

1 **PRACTICALITY AND EFFECTIVENESS OF BIOSECURITY MEASURES**

2 **Exploring expert opinion on the practicality and effectiveness of biosecurity measures**

3 **on UK dairy farms using choice modelling**

4 **Orla Shortall*, Martin Green*, Marnie Brennan*, Wendela Wapenaar*, Jasmeet**

5 **Kaler*¹**

6 *School of Veterinary Medicine and Science, University of Nottingham, Sutton Bonington

7 Campus, Sutton Bonington, Leicestershire, LE12 5RD, UK

¹ Corresponding author: jasmeet.kaler@nottingham.ac.uk

8 **ABSTRACT**

9 Biosecurity – defined as a series of measures aiming to stop disease-causing agents entering
10 or leaving an area where farm animals are present – is seen as very important to the
11 continuing economic viability of the UK dairy sector and for animal welfare. This study
12 gathered expert opinion from farmers, veterinarians, consultants, academics, government and
13 industry representatives on the practicality and effectiveness of different biosecurity measures
14 on dairy farms. The study used best worst case scenario modelling, a technique which is seen
15 to allow greater discrimination between choices and avoid variability in interpretation
16 associated with other methods such as Likert scales and ranking methods. The results showed
17 that keeping a closed herd was rated as the most effective measure overall, and maintaining
18 regular contact with the veterinarian as the most practical measure. Measures relating to
19 knowledge, planning and veterinary involvement; buying in practices; and quarantine and
20 treatment scored highly overall for effectiveness. Measures relating to visitors, equipment,
21 pest control and hygiene scored much lower for effectiveness. Overall, measures relating to
22 direct animal to animal contact scored much higher for effectiveness than measures relating
23 to indirect disease transmission. Some of the most effective measures were also rated as the
24 least practical, such as keeping a closed herd and avoiding nose to nose contact between
25 contiguous animals, suggesting that real barriers exist to farmers implementing the
26 biosecurity measures that are needed on dairy farms. There was heterogeneity in expert
27 opinion on biosecurity measures e.g. veterinarians rated effectiveness of consulting the
28 veterinarian on biosecurity as significantly more effective than dairy farmers, suggesting a
29 greater need for veterinarians to promote their services on farm. Though, both groups rated it
30 as a practical measure, suggesting that this relationship still holds some advantages for the
31 promotion of biosecurity.

32

33 **Keywords:** Biosecurity, disease control, effectiveness, practicality, best worst scaling.

INTRODUCTION

35 Biosecurity – defined as a series of measures aiming to stop disease-causing agents entering
36 or leaving an area where farm animals are present (Defra, 2003) – is seen as very important to
37 the continuing economic viability of the UK dairy sector and for animal welfare (Defra et al.,
38 2004). The 2004 Animal Health and Welfare Strategy for Great Britain emphasises the
39 responsibility of animal owners in managing animal health risks and states that costs should
40 be increasingly born by the industry rather than tax payers, putting increasing onus on
41 farmers to tackle problems (Defra et al., 2004). The strategy also states that veterinarians
42 (hereafter referred to as ‘vets’) are uniquely placed to promote animal health and welfare and
43 should be at the forefront of delivering proactive disease prevention services. In a European
44 context a 2013 proposal for a regulation on animal health, which will be implemented after
45 2016, similarly states that animal owners and professionals are in the best position to manage
46 animal health and that vets should play an active role in disease prevention and raising
47 awareness of disease risks (European Commission, 2013).

48 There is little consensus however over which biosecurity measures are deemed to be the most
49 effective for stopping the spread of disease (Valeeva et al., 2011). A number of reviews have
50 been carried out synthesising information about the effectiveness of biosecurity measures or
51 the risk of disease introduction through different pathways, (which can be seen as the
52 corollary of evaluating the effectiveness of a biosecurity measure) from field trials and other
53 types of evidence (Wells, 2000; Cooke & Brownlow, 2008; Maunsell & Donovan, 2008; Mee
54 et al., 2012). A number of studies have focused on particular diseases or conditions (Horst et
55 al., 1996; Sørensen et al., 2002; Valeeva et al., 2005; Garabed et al., 2009; Gorden and
56 Plummer, 2010; Gates et al., 2013; Kuster, 2013). However, there is still lack of evidence for
57 effectiveness for many biosecurity measures that are recommended on the dairy farms, and
58 some maintain that quantifying the effectiveness of a biosecurity measure based on

59 experiments in controlled conditions is not the ideal approach to biosecurity because of the
60 difficulty in extrapolating these findings to working farms (Kuster, et al., 2015). Studies of
61 farmers' attitudes to biosecurity have reported that the effectiveness of different measures is
62 very important to them; farmers do not want to take time to carry out practices that do not
63 bring substantial benefits (Garforth et al., 2013). The practicality of measures has also been
64 shown to be important to farmers; if the measure is effective but impractical to implement
65 then they are unlikely to carry it out (Kristensen & Jakobsen, 2011; Valeeva et al., 2011).
66 However, there are no studies that have explicitly looked into the practicality of biosecurity
67 measures on dairy farms.

68 The dairy sector in the UK is the third largest milk producer in the EU and the tenth largest in
69 the world (Bate, 2016). Trends in the dairy sector in the UK have been in line with those of
70 other industrialised countries with a decreasing number of farms, increasing herd size and
71 milk yield (AHDB Dairy, 2016). The average herd size in the UK in 2015 was 142 cows, and
72 the average milk yield was 7944 litres per cow per year (AHDB Dairy, 2016). The majority
73 of dairy farms in UK operate a mixed grazing and housing system, with cows grazing in
74 summer months and housed during the winter months (The Andersons Centre, 2013). A
75 smaller number operate a low input year round grazing system, or a high input year round
76 housing system. Since the 2001 foot and mouth disease (FMD) outbreak the government has
77 been ceding control over certain areas of biosecurity to industry, as outlined in the 2004
78 Animal Health and Welfare Strategy for Great Britain (Defra, 2004). An exception is
79 Scotland where the Scottish Government introduced a mandatory scheme to eradicate bovine
80 viral diarrhoea (BVD) (Voas, 2012).

81 The elicitation of expert judgement is often used in situations where problems are complex,
82 there is a lack of data and there is a need for action (Slottje et al., 2008; Martin et al., 2012).
83 Bijker et al. (2009) state that in situations of "complex risks", the most appropriate course of

84 action can be to try to clarify the factual base for making decisions on risk management and
85 improve the reliability and validity of scientific knowledge by consulting with experts. A
86 small number of expert studies have also been carried out looking into the most important or
87 effective biosecurity measures. Van Winden et al. (2005) undertook a systematic review of
88 risk factors for the introduction of four common cattle diseases and held an expert opinion
89 workshop asking experts to attribute a percentage risk to each risk factor and a risk reduction
90 factor to different biosecurity measures. Sayers et al. (2014) asked expert vets and veterinary
91 practitioners to rate the importance of a number of biosecurity measures on dairy farms using
92 a Likert scale measuring importance.

93 There are a number of limitations associated with these studies. First these studies only
94 focussed on asking experts to rank effectiveness or importance of a measure without
95 considering their relative practicality, secondly, these studies used Likert scale or rating
96 scales to gather expert opinion which have methodological deficiencies. For example, Likert
97 scales and rating scales can involve a “scale equivalence” which means that people may
98 interpret a ratings scale differently, and this may vary significantly across cultures (Adamsen
99 et al., 2013). There may be acquiescence bias in that people tend to respond positively to
100 questions more frequently than they respond negatively (Whitty et al., 2014). Rating and
101 Likert scales also may not discriminate sufficiently between items, which may be given the
102 same or similar ratings (Louviere et al., 2013). Methods which ask people to rank items can
103 become too cognitively demanding and unfeasible for more than seven items (Louviere et al.,
104 2013).

105 A technique which overcomes these methodological deficiencies is best worst case scaling
106 (BWS) (Finn and Louviere, 1992). BWS is a choice method which presents people with a set
107 of options, usually four or five, and asks them to pick the best and the worst (Louviere et al.,
108 2013). The method is often used to obtain information about preferences across a large

109 number of items, as it is not as cognitively demanding as ranking many items (Adamsen et
110 al., 2013). It also avoids scale bias where respondents only use part of a scale or where they
111 interpret the scale in different ways (Cohen and Orme, 2004). BWS has been used in a range
112 of different disciplines and contexts, to elicit consumer preferences in market research
113 (Adamsen et al., 2013), health (Lancsar and Savage, 2004) and in an agricultural context it's
114 been used to gather expert opinion on different greenhouse gas emissions mitigation
115 measures on sheep farms (Jones et al., 2013) and to assess the effectiveness and practicality
116 of measures to control *E. coli* O157 on cattle farms (Cross et al., 2012).

117 The aim of this study is to use best worse scaling choice modelling to gather expert opinion
118 from vets, farmers, academics, consultants, industry and government representatives on the
119 relative practicality and effectiveness of different biosecurity measures on dairy farms in the
120 UK. The aim is to bring greater clarity to debates in the dairy sector about what biosecurity
121 measures farmers can and should carry out in conjunction with their vet and contribute to
122 debates about initiatives that could improve biosecurity in the dairy industry.

123 **MATERIALS AND METHODS**

124 ***Study Design***

125 ***Recruitment of Experts.***

126 In this study expert opinion was gathered from expert vets, farmers, academics, consultants,
127 industry and government representatives. Expertise means substantive knowledge on a
128 particular topic that not everyone has, and an expert is someone who holds this knowledge
129 (Martin et al., 2012). There may be different types of expertise and experts: that which is
130 acquired through formal training and research, and that which is based on experience (Martin
131 et al., 2012) and on professional standing and performance (Burgman et al., 2006). Pearson et

132 al. (2007) state that expertise in a health care context involves both knowledge and
133 experience, as practitioners balance external information and their own experience when
134 making clinical decisions. This can also be seen to be true in the case of farm animal health.
135 Thus the aim of the sampling process for this study was not to access a representative sample
136 of the vet, farmer and other populations, but to use purposive sampling that aimed to access
137 relevant expertise within these groups.

138 In this study expert vets were defined as those who held a relevant postgraduate qualification:
139 either a Royal College of Veterinary Surgeons (RCVS) certificate or a diploma in cattle
140 health and production (CCHP and DCHP) or status as a fellow or honorary fellow of the
141 RCVS, as Slottje et al. (2008) maintain that professional awards and other signs of peer
142 recognition can be taken to denote expertise. In addition it was stipulated that the vet must
143 carry out all or most of their work in farm animal practice and have a minimum of 8 years
144 clinical experience. An expert farmer was defined as a farmer who considers biosecurity and
145 disease control on farm to be a key priority and rate their biosecurity on their farm as high.
146 Expert farmers could operate different types of dairy system e.g. open or closed herds, zero
147 grazing or spring/summer grazing, conventional or organic. Farmers were included as experts
148 because it was considered that specially screened and selected farmers would have the
149 requisite experiential and knowledge-based expertise on biosecurity to take part in the study.
150 Expert farmers gain experience on their farm and inform themselves on biosecurity through a
151 wide range of sources (Brennan and Christley, 2013). The inclusion of farmers as experts can
152 be seen as analogous to the growing understanding of patients as experts on disorders which
153 they experience (Paterson and Thorne, 2000). Expert patients are considered to have
154 experiential and knowledge-based expertise which can inform other patients, and they have
155 day to day experiential expertise on the disorder, which clinicians do not (Hartzler and Pratt,
156 2011). Farmers have also been included as experts whose local expertise can inform policy

157 and practice, in areas such as water quality protection (Oliver et al., 2012). Other experts
158 included people from industry, academia, government and consultancy who had substantial
159 knowledge and experience about biosecurity and would be able to answer the questions in
160 relation to effectiveness and practicality of biosecurity measures on farms.

161 Expert vets were selected through lists of RCVS veterinary practitioners (RCVS, 2016) and
162 telephone calls with veterinary practices were made to verify selection criteria. Expert
163 farmers, those fitting the criteria, were contacted through project links with the industry levy
164 body the Agriculture and Horticulture Development Board (AHDB) Dairy, through AHDB
165 field extension officers and through a brief questionnaire to farmers which included questions
166 asking them to rate the effectiveness of their biosecurity practices on their farm (scale 1-5)
167 given to farmers at two prominent livestock and dairy events in England in 2015. A list of
168 other academic, industry, consultant and government biosecurity experts was generated
169 through literature searches and prior knowledge of expertise thorough published work. All
170 the selected experts were contacted by email with information and a link to the survey in May
171 2015. A reminder email was sent if the person did not fill out the survey.

172 *Survey Design.*

173 In order to develop the list of biosecurity measures used in the survey, an initial list of 72
174 measures was compiled from existing published biosecurity guidelines and advice to farmers.
175 This list was then narrowed down to 30 measures which were deemed to be the most
176 important, based on reviews of the literature. A group of three expert vets at the School of
177 Veterinary Medicine and Science, University of Nottingham were then consulted on the
178 comprehensiveness and the wording of this list. The survey was piloted with a group of 8
179 expert vets. The list of 30 measures used in the study can be seen in Table 1.

180 For the purposes of the study, biosecurity was defined as both bioexclusion: preventing the
181 introduction of disease causing agents onto the farm, and biocontainment: stopping the spread
182 of disease causing agents to other parts of the farm and off the farm. The 'effectiveness' of a
183 measure was defined as how well it prevents disease-causing agents entering or leaving any
184 place where farm animals are present. The 'practicality' of a measure was defined as the ease
185 with which the measure could be implemented by the farmer. This can involve issues of
186 physical, financial and cultural feasibility, among other considerations.

187 The survey was designed and uploaded as a web survey using Sawtooth Software SSI Web
188 8.3.13. Optimal survey designs were selected based on the following criteria: frequency
189 balance so that each item (biosecurity measure) appears an equal number of times in the
190 survey; orthogonality meaning that items are paired together an equal number of times;
191 connectivity meaning that pairs are designed in such a way that all items are connected; and
192 positional balance so that items are presented an equal number of times in different positions
193 (Erdem et al., 2012). The biosecurity BWS survey consisted of twenty five effectiveness
194 questions asking the respondent to pick the most and least effective out of a set of five
195 biosecurity measures, and twenty five practicality questions asking the respondent to pick the
196 most and least practical out of a set of five biosecurity measures. An example of a BWS
197 question used in this survey can be seen in Table 2.

198 Basic demographic information was collected. Farmers were asked how many milking cows
199 were in their herd; their age; what region of the UK their farm was in; whether their buying
200 practices could be classed as open, open with biosecurity practices or closed; whether they
201 practiced year round housing, seasonal grazing and housing or year round grazing; and how
202 effective they rate the disease control measures on their farm. Vets were asked in what year
203 they qualified as a vet; what region of the country they practice in; what proportion of their

204 time is spent on dairy farm work; and what percentage of that time is spent in a disease
205 prevention advisory role. Other experts were asked about the nature of their employment and
206 the nature of their expertise in relation to disease control on dairy farms.

207 *Analysis*

208 Data analysis was carried out using a multinomial logit (MNL) model in a Hierarchical Bayes
209 framework, which are based on Random Utility Theory (RUT). RUT is the framework that
210 underlies most discrete choice experiments and assumes that a person's relative preference
211 for item A over item B is revealed in how often they choose item A over item B (Thurstone,
212 1927). It assumes that there is an underlying subjective scale behind people's choices, and the
213 utility for each item is a measure of the item's location on that scale (Louviere et al., 2013).
214 We can express the utility of item i as:

$$215 \quad U_i = V_i + \varepsilon_i$$

216 Here the utility for item i (U_i) is made up of the explainable, systematic component V_i and
217 the stochastic, unexplainable component ε_i .

218 If we assume that the unexplainable component ε_i follows a Gumbel distribution then this
219 creates a multinomial logit (MNL) model that can be used to estimate the probability of each
220 individual choosing any item as best. In this MNL the probability that the individual chooses
221 the i th item as best (or in this study, most effective or most practical) from a set of K items
222 can be expressed as:

$$223 \quad P_i = \frac{e^{u_i}}{\sum e^{u_k}}$$

224 Where e^{u_i} is the antilog of the utility for item i , and e^{u_k} is the antilog of the utility scores for
225 each item in the set of K items.

226 The probability of choosing the *j*th item as worst (or least effective or least practical) in a set
227 of K items can be expressed as:

$$228 \quad P_j = \frac{e^{-uj}}{\sum e^{-uk}}$$

229 Where e^{-uj} is the antilog of the negative utility for item *j*, and e^{-uk} is the antilog of the
230 utility scores for each item in the set of K items.

231 The probability that a person will choose the pair *i* and *j* as best and worst respectively is the
232 probability that the difference in utility between *i* and *j* is greater than the difference in utility
233 between any other pair in the set of K items. This probability can be expressed in conditional
234 logit form as:

235 P(i is chosen best and j is chosen worst)

$$236 \quad = \frac{e^{u_i - u_j}}{\sum_{b=1}^K \sum_{w=1}^K e^{U_b - U_w} - K}$$

237 Where b stands for the best choice and w for the worst choice.

238 For more about the MNL model and HB analysis see (McFadden, 1980; Flynn et al., 2008;
239 Sawtooth Software, 2009a; 2009b; 2009c; 2009d). A fit statistic was also calculated which
240 shows the internal consistency of each respondent's answers. Sawtooth Software calculates
241 each respondent's fit statistic as the root likelihood, based on the likelihood that they will
242 pick each of the answers they did, given their other answers (Sawtooth Software, 2014). A
243 minimum fit statistic is calculated as 1/c, where c is the number of items per set. In a study
244 asking respondents to pick from set of 5 choices then a random set of scores would predict
245 the respondent's answer correctly 20% of the time, generating a fit statistic of 0.20. A
246 minimum fit statistic of 0.2 was stipulated in this study because there were 5 options to

247 choose from. All respondent's fit statistics in this study exceeded the minimum suggested fit
248 statistic, so all responses were retained. The model was run for 20,000 'burn-in' iterations
249 followed by another 10,000 more iterations which were then saved and averaged to produce
250 the scores for each measure.

251 The practicality and effectiveness scores for a single measure were compared using a t-test
252 and Mann-Whitney U test (Petrie and Watson, 2013) was used to investigate if effectiveness
253 was scored significantly different to practicality.

254 In order to explore the heterogeneity or degree of agreement and disagreement among experts
255 for the set of measures, estimate scores distributions were computed with a mean for each
256 respondent for each measure drawn from best worst choices (Cross et al., 2012). Then for
257 each measure a coefficient of variation was calculated and any values above 1 were
258 considered to indicate heterogeneity (Adamsen et al., 2013). For measures exhibiting
259 heterogeneity, post-hoc comparisons (using ANOVA test and a Tukey HSD post-hoc test, or
260 a nonparametric Kruskal-Wallis test and Dunn-Bonferroni post hoc test, depending on the
261 distribution of the data) between expert groups' scores were conducted to see if significant
262 differences existed between respondent groups. Ethical approval for the study was obtained
263 from the School of Veterinary Medicine and Science, University of Nottingham.

264 **RESULTS**

265 ***Response Rate***

266 In total 84 expert vets were invited, 28 completed the survey and 8 partially completed the
267 survey, giving in a total usable response rate of 33%. A total of 36 other experts were
268 contacted, of these 16 completed the survey and 3 partially completed the survey, giving a
269 usable response rate of 44%. Out of 62 farmers contacted, 16 completed the survey and 3

270 partially completed the survey, giving a useable, response rate of 26%. Descriptive statistics
271 of the respondents are shown in Table 4. All respondent's fit statistics in this study exceeded
272 the minimum suggested fit statistic, so all responses were retained.

273 *Best Worst Scaling Scores*

274 The estimated mean effectiveness and practicality scores for each measure from choice
275 modelling are shown in Table 4. For the purposes of analysis the different measures were
276 grouped into sets of measures relating to knowledge, planning and vet involvement;
277 quarantine and treatment; buying practices; grazing livestock; animals re-entering the farm;
278 pest control; visitors, equipment and hygiene, which can be seen in Table 4. The measure
279 rated most effective overall was measure 7, maintain a closed herd; followed by measure
280 measures 14, prevent nose to nose contact with neighbouring animals by maintaining
281 adequate fencing; measure 12, test new animals bought onto the farm to assess their disease
282 status; and measure 6, implement rapid culling of persistently infected animals where it is
283 appropriate for the disease. The most practical measure was measure 3, maintain regular
284 contact with the vet; followed by measure 16, do not spread fields with imported slurry;
285 measure 13, avoid hiring bulls; and measure 2, establish a herd health protocol e.g. through
286 using a herd health plan.

287 Figure 1 shows a scatter plot presenting measure's effectiveness scores on the Y axis and the
288 practicality scores on the X axis. The scores were normalised so that the average practicality
289 and effectiveness scores were 0 and the standard deviation was 1. If the measure scored
290 above average for practicality then it appears to the right hand side of the Y axis. If it scored
291 above average for effectiveness then it appears above the X axis. Measures in the upper right
292 quadrant are both above average for effectiveness and practicality, and measures in the lower

293 left quadrant score below average for both practicality and effectiveness. In total nine
294 measures scored above average for both practicality and effectiveness.

295 Measures relating to knowledge planning and veterinary involvement, measures 1, 2 and 3 all
296 scored above average for effectiveness and practicality. Measure 3 had a significantly higher
297 practicality score than effectiveness score ($P=0.007$). Measure 30, vaccinate for diseases not
298 already on the farm, scored slightly below average for effectiveness and below average for
299 practicality. In terms of measures relating to quarantine and treatment, measures 5 and 6,
300 vaccinate for diseases already on the farm, and implement rapid culling of persistently
301 infected animals, respectively, also scored above average for both practicality and
302 effectiveness. Measure 4, isolating sick animals and monitoring their disease status scored
303 around average for effectiveness and below average for practicality. Any measures relating
304 to isolating or quarantining animals: measures 4, 11, 18 and 19 scored below average for
305 practicality.

306 All 7 measures related to buying in livestock scored above average for effectiveness, with the
307 exception of measure 9, consulting with the seller farmer before buying in animals. Several
308 measures related to buying in livestock had with significantly higher ($P < 0.05$) effectiveness
309 than practicality scores: measures 7 ($P<0.001$), 10 ($P<0.001$), 11 ($P<0.001$), 12 ($P<0.001$).
310 Measure 8, consulting with the seller farmer's vet, and measure 10, viewing accredited test
311 results, as well as measure 12, testing new animals brought on to the farm, scored above
312 average for practicality. Measure 13, avoid hiring bulls, was rated as one of the most practical
313 measures. Measure 14 relating to preventing nose to nose contact between neighbouring
314 animals by maintaining adequate fencing had a significantly higher effectiveness than
315 practicality score ($P<0.001$). Measure 16, do not spread fields with imported slurry had a
316 significantly higher practicality than effectiveness score ($P<0.001$). The rest of the measures
317 relating to isolating animals re-entering the farm, pest control, visitors, equipment and

318 hygiene all scored below average for effectiveness, with the exception of measure 18,
319 isolating young re-entering the farm after being housed elsewhere, which had a significantly
320 higher effectiveness than practicality score ($P < 0.001$). Most also scored below or near
321 average for practicality, with the exception of measure 18, maintain good hygiene on the farm
322 which scored above average for practicality.

323 Another useful way to divide the data was exploring measures relating to minimising or
324 eliminating disease risk through *direct contact* between farm animals, what will be referred to
325 as “direct measures”, and measures which relate to *indirect contact* between animals, relating
326 to fomites or to higher level strategic measures such as disease planning and monitoring,
327 these will be referred to as “indirect measures”. The scatter plot in Figure 2 divides the
328 normalised data into direct and indirect measures. Direct measures scored higher than indirect
329 measures for effectiveness, with only two direct measures scoring below average for
330 effectiveness: measures 9 and 19, and three indirect measures scoring above average for
331 effectiveness: measures 1,2 and 3 relating to planning and recording herd health status.

332 ***Choice Heterogeneity***

333 Thirteen measures showed some heterogeneity in effectiveness scores with coefficient of
334 variation above 1 (Table 5). Of these measures, 7 had significant ($P < 0.05$) differences
335 between respondent groups' scores. The vet respondent group for instance rated measure 3,
336 maintain regular contact with your vet and discuss disease prevention and herd health status,
337 as significantly more effective than the farmer respondent group ($P = 0.002$). Farmers rated
338 measure 20, prevent wildlife accessing housing sheds and food supplies as significantly more
339 effective than vets ($P = 0.001$). And vets rated measure 30, implement a programme of
340 preventive vaccination for diseases not already on the farm, as significantly more effective
341 than the farmer ($P = 0.013$) and other respondent groups ($P < 0.001$). Nineteen measures

342 showed some evidence of some heterogeneity in practicality scores. Of these, 11 had
343 significant differences among scores between respondent groups' scores. The vet group rated
344 measure 5, vaccinate to control diseases already on the farm as significantly more practical
345 than the farmer group ($P=0.041$). The farmer group rated measure 7, maintain a closed herd,
346 as more practical than the vet group ($P=0.014$) and other groups ($P=0.006$). Farmers also
347 rated measure 14, prevent nose to nose contact with neighbouring animals by maintaining
348 adequate fencing, as more practical than the vet group ($P<0.001$) and the other group
349 ($P=0.015$).

350 **DISCUSSION**

351 This is the first study exploring both effectiveness and practicality of biosecurity measures
352 implemented on dairy farms using choice modelling and also first study that includes farmer
353 choices in expert opinion for biosecurity.

354 One key finding of the study is that measures relating to direct animal to animal contact were
355 rated as being clearly more effective than measures relating to indirect contact. These were
356 measures related to buying in new animals; reintroducing animals to the farm; and nose to
357 nose contact between animals on contiguous farms. This point is reiterated in the literature
358 (Van Winden et al., 2005; Defra, 2006; Cooke & Brownlow, 2008; Sibley, 2010; Mee et al.,
359 2012). The effectiveness of direct and indirect measures will depend on the epidemiology of
360 the disease, as diseases which are highly infectious but fragile such as bovine herpesvirus
361 type 1 (BVH-1) are more likely to be spread by direct contact, whereas pathogens which are
362 more robust and can survive in the environment for longer, such as the foot and mouth
363 disease virus and bovine tuberculosis virus, are more likely to be spread by indirect contact
364 (Sibley, 2010). However, there was a clear trend in the data showing the higher effectiveness
365 of direct measures.

366 Within direct measures, the high effectiveness scores of buying in practices is supported in
367 the literature (Maunsell & Donovan, 2008; Gorden & Plummer, 2010) in particular, keeping a
368 closed herd was also cited or rated reviews and experts studies as the most effective or
369 important measure (Van Winden et al., 2005; Cooke & Brownlow, 2008; Mee et al., 2012;
370 Sayers et al., 2014). But maintaining a closed herd scored below average for practicality.
371 Maintaining a completely closed herd is recognised as a difficult thing for a farmer to achieve
372 and some maintain that it likely to remain so in the future as many dairy herds in Britain aim
373 to expand production, or need to replace animals culled because of diseases such as bTB
374 (Sibley, 2010). It was interesting to note that farmers rated keeping a closed herd as
375 significantly more practical than vets and others. This may be because the farmers surveyed
376 in this study were “expert” farmers who defined themselves, or were defined by research
377 partners, as having an interest in biosecurity, and vets and others may have been answering
378 the questions with average farmers in mind. It could also be that farmers and vets and others
379 were operating with a slightly different definition of what a closed herd is, as Sayers et al.
380 (2014) found that some farmers claimed to have a closed herd but they did buy in some
381 animals.

382 The second most effective measure overall, measure 14, preventing nose to nose contact
383 between neighboring animals through maintaining adequate fencing, was also
384 considered to be important in other expert studies (Van Winden et al., 2005; Sayers et al.,
385 2014). Local disease spread, including through nose to nose contact, was considered
386 especially important for dairy farms compared to cattle operations by Gates et al. (2013)
387 because dairy farms tend to be relatively densely clustered in the UK. This measure also
388 scored below average for practicality and Sibley (2010) states that adequate fencing can be
389 expensive and difficult to maintain by individual farmers, suggesting regional approach
390 involving cooperation between farmers may be more suitable to improve its implementation.

391 The results suggested that isolating animals is considered an effective biosecurity measure,
392 but is particularly difficult for dairy farmers to achieve, as all measures relating to isolating
393 animals (4, 11, 18, 19) scored below average for practicality. Studies have suggested that
394 only a small proportion of farmers isolate purchased stock (Brennan & Christley, 2012; Gates
395 et al., 2013). Farmers may not have adequate facilities for isolating animals, and that it can be
396 very labour and time intensive to manage isolated animals separately, especially in relation to
397 milking as this would require isolated animals to be milked separately, potentially involving
398 disinfecting milking machines before and after use and many farmers do not have the
399 resources to achieve this (Sibley, 2010).

400 Measure 10 and 12 buy animals with accredited test results and test new animals brought
401 onto the farm to assess their disease status respectively scored highly for effectiveness, but its
402 effectiveness can be limited by a lack of availability of accredited disease free herds to
403 purchase from (Sibley, 2010) and poor sensitivity of some tests (Maunsell and Donovan,
404 2008). This seems to be reflected in the current study as for both these measures practicality
405 scores were significantly lower than their effectiveness. Gates et al. (2013) suggested that
406 testing and isolating bought in animals were effective measures, but action needs to be taken
407 based on the test results, such as exclusion of these animals from the herd, or treatment. How
408 well the biosecurity measure is carried out will also have an impact on its effectiveness, as
409 isolation measures could be more or less rigorous and complete (Gates et al., 2013).

410 The only measure within the set of buying in measures which scored below average for
411 effectiveness was measure 9 consulting the seller farmer about the animals' disease status,
412 though vets and others rated it more practical than the farmer group. This may be because
413 there is an asymmetry of information between seller and buyer farmer, as seller farmers may
414 not be obliged to inform the buyer about any disease problems (Mee et al., 2012) and a large
415 proportion of farmers can be unaware of the disease status of their animals for a particular

416 disease at a given time (Gates et al., 2013), meaning they may not be in a position to pass this
417 information on to the buyer.

418 The biosecurity measures related to buying in animals were seen as some of the most
419 effective, yet also some of the least practical to implement. This adds a further rationale to
420 literature that suggests that simply giving farmers more information about biosecurity will not
421 improve biosecurity on farms (Jansen et al., 2010; Kristensen & Jakobsen, 2011). Farmers
422 cannot implement measures that are very impractical for them. This study supports the need
423 for a recognition of this point in the wider debate and a discussion of what individual farmers
424 can and cannot control and where else change needs to come from (Enticott, 2008).

425 Measures relating to knowledge planning and veterinary involvement also scored highly for
426 effectiveness (measures 1, 2 and 3, with the exception of measure 30). This resonates with an
427 extensive literature on the important role of the vet as gatekeeper to and promoter of
428 biosecurity (Cannas da Silva et al., 2006; Lowe, 2009; Orpin & Sibley, 2014; Statham &
429 Green, 2015). Vets rated measure 3, maintain regular contact with the vet, as significantly
430 more effective than farmers. This is perhaps unsurprising; that vets believe their services are
431 valuable in helping to promote good biosecurity. There have been many suggestions in the
432 literature however that vets need to become better at promoting their services as disease
433 prevention and management consultants rather than their more traditional role of treating
434 individual sick animals (Ruston et al., 2016). This difference between vet and farmer scores
435 could bear this out, if even expert farmers who presumably have a good working relationship
436 with the vet rate the effectiveness of their services lower than vets do. Interestingly,
437 maintaining regular contact with the vet was rated as the most practical measure overall, by
438 both farmer and vet respondent groups. This is interesting given that a number of barriers in
439 the vet-farmer relationship have been highlighted to better implementation of biosecurity
440 measures, including lack of farmer and vet time, farmer's financial barriers and a perception

441 by vets that farmers are not interested in biosecurity (Gunn et al., 2008). This could be related
442 to the familiarity of the farmer-vet relationship meaning that vets can tailor biosecurity advice
443 to farmers (Ruston et al., 2016).

444 In relation to measure 30, vaccinating for disease not already on the farm, it is perhaps
445 surprising that this did not score more highly for effectiveness and practicality. Vets were the
446 only group who rated this as above average for effectiveness, and rated it more highly than
447 farmers and others. Preventive vaccination is promoted as an important measures for many
448 common livestock diseases (Wells, 2000; Mee et al., 2012; Paton, 2013), and vaccination is a
449 widely carried out biosecurity measure by farmers in the UK: Cresswell et al. (2014) found
450 that 86% of farmers they surveyed had vaccinated their cattle for at least one disease in the
451 previous year. Measure number 5, vaccinating for diseases already on the farm, scored higher
452 for effectiveness and practicality, though vets gave it a significantly higher score for
453 practicality than farmers. It has been shown that there is a lack of compliance with
454 vaccination protocols in terms of timing of doses, storage, and other factors by farmers which
455 could impact on the effectiveness of vaccinations (Cresswell et al., 2014), and veterinary
456 advice around when and what to vaccinate for has also been shown to vary (Cresswell et al.,
457 2013). These factors might explain the relatively low results for preventive vaccination, and
458 why farmers see vaccination as less practical than vets see it. More work could be done
459 however on why there was a difference in scores between vaccination as a preventive or a
460 treatment measure, and between farmer and veterinary scores.

461 All indirect measures relating to pest control, visitors, equipment and hygiene were rated
462 below average for effectiveness and most below average for practicality. Experts consulted in
463 the studies by Sayers et al. (2014) and Van Winden et al. (2005) also rated the biosecurity
464 risk of visitors as relatively low, and the risk from shared equipment as relatively low (Van

465 Winden et al., 2005). Different types of visitors will pose different levels of risk, and visitors
466 who regularly visit other farms may pose a greater risk (Sibley, 2010).

467 There is arguably a need for a greater recognition in debates about biosecurity that direct
468 measures are perceived to be more effective than indirect measures. In a study of biosecurity
469 recommendations across different livestock species Moore et al. (2008) found that the most
470 commonly recommended measures were indirect measures relating to equipment and visitors,
471 with operational policies, infrastructure and animal identification being recommended less
472 often.

473 BWS was best suited to evaluate a large number of measures, which are too cognitively
474 demanding for respondents to rank in a list. The model allowed us to calculate an overall
475 mean with credible intervals and respondent specific estimates of effectiveness and
476 practicality, thus allowing us to investigate degree of consensus or disagreement (i.e. choice
477 heterogeneity), which is generally lacking in evaluation of expert opinion. There was
478 evidence of heterogeneity among experts on effectiveness and practicality of biosecurity
479 measures, similar to the findings of Cross et al. (2012). Whilst caution should be taken when
480 attempting to make inferences to the wider veterinary and farmer community, as we chose a
481 purposive sample of expert farmers and vets, our results suggest that perceived effectiveness
482 and practicality of certain biosecurity measures could differ significantly among vets and
483 farmers and thus have implications for knowledge transfer. This variability in expert opinion
484 could be because of lack of evidence on efficacy and practicality of these measures or
485 different experiences among groups – further work is needed to explore sources of
486 heterogeneity. The response rate was lowest, 26%, among the farmer expert group. Low
487 farmer response rates to surveys is recognised as a problem among researchers, which is
488 partly explained by “survey fatigue” as farmers get approached to fill in a large number of
489 surveys (Pennings et al., 2002).As with all the expert opinion research which relies on non-

490 probability sampling, the expert elicitations in the study belong to respondents who
491 participated in the study and may not be representative of the overall population. However,
492 we believe by using a strict and defined expert selection criterion we have limited the
493 potential bias. In this study the biosecurity questions were not divided by type of farm or
494 disease separately. The effectiveness of different biosecurity measures for different diseases
495 can depend on many factors including the transmission pathway of the disease, the time lag
496 between exposure and acquiring the disease, whether or not the disease is zoonotic, how
497 prevalent the disease is, how accurate tests for the disease are. And the practicality of the
498 measure can vary according to a myriad, psychological and contextual factors on the farm
499 (Enticott, 2008). However, it appears that there was a certain level of consistency within and
500 between groups in the responses, such as the higher effectiveness of direct over indirect
501 measures, and measures relating to buying in cattle. Others have also emphasised the
502 potential for consistency across different biosecurity measures, in that one measure, such as
503 keeping a closed herd, can be effective in relation to a number of diseases (Defra, 2006;
504 Cooke & Brownlow, 2008; Carslake et al., 2011).

505 The wording of the measures is by necessity open to interpretation. Measures could also be
506 applied in very different ways, with a potentially wide impact on effectiveness and
507 practicality. There were also a number of measures and variations on measures that were not
508 included in the study (Maunsell and Donovan, 2008; Mee et al., 2012).

509 The results also do not provide an absolute measure of how effective or practical a
510 biosecurity measure is considered to be, but rather provide a *relative* estimation of which
511 measures are more or less practical or effective than each other. To obtain an absolute
512 assessment of effectiveness studies such as randomised controlled trials are necessary.

513 While the study was based in the UK the results can be applied to the dairy sectors in other
514 Western countries. The UK has the second largest average herd size in the EU after Denmark
515 and the mixed production system is typical, though some countries such as Denmark and the
516 Netherlands could be considered to have intensive systems and countries such as Ireland to
517 have more extensive systems (Promar International Limited, 2014). Dairy sectors in certain
518 European countries, such as Scandinavian countries, have less endemic disease than the UK,
519 thanks to successful eradication programs (Moennig et al., 2005). This would mean that they
520 may make less use of vaccination as a control and prevention measure than the UK. In the US
521 farms are on average much bigger than in the UK and systems are more intensive with cows
522 spending more time indoors (Barkema et al., 2015). The effectiveness of measures could be
523 seen to vary more based on the types of disease threats a country's dairy sector faces, rather
524 than the type of production system in the country. It has been suggested that dairy farms in
525 the US also need to improve the biosecurity of their buying practices (Barkema et al., 2015;
526 Wells, 2000). The practicality of carrying out measures could vary more between countries
527 based on the structure of their dairy sector and facilities on dairy farms. Where industry and
528 government initiatives are well established to minimise the disease risk from buying in
529 animals, such as Scandinavian countries, this could make buying in measures more practical
530 for farmers to carry out. Minimising contact with wildlife and neighbouring animals could be
531 more practical in systems where cows are housed for more of the year such as the US. Large
532 farms may have more facilities for isolating cows, disinfecting equipment and more protocols
533 for minimising disease risks from visitors, making these measures more practical. However,
534 it is suggested that these are areas which even large farms in the US need to work on
535 (Barkema et al., 2015).

536 The results of the study were disseminated and discussed in a consensus panel with vets and
537 farmers and are made available in a report prepared for the funding body AHDB Dairy, who
538 will also take steps to disseminate the results to farmers.

539

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CONCLUSIONS

541 This study gathered expert opinion from farmers, vets, consultants, academics, government
542 and industry representatives on the practicality and effectiveness of different biosecurity
543 measures on dairy farms using best worst case scenario modelling. The results showed that
544 keeping a closed herd was rated as the most effective measure overall, and maintaining
545 regular contact with the vet as the most practical measure. Measure relating to knowledge,
546 planning and veterinary involvement; buying in practices; and quarantine and treatment
547 scored highly overall for effectiveness. Measures relating to visitors, equipment, pest control
548 and hygiene scored relatively much lower for effectiveness. Overall, measures relating to
549 direct animal to animal contact scored much higher for effectiveness than measures relating
550 to indirect disease transmission. Some of the most effective measures were also rated as the
551 least practical, such as keeping a closed herd and avoiding nose to nose contact between
552 contiguous animals.

553

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751
752

753 **Table 1 Biosecurity measures used in the study**

Item number	Biosecurity measure
1.	Monitor and record the herd health status through regular disease testing.
2.	Establish a herd health protocol e.g. through using a herd health plan.
3.	Maintain regular contact with your vet and discuss disease prevention and herd health status.
4.	Isolate sick animals and carry out testing to monitor their disease status.
5.	Vaccinate to control diseases already on the farm.
6.	Implement rapid culling of persistently infected animals where it is appropriate for the disease.
7.	Maintain a closed herd.
8.	Verify the disease status of bought in animals by consulting with the seller farmer's vet.
9.	Verify the disease status of bought in animals by asking the seller farmer.
10.	Verify the disease status of bought in animals by viewing accredited test results.
11.	Isolate new animals after purchasing for a minimum of three weeks.
12.	Test new animals bought onto the farm to assess their disease status.
13.	Avoid hiring bulls.
14.	Prevent nose to nose contact with neighbouring animals by maintaining adequate fencing.
15.	Do not graze animals on grass spread with slurry for at least 6 weeks.
16.	Do not spread fields with imported slurry.
17.	Prevent cattle having access to common waterways.
18.	Isolate and test young stock re-entering the farm after being housed off-site.
19.	Isolate animals returning from livestock shows.
20.	Prevent wildlife accessing housing sheds and food supplies.
21.	Maintain a pest control regime.
22.	Minimise the number of visitors entering the farm.
23.	Ensure that visitors' shoes, clothing and vehicles are clean when entering the farm.
24.	Have a separate area on the farm for incoming vehicles and stock.
25.	Avoid equipment sharing between farms.
26.	Disinfect borrowed vehicles and equipment before and after use.
27.	Ensure contractors use clean equipment on the farm.
28.	Maintain good hygiene in the housing, yard, parlour and other farm areas.
29.	Wash hands and disinfect clothing when going between herds on the farm.
30.	Implement a programme of preventive vaccination for diseases not already on the farm.

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756 **Table 2 Example BWS**

Please pick the most effective and the least effective measure for stopping the spread of disease onto and within the farm, in the absence of any practical constraints to implementing them.

Most effective		Least effective
<input type="checkbox"/>	Ensure that visitors' shoes, clothing and vehicles are clean when entering the farm.	<input type="checkbox"/>
<input type="checkbox"/>	Avoid equipment sharing between farms.	<input type="checkbox"/>
<input type="checkbox"/>	Maintain a closed herd.	<input type="checkbox"/>
<input type="checkbox"/>	Monitor and record the herd health status through regular disease testing.	<input type="checkbox"/>
<input type="checkbox"/>	Minimise the number of visitors entering the farm	<input type="checkbox"/>

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759 **Table 3 Descriptive statistics of respondents**

760	Respondent group Farmer	Total number 16	Region (n) England NE = 1 England NW = 3 England Central = 4 England SE = 4 England SW = 2 Northern Ireland = 0 Scotland = 1 Wales = 1	Age (n) Under 30 = 2 30-40 = 1 40-50 = 4 50-60 = 6 > 60 = 3	Closed herd (n) – 11 Open herd with biosecurity measures (n) – 5	Year round housing (n) – 2 Seasonal housing and grazing (n) – 12 Year round grazing (n) – 2
	Respondent group Vet	Total number 28	Region (n) England NE = 2 England NW = 8 England Central = 2 England SE = 2 England SW = 10 Northern Ireland = 0 Scotland = 2 Wales = 2	Median number of years practicing as a vet = 19 years. Interquartile range = 13-30 years.	Median % time spent on dairy veterinary work = 85% Interquartile range = 79-90%	Median % time on dairy farms spent in disease prevention advisory role = 25% Interquartile range = 20-40%
	Respondent group Other	Total number 16	Profession (n) Industry = 7 Qualified veterinary surgeon = 8 Academia = 3 Government = 4 Consultancy = 5 Other = 1 (dairy farmer)			

761 **Table 4 Effectiveness and practicality scores for each measure**

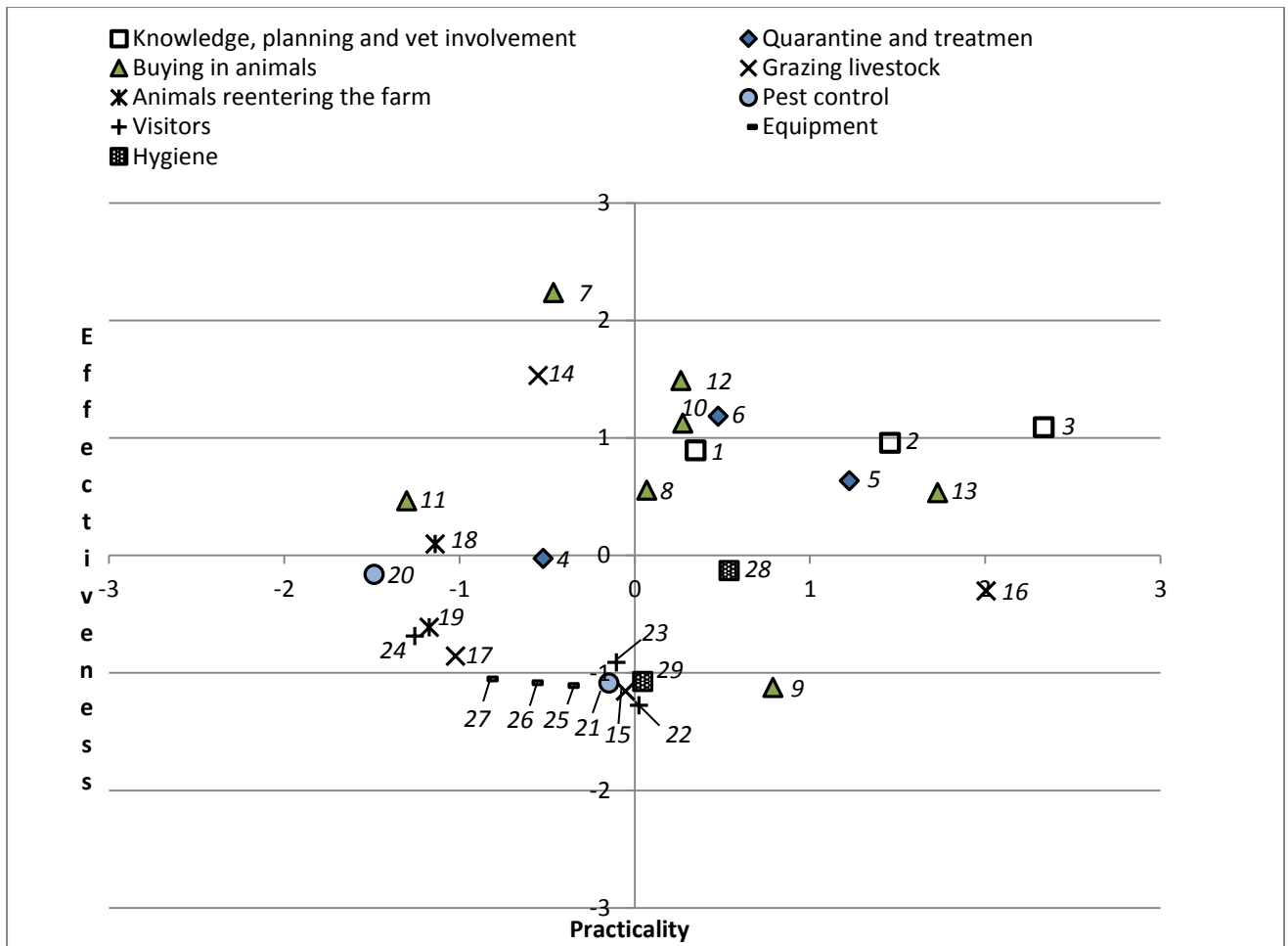
762 The symbols ^{a*} show that the measure's effectiveness score was significantly higher ($p \leq$
 763 0.05) than the practicality score. The symbol ^{b*} shows that the measure's practicality score
 764 was significantly higher ($p \leq 0.05$) than the effectiveness score.

Set of measures	Item number	Mean effectiveness scores	95% CI	Mean practicality scores	95% CI
Knowledge, planning and vet involvement	1.	5.55	4.82 - 6.28	4.017	3.36 - 4.68
	2.	5.71	4.81 - 6.61	6.20	5.51 - 6.89
	3.	6.03	5.23 - 6.85	7.93 ^{b*}	7.46 - 8.39
	30.	2.97	5.23 - 6.85	2.24	1.55 - 2.93
Quarantine and treatment	4.	3.27	2.67 - 3.87	2.30	1.73 - 2.88
	5.	4.91	4.18 - 5.65	5.74	4.99 - 6.50
	6.	6.28	5.52 - 7.03	4.27	3.52 - 5.03
Buying in animals	7.	8.89 ^{a*}	8.20 - 9.57	2.42	1.56 - 3.29
	8.	4.71	3.86 - 5.57	3.47	2.80 - 4.13
	9.	0.54	0.25 - 0.84	4.88	4.01 - 5.76
	10.	6.13 ^{a*}	5.44 - 6.82	3.87	3.09 - 4.66
	11.	4.49 ^{a*}	3.73 - 5.25	0.77	0.49 - 1.06
	12.	7.03 ^{a*}	6.25 - 7.81	3.85	3.26 - 4.44
	13.	4.66	3.84 - 5.48	6.73	5.99 - 7.48
Grazing livestock	14.	7.14 ^{a*}	6.68 - 7.59	2.25	1.74 - 2.76
	15.	0.46	0.37 - 0.55	3.23	2.50 - 3.96
	16.	2.58	2.07 - 3.09	7.28 ^{b*}	6.60 - 7.96
	17.	1.21	0.84 - 1.57	1.32	0.83 - 1.81
Animals re-entering farm	18.	3.58 ^{a*}	2.95 - 4.20	1.09	0.62 - 1.57
	19.	1.81	1.32 - 2.30	1.03	0.85 - 1.21
Pest control	20.	2.93	2.23 - 3.63	0.41	0.07 - 0.75
	21.	0.63	0.28 - 0.99	3.04	2.50 - 3.59
Visitors	22.	0.16	0.09 - 0.23	3.38	2.59 - 4.17
	23.	1.07	0.63 - 1.51	3.13	2.33 - 3.93
	24.	1.63	1.03 - 2.22	0.87	0.56 - 1.17
Equipment	25.	0.58	0.43 - 0.74	2.60	1.97 - 3.22
	26.	0.64	0.49 - 0.79	2.19	1.66 - 2.72
	27.	0.72	0.53 - 0.91	1.69	1.11 - 2.26
Hygiene	28.	3.01	2.35 - 3.67	4.39	3.65 - 5.14
	29.	0.67	0.36 - 0.98	3.42	2.63 - 4.22

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767 **Shortall Figure 1**

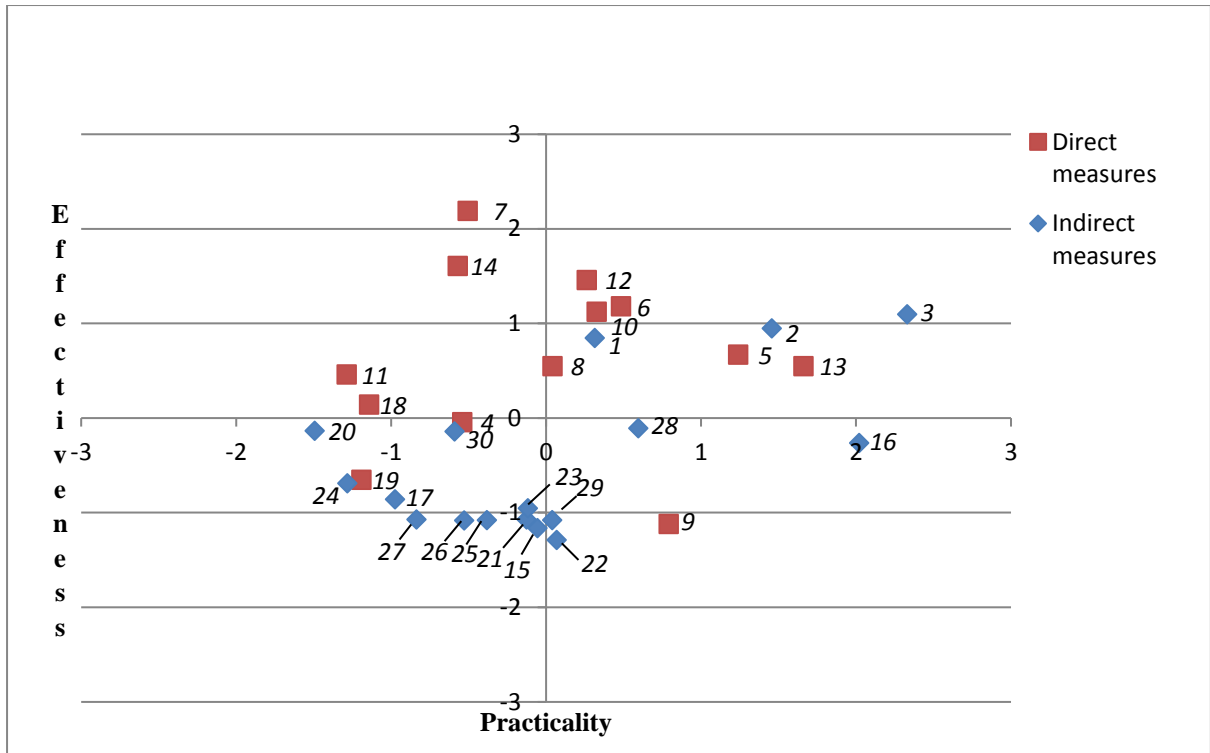


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770 **Figure 1 Zero centred scatter plot of effectiveness and practicality scores by measure**
771 **set.** Practicality scores are on the X axis, effectiveness scores are on the Y axis. Refer to table
772 1 for list of biosecurity measures by number. Symbols in legend indicate groups of measures.

773 **Shortall Figure 2**



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776 **Figure 2 Zero-centred scatter plot of effectiveness and practicality scores as direct or**
777 **indirect measures.** Practicality scores are on the X axis, effectiveness scores are on the Y
778 axis. Refer to table 1 for list of biosecurity measures by number.

779 **Table 5 Heterogeneity within scores.** The letter F stands for farmer respondent group, O
780 stands for other respondent group and V stands for vet respondent group. The symbols F>O
781 means that the farmer respondent group scored that measure as significantly ($P < 0.05$) more
782 effective than the other respondent group, and likewise for vet and other groups.

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Measure No.	Heterogeneity in effectiveness scores	Significant differences between respondent groups' effectiveness scores	Heterogeneity in practicality scores	Significant differences between respondent groups' practicality scores
1	No	-	Yes	-
2	Yes	F>O	No	-
3	Yes	V>F	No	-
4	Yes	V>F	Yes	-
5	Yes	-	Yes	V>F
6	No	-	Yes	F>V, F>O
7	No	-	Yes	F>V, F>O
8	Yes	O>F	Yes	-
9	No	-	Yes	V>F, V>O
10	No	-	Yes	-
11	Yes	-	No	-
12	No	-	Yes	V>O
13	Yes	V>O	No	-
14	No	-	Yes	F>V, F>O
15	No	-	Yes	V>F, V>O
16	Yes	-	No	-
17	No	-	No	-
18	Yes	-	No	-
19	Yes	-	No	-
20	Yes	F>V	No	-
21	No	-	Yes	-
22	No	-	Yes	O>F
23	No	-	Yes	-
24	Yes	-	No	-
25	No	-	Yes	-
26	No	-	Yes	-
27	No	-	Yes	O>F
28	Yes	-	Yes	O>F
29	No	-	Yes	-
30	Yes	V>F, V>O	No	-

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