



UNIVERSITY OF LEEDS

This is a repository copy of *Do awareness-focussed approaches to mitigating diffuse pollution work? A case study using behavioural and water quality evidence.*

White Rose Research Online URL for this paper:
<https://eprints.whiterose.ac.uk/171356/>

Version: Accepted Version

Article:

Okumah, M orcid.org/0000-0002-2937-8467, Chapman, PJ orcid.org/0000-0003-0438-6855, Martin-Ortega, J orcid.org/0000-0003-0002-6772 et al. (5 more authors) (2021) Do awareness-focussed approaches to mitigating diffuse pollution work? A case study using behavioural and water quality evidence. *Journal of Environmental Management*, 287. 112242. ISSN 0301-4797

<https://doi.org/10.1016/j.jenvman.2021.112242>

© 2021, Elsevier. This manuscript version is made available under the CC-BY-NC-ND 4.0 license <http://creativecommons.org/licenses/by-nc-nd/4.0/>.

Reuse

This article is distributed under the terms of the Creative Commons Attribution-NonCommercial-NoDerivs (CC BY-NC-ND) licence. This licence only allows you to download this work and share it with others as long as you credit the authors, but you can't change the article in any way or use it commercially. More information and the full terms of the licence here: <https://creativecommons.org/licenses/>

Takedown

If you consider content in White Rose Research Online to be in breach of UK law, please notify us by emailing eprints@whiterose.ac.uk including the URL of the record and the reason for the withdrawal request.



eprints@whiterose.ac.uk
<https://eprints.whiterose.ac.uk/>

1 Do awareness-focussed approaches to mitigating diffuse pollution 2 work? A case study using behavioural and water quality evidence 3

4 Murat Okumah^{a*}, Pippa J. Chapman^b, Julia Martin-Ortega^a, Paula Novo^c, Marie Ferré^a,
5 Sarah Jones^d, Phillipa Pearson^d and Tara Froggatt^d
6

7 ^a Sustainability Research Institute, School of Earth and Environment, University of Leeds, Leeds, LS2
8 9JT, England, UK

9 ^b School of Geography, University of Leeds, Leeds, LS2 9JT, England, UK

10 ^c Rural Economy, Environment and Society Department, Scotland's Rural College (SRUC),
11 Edinburgh, EH9 3JG, Scotland, UK

12 ^d Water Services Science, Dŵr Cymru Welsh Water, Pentwyn Road, Nelson, Treharris, CF46 6LY

13 *corresponding author: ee15sa@leeds.ac.uk
14
15
16

17 ABSTRACT

18
19 Efforts to tackle diffuse water pollution from agriculture are increasingly focussing on improving
20 farmers' awareness under the expectation that this would contribute to adoption of best management
21 practices (BMPs) and, in turn, result in water quality improvements. To date, however, no study has
22 explored the full awareness-behaviour-water quality pathway; with previous studies having mostly
23 addressed the awareness-behaviour link relying on disciplinary approaches. Using an interdisciplinary
24 approach, we investigate whether awareness-focussed approaches to mitigating diffuse water pollution
25 from agriculture indeed result in water quality improvement, addressing the pathway in full. We worked
26 with Dŵr Cymru Welsh Water (a water and waste utility company in the UK) on a pesticide pollution
27 intervention programme, referred to as "weed wiper trial". The main goal of the trial was to raise
28 farmers' awareness regarding pesticide management practices and to promote uptake of BMPs to tackle
29 the rising concentrations of the pesticide MCPA (2-methyl-4-chlorophenoxyacetic acid) in raw water
30 in three catchments in Wales. Using factorial analysis of variance, we analysed MCPA concentrations
31 from 2006 to 2019 in the three targeted catchments and in three control catchments. This was followed
32 by semi-structured in-depth interviews with institutional stakeholders and farmers with varying degrees
33 of exposure to the weed wiper trial. Results show that MCPA concentration for both targeted and control
34 catchments had reduced after the implementation of the weed wiper trial. However, the decline was
35 significantly larger ($F(1) = 6.551$, $p < 0.05$, $n = 3077$, Partial eta-squared (η^2) = 0.002) for
36 the targeted catchments (mean = 45.2%) compared to the control catchments (mean = 10.9%). Results
37 from the stakeholder interviews indicate that improved awareness contributed to changes in farmers'
38 behaviour and that these can be related to the water quality improvements reflected by the decline in
39 MCPA concentration. Alongside awareness, other psychosocial, economic, agronomic factors,
40 catchment and weather conditions also influenced farmer's ability to implement BMPs and thus overall
41 water quality improvements.
42

43 **Keywords:** Best Management Practices; Diffuse Pollution; Glyphosate; MCPA (2-methyl-4-
44 chlorophenoxyacetic acid); Pesticides; Wales
45
46
47
48
49
50

51 **1. INTRODUCTION**

52
53 Diffuse water pollution from agriculture is one of today’s major environmental problems, with great
54 social impacts such as cost of water treatment and reduced recreational potential of water resources
55 (Damania et al., 2019; United Nations, 2016; OECD, 2012, OECD, 2017). Policy interventions are
56 increasingly focusing on improving farmers’ awareness on these problems under the expectation that
57 this can lead to adoption of best management practices (BMPs), i.e. practical measures to reduce the
58 amount of fertilisers, pesticides and other pollutants entering watercourses. Examples of these policies
59 include, for example, the Water Quality Scheme and the Environmental Quality Incentive Programme
60 in the United States (NRCS, 2018, 2019), the Monitor Farms Programme in New Zealand (Ministry for
61 the Environment, 2014), the Reef 2050 Water Quality Improvement Plan in Australia (Queensland
62 Government, 2018), the Catchment Sensitive Farming Delivery Initiative in England (Environment
63 Agency, 2011, Environment Agency, 2014) and the Diffuse Pollution Management Strategy in Scotland
64 (DPMAG, 2015). Improving farmers’ awareness is expected to deepen their understanding of the link
65 between land management practices and diffuse water pollution from agriculture, motivating a change
66 in behaviour that increases uptake of BMPs and that, in turn, reduces risks of diffuse water pollution
67 from agriculture, ultimately contributing to improving water quality (Okumah et al., 2019a, 2019b;
68 DPMAG, 2015; Gibbons et al., 2014; Martin-Ortega and Holstead, 2013; Blackstock et al., 2010; Kay
69 et al., 2009). This expectation is based on the assumption of a relatively straightforward relationship
70 between awareness, behaviour and water quality, herein referred to as the awareness-behaviour-water
71 quality pathway.

72
73 However, there is lack of evidence on how this pathway works. Previous studies have often addressed
74 partial aspects of the pathway from disciplinary perspectives. For instance, some studies have focussed
75 on farmers’ behavioural intentions, but not on actual adoption of BMPs (e.g., Daxini et al., 2018, Daxini
76 et al., 2019a, Daxini et al., 2019b, Zeweld et al., 2017, Floress et al., 2017). While these studies provide
77 insights into factors influencing uptake of BMPs, they fail to provide a full account of the determinants
78 of behavioural change. This is because farmers’ intentions might not always translate into behavioural
79 changes due to the influence of contextual factors such as cost, time, available (or lack of) institutional
80 support and farm tenure (Baumgart-Getz et al., 2012; Barnes et al., 2009; Macgregor and Warren, 2006).
81 Other studies have focussed on the link between awareness and actual adoption of BMPs (e.g., Okumah
82 et al., 2018; Vrain and Lovett, 2016; Macgregor and Warren, 2006), but have not considered the impact
83 of the uptake of BMPs on water quality. Other studies that have investigated the impact of BMPs on
84 water quality did not include information on factors driving adoption of BMPs by farmers (e.g., Collins
85 et al., 2016; Kay et al., 2012).

86
87 There is therefore an urgent need to overcome this partial and mono-disciplinary approach to the
88 understanding of the awareness-behaviour-water quality pathway in order to inform awareness-

89 focussed interventions (Okumah et al., 2019; Giri and Qiu, 2016). In this study, we take an
90 interdisciplinary approach, where farmers and institutional stakeholders' perceptions of diffuse water
91 pollution from agriculture and factors influencing actual (rather than intended) adoption of BMPs are
92 considered alongside changes in water quality. By combining semi-structured in-depth interviews and
93 water quality data from a case study in Wales (UK), we examine how farmers' awareness interacts with
94 psychosocial, economic, agronomic, biophysical factors and adoption of BMPs and whether pesticide
95 concentrations in three catchments in Wales have declined following an awareness-focussed trial aimed
96 at reducing pesticide pollution. The pesticide of focus is MCPA (2-methyl-4-chlorophenoxyacetic acid),
97 a chemical that is extensively used in agriculture to control broad-leaf weeds such as thistles, docks and
98 the common rush (*Juncus effusus*). Due to the high solubility of MCPA and poor absorption to the soil
99 matrix, it is prone to leaching directly into watercourses or via land drains, with a recent study showing
100 that MCPA is frequently detected in watercourses and drinking water sources around the world (Morton
101 et al., 2020), and is therefore not an issue particular to Wales. Although EU standards stipulate that the
102 maximum concentration of any individual pesticide in drinking water remains below one tenth of part
103 per billion (0.1 µg/L), the equivalent of one blade of grass in a 100,000 hay bale (Morton et al., 2020,
104 Welsh Water, 2014), available data shows that between five to 10% of raw drinking water samples from
105 surface water exceed 0.1 µg/L limit for MCPA in England and Wales (Defra, 2012).

106

107 Specifically, the study seeks to investigate: 1) whether MCPA concentration in drinking water sources
108 declined significantly following an awareness-focussed intervention, 2) whether the decline in MCPA
109 concentration can be attributed to adoption of BMPs, and 3) whether awareness contributed to adoption
110 of BMPs. While the study is set in the context of pesticide pollution in Wales, it sets out to provide
111 insights into the role of awareness-based interventions towards mitigating the environmental impact of
112 land management practices on diffuse water pollution from agriculture more broadly. To our
113 knowledge, this is the first study exploring the awareness-behaviour-water quality pathway in full, and
114 one of the few in the field of sustainable land management (e.g. Pannell and Zilberman, 2020).

115

116

117 **2. MATERIALS AND METHODS**

118

119 **2.1 Case study – Welsh Water's pesticide pollution reduction strategy**

120

121 Dŵr Cymru Welsh Water (hereafter referred to as Welsh Water) is a water and waste utility operating
122 in Wales (UK) responsible for the supply of high quality drinking water to over three million people,
123 as well as treating and disposing of wastewater. In 2013, through their routine raw water monitoring
124 programme, Welsh Water found that MCPA concentrations were increasing in drinking water sources
125 (Welsh Water, 2014). Welsh Water's root cause analysis and discussions with stakeholders revealed
126 that it was common practice for farmers to boom spray MCPA to tackle common rush (*Juncus effusus*)
127 infestation (Welsh Water, 2014), which is mainly a problem in permanent pastures on poorly drained

128 soils in high rainfall areas, especially after wet winters and/or summers. Although MCPA concentration
129 were too low to pose a risk to those drinking the water, continuous increase in MCPA concentration in
130 raw water may result in breaching EU Drinking Water standards and therefore were a concern for the
131 utility company (Welsh Water, 2014). By safeguarding and improving raw water quality, before it gets
132 to water treatment works can avoid the need for using additional chemicals and energy to ensure
133 drinking water meets regulatory standard. This helps keep bills low for customers and safeguard the
134 environment for generations to come (Welsh Water, 2014).

135
136 To address this issue, Welsh Water decided to work with the farming industry and other stakeholders
137 in the land management sector, placing particular emphasis on providing farmers with advice and
138 increasing their awareness of the problem and how to tackle it. Welsh Water argued that without the
139 support of key industry partners, they were less likely to be successful. As a result, key industry partners
140 were engaged at the beginning after their root cause analysis. They worked with them to identify
141 solutions and to create a trial that was ‘fit for purpose’ for the target audience and to tackle the issue.

142
143 In 2015, Welsh Water launched a programme called the weed wiper trial in three targeted catchments
144 (hereafter referred to as ‘targeted catchments’); the Teifi, Towy and Wye, where routine water
145 monitoring detected the most significant increase in MCPA concentrations. For example, between 2006
146 and 2015, 18 raw water samples exceeded the 0.1 ug/L MCPA limit. The location of the targeted and
147 control catchments (Cleddau, Teme and Usk) which had not been in the trial are shown in Figure 1 and
148 their characteristics presented in Table 1. Elevation range, average slope and average daily temperature
149 is similar for all catchments. Mean annual rainfall is ~1600 mm for two of the control and two of the
150 targeted catchments. The Towy has the highest annual rainfall of 1845 mm and the Teme, which is
151 furthest east, the lowest annual rainfall. The Teme catchment is located mainly in England but provides
152 source water to Welsh Water. The dominant bedrock in all catchments is Silurian mudstones and
153 siltstones and the major soils associated with this geology are slowly permeable, seasonally wet, and
154 have a loamy to loamy clay texture. Where Devonian old red sandstone is the dominant geology, the
155 soils are more freely draining with a sandy loam texture. Some of the catchments contain small areas
156 of limestone and/or mafic and felsic lava and tuffs. The main land use in all catchments is pasture that
157 is used predominantly for sheep and beef grazing. One catchment in the targeted group (Wye) and
158 another in the control group (Usk) contain 30% moorland, whereas the other catchments only contain
159 between 6 and 12% moorland. Arable land is below 10% in all catchments except the Teme where it
160 represents 32% of the area. Forestry represents between 5 and 15% of each catchment and is dominated
161 by coniferous plantations.

162
163 The weed wiper trial was built on the principle of using a trusted third party organisation (Daltons ATV,
164 who sell all-terrain vehicles such as quad bikes) who have good knowledge of the catchments and the

165 farming community as brokers between Welsh Water, who want to improve water quality, and the
166 farmers. The initiative encouraged farmers to sign up for the free hire of a weed wiper. A weed wiper
167 is a technology where a wick wetted with herbicide is connected to a boom and dragged or rolled across
168 the tops of the taller weed plants (Appendix A). This allows treatment of taller grassland weeds by
169 direct contact, without affecting related but desirable shorter plants in the grassland sward beneath. The
170 technology has the benefit of avoiding spray drift that occurs with other conventional methods
171 (Appendix A) of application that use self-propelled sprayers equipped with long booms. In addition,
172 only glyphosate based products are licenced to be used in the weed wiper. This is because, compared
173 to MCPA that takes 15 – 25 days to break down in water, glyphosate takes considerably less time (three
174 days) (Welsh Water, 2014). There was a total of 292 weed wiper hires between 2015 and 2019 across
175 the three targeted catchments (Table 2).

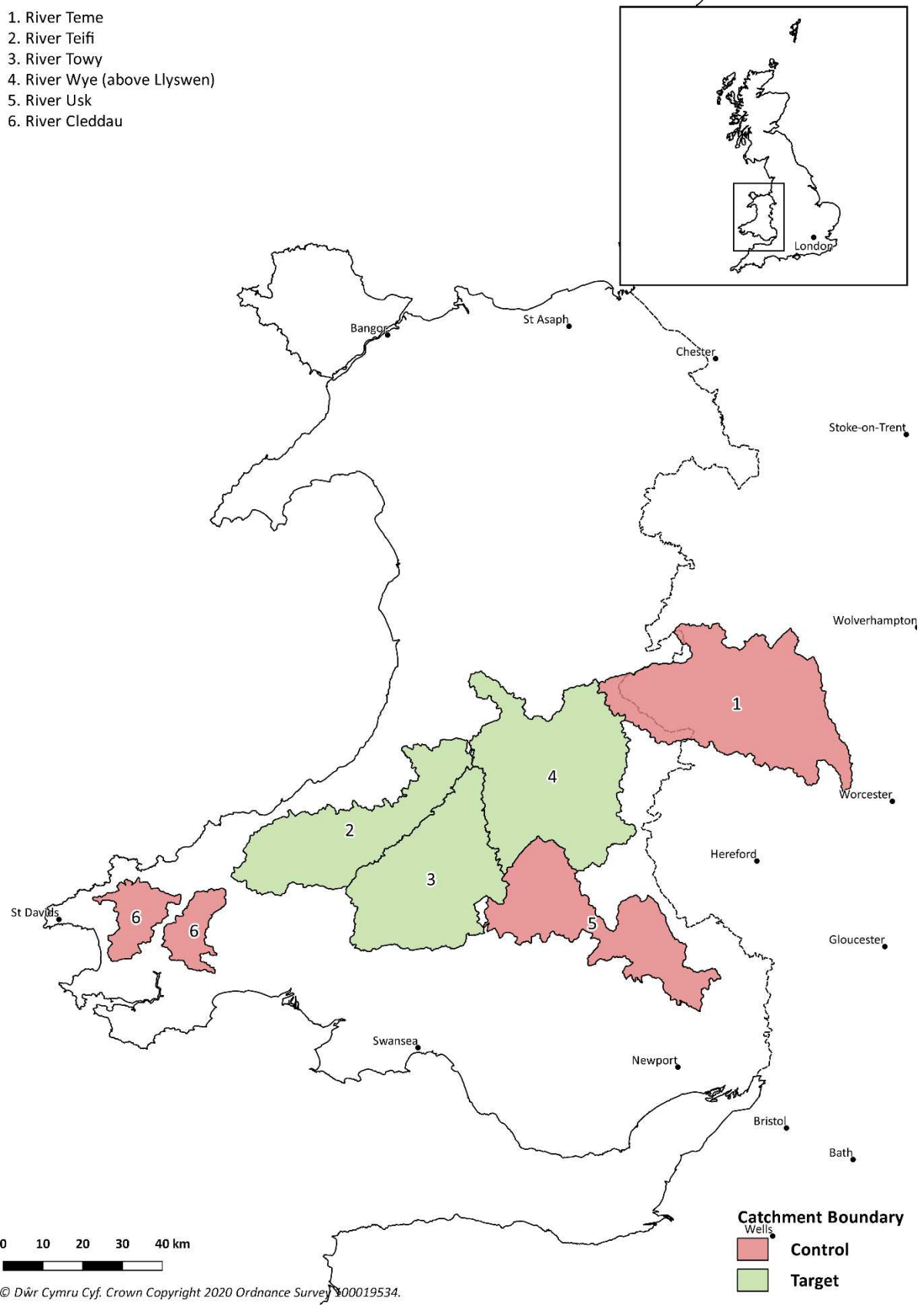
176
177 In addition to Welsh Water attending a wider range of agricultural shows and various workshops to
178 promote the weed wiper, information packs on the use of weed wipers and advice films on safe measures
179 of pesticide application were distributed to farmers within and outside the three-targeted catchments to
180 raise their awareness of BMPs and their benefits, including to water quality. Information regarding the
181 weed wiper trial was advertised to farmers via a wide range of sources from agricultural magazines and
182 newspapers to farm advisors. In addition to these, national regulatory and advisory authorities provided
183 farmers with information on regulation and best pesticide management. Farmers' neighbours was also
184 an important source of information. Between 2015 and 2019, a total of 628 information packs were
185 distributed to farmers (Table 2), of which 444 packs (70.7% of total) were within the targeted
186 catchments. Welsh Water encouraged farmers to use non-chemical techniques, such as topping with a
187 rotary or flail mower before the rush plants produce seed, alongside targeted pesticide use via the weed
188 wiper to achieve a long-term control of rushes. Thus, farmers were encouraged to take up pest
189 management practices that could help tackle all possible sources of pesticide pollution to drinking water
190 sources (see Appendix B for an overview of the practices).

191
192 The weed wiper trial is considered by Welsh Water to be a win-win solution that is expected to provide
193 effective control for the farmer and lower risk of pollution to water sources. Welsh Water believed that
194 by allowing farmers to hire the weed wiper and experience first-hand the technology would help farmers
195 appreciate its benefits and raise awareness of the impact of poor pesticide management practices. It was
196 hoped that by 'trying before buying', farmers would be more likely to adopt the weed wiper and other
197 non-chemical techniques that could be used alongside (instead of pesticide) to provide longer-term
198 control of pests and weeds (Welsh Water, 2014). The weed wiper trial is therefore 'advice-centred' and
199 a voluntary approach that focusses on increasing farmers' awareness to stimulate their adoption of
200 BMPs, with the specific intent to reduce pesticide leaching and thus improvement in water quality. This

201 makes the weed wiper trial a suitable case study for exploring the full awareness-behaviour-water
202 quality pathway.

203

- 1. River Teme
- 2. River Teifi
- 3. River Towy
- 4. River Wye (above Llyswen)
- 5. River Usk
- 6. River Cleddau



204

205 **Figure 1: Location of the six study catchments.**

206
207
208
209

Table 1: Catchment characteristics

	Wye	Teifi	Towy	Teme	Usk	Cleddau
Catchment Type	Targeted	Targeted	Targeted	Control	Control	Control
Average (2010-2019) annual rainfall (mm)	1625.78	1631.71	1845.31	989.89	1629.10	1624.14
Average (2010-2019) daily temperature (°C)	8.4	9.3	9.1	9.4	9.0	10.0
Elevation range (metres)	88.6 - 748.5	3.5 -571.7	8.8 - 799.7	25.2-544.5	14.5 - 883.6	3.3 - 535.1
Average slope (degrees)	8.51	6.15	8.64	6.15	8.75	4.45
Land area (km²) and use (%)						
Land area	569	906	511	1,435	870	394
Pasture	47	81	72	51	49	78
Moors, heath, open land	30	10	12	8	31	6
Arable	7	1	0	32	9	10
Forestry	11	6	15	8	7	5
Others	5	2	0	2	3	1
Soil texture (% of catchment)						
Clay>loam	10.5	1.3	0.3	6.9	0.1	1.2
Loam	15.6	50.1	76.1	27.9	65.0	21.1
Loam>clay	61.8	33.3	0	53.0	29.3	66.3
Sand	0	0	0	0.0	0	4.2
Sand>loam	11.6	15.3	23.5	12.1	5.4	7.1
Others	0.4	0.0	0.2	0.1	0.2	0.0
Bedrock geology (% of catchment)						
Mudstone and Siltstone	82.6	63.1	68.7	91.6	77.0	91.6
Sandstone and Conglomerate Interbedded	16.6	36.9	31.0	3.7	20.1	0
Mudstone, Siltstone, Sandstone, Coal, Ironstone & Ferricrete	0	0	0	1.3	1.3	0
Limestone with subordinate sandstone and argillaceous rocks	0	0	0.3	2.7	1.5	0
Felsic, Mafic Lava and Tuff	0.8	0	0	0.7	0	8.4

210 **Notes:** Under Land use, “Other” includes e.g. urban, wetland, mines and industrial; under soil texture, “Others” include
 211 Loam>clay>sand, Sand>loam>clay, and Loam>sand>clay. Information on soil texture refers to that of the topsoil (5-20cm).
 212 Data on catchments were obtained from the following open sources: Meteorology Office (Historical Weather 2010-2020);
 213 Corine Land Cover (2018) European Environment Agency; British Geological Survey (Bedrock Geology 625k and Soil-Parent
 214 Material Model) (Russell, 2011).

215
216
217
218
219
220
221
222
223
224
225
226

227
228
229

Table 2: Summary of number of information packs distributed and weed wiper hires within and outside the targeted catchments

Year	Catchment				Total
	Teifi	Wye	Towy	Outside targeted catchments	
Information packs distributed					
2015	79	57	0	55	191
2016	45	34	0	32	111
2017	37	36	44	44	161
2018	28	18	21	30	107
2019	15	12	18	23	68
Total	204	157	83	184	628
Weed wiper hires					
2015	45	18	-	-	63
2016	41	22	-	-	63
2017	26	25	22	-	73
2018	18	16	13	-	47
2019	22	13	11	-	46
Total	152	94	46	-	292

230 Note: 1) In 2015 and 2016, farmers in Towy did not receive any packs and there were no hires as this catchment was only
231 included in the scheme in 2017.
232

233 **2.2 Methods**

234 To determine whether Welsh Water’s awareness focussed approach has resulted in a decline in MCPA
235 concentrations in drinking water sources, and whether this can be related to an increased adoption of
236 BMPs, we used two strands of data: water quality data (i.e., MCPA concentration) from Welsh Water’s
237 routine raw water programme, and qualitative data gathered via semi-structured in-depth interviews
238 with farmers and other relevant regional stakeholders. This interdisciplinary approach aims at
239 overcoming the limitations of partial mono-disciplinary methodologies unsuitable to addressing the
240 complexity of ‘wicked problems’ such as diffuse water pollution from agriculture (Stoate et al., 2019;
241 Termeer and Dewulf, 2019; Duckett et al., 2016; Martin-Ortega et al., 2015; Raymond et al., 2010).

242
243
244 **2.2.1. Analysis of water quality changes**
245

246 Welsh Water’s monitoring assesses raw water quality based on a number of parameters, including
247 MCPA concentration (measured in µg/L). Welsh Water provided MCPA data from 2006 to 2019 for all
248 water treatment works (WTW) in the three targeted catchments (Towy, Tefi and Wye). In addition, they
249 also provided MCPA data for all WTW within three control catchments (Cleddau, Teme and Usk) that
250 had not been in the trial but were in a similar location (Figure 1) and of similar characteristics to the
251 targeted catchments (Table 1). An overview of the water quality data provided by Welsh Water for each
252 catchment is given in Table 3. For the Teifi and the Wye catchments, April 2015 served as the separation
253 point between pre and post intervention, while April 2017 was used as the separation point for the Towy

254 catchment; as this is when it became part of the weed wiper trial. For all the control catchments, April
 255 2015 served as the separation point.

256
 257 We explored the potential effects of the weed wiper trial on MCPA concentrations using factorial
 258 analysis of variance (ANOVA). Factorial designs are effective for examining treatment variations and
 259 to investigate interaction effects. Factorial designs enable us to effectively combine these data into one
 260 and examine the main and interaction effects of different variables. The Type III sum of squares
 261 estimation option was selected. This option allows us to evaluate the effect of each variable after other
 262 factors have been accounted for. Using this option has an advantage over estimation options such as
 263 Type I as the Type III option is not sample size dependent. The factorial ANOVA was ran using SPSS
 264 IBM version 23. In the model, MCPA concentration was classified as the dependent variable while
 265 condition (control or targeted), time (pre or post intervention) and catchment were included as
 266 independent categorical factors (Table 3). This allowed us to test whether there were differences in
 267 observed MCPA concentrations, whether such differences were statistically significant as well as the
 268 interaction between variables.

269
 270

271 **Table 3: Distribution of water samples provided by Welsh Water**

Variable	Groups	Code	Number of water samples	Percentage
Condition	Control (C)	1	1339	43.5
	Targeted (T)	2	1738	56.5
Time	Pre intervention	1	1420	46.1
	Post Intervention	2	1657	53.9
Catchment	T-Towy	1	507	16.5
	T-Teifi	2	467	15.2
	T- Wye	3	764	24.8
	C Cleddau	4	488	15.9
	C-Teme	5	395	12.8
	C-Usk	6	456	14.8
Total	-	-	3077	-

272
 273

274 2.2.3 Semi-structured in-depth interviews

275

276 Semi-structured interviews were conducted with sixteen farmers and six institutional stakeholders
 277 between July 2019 and February 2020 (see Appendix C for the interview scripts). In-depth interviews
 278 lasted up to about one hour and focussed on understanding interviewees perceptions on: 1) whether
 279 water quality outcomes can be attributed to land management practices, 2) whether and how awareness
 280 has contributed to adoption of BMPs, and 3) other factors that could influence land management
 281 practices and water quality outcomes. Relying on different stakeholders’ perceptions enables us to
 282 gather different ‘knowledges’ from policymakers and local stakeholders as this could offer useful
 283 insights into understanding the complex factors influencing behaviours and diffuse water pollution from
 284 agriculture (Morgan, 2014). This helps to bridge the gap between science and society, elicit information
 285 that would otherwise be missed and help us to capture a more “ground-truthed” picture of reality (Tress

286 et al., 2005). The value of qualitative data collected through the interviews lies in the deep insights it
287 provides, not the ‘number of persons explaining what’, as the goal is not to generalise but to ‘make
288 sense’ of the phenomenon that is under investigation (Onwuegbuzie and Leech, 2005, Rossman and
289 Wilson, 1985). Consequently, as with any other qualitative social science study, sampling, analysis and
290 study outcomes are not necessarily (motivated by and/or) dependent on sample size.

291
292 Farmers were our primary stakeholders as they were the ones whose knowledge and behaviours were
293 expected to change through the weed wiper trial. At the same time, institutional stakeholders (e.g.,
294 representatives of farmer unions, local environmental organisations, and water utility) play important
295 regulatory and advisory roles in land and water management and their views are therefore useful to
296 further our understanding of the context and provide further insights (see Table 4a for the justification
297 for their inclusion in this study and 4b for the characteristics of participating farmers). Of the sixteen
298 farmers who participated in the interviews, eight had participated in the weed wiper trial while the
299 remaining eight had not participated in it (although they had knowledge of the weed wiper trial and
300 some had received information regarding the BMPs promoted). Implications of the views of these
301 different farmers are considered in the discussion. Interviewees were predominantly livestock farmers
302 (Table 4b).

303
304 Interviewees were recruited using a combination of connections with local partners (Welsh Water and
305 Farming Connect, an advisory service that provides independent advice to farming businesses), face-
306 to-face contact at the Royal Agricultural Welsh Show in Builth Wells in 2019 and snowballing, where
307 some interview participants referred us to other stakeholders. Ten of the farmers and stakeholder
308 interviews were conducted through phone calls while twelve were face-to-face at the Royal Welsh Show
309 (Tables 4a and 4b describe interview participants). To enhance the credibility and validity of the data,
310 we applied descriptive respondent validation (Byrne, 2001). This involved summarising key aspects of
311 the interview and asking participants whether they represented their views or not. This was implemented
312 either during or after the interview session. We applied the intelligent verbatim transcription method to
313 transcribe the interviews (Golota, 2018).

314
315 Interviews were analysed using a grounded theory approach (Strauss and Corbin, 1998) to first perform
316 an open coding of emergent themes, using NVIVO version 11. This was done by carefully reading
317 through the interview transcripts and identifying recurring topics that emerged from the texts rather than
318 on the basis of pre-defined topics. We identified statements that provided plausible explanations to the
319 water quality results. Through an iterative process, 49 codes were generated (Appendix D), however,
320 only 31 codes focused on the following topics: factors influencing awareness, factors influencing uptake
321 of the weed wiper (and other BMPs), and factors that influence water quality. The other codes focussed
322 on the role of agri-environment schemes, barriers to participation in agr-environment schemes as well

323 as recommendations to improve awareness and uptake of BMPs (including the weed wiper, Appendix
 324 D).

325
 326 All 31 codes were categorized under the three relevant topics. Next, using axial coding, we compared
 327 codes to establish similarities and differences and categorised them to identify the most dominant
 328 themes being discussed. In the case of factors influencing uptake of the weed wiper, the codes were
 329 further categorised under four main themes based on whether it is a resource issue, psychosocial issue,
 330 agronomic or geographical (Appendix D). To establish validity of our results, the procedure was
 331 reviewed in an iterative process until the results became stable. Results of the in-depth interviews are
 332 presented in Section 3 using a manifest style (Bengtsson, 2016), where key findings are presented and
 333 reference made to interviewees' statements.

334

335 **Table 4a: List of stakeholders and justification for their inclusion in the interviews**

#	Stakeholder	Justification for Inclusion
1	Farmers	Frontlines of land use and their farm activities may impact river water quality. Also, they are the ones that the weed wiper trial aimed to change their awareness and behaviours (see description of the farmers in Table 5b).
2	Welsh Water	Responsible for the supply of high quality drinking water to over three million people in Wales. They implemented the weed wiper trial.
3	Farming Connect	It is a knowledge transfer, innovation and advisory service for farming and forestry businesses in Wales funded through Welsh Government Rural Communities – Rural Development Plan 2014-2020.
4	National Farmers' Union	Representation body for agriculture and horticulture in England and Wales. They campaign for a stable and sustainable future for British farmers, including encouraging their members (farmers) to engage in best farming practices.
5	Natural Resources Wales	Advise and regulate the activities of farmers including practices that affect water resources.
6	Daltons ATV	Welsh Water's trusted intermediary and delivered the weed wipers to farmers. They also provide advice on best pesticide application techniques and how to use the weed wiper.
7	Lantra	Provide pesticide application training to farmers in Wales.

336

337 **Table 4b: Profile of the farmer participants in-depth interviews**

#	ID	Participated in weed wiper trial	Weed wiper use	Catchment	Tenancy	Farm type
1	P1	No	No*	Cleddau	Owner occupier	Arable
2	P2	No	No	Teifi**	Owner occupier	Livestock
3	P6	No	Yes	Towy**	Owner occupier	Livestock
4	P8	No	No	Usk	Rent (Tenant)	Livestock
5	P10	No	No	Severn	Rent (Tenant)	Livestock
6	P12	No	Yes	Teifi**	Owner occupier	Livestock
7	P13	No	No*	Teifi**	Rent (Tenant)*	Livestock
8	P14	No	Yes	-----	Rent (Tenant)*	Livestock
9	P15	Yes	No*	Towy**	Owner occupier	Livestock
10	P16	Yes	No*	Towy**	Owner occupier	Livestock
11	P17	Yes	No*	Teifi**	Owner occupier	Livestock
12	P18	Yes	No*	-----	Owner occupier	Livestock
13	P19	Yes	Yes	Wye**	Owner occupier	Livestock
14	P20	Yes	Yes	Wye**	Owner occupier	Livestock
15	P21	Yes	No*	Teifi**	Owner occupier	Livestock
16	P22	Yes	No*	----	Owner occupier	Livestock

338 No* = farmer not using the weed wiper at the time of the interview but has used it in the past; * in tenancy types suggests that
 339 the farmer owns some portion of the land, with others being rented; ** targeted catchments; ----- = information not available.

340
 341
 342

343 3. RESULTS

344 3.1 Has MCPA concentration in drinking water sources declined significantly?

345
 346 Between 2006 and 2019, 98.3% of all raw water samples at the WTW were below the 0.1 µg/L drinking
 347 water limit for MCPA in England and Wales. Concentrations exceeded 0.1 µg/L on 47 occasions; 26 in
 348 targeted catchments and 21 in control catchments. A seasonal pattern in concentrations was detected,
 349 with exceedances mostly evident during May, June, and July and again in September and October. This
 350 coincides with periods when MCPA is commonly applied to grassland for the control of ragwort,
 351 rush and thistle (Welsh Water, 2014).
 352

353
 354 Table 5 shows that before the weed wiper trial, the mean MCPA concentration in the targeted
 355 catchments (0.0137 µg/L) was higher than in the control catchments (0.0091 µg/L). Further results show
 356 that MCPA concentrations for both targeted and control catchments declined after the implementation
 357 of the weed wiper trial (see Table 5). However, the decline was significantly larger ($F(1) = 6.551$,
 358 $p < 0.05$, $n = 3077$, Partial eta-squared (η^2) = 0.002) for the targeted catchments (mean = 45.2%)
 359 compared to the control catchments (mean = 10.9%). It was further revealed that the MCPA response
 360 post intervention varied between catchments: ($F(5) = 6.249$, $p < 0.001$, $n = 3077$), $\eta^2 = 0.01$). Figure 2
 361 shows that a substantial decline (between 3.1 and 55%) in MCPA concentration occurred in all three
 362 targeted catchments (with the highest decline observed in the Teifi catchment). In contrast, only one of
 363 the control catchments (the Teme) recorded a decline in MCPA concentration (mean % decline =
 364 31.6%) while the Usk and the Cleddau catchments recorded an increase in MCPA concentration post
 365 2015 (mean % increase = 20.2% and 31.6% respectively). Additional results indicate evidence of an
 366 interaction effect between the weed wiper trial and catchments: ($F(5) = 1.997$, $p < 0.1$, $n = 3077$), $\eta^2 =$
 367 0.003), suggesting that the impact of the weed wiper trial on MCPA concentration depends on location
 368 or catchment characteristics.
 369

370 **Table 5: Mean concentration of MPCA for targeted and control catchments pre- and post-**
 371 **intervention**

Period	Condition	Mean	Std. Deviation	Number of water samples
Pre-intervention	Targeted	0.0182	0.0968	783
	Control	0.0097	0.0285	637
Post-intervention	Targeted	0.0100	0.0231	955
	Control	0.0086	0.0181	702
Total	Targeted	0.0137	0.0673	1738
	Control	0.0091	0.0236	1339

372
 373
 374

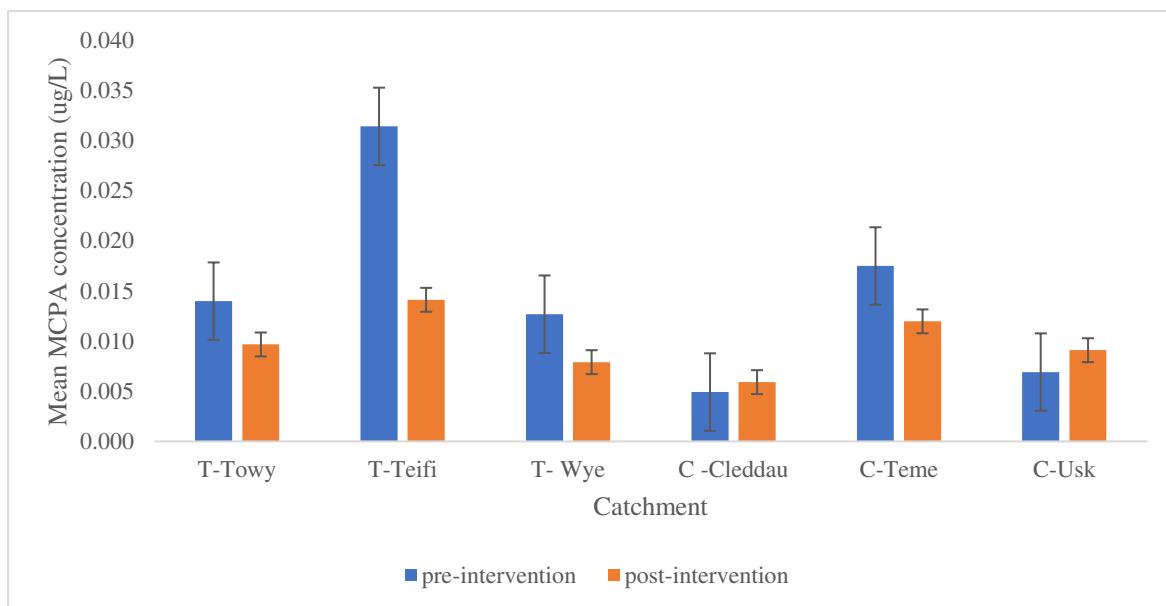


Figure 2: Average MCPA concentration in all catchments, pre and postintervention.
Notes: T. = Targeted catchments; C. = Control catchments

3.2. Has awareness and the adoption of BMPs contributed to a decline in MCPA concentration?

Results of the water quality analysis show that MCPA concentrations declined substantially in the catchments where the weed wiper trial had been carried out (mean = 45.2%) compared to the control catchments (mean = 10.9%). The interviews allowed us explore the role that awareness and behavioural change (through the adoption of BMPs), might have had on this effect. Statements from some farmers clearly showed an effect of the weed wiper trial and the adoption of more responsible pesticide practices beyond the trial. For instance, Participant 19 noted, “I now only use a weed wiper and several of my neighbours have also bought their own weed wiper using grants”. Another added “Yeah, I'm being very sort of responsible... The weed wiper only targets the weed so you are going to have less risk of any runoff or anything getting into watercourses. I think pretty much we're operating at a high standard. A lot of the businesses using chemicals and pesticides are operating at very high standards in terms of technology and precision. I think people have probably got more aware, rightly so” (Participant 3).

Farmers believed that their practices (since their involvement in the trial and use of the information packs) contribute to reducing pesticide pollution because a lower amount of spray is used and it is only applied to the targeted weeds. This is reinforced by the positive relationship between number of weed wiper hires and percentage decline in MCPA concentration as catchments with more hires recorded the highest net reductions ($p < 0.05$, $R^2 = 0.60$, $N = 6$, see Figure 3). This is also backed up by the fact that catchments where more information packs had been distributed also recorded higher declines in MCPA concentration ($p < 0.05$, $R^2 = 0.59$, $N = 6$, see Figure 4), although it should be noted that most weed wiper

402 hires occurred in the smallest target catchment; the Teifi which is 35% smaller than the Wye (see Tables
403 2 and 3).

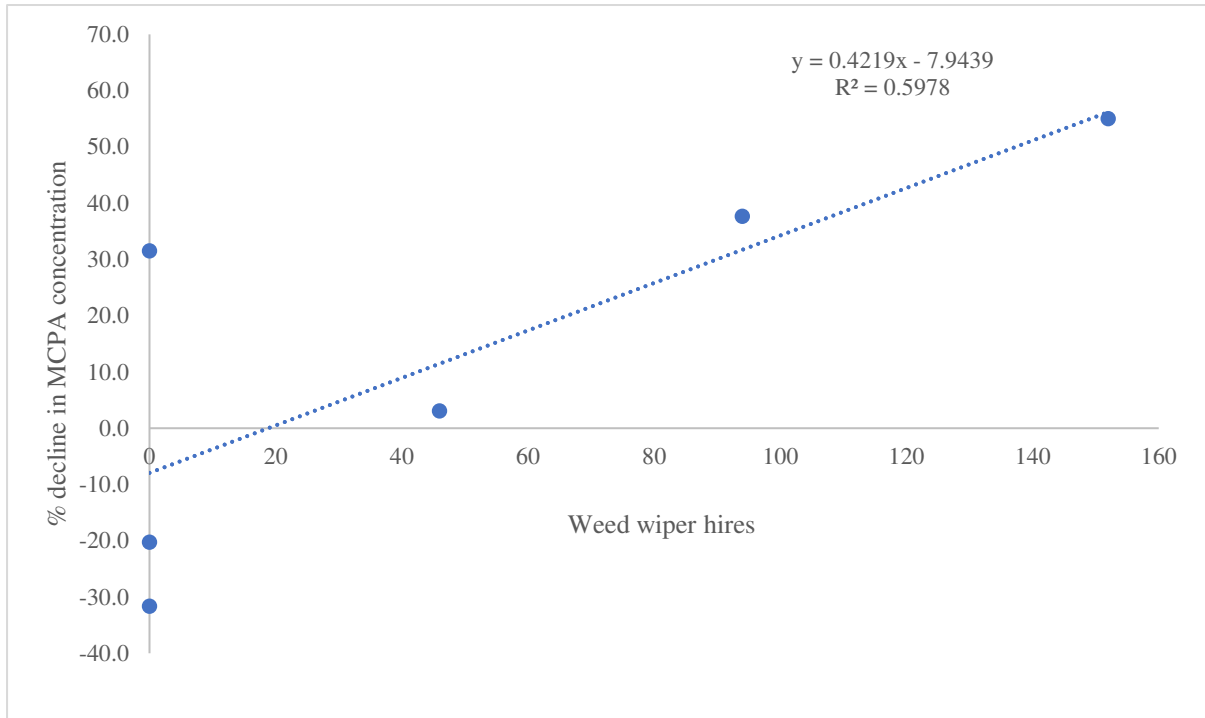
404
405 From the interviews, we established that indeed, awareness – promoted through the weed wiper trial –
406 seems to have contributed to uptake of the weed wiper, although it should be noted that weed wiper
407 hires appear to have declined in the Teifi and Wye in 2018 and 2019 compared to the period 2015-2018
408 (Table 2). Statements on how applying chemicals near watercourses, failing to follow calibration
409 standards for chemical applications, and applying excess chemicals particularly in wet conditions could
410 result in on-farm pesticide pollution reflect farmers’ awareness of the factors causing pesticide
411 pollution. As Participant 14 noted “....when you have a thunderstorm, like we did last night, heavy rain
412 came in a matter of minutes from a dry condition to that. They could have just sprayed that ground with
413 so much chemicals per acre, okay? All of a sudden comes down the rain, the surface wash off, goes into
414 ditches, ends up in a water stream. That’s pollution. Because the conditions were wrong at that specific
415 moment. And there was heavily used chemicals... Or if there’s a chemical spillage, you know, I mean,
416 if somebody left the water running in a tank when they were filling, and they had already added the
417 chemicals and ouch, over the top it came down the drain, and it found a ditch which then went to a
418 river, then you’d have that. They are very minor ones and human error”. This clearly shows awareness,
419 although responsibility is deflected mainly to weather conditions and human error.

420
421 On how awareness contributes to adoption, one farmer pointed out that the main reason they were
422 engaged in best practice (including the use of the weed wiper) was because they were aware of the
423 impacts of their practices on water quality and how best to mitigate pesticide pollution: “...knowing
424 what to do. We know there are issues of water supply so we’re very conscious of where our water supply
425 is on the farm and where our neighbouring water supply is, so we’re not spraying near them as well.
426 And then we’ll watch the wind speed so there’s no spray going into the watercourse as well” (Participant
427 12). Another farmer, highlighting the role of the information pack said that “the information pack was
428 good and helped me...without this trial I wouldn’t have tried out the [weed wiper] machine for myself
429 and I’d probably still be using a knapsack” (Participant 20). Other farmers indicated that “the ability to
430 try out one of the weed wipers for free before committing to buying one was the best way of me
431 improving my knowledge and understanding of pesticide management. Without hiring one for free I
432 would probably still be using a boom sprayer...The machine worked well for me, that’s why I went to
433 buy my own. I now only use a weed wiper” (Participant 19). This view further points to the role of
434 experiential learning, as a first-hand experience of the use of the weed wiper gave him/her the
435 opportunity to appreciate the benefits of using the technology, which in turn contributed to his decision
436 to acquire it.

437
438 All this evidence suggests that awareness promoted through the weed wiper trial played a crucial role
439 in the adoption of the weed wiper. Further evidence shows that since the peak in MCPA concentration

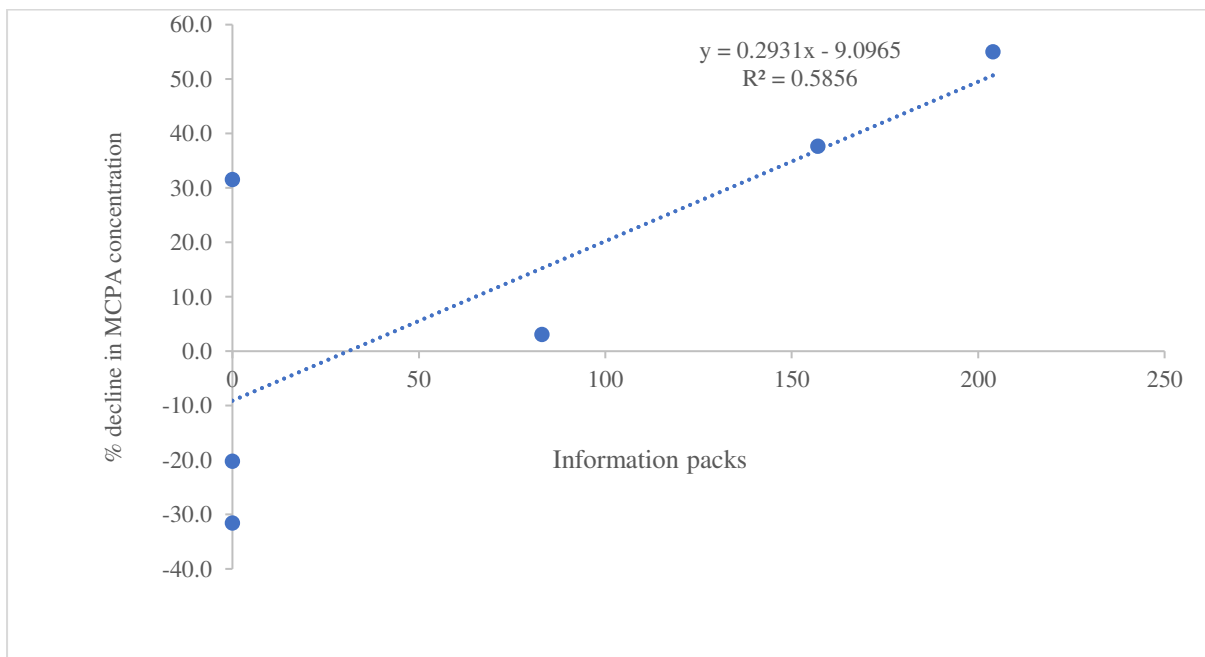
440 in 2014, concentrations have declined in both control and targeted catchments, but a substantial
 441 reduction was observed in the targeted catchments to such an extent that in 2019 mean MCPA
 442 concentration was lower for the targeted than control catchments for first time since 2010 (see Figure
 443 5).

444
 445



446
 447 **Figure 3: Relationship between weep wiper hires and % decline in MCPA concentration**

448
 449



450
 451 **Figure 4: Relationship between number of information packs distributed in each catchment and**
 452 **% decline in MCPA concentration**

453

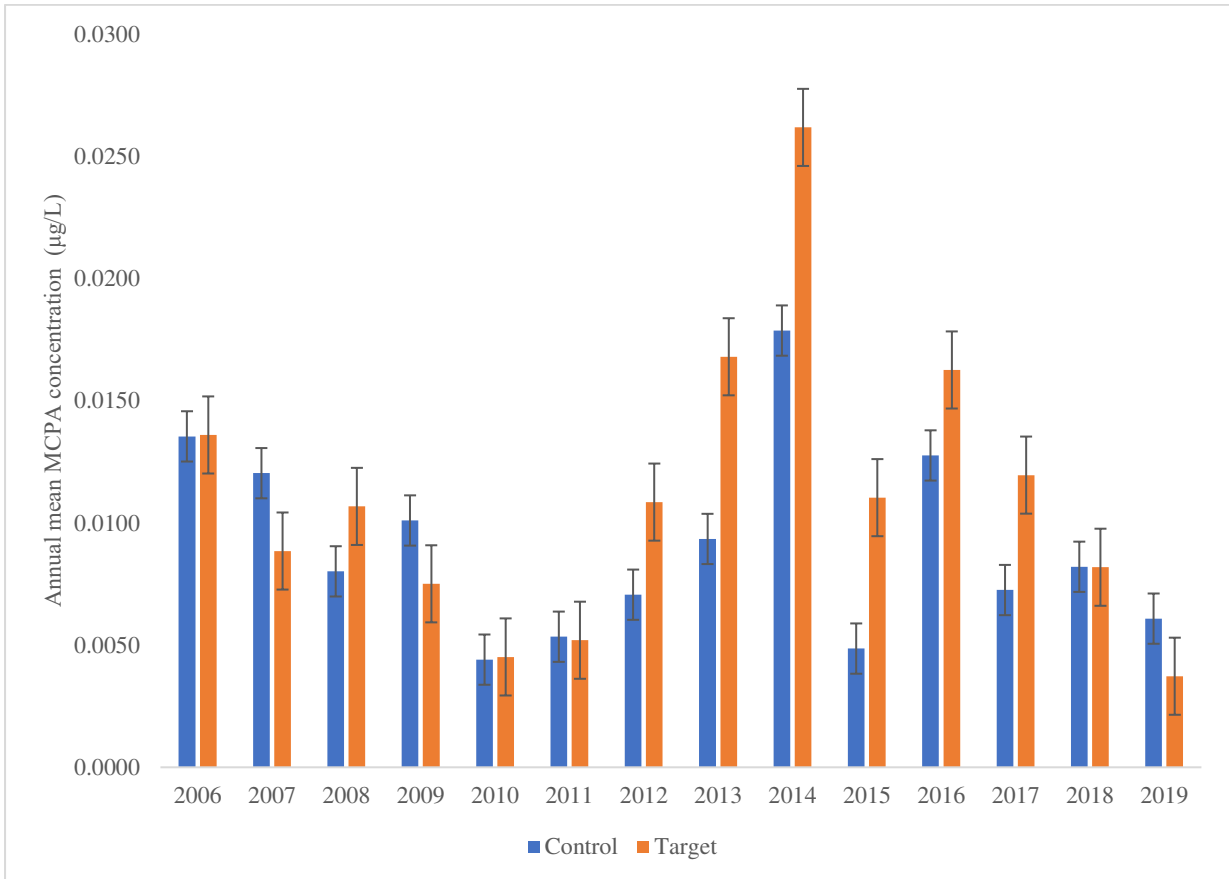


Figure 5: Annual mean MCPA concentration for both targeted and control catchments

455
 456
 457
 458
 459
 460
 461
 462
 463
 464
 465
 466
 467
 468
 469
 470
 471
 472
 473
 474
 475

3.3. Other factors contributing to adoption of BMPs

Awareness was not the only factor contributing to behavioural changes as this study identified other factors that contributed to the adoption of the weed wiper. For instance, we found that attributes of weed wiper technology played a very crucial role in its adoption as one farmer noted that *“this is probably one of the simplest machines that you could use. And you know, with the least amount of chemical use”* (Participant 14). Almost all farmers indicated that they found it *“extremely easy to hire the weed wiper”* and *“very easy to use”*. This shows that ease of use of the weed wiper, the financial benefits associated with reduced input cost, and the fact that it does not require any substantial changes in farm operations are important drivers of uptake. These benefits of the weed wiper were disseminated among farmers through their neighbours, farm trials and other channels. Indeed, access to and assimilation of knowledge coupled with an improved understanding of the negative impacts poor pesticide management practices and of the benefits of best management practices improves environmental consciousness, boosts farmers’ self-efficacy and may result in favourable environmental attitudes thus contributing to uptake of such practices.

476 Other important drivers of adoption of the weed wiper include psychosocial factors, such as social
477 pressure, information source and trust, farmers' desire to protect their reputation, regulations, and
478 beliefs towards old and new practices. Regarding social pressure, we found that neighbours' opinions
479 have a role in encouraging or discouraging farmers in using the weed wiper. Similarly, perceived
480 pressure from landlords was influential in farmers' decision to acquire the weed wiper. As Participant
481 14 noted "*the weed wiper was more acceptable with our landlords so we upgraded our old weed wiper*
482 *and had a new one. Our landlords obviously wouldn't want us putting chemicals anywhere near water*
483 *source*".

484
485 We also found that some farmers would not want to be associated with pollution problems and this
486 desire to protect their reputation was influential in their decision to use the weed wiper. As participant
487 7 stated, "*it has to be in their [the farmers'] interests as well. I think because some farmers would want*
488 *to make sure that they aren't kind of associated with any issues of pollution, maybe, you know, such as*
489 *water runoff or similar, that would be in their interest*". The regulatory context, in this case the need to
490 acquire a pesticide application license prior to the purchase of the weed wiper, was a hindrance to the
491 uptake of the weed wiper. In responding to why some farmers may not be able to use the weed wiper,
492 Participant 4 said "*...how difficult it is to take the licences before using the weed wiper and the use of*
493 *that chemical, because it's a really strong chemical, Round up Glyphosate*", while Participant 8 noted
494 that "*we haven't got our pesticide application licence and that's going to inhibit us from using the weed*
495 *wiper*".

496
497 Some farmers are less likely to change practices because they feel uncomfortable about dealing with a
498 new technology. They feel comfortable keeping practices that have been passed on from generations.
499 This is illustrated in the account of participant 14 who indicated that one reason some farmers are not
500 using the weed wiper is "*probably because they feel uncomfortable about something they've never used*
501 *before. Maybe the older generation who don't like machinery and say, Oh, I can't do that. Because I've*
502 *never done it before. A younger person will be more adaptable to things...It's only a generation thing*
503 *really*".

504
505 Interview results also revealed that time and availability of resources such as technology (the weed
506 wiper), complementary equipment (e.g., quad bike), the required herbicide (Glyphosate), and time were
507 key factors driving the decision to use the weed wiper. These resources are all needed to be able to use
508 the weed wiper, and are therefore conditional of its adoption. As Participant 1 noted, "*the other*
509 *[barrier] would be availability of the technology such that farmers tend to be very busy now and some*
510 *don't plan very well. And suddenly, I can do it today, well, the weed wiper is not available*". Participant
511 2 added that "*the main reason I didn't do it [participate in the trial] is I don't have a quad bike. I need*
512 *something to pull it with*".

513

514 We found that agronomic factors such as the type of weed and extent of weed problem, type of crop,
515 land use and farm size may also determine whether a farmer adopts the weed wiper, and sustains its use
516 on his/her farm in the future . For example, when asked if they would use the weed wiper in future, one
517 farmer responded “...*Yes, possibly! But the main weed that I control is dock. And the best way to control*
518 *a dock is when it's small. So if you leave it until it's big enough to be controlled by a weed wiper, it's*
519 *too big to kill it. You're supposed to kill docks when it's just starting to grow, in the spring. But you*
520 *can't use a weed wiper for that”* (Participant 2). In relation to farm size, a participant of the weed wiper
521 trial who had not pursued using the technology afterwards indicated that “*I have thought about buying*
522 *more land and expanding my farm, if I did this, I would consider hiring the weed wiper. I'd consider*
523 *using one in the future if I bought more land with more rush to treat”* (Participant 17). The fact that this
524 farmer mentions additional land “with more rush to treat” suggests that the extent of weed problem may
525 interact with farm size to influence the decision to adopt the weed wiper.

526
527 Other crucial agronomic factors include the need to not kill off the clover, keep healthy soil, and to
528 apply a fast and easy weed management technique. Beyond these, perceived financial benefits were
529 identified as a motivation for adoption while cost was a potential barrier. Participant 8 explaining why
530 they were unable to use the weed wiper stated that “...*because there's no plenty of money for other*
531 *things. Because we haven't got our pesticide application licence, we'd probably need a contractor to do*
532 *it and I don't know how costly that is. So it's been a question of priorities and we got other things to do.*
533 *When you got X amount to spend, you know, that might not be your concern. Maybe it's wrong, but it's*
534 *a bit lower priority. If we had unlimited cash, we could do something different”*. A participant of the
535 weed wiper trial also indicated that “*we're not able to use the weed wiper [again] as we cannot afford*
536 *to buy our own machine. If we were able to hire one for free again we definitely would as it was*
537 *amazing”* (Participant 22). Financial constraint explains in part, why some farmers are unable to
538 continue to use the weed wiper. While these farmers highlighted cost as a barrier, another farmer from
539 the Wye catchment who participated in the weed wiper trial indicated that “*the low cost of using a weed*
540 *wiper in comparison to other methods is the main driver, along with the good results. I can't think of*
541 *anything that would prevent me from using one”* (Participant 20). This suggests that financial
542 considerations can act both as a driver and a barrier depending on the farmers' circumstances, thus
543 highlighting a potential moderating role of situational factors.

544
545 Season and weather conditions appear to influence weed management practices. Some farmers
546 explained that wet seasons pose major challenges to them and this may determine the extent to which
547 they are able to follow best practice. One farmer explained that, “...*season does have impact because*
548 *our land is quite wet. So in a wet year, we struggle to get on with the tractor and the topper to do the*
549 *topping. So some years we wouldn't touch because we can't basically get on there to top them. If we*
550 *can't top them, they grow too strong...And then it's no good spraying them because they're too big; you*

551 *need to spray them when they're small. So yeah, the season is important. Generally, in a wet year, we*
552 *wouldn't do so much weed control. But in a dry year like this, we've got more opportunities to top the*
553 *weeds” (Participant 13, Farmer). Similarly, locational characteristics seem to influence practices as*
554 *some farmers mentioned that very steep landscapes makes it difficult to in move spraying machines.*

555
556 Just as the awareness-behaviour link is influenced by other factors, the relationship between adoption
557 of BMPs and MCPA concentration is influenced by contextual factors. From the interviews, we
558 identified other factors that could influence MCPA concentration. For instance, some interview
559 participants indicated that MCPA concentration depends on the number of farmers implementing the
560 recommended practices within a catchment, how long the practice has been implemented, external
561 interventions (e.g., work from other companies within the catchment) and differences in land uses. In
562 fact, Participant 9 suggested that the declining MCPA concentration recorded in the Teme, one of the
563 control catchments, might be due to a different land use, which in turn contributes to different pesticides
564 being applied in the catchment: “...if you looked at other grassland pesticides, not just MCPA, that
565 catchment [the Teme] will be really high. Because that's quite a heavy arable land area so they could
566 be using more grassland herbicides, not necessarily MCPA”.

567
568
569

570 **4. DISCUSSION**

571
572 Results show that the mean MCPA concentration declined significantly in all the targeted catchments
573 post the weed wiper trial (Figure 2); decreasing in all three targeted catchments by on average 45.2%
574 In contrast, mean MCPA concentration displayed a variety of response in the control catchments; one
575 declined and two increased (Figure 2). The largest decline in MCPA (55%) was observed in the Teifi
576 catchment (Figure 3) where almost double the weed wiper hires occurred over the last five years than
577 in the Upper Wye (152 and 94, respectively) and where most information packs were distributed (Table
578 2). In addition, the Teifi is the smallest of the target catchment. Therefore, these two factors (small
579 catchment size and high uptake of weed wiper hires) is likely to account for why the largest decline in
580 MCPA has been observed in the Teifi catchment. This is strong evidence that the weed wiper trial has
581 resulted in the adoption of the weed wiper and that this is likely to account for the decline in MCPA
582 concentrations in drinking water sources. By wiping pesticides directly onto the weeds, the weed wiper
583 reduces spray drift and uses less chemicals, thereby reducing risk of runoff. This finding supports results
584 of previous studies on measures that reduce spray drift to pesticide pollution (e.g., de Snoo and de Wit,
585 1998, see also, Kay et al., 2009 for a review), as they found that such BMPs could be highly efficient
586 in reducing pesticide pollution, although none of these earlier studies focussed specifically on MCPA.
587 Even more importantly, all weed wipers were only licensed for use with Glyphosate, thus the amount
588 of MCPA being applied in the targeted catchments declined with increasing hires. As found by Baker
589 et al. (1995), product substitution can potentially contribute to a reduction in pesticide pollution in

590 surface waters although this depends on the efficacy of the new product (Reichenberger et al., 2007),
591 which seems to have been the case here.

592
593 Another key factor that contributes to the success of the weed wiper trial in improving water quality
594 relates to the type of pollutant being targeted. Due to its high solubility and poor adsorption to the soil
595 matrix, MCPA is susceptible to rapid transport to surface water and thus it takes a relatively short
596 timeframe to see the impact of increasing weed wiper use on water quality. In contrast, research on
597 phosphorus has shown that it may take many years to realise the impacts of BMPs on water quality due
598 to the build-up and retention of phosphorus in soils and river sediments (Stålnacke et al., 2003, Grimvall
599 et al., 2000). In the case of nitrate, it can take several decades to see changes in surface water
600 concentrations in catchments dominated by groundwater (e.g., Burt et al., 2011). This is because nitrate
601 usually moves slowly through the aquifer. Therefore, the nature of the pollutant and catchment
602 characteristics are important in controlling the time lag observed between intervention and improvement
603 in water quality and the difference observed between the results of the weed wiper trial in this case
604 study and those observed in other studies (e.g., Kroon et al., 2016; Meals et al., 2010). In the case of
605 this research, the role of these other factors is reinforced by the small effect size (Partial eta-
606 squared (η^2) = 0.002) obtained for the effects of the weed wiper trial on MCPA concentration (based
607 on Cohen's indicators where small, medium, and large effects are reflected in values up to 0.10, 0.25,
608 and 0.40, respectively (Cohen, 1973, 2013)). This raises an important question about what techniques
609 might be needed to help farmers appreciate how water quality is responding to changes in land
610 management practices for pollutants that take longer to respond to BMPs. Especially as slower changes
611 in water quality may lead to farmers being less motivated to adopt BMPs. Vilas et al. (2020) have shown
612 that real-time reporting of water quality data has the potential to tackle this problem, ultimately
613 enhancing likelihood of BMP adoption among farmers.

614
615 Results from the in-depth interviews show that farmers had a good understanding of both pesticide
616 pollution and BMPs. Farmers' awareness of pesticide pollution and BMPs could be attributed in part to
617 the weed wiper trial. Moreover, Welsh Water used different information dissemination channels to
618 reach many farmers including those who did not participate in the trial (29.3% of information packs
619 were distributed among farmers outside the targeted catchments). Past studies have shown that
620 dissemination mechanisms involving multiple channels are effective in reaching out to a wide audience
621 and improving farmers' awareness particularly where the message is personally relevant (Dwyer et al.,
622 2007). As observed in this study, even farmers who did not participate in the trial reported that they
623 received information on pesticide pollution, the weed wiper and other BMPs from different sources
624 including their neighbours (see section 2.1). For those that participated, they indicated how the
625 information packs were useful in improving their understanding of safe measures of pesticide
626 management.

627
628 While advice (via the information packs) seems to have improved farmers' awareness, experiential
629 learning seem to have played a crucial role in further advancing farmers' understanding and contributed
630 to uptake of BMPs (specifically the weed wiper). Experiential learning refers to learning-by-doing, and
631 has been shown to be an effective mechanism for improving farmers' knowledge and uptake of BMPs
632 (Suškevičs et al., 2019; Drangert et al., 2017). As some farmers noted, having the opportunity to use
633 the weed wiper during the trial was critical in improving their knowledge of best pesticide management,
634 and helped them to appreciate the benefits of adopting BMPs. Without this first-hand experience, they
635 were more likely to be still using their old practices of weed management (e.g., knapsack and/or boom
636 spraying). This finding consolidates the evidence that while information provision is important,
637 farmers' are more likely to take up BMPs when given the opportunity to 'practise what they are taught'
638 (Suškevičs et al., 2019, Okumah et al., 2019b, Dwyer et al., 2007). This can be linked to the reflective
639 process that individuals go through when they engage in an activity, thus offering them the opportunity
640 to learn from active experimentation, subsequently enhancing their chances of adoption (Kolb, 1984).
641 In this case, adoption could be linked to two issues: first, a better understanding of the benefits (Kolb,
642 1984) and thus, the motivation to do it, and second, improved self-efficacy i.e., the confidence that they
643 would be able to engage in the practice and do it well (Bandura, 1997). Consistent with these results,
644 previous studies have demonstrated that farmers with a profound understanding of environmental
645 pollution and BMPs are more likely to be environmentally concerned, have higher self-efficacy (Sewell
646 et al., 2017) and are more likely to take up BMPs (Floress et al., 2017).

647
648 The extensive dissemination of information among farmers means that some farmers who did not
649 participate in the trial had knowledge of the practices being promoted, with some of them acquiring and
650 using a weed wiper (although the vast majority of information packs were distributed in the targeted
651 catchments). This is not surprising, since farming communities do not operate in 'closed bubbles' and
652 some permeability of information is to be expected. Moreover, other existing advisory services implies
653 that farmers who did not participate in the scheme still had knowledge of BMPs from other sources. As
654 some farmers and institutional interviewees indicated, there are ongoing efforts to raise awareness of
655 BMPs to reduce diffuse water pollution from agriculture and farmers are increasingly taking advantage
656 of the advice being provided. While it would have been interesting to point out potential differences in
657 levels of awareness and behavioural changes between farmers who participated in the trial and those
658 who did not, this was not possible with the available data. However, the results of this study still show
659 that awareness does play a key role in explaining behavioural changes and improvements in water
660 quality.

661
662 We also found that attributes of the weed wiper technology influenced its uptake. As Pannell and
663 Zilberman (2020) have indicated, the advantages that a technology has over competing alternatives
664 plays a key role in farmers' decisions and adoption behaviour. In this study, we found that some of the

665 reasons for the adoption of the weed wiper was because there was less hassle to hire or acquire the
666 machine, it was easy to operate or use, it yielded financial benefits due to reduced input cost and did
667 not require significant changes in farm operations or management practices. This supports the growing
668 evidence on the moderating role of contextual factors such as cost of compliance and ‘goodness of fit’
669 of practice on the awareness-behaviour link (Pannell and Zilberman, 2020; Okumah et al., 2018; Kroon
670 et al., 2016; Barnes et al., 2009; Pannell et al., 2006). Farmers are more likely to adopt BMPs where the
671 requirements fit the farm situation, especially when the costs of taking up such measures are low and
672 the technology is easy to implement compared to more expensive and complicated technologies (Sattler
673 and Nagel, 2010; Wynn et al., 2001; Morris et al., 2000; Wilson, 1997).

674
675
676 Pressure from neighbours, landlords and institutions seem to play a role in uptake of BMPs in our case.
677 This evidence supports the findings of previous studies on the role of social norms. For some farmers,
678 the decision to engage in sustainable practices depends on what their neighbours think or do, and their
679 perceptions on what they ought to do (Dessart et al., 2019). This is particularly true for people with a
680 strong tendency to conform to the majority (Asch, 1956) as well as ‘conditional co-operators’ – those
681 who would do it if others do (Fischbacher et al., 2001). This is reinforced by the finding that some
682 farmers do not want to be associated with pollution problems as they perceive other people’s opinions
683 to be important and sometimes need social approval (Talcott, 2013). Consequently, these farmers feel
684 that engaging in bad practices could project them as ‘bad’ people (Defrancesco et al., 2008).

685
686 Openness to change is another important factor. We found that some farmers were less likely to change
687 practices because they are not comfortable dealing with a new technology; they prefer to keep practices
688 that have been passed on from generations. This corroborates the findings of previous studies on the
689 role of ‘resistance to change’ in farmers’ adoption of BMPs (e.g., Burton et al., 2008). We know from
690 past empirical studies that farmers who score low on openness to engage in new experiences were more
691 reluctant to change due to the status quo bias (George and Zhou, 2001), i.e., these farmers desire to keep
692 existing practices as new ones are (sometimes) perceived to have negative consequences (Dessart et al.,
693 2019; Samuelson and Zeckhauser, 1988). A recent study on the influence of status quo bias in adoption
694 of agri-environment policy concluded that a large proportion of farmers do not accept change (Barreiro-
695 Hurle et al., 2018), a potential reason for low adoption of BMPs in (some) farming communities.

696
697 While the use of the weed wiper appears to be promising in reducing MCPA concentration in drinking
698 water sources, sustaining results of this initiative may be challenging particularly as the uptake of weed
699 wiper hires appears to have declined in the target catchment over the last two years compared to the
700 first three years of the initiative (Table 3). The decline in weed wiper hires over time might be related
701 to the fact that farmers have only one opportunity to hire the machine for free. It could be that engaged
702 farmers who were very keen to try the machine participated in the early years (2015-2017) of the trial.

703 As these farmers do not have the opportunity to hire the weed wiper again, further effort will be needed
704 to reach out to less engaged farmers to encourage them to try it. This free hire aspect of the trial is very
705 important as cost of hiring and/or acquiring the weed wiper was highlighted as a barrier to uptake by
706 some farmers.

707
708 In addition to the above, the UK is at a major crossroads in terms of pesticide legislation and policy
709 given Brexit (i.e., the UK's departure from the EU). It could decide to mirror the existing EU system
710 and all its pesticide regulations and standards, or reduce regulations and weaken our existing standards
711 or go further than the EU in protecting our environment from pesticide-related harms and deliver a
712 'Green Brexit'. There are currently political debates on phasing out glyphosate – the approved product
713 for the weed wiper – in the agricultural sector by 2022 (European Parliament., 2017). If this should
714 happen, an alternative pesticide would be needed, otherwise farmers are likely to return to the use of
715 MCPA which may negate the water quality benefits Welsh Water have seen as a result of their weed
716 wiper trial. In the midst of these uncertainties, additional efforts will be needed towards encouraging
717 farmers to use Integrated Pest Management (IPM) methods for controlling weeds (i.e., the use non-
718 chemical and targeted chemical). Although non-chemical methods were previously seen as less
719 effective means of rush control, it is thought that modern farm technology could facilitate their use
720 (Morton et al., 2020).

721
722

723 **5. CONCLUSION**

724

725 Efforts to tackle diffuse water pollution from agriculture are increasingly focusing on improving
726 farmers' awareness under the expectation that this would contribute to them adopting BMPs and result
727 in water quality improvements. To date, however, there are limited studies exploring the full awareness-
728 behaviour-water quality pathway; with previous studies having mostly addressed the awareness-
729 behaviour link relying on mono-disciplinary approaches. To address this important knowledge gap, we
730 examined whether awareness-focussed approaches to mitigating diffuse water pollution from
731 agriculture do result in increased adoption of BMPs and improved water quality, adopting an
732 interdisciplinary approach to address the pathway in full. To do this, we worked with the Welsh water
733 utility in the UK and their weed wiper trial to reduce levels of pesticide MCPA (2-methyl-4-
734 chlorophenoxyacetic acid) in drinking water sources.

735

736 Analysis of MCPA concentrations from 2006 to 2019 shows a significant decline of 45.2% in MCPA
737 concentration for the targeted catchments. Results from stakeholder interviews suggest that awareness
738 – promoted through the weed wiper trial – had contributed to adoption of BMPs and that these are very
739 likely to have resulted in the water quality improvements to drinking water sources. The combination
740 of findings from this study provides some support for the emerging theoretical premise that the
741 awareness-behaviour-water quality pathway exists but that this relationship may be mediated and/or

742 moderated by other variables. This provides evidence that awareness-focussed approaches do work,
743 however, policymakers and catchment managers need to consider the complex nature of the pathway
744 and factors influencing it. Additionally, the findings of this study show promising results for awareness-
745 focussed approaches not just in relation to diffuse water pollution from agriculture, but more generally
746 for the uptake of BMPs and their impact in different environmental management areas.

747
748 The awareness-behaviour-water quality pathway is complex and dependent on several factors. We
749 believe that this complexity can never be fully disentangled due to the ‘wicked’ nature of diffuse
750 pollution problems and the psychosocial, agronomic, economic and biophysical factors influencing it.
751 Nonetheless, we believe that it is extremely useful to start disentangling such complex relationships
752 using the best available data as we have done in this study. To improve our understanding of the
753 pathway, further research and data will be needed on other psychosocial, economic, agronomic factors,
754 catchment and weather factors that interact to affect farmer’s ability to implement BMPs and thus
755 overall water quality improvements.

756
757 **ACKNOWLEDGEMENT**

758
759 This research was funded by the University of Leeds International Doctoral Scholarship (LIDS) (2017-
760 2020). Many thanks to water@leeds and Sustainability Research Institute (Economics and Policy
761 Research Group) for providing funds to support the fieldwork for this research. We are grateful to the
762 farmers and stakeholders who participated in this research. Special thanks to Welsh Water, particularly
763 Charlotte Poole and Aled Williams.

764
765
766
767
768 **5. REFERENCES**

769
770 ASCH, S. E. 1956. Studies of independence and conformity: I. A minority of one against a unanimous
771 majority. *Psychological monographs: General and applied*, 70, 1.
772 BARNES, A. P., WILLOCK, J., HALL, C. & TOMA, L. 2009. Farmer perspectives and practices
773 regarding water pollution control programmes in Scotland. *Agricultural Water Management*,
774 96, 1715-1722.
775 BARREIRO-HURLÉ, J., ESPINOSA-GODED, M. & DUPRAZ, P. 2010. Does intensity of change
776 matter? Factors affecting adoption of agri-environmental schemes in Spain. *Journal of*
777 *environmental planning and management*, 53, 891-905.
778 BARREIRO-HURLE, J., ESPINOSA-GODED, M., MARTINEZ-PAZ, J. M. & PERNI, A. 2018.
779 Choosing not to choose: A meta-analysis of status quo effects in environmental valuations
780 using choice experiments. *Economía Agraria y Recursos Naturales-Agricultural and*
781 *Resource Economics*, 18, 79-109.
782 BAUMGART-GETZ, A., PROKOPY, L. S. & FLORESS, K. 2012. Why farmers adopt best
783 management practice in the United States: A meta-analysis of the adoption literature. *Journal*
784 *of Environmental Management*, 96, 17-25.
785 BENGTTSSON, M. 2016. How to plan and perform a qualitative study using content analysis.
786 *NursingPlus Open*, 2, 8-14.

- 787 BLACKSTOCK, K. L., INGRAM, J., BURTON, R., BROWN, K. M. & SLEE, B. 2010.
 788 Understanding and influencing behaviour change by farmers to improve water quality.
 789 *Science of the Total Environment*, 408, 5631-5638.
- 790 BURT, T.P., HOWDEN, N.J.K., WORRALL, F., WHELAN, M.J. & BIEROZA, M., 2011. Nitrate in
 791 United Kingdom rivers: policy and its outcomes since 1970. *Environ. Sci. Technol.* 45, 175–
 792 181.
- 793 BURTON, R. J., KUCZERA, C. & SCHWARZ, G. 2008. Exploring farmers' cultural resistance to
 794 voluntary agri-environmental schemes. *Sociologia ruralis*, 48, 16-37.
- 795 BYRNE, M. M. 2001. Evaluating the findings of qualitative research. *AORN journal*, 73, 703-703.
- 796 CAPITANIO, F., ADINOLFI, F. & MALORGIO, G. 2011. What explains farmers' participation in
 797 rural development policy in Italian southern region? An empirical analysis. *New Medit*, 10,
 798 19-24.
- 799 COHEN, J., 2013. Statistical power analysis for the behavioral sciences. Academic press.
- 800 COHEN, J., 1973. Eta-squared and partial eta-squared in fixed factor ANOVA designs. *Educational*
 801 *and psychological measurement*, 33(1), pp.107-112.
- 802 COLLINS, A. L., ZHANG, Y. S., WINTER, M., INMAN, A., JONES, J. I., JOHNES, P. J.,
 803 CLEASBY, W., VRAIN, E., LOVETT, A. & NOBLE, L. 2016. Tackling agricultural diffuse
 804 pollution: What might uptake of farmer-preferred measures deliver for emissions to water and
 805 air? *Science of The Total Environment*, 547, 269-281.
- 806 DAMANIA, R., DESBUREAUX, S., RODELLA, A.-S., RUSS, J. & ZAVERI, E. 2019. Quality
 807 Unknown: The Invisible Water Crisis. The World Bank.
- 808 DAXINI, A., O'DONOGHUE, C., RYAN, M., BUCKLEY, C., BARNES, A. P. & DALY, K. 2018.
 809 Which factors influence farmers' intentions to adopt nutrient management planning? *Journal*
 810 *of environmental management*, 224, 350-360.
- 811 DAXINI, A., RYAN, M., O'DONOGHUE, C. & BARNES, A. P. 2019a. Understanding farmers'
 812 intentions to follow a nutrient management plan using the theory of planned behaviour. *Land*
 813 *Use Policy*, 85, 428-437.
- 814 DAXINI, A., RYAN, M., O'DONOGHUE, C., BARNES, A. P. & BUCKLEY, C. 2019b. Using a
 815 typology to understand farmers' intentions towards following a nutrient management plan.
 816 *Resources, Conservation and Recycling*, 146, 280-290.
- 817 DE SNOO, G. R. & DE WIT, P. J. 1998. Buffer zones for reducing pesticide drift to ditches and risks
 818 to aquatic organisms. *Ecotoxicology and environmental safety*, 41, 112-118.
- 819 DEFRA. 2012. *Observatory monitoring framework – indicator data sheet: Environmental Impact*
 820 *Water* [Online]. London: The Department for Environment, Food and Rural Affairs.
 821 Available:
 822 [https://assets.publishing.service.gov.uk/government/uploads/system/uploads/attachment_data/](https://assets.publishing.service.gov.uk/government/uploads/system/uploads/attachment_data/file/162165/defra-stats-observatory-indicators-da4.-120224.pdf)
 823 <file/162165/defra-stats-observatory-indicators-da4.-120224.pdf> [Accessed 18/05 2020].
- 824 DEFRANCESCO, E., GATTO, P., RUNGE, F. & TRESTINI, S. 2008. Factors affecting farmers'
 825 participation in agri-environmental measures: A Northern Italian perspective. *Journal of*
 826 *agricultural economics*, 59, 114-131.
- 827 DESSART, F. J., BARREIRO-HURLÉ, J. & VAN BAVEL, R. 2019. Behavioural factors affecting
 828 the adoption of sustainable farming practices: a policy-oriented review. *European Review of*
 829 *Agricultural Economics*, 46, 417-471.
- 830 DPMAG 2015. Strategy to reduce diffuse pollution. Edinburgh: Scottish Environment Protection
 831 Agency.
- 832 DRANGERT, J.-O., KIELBASA, B., ULEN, B., TONDERSKI, K. S. & TONDERSKI, A. 2017.
 833 Generating applicable environmental knowledge among farmers: experiences from two
 834 regions in Poland. *Agroecology and Sustainable Food Systems*, 41, 671-690.
- 835 DUCKETT, D., FELICIANO, D., MARTIN-ORTEGA, J. & MUNOZ-ROJAS, J. 2016. Tackling
 836 wicked environmental problems: The discourse and its influence on praxis in Scotland.
 837 *Landscape and Urban Planning*, 154, 44-56.
- 838 DWYER, J., MILLS, J., INGRAM, J., TAYLOR, J., BURTON, R., BLACKSTOCK, K., SLEE, B.,
 839 BROWN, K., SCHWARZ, G. & MATTHEWS, K. 2007. Understanding and influencing
 840 positive behaviour change in farmers and land managers. *CCRI, Macaulay Institute*.

841 ENVIRONMENT AGENCY 2011. Catchment Sensitive Farming - ECSFDI Phase 1 & 2 Evaluation
842 Report. Bristol Environment Agency

843 ENVIRONMENT AGENCY 2014. Catchment Sensitive Farming: A clear solution for farmers.
844 Bristol Environment Agency.

845 EUROPEAN PARLIAMENT. 2017. MEPs demand glyphosate phase-out, with full ban by end 2022
846 European Parliament News: European Parliament.

847 FISCHBACHER, U., GÄCHTER, S. & FEHR, E. 2001. Are people conditionally cooperative?
848 Evidence from a public goods experiment. *Economics letters*, 71, 397-404.

849 FLORESS, K., DE JALON, S. G., CHURCH, S. P., BABIN, N., ULRICH-SCHAD, J. D. &
850 PROKOPY, L. S. 2017. Toward a theory of farmer conservation attitudes: Dual interests and
851 willingness to take action to protect water quality. *Journal of Environmental Psychology*, 53,
852 73-80.

853 GEORGE, J. M. & ZHOU, J. 2001. When openness to experience and conscientiousness are related to
854 creative behavior: an interactional approach. *Journal of applied psychology*, 86, 513.

855 GIBBONS, J. M., WILLIAMSON, J. C., WILLIAMS, A. P., WITHERS, P. J. A., HOCKLEY, N.,
856 HARRIS, I. M., HUGHES, J. W., TAYLOR, R. L., JONES, D. L. & HEALEY, J. R. 2014.
857 Sustainable nutrient management at field, farm and regional level: Soil testing, nutrient
858 budgets and the trade-off between lime application and greenhouse gas emissions.
859 *Agriculture, Ecosystems & Environment*, 188, 48-56.

860 GIRI, S. & QIU, Z. 2016. Understanding the relationship of land uses and water quality in Twenty
861 First Century: A review. *Journal of Environmental Management*, 173, 41-48.

862 GOLOTA, H. 2018. Get Smart: Understanding Intelligent Verbatim Transcription. *Globalme*
863 *Language and Technology*, 10.

864 GRIMVALL, A., STÅLNACKE, P. & TONDESKI, A. J. E. E. 2000. Time scales of nutrient losses
865 from land to sea—a European perspective. 14, 363-371.

866 KAY, P., EDWARDS, A. C. & FOULGER, M. 2009. A review of the efficacy of contemporary
867 agricultural stewardship measures for ameliorating water pollution problems of key concern
868 to the UK water industry. *Agricultural Systems*, 99, 67-75.

869 KAY, P., GRAYSON, R., PHILLIPS, M., STANLEY, K., DODSWORTH, A., HANSON, A.,
870 WALKER, A., FOULGER, M., MCDONNELL, I. & TAYLOR, S. 2012. The effectiveness
871 of agricultural stewardship for improving water quality at the catchment scale: experiences
872 from an NVZ and ECSFDI watershed. *Journal of hydrology*, 422, 10-16.

873 KNOOK, J., DYNES, R., PINXTERHUIS, I., DE KLEIN, C. A. M., EORY, V., BRANDER, M. &
874 MORAN, D. 2019. Policy and Practice Certainty for Effective Uptake of Diffuse Pollution
875 Practices in A Light-Touch Regulated Country. *Environmental Management*.

876 KOLB, D. A. 1984. Experience as the source of learning and development. *Upper Sadle River:*
877 *Prentice Hall*.

878 KROON, F.J., THORBURN, P., SCHAFFELKE, B. & WHITTEN, S., 2016. Towards protecting the
879 Great Barrier Reef from land-based pollution. *Global change biology*, 22(6), pp.1985-2002.

880 KUHFUSS, L., PRÉGET, R., THOYER, S., HANLEY, N., LE COENT, P. & DÉSOLOÉ, M. 2016.
881 Nudges, social norms, and permanence in agri-environmental schemes. *Land Economics*, 92,
882 641-655.

883 MACGREGOR, C. J. & WARREN, C. R. 2006. Adopting sustainable farm management practices
884 within a Nitrate Vulnerable Zone in Scotland: The view from the farm. *Agriculture,*
885 *Ecosystems & Environment*, 113, 108-119.

886 MARTIN-ORTEGA, J. & HOLSTEAD, K. L. 2013. Improving Implementation and Increasing
887 Uptake of Measures to Improve Water Quality in Scotland. . Aberdeen: The James Hutton
888 Institute.

889 MARTIN-ORTEGA, J., PERNI, A., JACKSON-BLAKE, L., BALANA, B. B., MCKEE, A., DUNN,
890 S., HELLIWELL, R., PSALTOPOULOS, D., SKURAS, D. & COOKSLEY, S. 2015. A
891 transdisciplinary approach to the economic analysis of the European Water Framework
892 Directive. *Ecological Economics*, 116, 34-45.

893 MEALS, D. W., DRESSING, S. A. & DAVENPORT, T. E. 2010. Lag Time in Water Quality
894 Response to Best Management Practices: A Review. *Journal of environmental quality*, 39,
895 85-96.

- 896 MINISTRY FOR THE ENVIRONMENT 2014. National policy statement for freshwater
897 management 2014 amended 2017 New Zealand. (Ministry for the Environment: Wellington,
898 New Zealand.) [https://www.mfe.govt.nz/publications/fresh-water/national-policy-statement-](https://www.mfe.govt.nz/publications/fresh-water/national-policy-statement-freshwater-management-2014)
899 [freshwater-management-2014](https://www.mfe.govt.nz/publications/fresh-water/national-policy-statement-freshwater-management-2014)
- 900 MORGAN, D. L. 2014. Pragmatism as a Paradigm for Social Research. *Qualitative Inquiry*, 20, 1045-
901 1053.
- 902 MORRIS, J., MILLS, J. & CRAWFORD, I. 2000. Promoting farmer uptake of agri-environment
903 schemes: the Countryside Stewardship Arable Options Scheme. *Land Use Policy*, 17, 241-
904 254.
- 905 MORTON, P. A., FENNELL, C., CASSIDY, R., DOODY, D., FENTON, O., MELLANDER, P. E.
906 & JORDAN, P. 2020. A review of the pesticide MCPA in the land-water environment and
907 emerging research needs. *Wiley Interdisciplinary Reviews: Water*, 7, e1402.
- 908 NRCS 2018. Environmental Quality Incentives Program, USDA Natural Resources
909 Conservation Service Washington, DC.
- 910 NRCS 2019. Environmental Quality Incentives Program, Federal Register Rules and Regulations Vol.
911 84, No. 242, USDA Natural Resources Conservation Service and Commodity Credit
912 Corporation.
- 913 OECD 2012. Water quality and agriculture: meeting the policy challenge. OECD Studies on Water. .
914 Paris: Organisation for Economic Co-operation and Development.
- 915 OECD 2017. Diffuse Pollution, Degraded Waters: Emerging Policy Solutions. Paris OECD
916 Publishing.
- 917 OKUMAH, M., CHAPMAN, P., MARTIN-ORTEGA, J. & NOVO, P. 2019a. Mitigating Agricultural
918 Diffuse Pollution: Uncovering the Evidence Base of the Awareness–Behaviour–Water
919 Quality Pathway. *Water*, 11, 29.
- 920 OKUMAH, M., MARTIN-ORTEGA, J., CHAPMAN, P. J., LYON, C. & NOVO, P. 2019b.
921 Behavioural impacts of Northern Ireland’s Funded Soil Sampling and Training Schemes
922 2017-2019. A Rephokus project report prepared for the Department of Agriculture and Rural
923 Affairs (Northern Ireland).
- 924 OKUMAH, M., MARTIN-ORTEGA, J. & NOVO, P. 2018. Effects of awareness on farmers’
925 compliance with diffuse pollution mitigation measures: A conditional process modelling.
926 *Land Use Policy*, 76, 36-45.
- 927 OKUMAH, M. & ANKOMAH-HACKMAN, P., 2020. Applying conditional process modelling to
928 investigate factors influencing the adoption of water pollution mitigation
929 behaviours. *Sustainable Water Resources Management*, 6(2), p.17.
- 930 ONWUEGBUZIE, A. J. & LEECH, N. L. 2005. On becoming a pragmatic researcher: The
931 importance of combining quantitative and qualitative research methodologies. *International*
932 *journal of social research methodology*, 8, 375-387.
- 933 QUEENSLAND GOVERNMENT 2018. Reef 2050 Reef Water Quality Improvement Plan 2017-
934 2022. [https://www.reefplan.qld.gov.au/_data/assets/pdf_file/0017/46115/reef-2050-water-](https://www.reefplan.qld.gov.au/_data/assets/pdf_file/0017/46115/reef-2050-water-quality-improvement-plan-2017-22.pdf)
935 [quality-improvement-plan-2017-22.pdf](https://www.reefplan.qld.gov.au/_data/assets/pdf_file/0017/46115/reef-2050-water-quality-improvement-plan-2017-22.pdf)
- 936 PANNELL, D. & ZILBERMAN, D., 2020. Understanding adoption of innovations and behavior
937 change to improve agricultural policy. *Applied Economic Perspectives and Policy*, 42(1),
938 pp.3-7.
- 939 PANNELL, D.J., MARSHALL, G.R., BARR, N., CURTIS, A., VANCLAY, F. AND WILKINSON,
940 R., 2006. Understanding and promoting adoption of conservation practices by rural
941 landholders. *Australian journal of experimental agriculture*, 46(11), pp.1407-1424.
- 942 RANJAN, P., CHURCH, S. P., FLORESS, K. & PROKOPY, L. S. 2019. Synthesizing Conservation
943 Motivations and Barriers: What Have We Learned from Qualitative Studies of Farmers’
944 Behaviors in the United States? *Society & Natural Resources*, 32, 1171-1199.
- 945 RAYMOND, C. M., FAZEY, I., REED, M. S., STRINGER, L. C., ROBINSON, G. M. & EVELY, A.
946 C. 2010. Integrating local and scientific knowledge for environmental management. *Journal*
947 *of Environmental Management*, 91, 1766-1777.

948 REIMER, A. P., WEINKAUF, D. K. & PROKOPY, L. S. 2012. The influence of perceptions of
949 practice characteristics: An examination of agricultural best management practice adoption in
950 two Indiana watersheds. *Journal of Rural Studies*, 28, 118-128.

951 ROSSMAN, G. B. & WILSON, B. L. 1985. Numbers and words: Combining quantitative and
952 qualitative methods in a single large-scale evaluation study. *Evaluation review*, 9, 627-643.

953 RUSSELL LAWLEY 2011. *The Soil-Parent Material Database: A User Guide*. British Geological
954 Survey Open Report, OR/08/034. 53pp.

955 SAMUELSON, W. & ZECKHAUSER, R. 1988. Status quo bias in decision making. *Journal of risk
956 and uncertainty*, 1, 7-59.

957 SATTLER, C. & NAGEL, U. J. 2010. Factors affecting farmers' acceptance of conservation
958 measures—A case study from north-eastern Germany. *Land Use Policy*, 27, 70-77.

959 SEWELL, A., HARTNETT, M., GRAY, D., BLAIR, H., KEMP, P., KENYON, P., MORRIS, S. &
960 WOOD, B. 2017. Using educational theory and research to refine agricultural extension:
961 affordances and barriers for farmers' learning and practice change. *The Journal of
962 Agricultural Education and Extension*, 23, 313-333.

963 STÅLNACKE, P., GRIMVALL, A., LIBISELLER, C., LAZNIK, M. & KOKORITE, I. J. J. O. H.
964 2003. Trends in nutrient concentrations in Latvian rivers and the response to the dramatic
965 change in agriculture. 283, 184-205.

966 STOATE, C., JONES, S., CROTTY, F., MORRIS, C. & SEYMOUR, S. 2019. Participatory research
967 approaches to integrating scientific and farmer knowledge of soil to meet multiple objectives
968 in the English East Midlands. *Soil Use and Management*, 35, 150-159.

969 STRAUSS, A. & CORBIN, J. 1998. Basics of qualitative research: techniques and procedures for
970 developing grounded theory. Sage Publications. *Thousand Oaks, CA*.

971 SUŠKEVIČS, M., HAHN, T. & RODELA, R. 2019. Process and Contextual Factors Supporting
972 Action-Oriented Learning: A Thematic Synthesis of Empirical Literature in Natural Resource
973 Management. *Society & Natural Resources*, 32, 731-750.

974 TALCOTT, P. 2013. The social system.

975 TERMEER, C. J. & DEWULF, A. 2019. A small wins framework to overcome the evaluation
976 paradox of governing wicked problems. *Policy and Society*, 38, 298-314.

977 TRESS, G., TRESS, B. & FRY, G. 2005. Clarifying Integrative Research Concepts in Landscape
978 Ecology. *Landscape Ecology*, 20, 479-493.

979 UNITED NATIONS 2016. Global Sustainable Development Report 2016. New York, US:
980 Department of Economic and Social Affairs.

981 VILAS, M.P., THORBURN, P.J., FIELKE, S., WEBSTER, T., MOOIJ, M., BIGGS, J.S., ZHANG,
982 Y.F., ADHAM, A., DAVIS, A., DUNGAN, B. and BUTLER, R., 2020. 1622WQ: A web-
983 based application to increase farmer awareness of the impact of agriculture on water
984 quality. *Environmental Modelling & Software*, 132, p.104816.

985 VRAIN, E. & LOVETT, A. 2016. The roles of farm advisors in the uptake of measures for the
986 mitigation of diffuse water pollution. *Land Use Policy*, 54, 413-422.

987 WELSH WATER 2014. PestSmart: Controlling weeds, pests and diseases while looking after people,
988 water and wildlife. Aguide for farmers and land managers. Mid Glamorgan, UK. : Dwr
989 Cymru Welsh Water

990 WILSON, G. A. 1997. Factors influencing farmer participation in the environmentally sensitive areas
991 scheme. *Journal of environmental management*, 50, 67-93.

992 WYNN, G., CRABTREE, B. & POTTS, J. 2001. Modelling farmer entry into the environmentally
993 sensitive area schemes in Scotland. *Journal of agricultural economics*, 52, 65-82.

994 ZEWELD, W., VAN HUYLENBROECK, G., TESFAY, G. & SPEELMAN, S. 2017. Smallholder
995 farmers' behavioural intentions towards sustainable agricultural practices. *Journal of
996 Environmental Management*, 187, 71-81.

997
998
999
1000
1001

1002
1003
1004
1005
1006
1007
1008
1009
1010
1011

6. APPENDICES

Appendix A: Common chemical control strategies to manage weeds

Equipment	Description
Boom sprayer	Most commonly used to apply liquid fertilizers or pesticides to crops during their vegetative cycle, boom sprayers distribute the product from a tank <i>through a</i> pipe with nozzles. The sprayer's height is adjustable. Using a boom sprayer, MCPA can be applied to grass. However, this must be applied with care, as MCPA could damage most broad-leaved plants, including clover.
Knapsack sprayer	Most commonly used to spray fungicides or insecticides, knapsack sprayer consists of a knapsack tank together with pressurising device, line, and sprayer nozzle. A knapsack sprayer is versatile and enables the farmer to target areas with rush. However, spray can drift in windy weather onto other plants and ultimately reach watercourses.
Weed wiper	Using a weed wiper, Glyphosate can be applied, in conditions where rush plants are actively growing and stand higher than the surrounding grass. Because glyphosate has potentially less impact on water quality and broad-leaved plants than MCPA, the use of weed wipers (with glyphosate) is widely recommended than regular boom spraying with MCPA.

1012

Appendix B: Summary of BMPs promoted as part of the weed wiper trial

Component	Recommended Practice
Storage	<p>Keep pesticides in a clearly marked lockable, bunded store at least 10m away from any watercourse or drain.</p> <p>Keep pesticides in their original (clearly labelled) containers and legally dispose of any unwanted or out of date chemicals.</p> <p>Ensure you have a spill kit located near the store and/or filling area to contain any spillages.</p>
In yard	<p>Check application equipment is working correctly and has a valid National Sprayer Testing Scheme certificate where required.</p> <p>Ensure operator is suitably trained, competent and has required protective clothing e.g. overalls, gloves, masks.</p> <p>Ideally, fill equipment in a covered, concrete bunded area where drainage can be contained. Alternatively, fill on grass using a drip tray or portable bund.</p>
In field	<p>Carefully follow instructions for application. Do not over apply – this can wash off into drains or residues can stay in soils affecting the next crop grown.</p> <p>Do not fill at the entrance of a field or any bare earth especially if adjacent to a watercourse, or a road/track that could channel run-off water into a watercourse.</p> <p>Establish buffer strips adjacent to any ditches or watercourse.</p> <p>Do not apply pesticide prior to rainfall or in windy conditions or when ground is frozen.</p> <p>Plan your route through fields. Do not cross any ditches or streams to avoid accidents that could lead to involuntary pouring out of pesticides, and prevent pollution.</p>
Disposal	<p>Wash the outside of the sprayer before leaving the field, since there may remain residue on the machine or in the mud on tyres.</p> <p>Spray washings on to the crop or target area - be careful not to over apply.</p> <p>Ensure all cleaning activities take place away from watercourses.</p> <p>Return any unused pesticide to store. Alternatively, use a registered waste disposal company.</p> <p>Record all pesticide applications.</p>

1014

1015

1016

1017
1018
1019
1020
1021
1022
1023
1024
1025
1026
1027
1028
1029
1030
1031
1032
1033
1034
1035
1036
1037
1038
1039
1040
1041
1042
1043
1044
1045
1046
1047

Appendix C: Interview scripts

Skipping codes/questions

Are you aware of Welsh Water’s weed wiper trial? Did you participate in the trial?

INTERVIEW: FARMERS WHO PARTICIPATED IN THE WW CAMPAIGN

1. Please explain briefly how do you manage weeds on the farm?
2. If you use pesticides to control pests, how do you use them? What practices do you use? Do you often follow these same practices every year? When do you apply them? What type of pesticides do you use?
3. Have you always applied pesticide in this manner? Why? Or have you changed your practices over time?
4. There are reports that link pesticide use with a decline in water quality: do you believe this? Why?
5. Do you think your usage of pesticides is harmful to the environment? Why?
6. Thinking now about Welsh Water’s weed wiper trial? Please are you able to describe it briefly for me? a) Describe what it consists of, b) whether and how it worked.
7. Have you changed any practices regarding your pesticide usage following the trial? Do you think you would have changed practices anyway even if you didn’t participate in the trial? Why?
8. Would you say that your participation in the weed wiper trial has helped you improve your pesticide use? How?
9. Is there anything about the weed wiper trial that you believe was particularly useful in improving your understanding of best pesticide management? (e.g., how the messages were delivered, the amount of information that you received, how this information was portrayed)
10. Do you think the weed wiper is a good approach to pest management? Would you recommend it to your neighbours?
11. What might prevent/drive you (not) to use it in the future?

Catchment

Farm type Arable [1] Livestock [2] Mixed farming [3] Horticulture [4]

Which of the following best describes your status?

Tenant Farmer [1] Owner Occupier [2] Associate (a partner) [3]

Farm size in acres (all sites together). < 50 Acres [1] >= 50 Acres [2]

1048
1049
1050
1051
1052
1053
1054
1055
1056
1057
1058
1059
1060
1061
1062
1063

INTERVIEW: FARMERS WHO DID NOT PARTICIPATE IN THE WW CAMPAIGN

1. Please explain briefly how do you manage weeds in the farm?
2. If you use pesticides to control weeds, how do you use them?
3. What practices do you use? Do you often follow these same practices every year? When do you apply them? What type of pesticides do you use? Have you always applied pesticide in this manner? Why? Or have you adopted any new practices over time?
4. There are reports saying pesticides affect water quality: do you believe this? Why?
5. Do you think your usage of pesticides is harmful to the environment? Why?
6. Have you changed any practices in your pesticide usage over the past 4 years (since April 2015)? Why?
7. Do you think it would have been good to have participated in the weed wiper trial? Why?
8. Do you think you’d have done things differently if you had participated in the weed wiper trial? Why? What will you do differently?
9. Would you like to use the weed wiper in the future? Why?

- 1064 10. What might prevent/drive you (not) to use it in the future?
 1065 11. Would you recommend the weed wiper to your neighbours? Why?

Catchment			
Farm type	Arable [1]	Livestock [2]	Mixed farming [3] Horticulture [4]
Which of the following best describes your status?			
Tenant Farmer [1]	Owner Occupier [2]	Associate (a partner) [3]	
Farm size in acres (all sites together).		< 50 Acres [1]	>= 50 Acres [2]

1066

1067

INTERVIEW: (Welsh Water & Farming Connect)

1068

1069 1. Ask them to describe the trial: a) describe what it consists of, b) whether and how it worked c)
 1070 general impression of it.

1071 2. Can you explain how the wiper trial has improved the following?

1072 (a) Farmers' understanding of pesticide application

1073 (b) Pesticide management practices (which specific changes?)

1074 (c) MCPA concentration

1075 3. Has any farmer reported major changes in pesticide handling and application? Which areas?

1076 4. Show them water quality results and ask them to provide their views on what could explain
 1077 those results.

1078 5. Were your advice materials distributed among farmers in Teme?

1079

1080 **Note: The interview script for institutions (Welsh Water and Farming Connect) was adapted for**
 1081 **interviews with other institutions (based on their roles and involvement in efforts to mitigate diffuse**
 1082 **water pollution from agriculture).**

1083

1084 **Appendix D: Codes, themes and topics emerging from the analysis of interview transcripts**

Codes	Theme
Topic: Factors influencing awareness	
Availability and access to scientific evidence	-
Availability and physical access to training opportunities	
Economic Access to training and learning opportunities	
Consistent engagement in best practice or consistent application of advice	
Topic: Factors influencing uptake of pesticide application measures	
Awareness/environmental consciousness	Psycho-social factors
Social pressure	
Desire to protect reputation	
Regulations	
Mind-set (beliefs regarding practices)	
Information source and trust	Resource Availability
Availability of the technology (e.g., weed wiper)	
Availability of complementary equipment (e.g., no quad bike)	
Availability of the chemical/herbicide used with the weed wiper	
Time required to implement practice	Agronomic, farm characteristics and financial considerations
Perceived financial benefits (a motivational factor for uptake)	
Perceived financial cost (as a potential barrier)	
Type of weed and extent of weed problem	
Type of crop (e.g., the variety of potato)	
Land use and Farm size	
The need to save clovers	
The need to maintain good improve soil health or keep healthy land for growing grasses	
Need to use an application method that is faster (than other methods).	

Ease weed management	
Season and weather conditions	Location and climate characteristics
Location or landscape	
Topic: Factors interacting with behaviour to affect water quality	
Number of farmers implementing the recommended measures	-
Accidental pollution	
Pollution from other sources	
Land use	
How long measures have been implemented	
Possible external interventions	
Benefits of participating in agri-environment schemes	
Access to advice	-
Access to money	
Barriers to participating in agri-environment schemes	
Money is small	-
Lack of access to the right information	
Poor understanding of the point based system	
Recommendations to improve awareness and adoption of the weed wiper and (other BMPs)	
Provide scientific evidence	-
Attend shows	
Increase publicity; contact farmers	
Use case studies	
Do farm visits	
Make pesticide application course free for farmers.	
Increase funds/grants/incentives for courses	
Make the required herbicide more obtainable for people especially those around water catchment areas.	
Expand the weed wiper trial to include other catchments.	
Government should listen to farmers.	
Government should prioritise food production.	
Build relationship with land users to gain their trust and support.	
Work with trusted stakeholders to build trust and gain support.	

1085