 **Keywords:** water quality, agriculture, payments for ecosystem services, multi-criteria mapping

16 **Abbreviations:** PES, payments for ecosystem services; WFD, Water Framework Directive; WRT,
17 Westcountry Rivers Trust; GES, good ecological status; MCA, multi-criteria analysis; GIS,
18 geographical information system.

19
20
21
22
23
24
25

26 **Abstract**

27 Payment for Ecosystem Services (PES) schemes are one option in a suite of policy tools for improving
28 water surface water and groundwater quality. In these schemes, downstream water users who are
29 impacted by agricultural diffuse pollution incentivise upstream farmers to adopt better practices.
30 However, this type of scheme will not be successful in all situations, in part, due to a lack of potential
31 for agriculture to supply improved water quality and/or a lack in demand from downstream users for
32 good water quality. As such, this study aims to present a flexible approach to mapping the potential for
33 PES schemes to improve water quality in agricultural catchments. The approach is based on multi-
34 criteria analysis, with supply and demand as key criteria. It uses expert judgement or current guidance
35 on PES to select supply and demand sub-criteria, expert judgement to weight criteria through pairwise
36 comparisons and readily available, national datasets to indicate criteria. Once indicator data are
37 normalized, it combines them in a weighted sums analysis and presents results spatially at the national
38 scale, all within a geographical information system. The approach can easily be applied to the country
39 or region of interest by using locally relevant criteria, expert judgement and data. For example, when
40 applied to the situation for river waterbodies in England, supply sub-criteria were the contribution of
41 agriculture to loads of the major pollutants (nitrogen, phosphorus and sediments) and the demand sub-
42 criteria were the different downstream water users present (water companies and, tourist and local
43 recreational users) in each catchment. Expert judgement assigned equal weight to supply and demand
44 criteria and the highest weights to sediments and water companies for sub-criteria, respectively. Readily
45 available, national scale datasets were used to indicate these criteria. When indicator data were
46 combined in a weighted sums analysis, it was possible to identify areas of high potential for PES, which
47 would hopefully motivate more detailed research at the individual catchment level into the constraints
48 in linking supply and demand. Three case-study schemes were also examined to show how some of
49 these constraints are being identified and overcome. As such, the approach presented is the first tier in
50 a two-tier framework for establishing PES schemes to improve water quality in agricultural catchments.

51

52

53

54 **1. Introduction**

55 Diffuse pollution from agriculture remains a major problem in Europe, contributing to poor water
56 quality in aquatic ecosystems with associated impacts on related goods and services, on human health
57 and on economic activities (Le Moal et al., 2019). Despite this, the costs of these impacts are not
58 internalised in the purchase price of food (Bell et al., 2018). Instead, governments seek to reduce the
59 impact of diffuse agricultural pollution on water quality through policy initiatives that aim to improve
60 the sustainability of farming practices and change land use. These publicly funded initiatives include
61 regulation, such as the Nitrates Directive (OJEC, 1991) and advisory schemes, such as Catchment
62 Sensitive Farming in the UK. They also include incentive schemes such as the Basic Payment Scheme
63 and the Republic of Ireland’s Green, Low-Carbon, Agri-Environment scheme both funded under the
64 EU Common Agricultural Policy. In incentive schemes, government bodies pay farmers for taking up
65 practices that are expected to improve water quality. However, there are several issues including
66 funding limits, low uptake by farmers in certain areas, poor spatial targeting of best practices and low
67 levels of compliance monitoring. As such, schemes don’t always lead to improved water quality and
68 reduced costs, or achieve policy objectives (Collins et al., 2021; Collins and Anthony, 2008; Kay et al.,
69 2012; Pulley and Collins, 2021), such as ‘good’ ecological status (GES) as set by the European Union
70 Water Framework Directive (WFD) (OJEC, 2000).

71

72 With poor water quality continuing to cause impacts and costs, downstream users who are impacted by
73 diffuse pollution from agriculture are increasingly looking to implement catchment management,
74 through what are often referred to as ‘Payment for Ecosystem Services’ (PES) schemes. This is
75 evidenced by a year-on-year increase in the number of PES schemes in Europe, coupled with increasing
76 private sector investment in catchment management (Bennett et al., 2017). These schemes usually exist
77 because the expected cost of catchment management is lower than the costs of impacts caused by poor
78 water quality, and are usually set up by downstream users themselves, or by an ‘intermediary’
79 organisation who facilitates the scheme (Cook et al., 2017). In these schemes, downstream water users
80 (buyers) voluntarily incentivise upstream farmers (sellers) to adopt best practices, featuring options for
81 land management and/or land use change. As well as providing additional funds for wider catchment

82 management, these schemes tend to have higher levels of farmer enrolment, measures tend to be more
83 locally specific with better spatial targeting, and there are higher levels of compliance and ecosystem
84 service monitoring than in government incentive schemes (Wunder et al., 2018, 2008). Despite these
85 potential benefits, PES is still a relatively underdeveloped component of catchment management and
86 diffuse agricultural pollution policy in most EU member states, and more specifically in the UK (Cook
87 et al., 2017). However, interest in PES is growing due to recent opportunities to reform both EU and
88 UK agri-environmental policy (Bateman and Balmford, 2018; Bieroza et al., 2021).

89

90 Despite the possible benefits of PES, the success of this approach to improving water quality will be
91 variable, with the approach more likely to succeed in some catchments than in others, partly due to
92 supply and demand factors (Table 1). For instance, where the potential for agriculture to supply water
93 quality improvements, above those required by law, is coupled with a high demand for the better water
94 quality, then there is likely to be a high potential for PES schemes - i.e. there needs to be a good balance
95 of 'buyers' and 'sellers' of good water quality (Rogers et al., 2015; Smith et al., 2013). However, the
96 potential for agriculture to improve water quality will be lower when other sources of nutrients, such as
97 sewage treatment, are present, which could also make the desired effects of an agriculture focused
98 scheme difficult to achieve and quantify (Bol et al., 2018; Pohle et al., 2017). However, in those areas
99 PES could aim to maintain a low contribution of pollutant inputs from agriculture. Furthermore, it is
100 more difficult and costly to solve water quality problems caused by some pollutants than others, as
101 some are subject to transformation and lag times as they move through catchments (Melland et al.,
102 2018). Demand for good water quality may come from a range of downstream users who vary in their
103 willingness-to-pay and/or their technical capabilities for establishing a scheme (Glenk et al., 2011;
104 Hampson et al., 2017). In some areas where there are multiple individual downstream users, the use of
105 'intermediary organisations' may be necessary to facilitate a scheme (Cook et al., 2017), and there are
106 also higher transaction costs associated with multiple buyers, which could lower gains from any
107 exchange (Jack et al. 2008, Goldman-Benner et al. 2012). Since all of these supply and demand factors
108 will vary in presence and/or severity from one catchment to another so will the overall potential for PES
109 schemes to improve water quality.

110
111
112
113
114
115
116
117
118
119
120
121
122
123
124
125
126
127
128
129
130
131
132
133
134
135
136
137

[Insert Table 1]

Being able to link supply and demand, or buyers and sellers, is critical in establishing a successful scheme, and there are many technical, legal and economic constraints (Table 1) that need to be overcome in the scheme design if the potential for PES is to be realised (Engel et al., 2008; Goldman-Benner et al., 2012; Jack et al., 2008; Smith et al., 2013). In agricultural catchments these might include technical challenges such as targeting of payments at ‘critical source areas’ of the catchment that contribute the majority of pollutant loads (Le Moal et al., 2019); legal constraints such as those that discourage or prevent tenant farmers from enrolling on schemes (Harrison-Mayfield et al., 1998; Maye et al., 2009); and economic constraints such as the balance between the costs of impacts, the actual budget available for catchment management, and the estimated costs of improving water quality through catchment management (Engel et al., 2008; Glenk et al., 2011).

Mapping the spatial variation in the potential for PES to improve water quality could motivate PES establishment, advise on the type of schemes that might be most suitable and potentially inform policy at the strategic level. Although, there is currently no approach or framework to do this in Europe, studies with similar aims but concerned with the effects of deforestation on sediment loads in equatorial regions have successfully combined readily available, national scale indicator data in a multi-criteria analysis (MCA) (Locatelli et al., 2014; Wendland et al., 2010). Multi-criteria analysis lends itself well to these strategic level studies as it allows the key aspects or ‘criteria’ of a problem, such as supply and demand factors, to be organised in a hierarchical manner (Balasubramaniam and Voulvoulis, 2005). A MCA can also incorporate expert judgement to weight criteria in relation to their importance in a transparent way, which would be particularly important for criteria involving different pollutants and downstream users. It also has advantages of being able to handle the mixed data sets, the types of which might be available at national scale, to indicate those key criteria. Weighted data indicating the key criteria can then be parsimoniously combined and mapped (Arora, 2012; Fealy et al., 2010).

138 An MCA approach should be achievable for integrating and mapping supply of and demand for good
139 water quality in Europe, since there are national scale data sets available to indicate them. However, the
140 very specific nature of the constraints in linking supply and demand, and subsequent issues with data
141 availability, means that these would be better researched at the individual catchment level for the time
142 being. Such an exercise could therefore not be expected to inform all aspects of scheme design. Instead,
143 it would form part of a two-tier type approach to establishing PES, where this exercise motivates further
144 research into PES at the individual catchment level, advises on the types of schemes that are most
145 suitable and informs policy. The former research would allow the constraints in linking supply and
146 demand to be identified and the finer designs of a scheme to be detailed.

147

148 This study aims to present a flexible approach to mapping the potential and type of PES to improve
149 water quality in agricultural catchments. The approach presented is based on MCA, with the potential
150 for agriculture to increase the supply of good water quality and the demand from downstream water
151 users for water quality improvements as key criteria. It uses expert judgement or current guidance on
152 PES to select supply and demand sub-criteria, expert judgement to weight criteria through pairwise
153 comparisons and readily available, national datasets to indicate criteria. Once indicator data are
154 normalized, it combines them in a weighted sums analysis and presents results spatially at the national
155 scale, all within a geographical information system (GIS). This approach is applied to the situation in
156 England to show how it can be easily tailored to the country or region of interest, and where there are a
157 number of established PES schemes against which to validate the approach. Three case-study schemes
158 were also examined in greater detail to show how the constraints in linking supply and demand are
159 being identified and overcome.

160

161 **2. Material and methods**

162 *2.1. Criteria and indicators*

163 Current UK guidance on PES, which is based the PES literature and on experiences with a number of
164 pilot schemes (Defra, 2016; Smith et al., 2013), was used to define a number of key criteria and sub-
165 criteria important in establishing a successful scheme. Critically, this advice states that ‘PES schemes

166 are most likely to emerge where specific land management actions have the potential to increase the
167 supply of a particular ecosystem service (in this case water quality), and there is a clear demand for the
168 service in question'. Sub-criteria for supply and demand included the key agricultural pollutants (N, P
169 and sediments for surface waters and N for groundwaters) and sources of demand (for drinking water
170 and recreation), respectively, as identified in the guidance and pilots (Figure 1). These supply and
171 demand criteria, and sub-criteria were considered for rivers and groundwaters separately, since they
172 involved contrasting pollutants, stakeholders and management in the pilot schemes.

173

174 [Insert Figure 1]

175

176 Indicator data for these criteria were selected based on availability at national scale, and on suitability
177 for indicating water quality demand as outlined by Wolff et al. (2015). In addition to being outlined
178 below, further details on the sources, formats, resampling and normalisation of these datasets are
179 presented in Supplementary Table S1. Indicator data are also mapped in Supplemental Figures S1, S2,
180 S3 and S4. All data were resampled to WFD inland river water body ($n = 3753$) and groundwater body
181 ($n = 271$) catchment scale, as was the approximate scale at which PES schemes were established. This
182 and all other data processing and analysis, and mapping were carried out within a GIS using ArcGIS
183 Pro (version 2.5) and QGIS software (Version 3.14.1).

184

185 The relationship between percentage contribution of agriculture to pollutant loads, actual loads in kg/ha,
186 chemical and ecological change, and impacts on different downstream users is extremely complex and
187 is probably better researched at the individual catchment level. For the purposes of this study, the
188 percentage contribution that agriculture makes to pollutant loads used is a simple metric that provides
189 information about when other sources, such as sewage treatment, are present, which could make water
190 quality improvement difficult to achieve and quantify (Bol et al., 2018; Pohle et al., 2017). It would
191 also allow for suggestions about scheme type to be made, i.e. whether to lower the contribution or
192 maintain low contributions. For river waterbodies, data on N, P and sediments were taken directly from
193 Zhang et al. (2014). Whereas data for groundwater, data were calculated from modelled N loads

194 leaching to groundwater from agricultural land by the NEAP-N national scale leaching model (Anthony
195 et al., 1996) and from all other sources by the Lerner model (Lerner, 2000) (see Supplemental Table
196 S1). All three models use a range of catchment characteristics and management to model loads from
197 agriculture and all other sources.

198

199 To indicate demand for drinking water and the presence of water companies in river waterbodies, where
200 abstractions can occur downstream, i.e. outside of the catchment, the contributing areas upstream of all
201 Environment Agency licensed abstraction points were delineated. This layer was then used to sum the
202 maximum permitted abstractions (ML) downstream of and within each river water body catchment. For
203 groundwaters, which are more hydrological independent, maximum permitted abstractions (ML) for
204 drinking water within each waterbody catchment were summed. Summing abstraction was done on the
205 premise that water companies are more likely to establish PES when large abstractions are at risk.
206 Demand for recreational use by tourists and local populations were indicated separately, as previous
207 studies have shown recreational users within the water body catchment to have higher willingness-to-
208 pay for good water quality, than users from outside the catchment (Hampson et al., 2017). Indicator
209 data were percentage of tourists visits for outdoor recreation and population by water body catchment,
210 with both raw datasets being obtained from the National Office of Statistics. When these indicators are
211 high, demand for good water quality for outdoor recreation are also expected to be high (Wolff et al.,
212 2015).

213

214 Indicator data for N, P and sediments, and water use, tourist use and local use were not significantly
215 correlated ($p > 0.05$) to suggest biases, such as double accounting for criteria. However, data were on
216 differing scales with differing distributions. Each dataset was therefore normalised to a 0-1 scale, either
217 by min-max scaling or by rank normalisation when data contained many zeros and/or extreme values.

218

219 *2.2. Determining weights*

220 Indicator data were weighted by asking thirteen PES experts from universities, water companies,
221 government organisations and non-government organisations to conduct pairwise comparisons of

222 criteria and sub-criteria as outlined in Analytical Hierarchy Process (Saaty 1980, Saaty and Vargas
223 1991). For instance, they were asked to compare whether it is easier or harder to improve river water
224 quality through PES for N, P or sediments. The three potential comparisons (N vs. P, N vs. sediments
225 and P vs. sediments) were presented to the experts in a table, each comparison with a 9 through 1 to 1/9
226 scale, with 9 being extremely easier, 1 being equal difficulty and 1/9 being extremely harder. The scores
227 assigned by the experts were entered into one half of an N, P and sediment matrix, and in the other half,
228 the corresponding reciprocal values were calculated and entered. The matrix was then normalised by
229 dividing each value in the matrix by the sum of values in the corresponding column. The mean of the
230 values in each row of the normalised matrix is then taken as the weight, and the sum of these is always
231 equal 1 (Saaty, 1980; Saaty and Vargas, 1991). Where comparisons of three or more criteria are made,
232 this approach allows for the calculation of a 'consistency ratio' with values close to zero indicating the
233 highest consistency between comparisons. Ratio's above 0.1 indicate inconsistencies amongst
234 comparisons (Saaty, 1980; Saaty and Vargas, 1991).

235

236 Experts weighted supply and demand criteria equally in both rivers and groundwaters, quoting that there
237 needs to be a good balance of 'buyers' and 'sellers' for a scheme to be successful, which validates
238 current guidance (Smith et al., 2013) with more recent experiences with PES (Figure 1). For rivers, sub-
239 criteria under supply were weighted in the order: N<P<sediments. Experts commented that this reflected
240 the transformations and lag times associated with N and, to a lesser extent P transfer, when compared
241 with sediment, which would make improving water quality more challenging and costly. They also felt
242 that best practices for sediment are more likely to be effective than for N and P. One expert placed P
243 more highly than N and sediments, commenting that because P is an ecological quality parameter for
244 WFD it may therefore receive added government attention. This slightly increased the consistency ratio
245 to 0.06 compared to values of 0.01 and 0.02 for surface water and ground water supply, respectively.
246 Sub-criteria under demand were weighted highest for drinking water abstraction but similarly for tourist
247 and local use for outdoor recreation in both surface water and groundwater catchments (Figure 1). They
248 felt that good water quality are generally underappreciated by the general public, and that as multiple
249 buyers are involved, transaction costs would be high and an intermediary organisation would be

250 required to facilitate a scheme. They felt that impacts of poor water quality on water companies are
251 usually due to the chemical aspects, rather than the ecological aspects that impact recreational users,
252 which are more difficult and take longer to solve. Furthermore, they felt that where abstraction for
253 drinking water is high, water companies are actively looking to reduce the cost of raw water treatment
254 through catchment management and have the funds and technical skills to establish a successful scheme.
255 In terms of hydrological setting, experts felt that the slow movement of pollutants through groundwater
256 makes it more difficult to identify the sources of pollution and would delay any water quality
257 improvement due to PES compared to in river catchments.

258

259 *2.3. Combining indicators*

260 Indicators were then combined using a weighted sums analysis (Figure 1), which keeps data on
261 approximately continuous scales, thereby helping to maintain model resolution (Arora, 2012;
262 Balasubramaniam and Voulvoulis, 2005); an important quality when dealing with such large numbers
263 of catchments. Data for supply sub-criteria were then multiplied by their respective weights depending
264 on whether data was for groundwater or river water bodies and then summed, then the same process
265 was carried out for demand sub-criteria (Figure 1). Totals for supply and demand criteria were then
266 multiplied by their respective weights and then the two were summed. Optionally, the new totals can
267 be multiplied by weights for hydrological setting. The resulting values indicated the overall potential
268 for PES to improve water quality (Figure 1). Results were divided into quintiles of supply, demand
269 and potential scores, for river and groundwaters separately. The first, second, third, fourth and fifth
270 quintiles, indicate: low, medium-low, medium, medium-high and high, supply, demand or potential,
271 respectively.

272

273 While some catchments will have both high supply potential and high demand for improved water
274 quality and lend themselves to a classic PES scheme, other catchments may lack supply, demand or
275 both. Identifying these catchments would allow suggestions about alternative types of scheme for
276 private sector investment in catchment management. This was based on supply and demand scores for
277 individual catchments and whether they were above or below the overall median, and this was carried

278 out for rivers and groundwaters separately. These PES and alternative scheme types are defined in
279 Figure 2, and some example schemes are outlined in Table 2.

280

281 [Insert Figure 2]

282

283 *2.4. Validation*

284 In the absence of water quality data, the approach was validated by testing the scientific hypothesis that
285 catchments where PES are currently established or being established would contain a higher proportion
286 of waterbodies scoring high potential or identified as PES restoration types than would be present in
287 the overall population of waterbodies. This was tested on the premise that PES schemes are most likely
288 to emerge where agriculture has the potential to increase the supply of water quality, and there is a clear
289 demand for improved water quality (Smith et al., 2013). Thirteen existing schemes, containing 105
290 individual waterbodies were used in this validation (Figure 3). Schemes included those in the rivers
291 Fowey, Western Rother, Wicksters Brook, Tamar, Wolf, Lyd, Sussex Ouse, Evenlode, middle Severn
292 and Gara, and in groundwaters Frome and Piddle, Upper Hampshire Avon and Chichester Chalk. The
293 proportions of waterbodies in these catchments scoring high potential were tested against the same
294 proportion in the wider population using a two-sample Z-test of proportions, which was repeated for
295 PES restoration scheme types.

296

297 *2.5. Technical, legal and financial constraints in linking supply and demand*

298 Three case-study schemes in the south of England were examined in greater detail to show how the
299 constraints in linking supply and demand are being identified and overcome. All three schemes are case-
300 studies in the EU Interreg VA funded Channel Payments for Ecosystem Services Project led by the
301 University of Chichester. The project aims to establish PES schemes to improve water quality in the
302 north of France and south of England (for more information see: <https://www.cpes-interreg.eu/en/>). The
303 three case-studies used here were the river Western Rother in West Sussex, South Downs groundwater
304 in West Sussex and the Salcombe-Kingsbridge estuary in Devon (Figure 3). They differ in hydrological
305 setting as the river Western Rother and South Downs groundwater both have ground and surface water

306 hydrological components, whereas, being located away from principal aquifers, the Salcombe-
307 Kingsbridge estuary is surface water dominated (Figure 3). The catchments also differ in supply and
308 demand factors, and in the technical, legal and economic constraints in linking them, and hence also
309 have different scheme designs (Table 2).

310

311 [Insert Figure 3]

312

313 [Insert Table 2]

314

315 **3. Results and discussion**

316 *3.1. Potential of PES for improving water quality*

317 The approach presented here is based on MCA and uses current guidance to select criteria, expert
318 judgement to weight criteria and readily available, national datasets to indicate those criteria. Once
319 indicators are normalized, it combines them in a weighted sums analysis and presents results spatially
320 at the national scale, all within a GIS. The analysis is flexible and can easily be built upon to include
321 additional supply criteria, such as pesticides, bacteria, metals or dissolved organic carbon, and/or
322 additional demand criteria such as conservation and angling groups. It can therefore also be easily
323 applied to the country or region of interest by using locally relevant criteria, expert judgement weight
324 those criteria and data to indicate them. For example, when applied to the situation for river waterbodies
325 in England, current guidance suggested that the potential for agriculture to improve the supply of good
326 water quality (for nitrogen, phosphorus and sediments) and the demand for improved water quality from
327 key downstream users (water companies and, tourist and local recreational users) should be key criteria
328 for deciding potential. Readily available data was used to indicate these and expert judgement, using
329 pairwise comparisons, assigned equal weight to supply and demand criteria, and the highest weights to
330 sediments and water companies for sub-criteria. When combined in a weighted sums analysis, it was
331 possible to identify areas with high potential for PES, and these results are presented in Figures 4 and
332 5. For rivers, high potential areas include the north and west of the country, where the varied topography
333 suits surface water collection and storage for drinking purposes. Whereas for groundwaters, these areas

334 were in the south-east of the country, where principal bedrock aquifers are present and a greater water
335 company reliance on them as drinking water sources (EA 2012). However, as with MCA in general the
336 results are highly influenced by the selection of criteria and sub-criteria (Balasubramaniam and
337 Voulvoulis, 2005), and it is possible that results would follow a different spatial pattern when other
338 pollutants or types of downstream users are included. An alternative way of selecting comprehensive
339 criteria and sub criteria would be to draw on expert judgement, and this has been used with great success
340 in other MCA analyses (Bampa et al., 2019).

341

342 [Insert Figure 4]

343

344 [Insert Figure 5]

345

346 The main difference between this approach and the ones presented in similar studies is the focus here
347 on private sector investment in catchment management through small-scale PES schemes. Because of
348 this focus, it has been essential to weight criteria, especially for demand, as different downstream users
349 vary greatly in their willingness-to-pay upstream farmers and in their abilities to set up a scheme. This
350 is compared to previous approaches that are mainly concerned with identifying areas for government
351 investment in catchment management through national scale schemes, where weighting may not have
352 been so necessary (e.g. Locatelli et al., 2014; Wendland et al., 2010). When applied to the situation in
353 the UK, the approach was able to utilise a comparably higher quality of data than what has been used
354 in previous studies (e.g. Burkhard et al., 2012; Vrebos et al., 2015). This is due the catchment-science
355 specific and high-resolution of data recently available in this country. Supply indicators involved
356 detailed modelling of pollutant loads to rivers and groundwaters for all waterbody catchments (Zhang
357 et al., 2014). Indicating demand involved combining abstraction volumes with areas upstream of
358 abstraction points, which allowed demand from users downstream of the waterbody catchments
359 themselves to be included. As with many supply and demand mapping studies, other aspects were
360 constrained by data availability (Wolff et al., 2015), and this would likely be the case especially when
361 the approach is applied to more data sparse areas or countries (Pohle et al., 2021; Vrebos et al., 2015).

362 For example, this study indicates demand from tourists for recreation using the percentage of tourist
363 visits for outdoor recreation purposes. This does not directly indicate use of the waterbodies for
364 recreation, because outdoor recreation doesn't always involve water. While the willingness-to-pay of
365 local and tourist recreational users for improved water quality has been accurately estimated for
366 individual waterbodies (Glenk et al., 2011; Hampson et al., 2017), an exercise to extrapolate those
367 results to the national scale would very valuable for future mapping studies.

368

369 If the approach is to be considered at all accurate then catchments where PES are currently established
370 or being established would contain a higher proportion of waterbodies scoring high potential than would
371 be present in the overall population of waterbodies. This was indeed the case, with 65 % of waterbodies
372 within the catchments where PES are currently being established scoring high potential, compared to
373 20 % in the overall population (significantly different to $p < 0.0001$). These proportions were not
374 expected to reach 100 %, since not all factors were included in the analysis and because PES is often
375 targeted at problematic waterbodies within the wider catchment area of the scheme and these were not
376 always known. Water quality improvement data from the schemes would also further strengthen this
377 validation when it becomes available.

378

379 This validation exercise also shows how PES schemes are already starting to emerge in a small
380 proportion of high potential waterbodies, and this mapping study could further motivate that
381 proliferation. Even though the target pollutants and scale of these schemes will not always be aligned
382 with the WFD, a water quality improvement at any level should be a welcome contribution to achieving
383 GES. The current agricultural policy reforms happening in Europe must ensure adaptation of policy to
384 accommodate this new wave of catchment management.

385

386 *3.2. Type of schemes to improve water quality*

387 The approach was also validated based on the scientific hypothesis that catchments where PES are
388 currently established or being established would contain a higher proportion of waterbodies identified
389 as PES restoration types than would be present in the overall population of waterbodies. A proportion

390 76 % of waterbodies within catchments where PES schemes are being or have been established were
391 identified as being PES restoration types, compared to 25 % in the overall population (significantly
392 different to $p < 0.0001$).

393

394 The situation where water companies are incentivising upstream farmers to adopt better practices
395 because they are being impacted by diffuse pollution, or ‘PES restoration’ type schemes, are the most
396 common types of scheme found in England. However, there are alternative options for private sector
397 investment in catchment management for when supply potential, demand or both are lacking. To
398 suggest alternative types, the mapping approach further classifies catchments as being best suited to
399 either ‘PES protection’, ‘community restoration’ or ‘community protection’ type schemes. This is based
400 on whether their scores for demand are above or below the overall median, and this was carried out for
401 rivers and groundwaters separately (figures 4&5).

402

403 The PES protection type schemes would be best suited to catchments with high water company demand
404 but low potential for agriculture to improve the supply of good water quality. Such area include the
405 Thames Basin upstream of London, where sources other than agriculture are more important for water
406 quality (Figures 4 & 5). These schemes are important as they provide protection when external forces
407 such as agricultural intensification brought about by the abolition of EU milk quotas (Groeneveld et al.,
408 2016), or climate change (Ockenden et al., 2017) threaten to increase agricultural diffuse pollution. As
409 such, water companies may establish these schemes for risk management since they aim to eliminate
410 future impacts and associated costs of water treatment. Catchments with high supply but low demand
411 scores, where community restoration schemes are more suited, are mainly located around the fringes of
412 the country (Figures 4 & 5). These schemes would likely require an ‘intermediary’ organisation to
413 effectively facilitate payments from multiple individuals and businesses to farmers (Cook et al., 2017;
414 Engel et al., 2008). These intermediaries may play a number of roles including: introducing downstream
415 users and farmers and building rapport between them; establishing water quality baselines; identifying
416 best practices that will improve water quality; assisting in determining prices, accessing grants,
417 structuring agreements and agreeing a mutually acceptable payment regime; performing activities

418 related to implementation (including monitoring, certification, verification, etc); and overall scheme
419 administration (Cook et al., 2017; Smith et al., 2013). These activities cannot be conducted without cost
420 and one example of how policy might be adapted to accommodate PES, is to channel more government
421 funding towards the facilitation of these community type schemes by regulatory bodies or
422 environmental charities. If the budget available for incentivising practice and/or land use change is not
423 sufficient to improve water quality, intermediaries may also seek additional private sector funds from
424 outside the catchment, for example, from companies looking to offset their carbon emissions. In
425 catchments with low supply and demand, externally funded protective schemes may look similar,
426 except with the aim to ensure the inputs of pollutants from agriculture kept low.

427

428 *3.3. Technical, legal and financial constraints in linking supply and demand*

429 This mapping approach allowed for some basic supply and demand barriers to be identified in advance
430 (See Supplemental Table S2), and these barriers were confirmed by more detailed research within each
431 catchment (Table 2). However, it could not be expected to identify the catchment specific constraints
432 in linking supply and demand. Instead, the downstream users or intermediary organisations establishing
433 a scheme would carry out extensive research to understand their catchments and design the scheme in
434 detail. In the case-study schemes, this research involved gathering existing data, monitoring, modelling,
435 field experiments, cost benefit analysis, stakeholder analysis and mapping, and stakeholder
436 engagement. Amongst others, these constraints included technical challenges such as targeting of
437 payments at ‘critical source areas’ of the catchment that contribute the majority of pollutant loads; legal
438 constraints such as those that discourage or prevent tenant farmers from enrolling on schemes; and
439 economic constraints such as the balance between the costs that impacts are creating, the actual budget
440 available for catchment management, and the estimated costs of improving water quality by catchment
441 management (Table 2).

442

443 In the South Downs groundwater scheme, combined monitoring and modelling by the water company
444 identified a gradual increasing trend in nitrate concentrations at their groundwater boreholes as water
445 moves slowly through the chalk matrix ($\sim 1 \text{ m yr}^{-1}$). This trend is overlain by a series of spikes, which

446 they proved through tracer experiments, to be due to rapid transfer of N through fissures in the chalk in
447 response to rainfall events (Stuart et al., 2016). The water company identified all fields overlying these
448 fissures and plan to incentivise arable reversion to low input grassland on them to address the N spikes,
449 whilst also incentivising widespread adoption of cover crops in attempt to halt any increase in the
450 longer-term trend.

451

452 Farmers on short term tenancy agreements, or farmers whose landlords determines any interaction with
453 agri-environment schemes may be less likely to enrol on these types of schemes (Harrison-Mayfield et
454 al., 1998; Maye et al., 2009). This has been the case particularly in the Western Rother catchment,
455 where, despite over 50 years of research into erosion and management, the issue remains unresolved
456 (Boardman, 2016; Boardman et al., 2009; Farres et al., 1990). To encourage adoption of practices, the
457 water company operating in this catchment are working with farmers to co-design a scheme to ensure
458 practices are financially attractive and compatible with the farming systems present. They are also
459 working with land-owners to have those practices written into farm tenancy agreements.

460

461 Understanding the costs that water quality impacts are creating relative to the costs of incentivising
462 enough practices to improve water quality, can be key to designing a successful PES scheme. For
463 instance, in the South Downs groundwater scheme it was important for the water company's catchment
464 management team to demonstrate this to be able to secure internal funding for PES. Through their
465 modelling work, they demonstrated that incentivising farmers in a PES scheme would cost ~£3.3M to
466 achieve the desired affect by 2075. This is compared to the ~£8M cost of setting up and running a nitrate
467 removal plant over the same timescale, giving a net benefit of ~£4.7M, a clear case for PES restoration.

468

469 Such a quantitative assessment is not always necessary. In the Salcombe-Kingsbridge estuary scheme,
470 it was quite clear to the Westcountry Rivers Trust (WRT), the intermediary organisation establishing a
471 community restoration type scheme, that funds generated within the catchment would not be sufficient
472 to improve water quality. The types of multiple individual or small business 'buyers' that are present
473 here are generally supportive of the concept of catchment management, however, previous schemes

474 have found them difficult to engage (Rogers et al. 2015). The WRT have established a trust fund, to
475 which local businesses and individuals can contribute, which will reduce the costs associated with
476 multiple transactions (Jack et al. 2008, Goldman-Benner et al. 2012). To further boost funds, they are
477 also looking to attract external buyers who wish to offset their carbon emissions by investing in practices
478 that involve tree planting and/or other practices that result in increased soil organic carbon. They will
479 distribute the funds to farmers in exchange for practice or land use change either through one-to-one
480 visits with a WRT advisor to negotiate grant funding or through a reverse auction system. In the auction
481 system, farmers bid for funds and the bids likely to deliver the greatest impacts on water quality are
482 funded, making any actions more cost-effective (Valcu-Lisman et al., 2017). The WRT are also
483 involved in several of the other schemes mentioned in section 2.4, such as those in the river Tamar
484 catchment.

485

486 These are just a few of the design considerations made in the case-study schemes in-order to link supply
487 and demand, and realise PES potential. They also made many of the frequently cited design
488 considerations such as, how the scheme will provide additional protection or restoration for water
489 quality above what is already present, and how the payments will be conditional on implementation of
490 practices (Engel et al., 2008; Wunder et al., 2018). The Channel Payments for Ecosystem Services
491 project will bring together experiences from these schemes and from three other schemes in northern
492 France, to provide up-to-date guidance, specific to catchment management, for designing PES in this
493 second tier.

494

495 **4. Conclusion**

496 This study presents an approach to mapping the potential for PES to improve water quality in
497 agricultural catchments. The approach is based on MCA, with the potential for agriculture to increase
498 the supply of good water quality and the demand from downstream water users for water quality
499 improvements included as key criteria. The approach involves the following steps:

- 500 1. Select supply and demand sub-criteria using expert judgement or current guidance on PES

- 501 2. Weight criteria using expert judgement through pairwise comparisons
- 502 3. Indicate criteria with readily available, national datasets
- 503 4. Normalise indicators using appropriate techniques
- 504 5. Combine indicators in a weighted sums analysis
- 505 6. Present results at the national scale

506 Whilst following these steps the approach can easily be applied to the country or region of interest by
507 using locally relevant criteria, expert judgement and data. When applied to the situation in England, it
508 was possible to identify areas of high potential, which would hopefully motivate more detailed research
509 at the individual catchment level into the constraints in linking supply and demand. This study also
510 allows for some basic barriers to PES to be identified and suggestions for alternative types of schemes
511 to be made. Furthermore, by simultaneously assessing the current state of PES in England, it was
512 possible to make some initial policy recommendations. Specifically, this was that policy must be
513 adapted to accommodate this new wave of catchment management, and one way this might happen is
514 for some government funding to be channelled towards the facilitation of community type schemes.

515

516 **5. Acknowledgements**

517 This work was supported by the Interreg ‘Channel Payments for Ecosystem Services’ project, funded
518 through the European Regional Development Fund (ERDF). The authors would like to thank the project
519 partners for collaboration and access to data on the case-study schemes. They would also like to thank
520 the anonymous reviewers for their extremely valuable inputs to the manuscript.

521

522 **6. References**

523 Anthony, S., Quinn, P., Lord, E., 1996. Catchment scale modelling of nitrate leaching. *Asp. Appl.*

524 *Biol.*

525 Arora, J.S., 2012. Chapter 17 - Multi-objective Optimum Design Concepts and Methods, in: Arora,

526 J.S. (Ed.), *Introduction to Optimum Design (Third Edition)*. Academic Press, Boston, pp. 657–

527 679. [https://doi.org/https://doi.org/10.1016/B978-0-12-381375-6.00017-6](https://doi.org/10.1016/B978-0-12-381375-6.00017-6)

528 Balasubramaniam, A., Voulvoulis, N., 2005. The Appropriateness of Multicriteria Analysis in
529 Environmental Decision-Making Problems. *Environ. Technol.* 26, 951–962.
530 <https://doi.org/10.1080/09593332608618484>

531 Bampa, F., O’Sullivan, L., Madena, K., Sandén, T., Spiegel, H., Henriksen, C.B., Ghaley, B.B., Jones,
532 A., Staes, J., Sturel, S., Trajanov, A., Creamer, R.E., Debeljak, M., 2019. Harvesting European
533 knowledge on soil functions and land management using multi-criteria decision analysis. *Soil*
534 *Use Manag.* 35, 6–20. <https://doi.org/https://doi.org/10.1111/sum.12506>

535 Bateman, I.J., Balmford, B., 2018. Public funding for public goods: A post-Brexit perspective on
536 principles for agricultural policy. *Land use policy* 79, 293–300.
537 <https://doi.org/https://doi.org/10.1016/j.landusepol.2018.08.022>

538 Bell, A.R., Benton, T.G., Droppelmann, K., Mapemba, L., Pierson, O., Ward, P.S., 2018.
539 Transformative change through Payments for Ecosystem Services (PES): a conceptual
540 framework and application to conservation agriculture in Malawi. *Glob. Sustain.* 1, e4.
541 <https://doi.org/10.1017/sus.2018.4>

542 Bennett, G., Leonardi, A., Ruef, F., 2017. State of European markets 2017. Watershed Investments.
543 Forest Trends’ Ecosystem Marketplace, Washington DC. .

544 Bieroza, M.Z., Bol, R., Glendell, M., 2021. What is the deal with the Green Deal: Will the new
545 strategy help to improve European freshwater quality beyond the Water Framework Directive?
546 *Sci. Total Environ.* 791, 148080. <https://doi.org/https://doi.org/10.1016/j.scitotenv.2021.148080>

547 Boardman, J., 2016. The value of Google Earth™ for erosion mapping. *CATENA* 143, 123–127.
548 <https://doi.org/https://doi.org/10.1016/j.catena.2016.03.031>

549 Boardman, J., Shepherd, M.L., Walker, E., Foster, I.D.L., 2009. Soil erosion and risk-assessment for
550 on- and off-farm impacts: A test case using the Midhurst area, West Sussex, UK. *J. Environ.*
551 *Manage.* 90, 2578–2588. <https://doi.org/https://doi.org/10.1016/j.jenvman.2009.01.018>

552 Bol, R., Gruau, G., Mellander, P.-E., Dupas, R., Bechmann, M., Skarbøvik, E., Bieroza, M., Djodjic,
553 F., Glendell, M., Jordan, P., Van der Grift, B., Rode, M., Smolders, E., Verbeeck, M., Gu, S.,
554 Klumpp, E., Pohle, I., Fresne, M., Gascuel-Odoux, C., 2018. Challenges of Reducing
555 Phosphorus Based Water Eutrophication in the Agricultural Landscapes of Northwest Europe.

556 Front. Mar. Sci. 5. <https://doi.org/10.3389/fmars.2018.00276>

557 Burkhard, B., Kroll, F., Nedkov, S., Müller, F., 2012. Mapping ecosystem service supply, demand and
558 budgets. *Ecol. Indic.* 21, 17–29. <https://doi.org/10.1016/j.ecolind.2011.06.019>

559 Collins, A.L., Anthony, S.G., 2008. Assessing the likelihood of catchments across England and Wales
560 meeting ‘good ecological status’ due to sediment contributions from agricultural sources.
561 *Environ. Sci. Policy* 11, 163–170. <https://doi.org/10.1016/j.envsci.2007.07.008>

562 Collins, A.L., Zhang, Y., Upadhyay, H.R., Pulley, S., Granger, S.J., Harris, P., Sint, H., Griffith, B.,
563 2021. Current advisory interventions for grazing ruminant farming cannot close exceedance of
564 modern background sediment loss – Assessment using an instrumented farm platform and
565 modelled scaling out. *Environ. Sci. Policy* 116, 114–127.
566 <https://doi.org/10.1016/j.envsci.2020.11.004>

567 Cook, H., Couldrick, L., Smith, L., 2017. An Assessment of Intermediary Roles in Payments for
568 Ecosystem Services Schemes in the Context of Catchment Management: An Example from
569 South West England. *J. Environ. Assess. Policy Manag.* 19, 1750003.
570 <https://doi.org/10.1142/s146433321750003x>

571 Defra, 2016. Defra’s Payments for Ecosystem Services Pilot Projects 2012-2015: Review of key
572 findings. Department for Environment, Food and Rural Affairs.

573 Engel, S., Pagiola, S., Wunder, S., 2008. Designing payments for environmental services in theory
574 and practice: An overview of the issues. *Ecol. Econ.* 65, 663–674.
575 <https://doi.org/10.1016/j.ecolecon.2008.03.011>

576 Farres, P.J., Clifford, N.J., White, I.D., 1990. Sub-surface colluviation: An example from West
577 Sussex, UK. *CATENA* 17, 551–561. [https://doi.org/10.1016/0341-](https://doi.org/10.1016/0341-8162(90)90029-D)
578 [8162\(90\)90029-D](https://doi.org/10.1016/0341-8162(90)90029-D)

579 Fealy, R.M., Buckley, C., Mehan, S., Melland, A., Mellander, P.E., Shortle, G., Wall, D., Jordan, P.,
580 2010. The Irish Agricultural Catchments Programme: catchment selection using spatial multi-
581 criteria decision analysis. *Soil Use Manag.* 26, 225–236. [https://doi.org/10.1111/j.1475-](https://doi.org/10.1111/j.1475-2743.2010.00291.x)
582 [2743.2010.00291.x](https://doi.org/10.1111/j.1475-2743.2010.00291.x)

583 Glenk, K., Lago, M., Moran, D., 2011. Public preferences for water quality improvements:

584 implications for the implementation of the EC Water Framework Directive in Scotland. *Water*
585 *Policy* 13, 645–662. <https://doi.org/10.2166/wp.2011.060>

586 Goldman-Benner, R.L., Benitez, S., Boucher, T., Calvache, A., Daily, G., Kareiva, P., Kroeger, T.,
587 Ramos, A., 2012. Water funds and payments for ecosystem services: practice learns from theory
588 and theory can learn from practice. *Oryx* 46, 55–63.
589 <https://doi.org/10.1017/S0030605311001050>

590 Groeneveld, A., Peerlings, J., Bakker, M., Heijman, W., 2016. The effect of milk quota abolishment
591 on farm intensity: Shifts and stability. *NJAS - Wageningen J. Life Sci.* 77, 25–37.
592 <https://doi.org/https://doi.org/10.1016/j.njas.2016.03.003>

593 Hampson, D.I., Ferrini, S., Rigby, D., Bateman, I.J., 2017. River Water Quality: Who Cares, How
594 Much and Why? *Water* 9, 621.

595 Harrison-Mayfield, L., Dwyer, J., Brookes, G., 1998. The Socio-Economic Effects of the Countryside
596 Stewardship Scheme. *J. Agric. Econ.* 49, 157–170. [https://doi.org/https://doi.org/10.1111/j.1477-](https://doi.org/https://doi.org/10.1111/j.1477-9552.1998.tb01261.x)
597 [9552.1998.tb01261.x](https://doi.org/https://doi.org/10.1111/j.1477-9552.1998.tb01261.x)

598 Jack, B.K., Kousky, C., Sims, K.R.E., 2008. Designing payments for ecosystem services: Lessons
599 from previous experience with incentive-based mechanisms. *Proc. Natl. Acad. Sci.* 105, 9465.
600 <https://doi.org/10.1073/pnas.0705503104>

601 Kay, P., Grayson, R., Phillips, M., Stanley, K., Dodsworth, A., Hanson, A., Walker, A., Foulger, M.,
602 McDonnell, I., Taylor, S., 2012. The effectiveness of agricultural stewardship for improving
603 water quality at the catchment scale: Experiences from an NVZ and ECSFDI watershed. *J.*
604 *Hydrol.* 422–423, 10–16. <https://doi.org/https://doi.org/10.1016/j.jhydrol.2011.12.005>

605 Le Moal, M., Gascuel-Oudou, C., Ménesguen, A., Souchon, Y., Étrillard, C., Levain, A., Moatar, F.,
606 Pannard, A., Souchu, P., Lefebvre, A., Pinay, G., 2019. Eutrophication: A new wine in an old
607 bottle? *Sci. Total Environ.* 651, 1–11.
608 <https://doi.org/https://doi.org/10.1016/j.scitotenv.2018.09.139>

609 Lerner, D.N., 2000. Guidelines for estimating urban loads of nitrogen to groundwater. *Groundw. Prot.*
610 *Restor. Group, Dep. Civ. Struct. Eng. Univ. Sheff.*

611 Locatelli, B., Imbach, P., Wunder, S., 2014. Synergies and trade-offs between ecosystem services in

612 Costa Rica. *Environ. Conserv.* 41, 27–36. <https://doi.org/10.1017/S0376892913000234>

613 Maye, D., Ilbery, B., Watts, D., 2009. Farm diversification, tenancy and CAP reform: Results from a
614 survey of tenant farmers in England. *J. Rural Stud.* 25, 333–342.
615 <https://doi.org/https://doi.org/10.1016/j.jrurstud.2009.03.003>

616 Melland, A.R., Fenton, O., Jordan, P., 2018. Effects of agricultural land management changes on
617 surface water quality: A review of meso-scale catchment research. *Environ. Sci. Policy* 84, 19–
618 25. <https://doi.org/https://doi.org/10.1016/j.envsci.2018.02.011>

619 Ockenden, M.C., Hollaway, M.J., Beven, K.J., Collins, A.L., Evans, R., Falloon, P.D., Forber, K.J.,
620 Hiscock, K.M., Kahana, R., Macleod, C.J.A., 2017. Major agricultural changes required to
621 mitigate phosphorus losses under climate change. *Nat. Commun.* 8, 1–9.

622 OJEC, 2000. Council Directive 2000/60/EEC of 23 October 2000 of the European Parliament and of
623 the Council: Establishing a Framework for Community Action in the Field of Water Policy. *Off.*
624 *J. Eur. Community.*

625 OJEC, 1991. Council Directive 91/676/EEC of 12 December 1991 Concerning the Protection of
626 Waters Against Pollution Caused by Nitrates from Agricultural Sources. *Off. J. Eur.*
627 *Community.*

628 Pohle, I., Baggaley, N., Palarea-Albaladejo, J., Stutter, M., Glendell, M., 2021. A Framework for
629 Assessing Concentration-Discharge Catchment Behavior From Low-Frequency Water Quality
630 Data. *Water Resour. Res.* 57, e2021WR029692.
631 <https://doi.org/https://doi.org/10.1029/2021WR029692>

632 Pohle, I., Glendell, M., Stutter, M.I., Helliwell, R.C., 2017. An approach to predict water quality in
633 data-sparse catchments using hydrological catchment similarity, in: EGU General Assembly
634 Conference Abstracts. p. 9837.

635 Pulley, S., Collins, A.L., 2021. Can agri-environment initiatives control sediment loss in the context
636 of extreme winter rainfall? *J. Clean. Prod.* 311, 127593.
637 <https://doi.org/https://doi.org/10.1016/j.jclepro.2021.127593>

638 Rogers, S., Rose, S., Spence, J., Hester, N., 2015. Holnicote Payments for Ecosystem Services (PES)
639 Pilot Research Project. PES pilot research projects (2014-2015). United Kingdom, DEFRA.

640 DEFRA, United Kingdom.

641 Saaty, T.L., 1980. The analytic hierarchy process. McGraw-Hill, New York.

642 Saaty, T.L., Vargas, L.G., 1991. Prediction, Projection and Forecasting. Kluwer Academic Publishers,
643 Dordrecht .

644 Smith, S., Rowcroft, P., Everard, M., Couldrick, L., Reed, M., Rogers, H., Quick, T., Eves, C., White,
645 C., Defra, 2013. Payments for Ecosystem Services: A Best Practice Guide. London.

646 Stuart, M.E., Wang, L., Ascott, M., Ward, R.S., Lewis, M.A., Hart, A.J., Survey, british G., 2016.
647 Modelling the Groundwater Nitrate Legacy. British Geological Survey, Nottingham, UK.

648 Valcu-Lisman, A.M., Gassman, P.W., Arritt, R., Campbell, T., Herzmann, D.E., 2017. Cost-
649 effectiveness of reverse auctions for watershed nutrient reductions in the presence of climate
650 variability: An empirical approach for the Boone River watershed. *J. Soil Water Conserv.* 72,
651 280–295. <https://doi.org/10.2489/jswc.72.3.280>

652 Vrebos, D., Staes, J., Vandenbroucke, T., D'Haeyer, T., Johnston, R., Muhumuza, M., Kasabeke, C.,
653 Meire, P., 2015. Mapping ecosystem service flows with land cover scoring maps for data-scarce
654 regions. *Ecosyst. Serv.* 13, 28–40. [https://doi.org/https://doi.org/10.1016/j.ecoser.2014.11.005](https://doi.org/10.1016/j.ecoser.2014.11.005)

655 Wendland, K.J., Honzák, M., Portela, R., Vitale, B., Rubinoff, S., Randrianarisoa, J., 2010. Targeting
656 and implementing payments for ecosystem services: Opportunities for bundling biodiversity
657 conservation with carbon and water services in Madagascar. *Ecol. Econ.* 69, 2093–2107.
658 [https://doi.org/https://doi.org/10.1016/j.ecolecon.2009.01.002](https://doi.org/10.1016/j.ecolecon.2009.01.002)

659 Wolff, S., Schulp, C.J.E., Verburg, P.H., 2015. Mapping ecosystem services demand: A review of
660 current research and future perspectives. *Ecol. Indic.* 55, 159–171.
661 [https://doi.org/https://doi.org/10.1016/j.ecolind.2015.03.016](https://doi.org/10.1016/j.ecolind.2015.03.016)

662 Wunder, S., Brouwer, R., Engel, S., Ezzine-de-Blas, D., Muradian, R., Pascual, U., Pinto, R., 2018.
663 From principles to practice in paying for nature's services. *Nat. Sustain.* 1, 145–150.
664 <https://doi.org/10.1038/s41893-018-0036-x>

665 Wunder, S., Engel, S., Pagiola, S., 2008. Taking stock: A comparative analysis of payments for
666 environmental services programs in developed and developing countries. *Ecol. Econ.* 65, 834–
667 852. [https://doi.org/https://doi.org/10.1016/j.ecolecon.2008.03.010](https://doi.org/10.1016/j.ecolecon.2008.03.010)

668 Zhang, Y., Collins, A.L., Murdoch, N., Lee, D., Naden, P.S., 2014. Cross sector contributions to river
669 pollution in England and Wales: Updating waterbody scale information to support policy
670 delivery for the Water Framework Directive. *Environ. Sci. Policy* 42, 16–32.
671 <https://doi.org/https://doi.org/10.1016/j.envsci.2014.04.010>

672