

# *Capturing systemic interrelationships by an impact analysis to help reduce production diseases in dairy farms*

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1 **Capturing systemic interrelationships by an impact analysis to help reduce production diseases**  
2 **in dairy farms**

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14 **Abstract**

15 Production diseases, such as metabolic and reproductive disorders, mastitis, and lameness, emerge  
16 from complex interactions between numerous factors (or variables) but can be controlled by the right  
17 management decisions. Since animal husbandry systems in practice are very diverse, it is difficult to  
18 identify the most influential components in the individual farm context. However, it is necessary to do  
19 this to control disease, since farmers are severely limited in their access to resources, and need to  
20 invest in management measures most likely to have an effect. In this study, systemic impact analyses  
21 were conducted on 192 organic dairy farms in France, Germany, Spain, and Sweden in the context of  
22 reducing the prevalence of production diseases. The impact analyses were designed to evaluate the  
23 interrelationships between farm variables and determine the systemic roles of these variables. In  
24 particular, the aim was to identify the most influential variables on each farm. The impact analysis

25 consisted of a stepwise process: (i) in a participatory process 13 relevant system variables affecting the  
26 emergence of production diseases on organic dairy farms were defined; (ii) the interrelationships  
27 between these variables were evaluated by means of an impact matrix on the farm-level, involving the  
28 perspectives of the farmer, an advisor and the farm veterinarian; and (iii) the results were then used to  
29 identify general system behaviour and to classify variables by their level of influence on other system  
30 variables and their susceptibility to influence. Variables were either active (high influence, low  
31 susceptibility), reactive (low influence, high susceptibility), critical (both high), or buffering (both  
32 low). An overall active tendency was found for feeding regime, housing conditions, herd health  
33 monitoring, and knowledge and skills, while milk performance and financial resources tended to be  
34 reactive. Production diseases and labour capacity had a tendency for being critical while reproduction  
35 management, dry cow management, calf and heifer management, hygiene and treatment tended to  
36 have a buffering capacity. While generalised tendencies for variables emerged, the specific role of  
37 variables could vary widely between farms. The strength of this participatory impact assessment  
38 approach is its ability, through filling in the matrix and discussion of the output between farmer,  
39 advisor and veterinarian, to explicitly identify deviations from general expectations, thereby  
40 supporting a farm-specific selection of health management strategies and measures.

41 **Key words:** organic farming, complexity, participatory approach, decision support, impact matrix

42  
43 *“Every good regulator of a system must be a model of that system.” (Conant and Ashby, 1970)*

## 44 **1 Introduction**

45 Multifactorial diseases, such as metabolic and reproductive disorders, mastitis, and lameness, by  
46 causing economic losses and impairing the health and welfare of animals, represent serious problems  
47 in both conventional and organic dairy farming (Thamsborg et al., 2004). They have in common that  
48 all of them arise from complex interactions between a large number of risk factors, where each, in  
49 itself, would not necessarily lead to disease. Risk factors for the emergence of these diseases are  
50 mainly related to deficits in farm management, preventing animals from being able to cope with given  
51 living conditions. This is why they are called production diseases, because their prevalence and  
52 severity is impacted by management decisions (Nir, 2003). It is understood that production disease is

53 an emergent property of the farm, arising from the functioning of the component parts of the system  
54 (Sundrum, 2012). Animal husbandry systems are, in practice, so diverse, that it is difficult to identify  
55 the most influential component in the individual farm context. This, however, is necessary to prevent  
56 disease, since farmers are severely limited in their access to resources, and therefore need to invest in  
57 management measures most likely to have a greatest beneficial effect (Sundrum, 2014).

58 With challenges on many fronts to contend with such as impacts on landscape and ecosystems,  
59 pollution, health risks, and animal welfare, livestock farming is hard-pressed to change in order to  
60 meet societal demands (Gibon et al., 1999). This is especially true for organic livestock farming,  
61 where consumer willingness to pay premium prices is tied up with their trust in the delivery of  
62 additional credence values. Organic farming has the stated aim of good animal health and welfare and  
63 seeks to achieve that aim by means of stricter production rules and use of extensive advisory services.  
64 These requirements, however, have not led to outstanding results in a considerable proportion of  
65 organic farms, e.g. with regard to prevalence of production diseases (Hovi et al., 2003; Krieger et al.,  
66 2016). Poor animal health is to the detriment of the animals, by causing pain and distress, as well as  
67 the farmers, by leading to unfair competition and threatening consumer confidence in product and  
68 process quality. It follows that livestock farming in general, and organic systems in particular, are in  
69 need of approaches that support the identification of management measures that are prospective for  
70 improving animal health. Involvement of advisors and veterinarians in the context of health  
71 management can be highly beneficial. Their expertise is essential for proper diagnoses and they  
72 provide relevant knowledge that may be used for problem solving. The value of external knowledge,  
73 however, heavily depends on the bearers' capacity to tailor advice on the basis of the farm context, to  
74 ensure it is applicable and useful. Due to the high complexity (non-linear dynamic relationships) in  
75 livestock systems, one-size-fits-all solutions to problems, based on *ceteris paribus* assumptions and  
76 one single perspective is insufficient. Instead, systemic approaches must be developed and tested that  
77 take into account the specific context of each farm and also which simplify complexity without  
78 reducing it to simple cause-effect relationships, and involve relevant stakeholders.

79 Knowledge on the functional relationships between components is the basis for understanding the  
80 behaviour and attributes of systems and is necessary to achieve significant improvements in the  
81 performance of systems (Conway, 1985). In order to assess and analyse the interrelationships at work  
82 in systems, Vester and Hesler (1980) developed the Sensitivity Model; a method which uses  
83 cybernetic principles for system analysis and which is based on fuzzy logic (Zadeh, 1997), i.e. it uses  
84 imprecise knowledge of real experience. Within their 'network thinking method', representation of  
85 reality is achieved by the following steps: correctly identifying and selecting key system components;  
86 understanding how these inter-relate; and joining up the pattern in an 'impact matrix', all within a  
87 participatory framework. Impact matrices were initially developed and used for forecasting purposes  
88 (Godet, 1979; Gordon and Hayward, 1968) and have since been applied in a diversity of research  
89 contexts, e.g. identification of sustainability values (Cole et al., 2007), optimisation of management  
90 processes (Fried, 2010; Gausemeier, 1998; Schianetz and Kavanagh, 2008), cost benefit analysis  
91 (Wenzel and Igenbergs, 2001), improvement of slash and burn cultivation systems (Messerli, 2000),  
92 management of ecological reserves (Iron Curtain Consortium, 2004) and city regions (Wiek and  
93 Binder, 2005) as well as transport (OECD Environment Directorate, 2000), traffic (Vester, 2007), and  
94 settlement planning (Coplak and Raksanyi, 2003). Studying organic pig farms in Germany, Hoischen-  
95 Taubner and Sundrum (2012) were the first to use the impact matrix approach in the context of  
96 improving animal health.

97 The rationale for this study is the unsatisfactory animal health status in organic dairy farms, as  
98 demonstrated by Krieger et al. (2016), and the relative ineffectiveness of traditional herd health  
99 planning and management to improve this situation over many years. Systemic impact analyses were  
100 therefore conducted on European organic dairy farms which captured the complexity of individual  
101 farms and identified farm-level levers for driving desirable change. The overall objective of the study  
102 was to show the potentialities of using an impact analysis for reducing production diseases on  
103 (organic) dairy farms. The specific objectives were to evaluate the interrelationships between farm  
104 factors, determine the systemic roles of variables in driving herd health and identify the most  
105 influential variables in each farm context.

## 106 2 Material and methods

### 107 2.1 Farms

108 Impact analyses were performed during farm visits in four European countries. Farms were recruited  
109 to the study by phone or mail in Spain and Sweden, and through advisors involved in the project in  
110 Germany and France. A total of 192 organic dairy farms in France (51), Germany (60), Spain (28) and  
111 Sweden (53) were recruited and visited by 6 different researchers, 58 agricultural advisors and 143  
112 veterinarians during a period of 6 months (from November 2013 until April 2014). Country  
113 differences in sample sizes are primarily due to level of sector development, for example, the sector is  
114 less developed in Spain than in the other countries (MAGRAMA, 2014). Farms had been in organic  
115 production from 1 to 29 years. Herd size ranged from 7.4 to 376.5 cow-years (calculated by adding all  
116 the cow-days per farm in the year of survey and dividing the product by 365). Herds were smallest in  
117 Spain (median 29.7 cow-years) and largest in Sweden (median 68.1 cow-years). Although  
118 stratification was not used in sample selection, the final sample does cover the size range and system  
119 diversity found in organic dairy farms in Europe.

### 120 2.2 Definition of system variables

121 Identification of relevant system variables was undertaken before the farm visits to ensure that all key  
122 factors that play a role in the way the system behaves were captured. This step involved the definition  
123 of system boundaries, i.e. the organic dairy farm, and goal-setting, i.e. reducing the prevalence of  
124 production diseases. These choices then determined who should be involved in the subsequent variable  
125 selection process, namely, stakeholders affected by, or affecting, farm animal health management. To  
126 facilitate the identification of relevant system variables, five regional workshops were conducted in  
127 France (2), Germany (1), Spain (1), and Sweden (1). The workshops were held within a  
128 multidisciplinary framework and attended by a total of 80 experts in animal health on organic dairy  
129 farms: farmers, advisors, veterinarians, researchers, dairy processors and traders, and members of dairy  
130 associations. The list of variables identified, which was collected in a participatory process, was  
131 structured, and reduced to a set of essential components, resulting in four national lists containing a  
132 total of 81 variables. Using these lists a multinational team of researchers then established a pan-  
133 European set of 20 variables applicable to a wide range of farms (Duval et al., 2013). In pilot visits to

134 two organic dairy farms, impact analyses were performed using these 20 variables. To reduce the time  
 135 needed to undertake the task, this set was further aggregated to 13 variables (Table 1). As proposed by  
 136 Vester (2007), the final set of variables was then screened to bio-cybernetic criteria, in a so-called  
 137 ‘criteria matrix’, to make sure it sufficiently represents the system. During this validation exercise  
 138 variables are assigned to 18 criteria in four categories (areas of life, physical, dynamic and system-  
 139 relatedness). A variable set is regarded valid, if it is balanced and no aspect is neglected. The final set  
 140 of 13 variables was found to cover all aspects, with a slight overhang of ‘activities’ and variables that  
 141 are ‘controllable from the inside’ (data not shown).

142 Table 1: List of system variables and definitions.

|    | <b>Variable</b>                  | <b>Definition</b>  |
|----|----------------------------------|--|
| 1  | Milk performance                 | Level of milk production (considering quality and quantity).   |
| 2  | Production diseases              | Health status of the herd related to enzootic (production) diseases including udder diseases, lameness, and reproductive and metabolic disorders.  |
| 3  | Financial resources              | Economical results, financial resources of the farm to modify and improve suboptimal conditions.   |
| 4  | Labour capacity                  | Ratio between available labour time and work to do.  |
| 5  | Feeding                          | Degree of meeting the feeding requirement of individual animals in their actual life stage (energy nutrients, structure, water etc.); influenced by feeding management and the availability of feed. |
| 6  | Housing conditions               | Attributes of the cow environment (housing and pastures) that have a potential effect on animal health and welfare.  |
| 7  | Reproduction management          | Ensuring fertility in heifers and dairy cows meets the objectives of the farmer.   |
| 8  | Dry cow management               | Ensuring optimal conditions (regarding nutrition, housing, hygiene, and welfare) for dry cows to be able to start healthy into the next lactation.   |
| 9  | Calf and heifer management       | Ensuring optimal conditions (regarding nutrition, housing, hygiene, and welfare) for the development of calves and heifers.  |
| 10 | Herd health monitoring           | Quality of the perception and documentation of herd health and production at individual cow and herd level.  |
| 11 | Hygiene                          | To what extent are hygiene standards met/hygienic measures taken with respect to housing, milking, and the risk of transmitting infectious diseases through internal or external contact.            |
| 12 | Treatment                        | Degree of meeting the need of an individual (sick) animal by using remedies and palliative measures; needs-related = appropriate (made to measure therapy) and in time (early/timely treatment).     |
| 13 | Knowledge and skills on the farm | Knowledge and skills that can be accessed for the benefit of the farm. This includes knowledge and skills of external persons which can be involved if necessary.                                    |



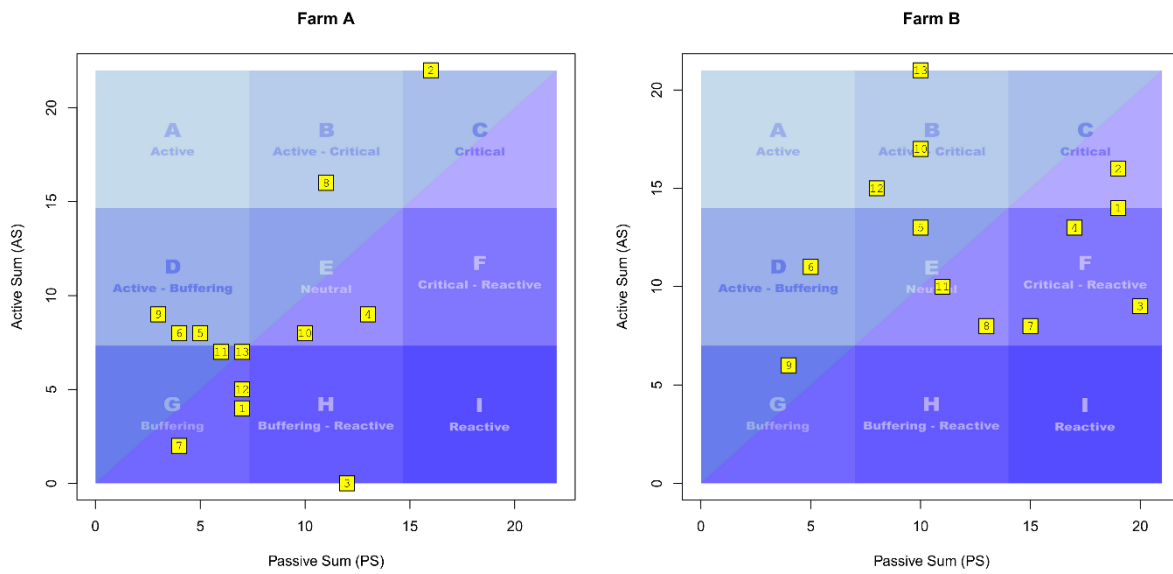
143 2.3 Impact analysis

144 An impact analysis was used to examine and visualise how the system variables impact on each other.  
 145 To undertake the impact analysis the farmer, an advisor and the local veterinarian met with a  
 146 researcher on each farm, the latter taking up the role of the facilitator. Prior to the visits, all researchers  
 147 were trained in the moderation of group discussions and had tested the procedure on two pilot farms.  
 148 In some cases a project veterinarian stepped in if the farm veterinarian could not attend the meeting,  
 149 ensuring a veterinarian’s perspective was always available. Each assessment was preceded by a short  
 150 farm walk and a presentation of data on general farm characteristics and herd health status by the  
 151 researcher. During the assessment an impact matrix was incrementally completed by quantifying the  
 152 relationships between pairs of variables, i.e. a set of 156 pair-wise comparisons. This process took  
 153 between 1 and 2 hours. By definition, variables could have no impact on themselves, which is why the  
 154 diagonal in each matrix was crossed out (Figure 1). The underlying question for each comparison was:  
 155 “If variable A changes, how will variable B change on this farm?” Only changes as a result of the  
 156 direct influence of the matched variable were taken into account, irrespective of the direction of  
 157 anticipated shift. The strength of influence was ranked using a four-point ordinal scale: 0 (no obvious  
 158 influence); 1 (weak change); 2 (moderate change); or 3 (strong change). Each proffered rank was first  
 159 discussed between the participants and the consensual score recorded by the researcher into a software  
 160 tool, called ‘dsp-Impro’, which was specifically designed for the purpose. Once all interrelationships  
 161 were rank scored, an output graph was generated for each farm in question.

| Impact of 1 on →             | 1    | 2    | 3    | 4    | 5    | 6    | 7    | 8    | 9    | 10   | 11   | 12   | 13   | absolute Active Sum | relative Active Sum | Sector | Activity Index | Criticality Index |
|------------------------------|------|------|------|------|------|------|------|------|------|------|------|------|------|---------------------|---------------------|--------|----------------|-------------------|
| 1 Milk performance           |      | 1    | 1    | 0    | 1    | 0    | 0    | 1    | 0    | 0    | 0    | 0    | 0    | 4                   | 0.18                | G      | -0.07          | -0.25             |
| 2 Production diseases        | 3    |      | 3    | 3    | 0    | 0    | 3    | 1    | 1    | 3    | 1    | 2    | 2    | 22                  | 1.00                | C      | 0.14           | 0.36              |
| 3 Financial resources        | 0    | 0    |      | 0    | 0    | 0    | 0    | 0    | 0    | 0    | 0    | 0    | 0    | 0                   | 0.00                | H      | -0.27          | -0.23             |
| 4 Labour capacity            | 0    | 1    | 1    |      | 0    | 1    | 1    | 2    | 1    | 1    | 1    | 0    | 0    | 9                   | 0.41                | E      | -0.09          | 0.00              |
| 5 Feeding                    | 2    | 2    | 1    | 1    |      | 0    | 0    | 0    | 0    | 1    | 0    | 0    | 1    | 8                   | 0.36                | D      | 0.07           | -0.20             |
| 6 Housing conditions         | 0    | 1    | 1    | 1    | 1    |      | 0    | 2    | 0    | 1    | 1    | 0    | 0    | 8                   | 0.36                | D      | 0.09           | -0.23             |
| 7 Reproduction management    | 0    | 0    | 0    | 1    | 0    | 0    |      | 0    | 0    | 1    | 0    | 0    | 0    | 2                   | 0.09                | G      | -0.05          | -0.36             |
| 8 Dry cow management         | 1    | 3    | 1    | 2    | 1    | 2    | 0    |      | 0    | 2    | 1    | 2    | 1    | 16                  | 0.73                | B      | 0.11           | 0.11              |
| 9 Calf and heifer management | 0    | 2    | 2    | 2    | 0    | 0    | 0    | 0    |      | 0    | 1    | 1    | 1    | 9                   | 0.41                | D      | 0.14           | -0.23             |
| 10 Herd health monitoring    | 0    | 1    | 1    | 1    | 1    | 0    | 0    | 2    | 0    |      | 0    | 1    | 1    | 8                   | 0.36                | E      | -0.05          | -0.09             |
| 11 Hygiene                   | 1    | 2    | 0    | 2    | 0    | 1    | 0    | 1    | 0    | 0    |      | 0    | 0    | 7                   | 0.32                | G      | 0.02           | -0.20             |
| 12 Treatment                 | 0    | 2    | 1    | 0    | 0    | 0    | 0    | 1    | 0    | 0    | 0    |      | 1    | 5                   | 0.23                | G      | -0.05          | -0.23             |
| 13 Knowledge and skills      | 0    | 1    | 0    | 0    | 1    | 0    | 0    | 1    | 1    | 1    | 1    | 1    |      | 7                   | 0.32                | G      | 0.00           | -0.18             |
| absolute Passive Sum         | 7    | 16   | 12   | 13   | 5    | 4    | 4    | 11   | 3    | 10   | 6    | 7    | 7    |                     |                     |        |                |                   |
| relative Passive Sum         | 0.32 | 0.73 | 0.55 | 0.59 | 0.23 | 0.18 | 0.18 | 0.50 | 0.14 | 0.45 | 0.27 | 0.32 | 0.32 |                     |                     |        |                |                   |

162  
 163 Figure 1. Impact matrix (farm A) showing the 13 variables’ active and passive sums, sector  
 164 designation indicating their roles within the system, and their activity and criticality indices.

165 Within the impact matrix the row sum is a measure of a variable's exerted influence (AS = Active  
 166 Sum), while the column sum measures its received influence (PS = Passive Sum). The output graph  
 167 (Figure 2) represents the numerically aggregated impact rank scores for each variable and classifies  
 168 the indicators depending on their type of system impact as active, reactive, critical or buffering using a  
 169 grid of nine sectors developed by Schianetz and Kavanagh (2008). The systemic roles associated with  
 170 the sectors in the graph and their implications for system control are presented in Table 2.



171

172 Figure 2. Output graphs of two farms showing the spatial distribution of 13 variables (definitions in  
 173 Table 1) on the grid of systemic roles determined by their absolute Active (AS) and Passive Sums  
 174 (PS). Axes ends are the maximum value of both AS and PS. Sectors above and below the diagonal  
 175 capture 'rather active' ( $AS > PS$ ) and 'rather reactive' ( $AS < PS$ ), respectively.

176 Table 2. Systemic roles of variables according to Vester (2007) and Schianetz and Kavanagh (2008).

| Grid sector | Systemic role    | Active Sum | Passive Sum | Use for System control  |
|-------------|------------------|------------|-------------|---|
| A           | Active           | High       | Low         | Effective control levers that will re-stabilise the system once change has occurred.  |
| B           | Active-Critical  | High       | Medium      | High leverage, but outcomes are less stable, more difficult to control than Sector A indicators.  |
| C           | Critical         | High       | High        | Accelerators and catalysts that are suitable as change starters, but outcomes are very difficult to control and can put the systems resilience at risk. |
| D           | Buffering-Active | Medium     | Low         | Medium leverage points with minimal side effects.   |

|   |                    |        |        |   |
|---|--------------------|--------|--------|---|
| E | Neutral            | Medium | Medium | It will be difficult to steer the system with components in this area, but they are useful for self-regulation. |
| F | Critical-Reactive  | Medium | High   | Changes in this area do not achieve expected results.   |
| G | Buffering          | Low    | Low    | Low leverage for system control, interventions serve no purpose.  |
| H | Buffering-Reactive | Low    | Medium | Sluggish system reaction with indicator change, but they may be suitable for experimentation.                   |
| I | Reactive           | Low    | High   | Intervening here to steer the system is (only) treating symptoms; these components make excellent indicators.   |

177

178 This information on the systemic roles of each of the system variables was revisited later in the  
 179 interview when action plans were established to improve the production disease status on the farm.  
 180 Space does not permit a reporting of the health plans drawn up as a result of this impact assessment  
 181 exercise.

#### 182 2.4 Data analysis

183 The impact matrix data were further analysed using the statistical software package R. For between-  
 184 farm comparison, relative values were determined by dividing Active Sum (AS) and Passive Sum (PS)  
 185 by the maximum value of both AS and PS per farm to rescale values between 0 and 1.

186 Inspired by the works of Linss and Fried (2010), two indices were obtained for each variable:

$$187 \quad AI = \frac{\text{relative AS} - \text{relative PS}}{2}$$

$$188 \quad CI = \frac{\text{relative AS} + \text{relative PS} - 1}{2}$$

189 Where

190 AI = Activity Index

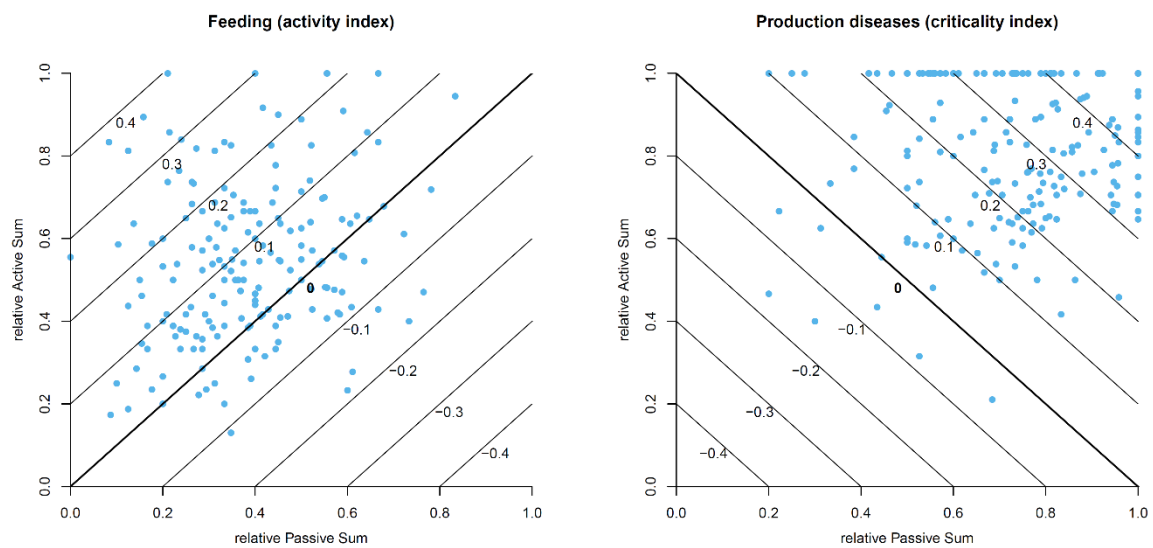
191 CI = Criticality Index

192 AS = Active Sum

193 PS = Passive Sum

194 Variables with a high score AI are active, i.e. they exercise a lot of influence on other variables  
 195 without being much affected by them. Conversely, variables with a low AI score are reactive, i.e. they  
 196 are strongly influenced by other variables while not being very influential. Variables with a high CI

197 score are critical in a farm system, i.e. having a large impact as well as being strongly impacted  
198 themselves, while variables with a low CI tend to be buffering, which means they are neither  
199 influential nor much influenced by others. The resulting activity and criticality ranks were used to  
200 identify the most active/reactive and most critical/buffering variables in each farm system. Figure 3  
201 shows, for illustration purposes, the distribution of farm AI and CI rankings for two variables  
202 ('feeding' AI and 'production diseases' CI), with AI and CI contour lines shown.



203  
204 Figure 3. Distribution of farm (n=192) AI and CI rankings for two variables ('feeding' AI and  
205 'production diseases' CI), with AI and CI contour lines shown.

## 206 2.5 Statistics

207 Medians (rather than means) are used as measures of central tendency in descriptive statistics because  
208 they are much less sensitive to outlying values. In order to test for the significance of differences in  
209 sample means between countries, two different statistical tests were performed. Homogeneity of  
210 variances was tested using the Levene test. Because sample variances were not equal, an approximate  
211 method of the Welch test (Welch, 1951) was used for continuous data, which generalizes the two-  
212 sample Welch test to the case of multiple samples. The Dunnett-Tukey-Kramer test for multiple  
213 pairwise comparisons, adjusted for unequal variances (Dunnett, 1980) was used for post-hoc analysis.  
214 Pearson's Chi-squared test was applied to ordinal data using the Holm-Bonferroni method for control  
215 of the familywise error rate. Sample differences were considered significant if  $p < 0.05$ .

## 216 2.6 *User assessments*

217 One year after the farm visits, when the impact assessment was applied, a postal survey was conducted  
218 to assess how farmers, advisors and veterinarians perceived the farm visits in general and the impact  
219 analyses in particular. Questionnaires were sent to all participating farmers, advisors and veterinarians.  
220 Farmers had a response rate of 44% (n=84), advisors and veterinarians (36%; n=73). Both closed and  
221 open-ended questions were asked. Questions were included in the survey to permit an evaluation of  
222 the perceived performance of the impact analyses:

- 223 1. How well did you understand the impact matrix session that was provided?
- 224 2. How relevant do you think the Impact Matrix was for your farm?
- 225 3. How useful was the Impact Matrix for the round-table discussion?
- 226 4. Please rank the Impact Matrix in terms of its importance to you.

## 227 **3 Results**

### 228 *3.1 Impact analysis*

229 The impact analysis revealed large differences between farms in terms of perceived impacts between  
230 variables, i.e. the systemic roles of variables. The median number of impacts (influences per farm,  
231 irrespective of strength) was 84 with a range of 25 – 155. Significant differences between countries  
232 were revealed, for example between Germany (median 73) and Sweden (median 98;  $p < 0.001$ ). The  
233 cumulative impact strength per matrix (sum of all cell values) ranged from 28 to 312 (median 119.5)  
234 and varied significantly between countries ( $p < 0.001$ ). The German median was lowest (94.5) whilst  
235 the French and Swedish were highest (133 and 130).

236 In the output graphs generated by the impact assessment, the variables were spread out across 6 grid  
237 sectors per farm on average (range 3 – 9). Across all farms, grid sector E (neutral) was frequented  
238 most (24.3%) and sectors A (active) and I (reactive) contained the least variables (3.5% and 5.4%).  
239 Twenty-six percent of farms tended to be particularly inert with more than 9 out of 13 variables  
240 located in sector G (buffering) and neighbouring sectors. An almost similar proportion (25%) were  
241 characterised as generally critical with more than 9 variables located in sector C (critical) and

242 neighbouring sectors. Just 3% of farms were generally reactive, while forty-six percent could not be  
243 associated with any one typology by the distribution of their variables.

244 As shown in Figure 2, most variables of farm A are located in the buffering region whereas farm B is  
245 characterised by its variables tending to be critical. Levers for change are identified as ‘dry cow  
246 management’ (variable number 8), ‘calf and heifer management’ (9), ‘housing conditions’ (6) and  
247 ‘feeding’ (5) in the case of farm A, and ‘knowledge and skills on the farm’ (13), ‘herd health  
248 monitoring’ (10), ‘treatment’ (12), ‘housing conditions’ (6) and possibly ‘feeding’ (5) in the case of  
249 farm B.

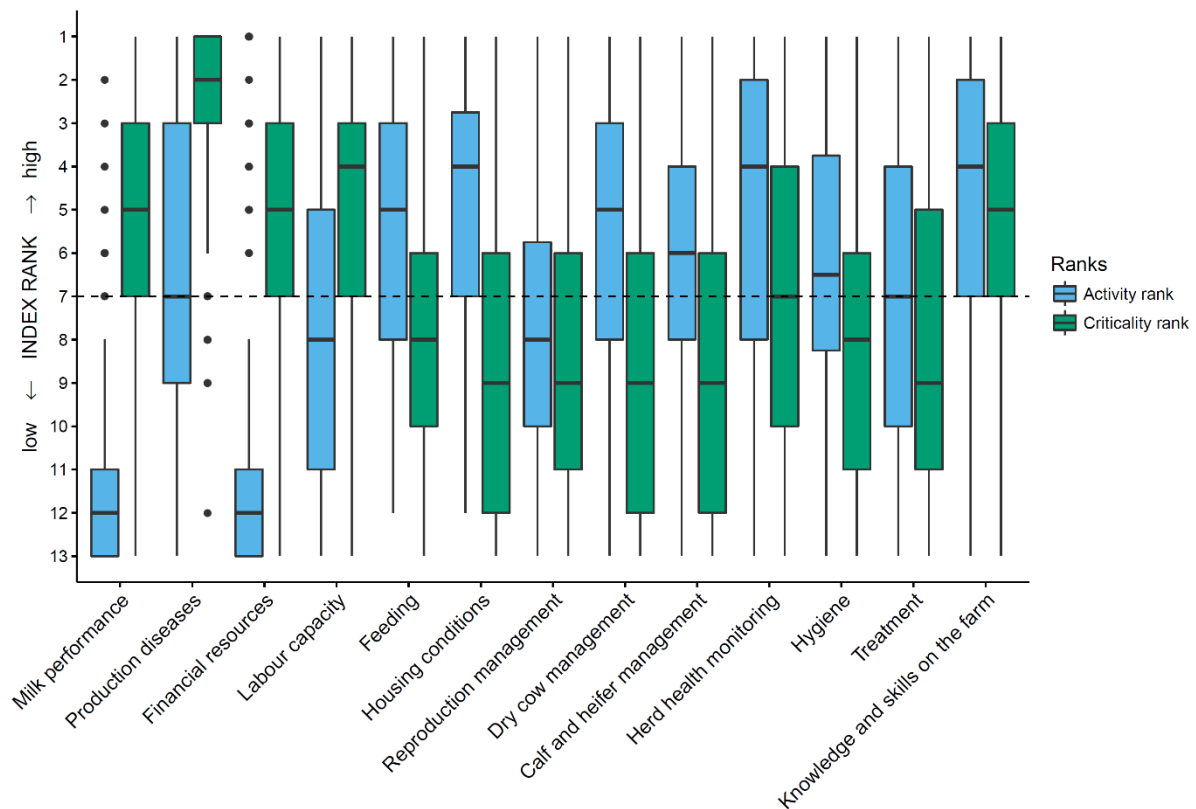
250 Table 3. Median activity and criticality indices and interquartile range (IQR) of all system variables for all countries combined (ALL) and for France (FR),  
 251 Germany (DE), Spain (ES) and Sweden (SE) with the significance of differences between countries marked as \*\*\*  $p < 0.001$ ; \*\*  $p < 0.01$ ; \*  $p < 0.05$ ; n.s. = not  
 252 significant.

| No | Variable                   | Country | Activity index (AI) |       |       |       |       | Criticality index (CI) |       |       |       |       |       |      |
|----|----------------------------|---------|---------------------|-------|-------|-------|-------|------------------------|-------|-------|-------|-------|-------|------|
|    |                            |         | ALL                 | FR    | DE    | ES    | SE    | ALL                    | FR    | DE    | ES    | SE    |       |      |
| 1  | Milk performance           | median  | -0.20               | -0.16 | -0.21 | -0.26 | -0.20 | **                     | 0.08  | 0.06  | 0.03  | 0.18  | 0.12  | ***  |
|    |                            | IQR     | 0.15                | 0.16  | 0.14  | 0.14  | 0.13  |                        | 0.18  | 0.13  | 0.21  | 0.17  | 0.15  |      |
| 2  | Production diseases        | median  | 0.03                | -0.04 | 0.10  | 0.03  | 0.04  | ***                    | 0.28  | 0.32  | 0.32  | 0.22  | 0.22  | ***  |
|    |                            | IQR     | 0.17                | 0.12  | 0.17  | 0.12  | 0.20  |                        | 0.17  | 0.16  | 0.13  | 0.17  | 0.15  |      |
| 3  | Financial resources        | median  | -0.25               | -0.25 | -0.25 | -0.24 | -0.25 | n.s.                   | 0.05  | 0.00  | -0.03 | 0.06  | 0.18  | ***  |
|    |                            | IQR     | 0.16                | 0.16  | 0.20  | 0.11  | 0.15  |                        | 0.22  | 0.21  | 0.17  | 0.15  | 0.18  |      |
| 4  | Labour capacity            | median  | -0.04               | -0.03 | -0.07 | -0.01 | -0.04 | n.s.                   | 0.09  | -0.02 | 0.14  | 0.06  | 0.16  | **   |
|    |                            | IQR     | 0.17                | 0.21  | 0.14  | 0.21  | 0.12  |                        | 0.25  | 0.24  | 0.23  | 0.17  | 0.21  |      |
| 5  | Feeding                    | median  | 0.07                | 0.09  | 0.05  | 0.07  | 0.06  | *                      | -0.04 | -0.04 | -0.08 | 0.00  | 0.00  | **   |
|    |                            | IQR     | 0.15                | 0.14  | 0.11  | 0.18  | 0.13  |                        | 0.18  | 0.14  | 0.18  | 0.12  | 0.19  |      |
| 6  | Housing conditions         | median  | 0.09                | 0.09  | 0.04  | 0.14  | 0.10  | **                     | -0.11 | -0.18 | -0.18 | 0.07  | -0.04 | ***  |
|    |                            | IQR     | 0.14                | 0.10  | 0.11  | 0.07  | 0.14  |                        | 0.26  | 0.24  | 0.19  | 0.20  | 0.26  |      |
| 7  | Reproduction management    | median  | -0.03               | -0.04 | 0.00  | -0.01 | -0.06 | ***                    | -0.12 | -0.09 | -0.24 | -0.07 | -0.04 | ***  |
|    |                            | IQR     | 0.13                | 0.14  | 0.10  | 0.16  | 0.14  |                        | 0.27  | 0.25  | 0.23  | 0.20  | 0.25  |      |
| 8  | Dry cow management         | median  | 0.04                | 0.00  | 0.09  | 0.09  | 0.04  | ***                    | -0.11 | -0.11 | -0.13 | -0.17 | -0.06 | n.s. |
|    |                            | IQR     | 0.13                | 0.12  | 0.14  | 0.16  | 0.12  |                        | 0.28  | 0.22  | 0.27  | 0.21  | 0.34  |      |
| 9  | Calf and heifer management | median  | 0.04                | 0.03  | 0.05  | 0.04  | 0.03  | n.s.                   | -0.13 | -0.03 | -0.25 | -0.11 | 0.03  | ***  |
|    |                            | IQR     | 0.12                | 0.15  | 0.08  | 0.11  | 0.11  |                        | 0.29  | 0.22  | 0.11  | 0.22  | 0.38  |      |
| 10 | Herd health monitoring     | median  | 0.07                | 0.12  | 0.03  | 0.06  | 0.06  | *                      | -0.05 | 0.07  | -0.07 | -0.17 | -0.04 | ***  |
|    |                            | IQR     | 0.14                | 0.13  | 0.17  | 0.16  | 0.13  |                        | 0.26  | 0.22  | 0.24  | 0.22  | 0.26  |      |
| 11 | Hygiene                    | median  | 0.02                | 0.06  | 0.00  | 0.03  | 0.00  | **                     | -0.08 | -0.02 | -0.16 | -0.12 | -0.02 | ***  |
|    |                            | IQR     | 0.13                | 0.17  | 0.09  | 0.10  | 0.15  |                        | 0.26  | 0.24  | 0.21  | 0.24  | 0.28  |      |

|    |                                  |            |             |             |             |             |             |             |             |             |             |             |
|----|----------------------------------|------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|-------------|
| 12 | Treatment                        | median     | 0.00        | 0.03        | -0.01       | -0.01       | 0.03 *      | -0.09       | -0.02       | -0.11       | -0.14       | -0.14 ***   |
|    |                                  | <i>IQR</i> | <i>0.14</i> | <i>0.16</i> | <i>0.13</i> | <i>0.10</i> | <i>0.12</i> | <i>0.26</i> | <i>0.23</i> | <i>0.26</i> | <i>0.18</i> | <i>0.26</i> |
| 13 | Knowledge and skills on the farm | median     | 0.11        | 0.07        | 0.13        | 0.11        | 0.09 n.s.   | 0.08        | 0.21        | 0.00        | 0.11        | 0.07 ***    |
|    |                                  | <i>IQR</i> | <i>0.19</i> | <i>0.27</i> | <i>0.18</i> | <i>0.12</i> | <i>0.13</i> | <i>0.27</i> | <i>0.24</i> | <i>0.24</i> | <i>0.21</i> | <i>0.24</i> |



254 With regard to the four systemic variable typologies some generalisations can be made (see Table 3):  
255 The variables 'milk performance' and 'financial resources' are both characterised by low median AI  
256 ( $-0.2$  and  $-0.25$  respectively), which indicates a strongly reactive tendency, i.e. the variables are  
257 highly susceptible to the influence of other variables. The variable 'production diseases', with a  
258 median CI of  $0.28$ , was the most critical of all variables, i.e. it had a large impact on other variables  
259 but at the same time was also strongly impacted by other variables. 'Labour capacity' was rather  
260 critical as well, with a median CI of  $0.09$ . Quite active were the variables 'feeding' and 'housing  
261 conditions' with median AI of  $0.07$  and  $0.09$ , although the latter had also a tendency towards buffering  
262 (median CI  $-0.11$ ). Similarly characterised by low median CI, and thus with a buffering tendency,  
263 were the variables 'reproduction management' ( $-0.12$ ), 'dry cow management' ( $-0.11$ ), 'calf and  
264 heifer management' ( $-0.13$ ), 'hygiene' ( $-0.08$ ), and 'treatment' ( $-0.09$ ). 'Herd health monitoring'  
265 generally had an active tendency with a median AI of  $0.07$ . The variable 'knowledge and skills on the  
266 farm' was the most active of all variables with a median AI of  $0.11$  but at the same time was also quite  
267 critical with a median CI of  $0.08$ . All variables were characterised by a large spread of AI and CI  
268 values across farms (see the interquartile range in Table 3). Significant country effects were found for  
269 all variables. Figure 4 summarises the distribution of activity and criticality ranks of all variables. It is  
270 also shown, that each of the 13 variables, except 'milk performance', reached the top activity and  
271 critical ranks on at least one farm.



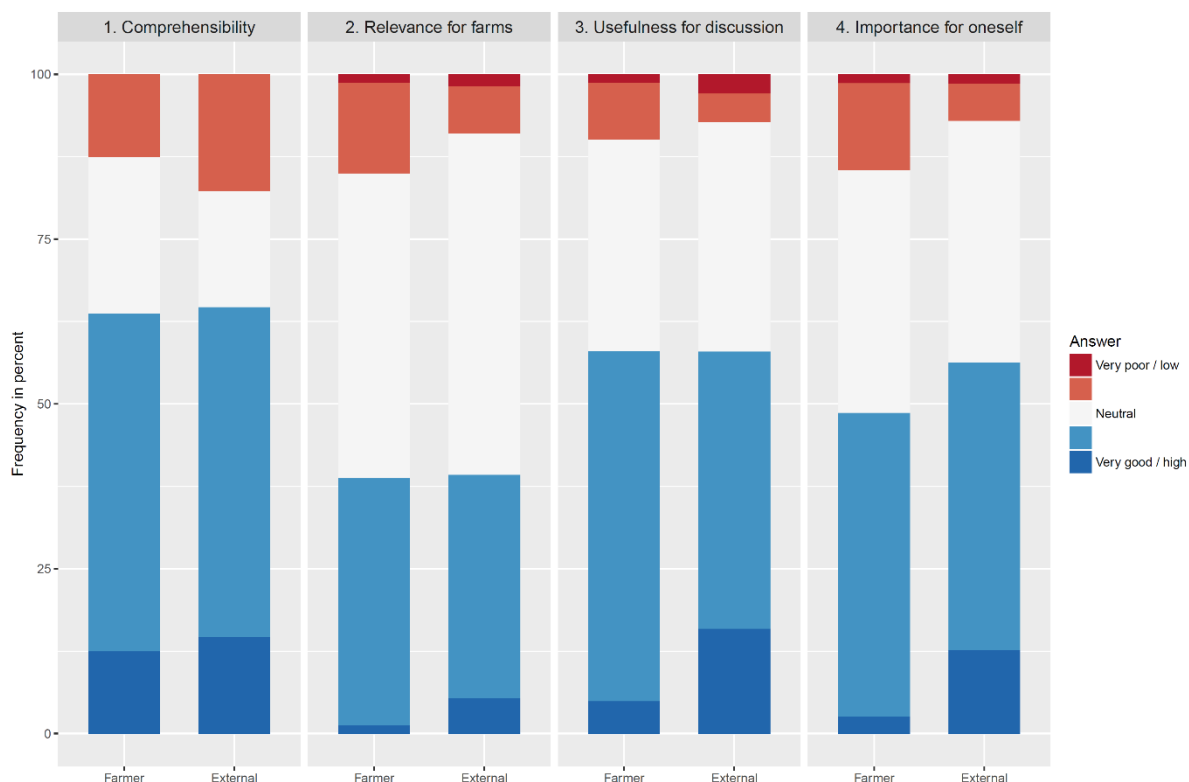
272

273 Figure 4. Distribution of activity ranks (1 = most active, 13 = most reactive) and criticality ranks (1 =  
 274 most critical, 13 = most buffering) for all system variables across all farms (n = 192); variables could  
 275 be assigned the same rank in one farm if activity and criticality indices were equal; median values are  
 276 represented as thick lines, the lower and upper quartile values as boxes, and the extreme values as  
 277 whiskers; outliers are data points outside 1.5 times the interquartile range above the upper quartile and  
 278 below the lower quartile; the dotted line divides top and bottom ranks.

279 *3.2 User assessments*

280 The survey results related to the impact assessments are shown in Figure 5. They indicate that the  
 281 method was understood by the majority of farmers and externals (advisors and veterinarians), with  
 282 over 60% of respondents having a positive view on its comprehensibility. Less than 20% of  
 283 respondents took a negative view of the matrix in terms of its relevance for their farms or clients. The  
 284 large degree of neutrality might be interpreted as uncertainty on the part of the respondents about the  
 285 value of the matrix. The impact assessments were mostly described as being useful for the round-table  
 286 discussion on animal health and were found to be of importance to the persons involved. In terms of

287 importance, externals were more positive than farmers, which may be due to the opportunity the  
 288 impact matrix provides for learning about the farm in question (which may be more relevant for  
 289 externals than for farmers who feel they are familiar with their own farm). Despite this difference,  
 290 there was great consistency between farmers and their advisors in terms of their evaluations.



291

292 Figure 5. User perceptions of the relevance and usefulness of the impact matrix. The four survey  
 293 questions (see chapter 2.6) were answered by a total of 73 externals (advisors and veterinarians) and  
 294 84 farmers.

## 295 4 Discussion

### 296 4.1 System variables

297 As far as we are aware, this was the first time an impact assessment, with a standard set of variables,  
 298 was applied to a large number of different systems (farms). Although the individual participants on a  
 299 given farm would probably have identified slightly different variable sets, e.g. less aggregated and  
 300 more specific, the common set proved to be usable on all farms. This broad applicability was achieved  
 301 by the participatory framework where all participants were involved as knowledge-bringing subjects,

302 participating in the knowledge-sharing, and knowledge-production process (Bergold and Thomas,  
303 2012). The impact assessment focused on the dairy farm, this being the main field of action for  
304 farmers and advisors in terms of dairy cattle health. Variables were identified based on their relevance  
305 to the goal of reducing the prevalence of production diseases and of characterising the system context.  
306 Production diseases themselves were represented by one variable in the final set of variables. This is  
307 not surprising, for the other 12 variables were chosen because of their perceived connection, in one  
308 way or the other, to disease prevalence. Unlike single-equation models, in which a dependent variable  
309 is a function of independent variables, and no autocorrelation is permitted, a system model consists of  
310 several equations. This allows one variable to be dependent in one equation and explanatory in another  
311 equation (Barreto and Howland, 2006). Production diseases turned out to be the most critical variable,  
312 a fact that might underscore the goodness of the variable set. Comparable models also included the  
313 main element, e.g. ‘climatic change’ in the climate network by Vester (2007), and ‘agricultural  
314 expansion’ in the deforestation model by Kok (2009). In both studies, as in our model, the central  
315 variable was characterised by strong interlinkages with other variables.

316 The total number of system variables used was smaller than the range, i.e. 20 – 40, recommended by  
317 some commentators (Vester, 2007). This was deliberately achieved through an intensive reduction  
318 process for practical reasons: Scoring all pairwise interrelationships between more than thirteen  
319 variables would have been too onerous for participants. The downside of this reduction process, of  
320 course, was that the variables became highly aggregated. The variable ‘housing conditions’, for  
321 example, could include anything from cubicle dimensions to air temperature and ‘hygiene’ could be  
322 related to different areas, such as bedding, milking, or feed. Only by accepting this ‘fuzziness’, did it  
323 become feasible to apply the method in a consistent manner on visits to a large number of farms within  
324 given time constraints.

#### 325 *4.2 Impacts*

326 Numbers of impacting variables and the strengths of these impacts varied between farms and  
327 countries. Farm effects and possibly also some of the differences between countries can be explained  
328 by the fact that dairy farms in general, and organic dairy farms in particular, can vary in many

329 respects, such as overall organisation and availability of resources (Häring, 2003; Sundrum et al.,  
330 2006). National climatic, market and policy conditions may have had additional effects. It cannot be  
331 ruled out that some of the between-country variation is also due to different researchers applying the  
332 method. The distinction between direct and indirect impacts, for example, can be quite difficult to  
333 explain and may have been handled differently in spite of standardised training. Those differences,  
334 however, do not diminish the insights gained by the impact assessment, because its aim was not to  
335 identify generalised relationships between variables that are applicable to all contexts, but to supply a  
336 first description of the variables at work within each farm. The matrix is an essential component of the  
337 assessment since it forces the scoring of the bilateral relationships of all system variables (i.e. all  
338 system factors). This procedure is time consuming for those doing the assessment, but at the same time  
339 it is crucial, since it sheds light not only on those relationships well known to the assessors, but on  
340 those that would otherwise remain hidden, either because they are not well covered by standard  
341 management assessments, or because of deficiencies in the knowledge of stakeholders, or because of  
342 the specificities of systems operating in individual farms. Completing the matrix generates a  
343 comprehensive picture of the most important system variables and their interrelationships. By  
344 identifying the most influential variables, the procedure clears the ground for further in-depth analysis,  
345 pointing to the most relevant areas for action to improve herd health in the farm specific situation.  
346 While the impact strengths were estimated by the participants themselves, and therefore might be seen  
347 as subjective, the validity of these perceptions can be confirmed by intersubjectivity (Velmans, 1999)  
348 based on the notion that if there is significant agreement between individuals within groups about a  
349 percept or concept, then this phenomenon may be considered 'real' by consensus (Heylighen and  
350 Joslyn, 2001). Intersubjectivity was indeed observed in this case. By involving the farm's own  
351 'steersman' (usually the farmer) in the assessment process the systems own steering potential, i.e. its  
352 latent risks and opportunities, could be acknowledged. The inclusion of external perspectives (of  
353 advisor and veterinarian) in the assessment process provided a frame of reference which served to  
354 complement and supplement existing knowledge and, where necessary, identify unhelpful established  
355 routines (Hall and Wapenaar, 2012).

#### 356 4.3 Output

357 The matrix outputs (graphically presented) made it possible to immediately identify the farm-specific  
358 position of each system variable with respect of the four key typologies. This position can be regarded  
359 as relational information (Maruyama, 1972), as it only occurs through the involvement of all other  
360 variables. In economic or statistical terminology, the ‘marginal’ effects are being identified. By means  
361 of these graphic outputs the farm can be characterised as a whole and its critical points can be readily  
362 identified, as well as its levers for change and its sensors (or reactive variables). The graphical outputs  
363 can thus be regarded as a revelation of a farm’s inherent potentials and constraints, where the  
364 distinctive features of the system variables become explicit (e.g. being more active or buffering). Such  
365 information must be particularly useful to those stakeholders in health management decision making,  
366 who are not working on the farm itself (e.g. veterinarian and advisor).

367 Despite the fact that the operation of system variables could be very different from farm to farm, some  
368 variables were found to have a general tendency of influencing the system in a particular manner, such  
369 as ‘feeding’, ‘herd health monitoring’ and ‘knowledge and skills on the farm’. These variables can  
370 easily be imagined as levers of change. To illustrate, metabolic health and feeding strategies were the  
371 most common topics selected by farmers during ‘stable school’ interventions on organic farms in  
372 Germany (March et al., 2014). Monitoring, in terms of regular planned observations and  
373 documentation, identifies health areas not under control and is likely to trigger changes in  
374 management (Brand et al., 1996). Farmers monitor health indicators to analyse whether their  
375 objectives are being reached and to support their decision-making (Duval et al., 2016). In a Dutch  
376 study 30% of randomly chosen farmers stated they lacked sufficient knowledge to prevent mastitis  
377 problems, which could mean that they saw potential in increasing their knowledge (Kuiper et al.,  
378 2005).

379 Variables that were generally sensitive to changes and thus reactive in nature were ‘milk performance’  
380 and ‘financial resources’. Milk yield has been shown to be affected by numerous farm factors such as  
381 feeding, housing, management, and prevalence of disease (Roesch et al., 2005) and is thus a typical  
382 performance indicator in dairy farms. Perhaps one reason for the small impact expected from a change  
383 in milk performance in our study farms, is that performance levels are generally lower in organic

384 compared to conventional farms (Fall and Emanuelson, 2009). Financial resources, in this study, were  
385 merely seen as a result, rather than a means for change. One reason for this may be that although  
386 farmers are aware about losses caused by diseases, they do not necessarily value economic information  
387 in the context of decision-making (van Asseldonk et al., 2010). Our results indicate that, despite  
388 decisions being made within financial constraints, non-financial factors may be more crucial in  
389 influencing decision-making on the farm (Edwards-Jones, 2006).

390 All three management variables as well as ‘hygiene’, ‘treatment’ and ‘housing conditions’ were found  
391 to have a buffering tendency on most farms. Their impact on the whole system may be low because  
392 they act upon specific areas and have little direct effects on variables outside these areas. Besides its  
393 buffering role, ‘housing conditions’ also had an active tendency. The most critical system variables  
394 were ‘production diseases’ and ‘labour capacity’. Production diseases are caused by an interplay of  
395 many factors (Nir, 2003). At the same time their prevalence affects production levels, financial  
396 resources, and forces management decisions. Labour capacity, also, determines what can be achieved  
397 on a farm and may act as a constraint or catalyst for change (Mugera and Bitsch, 2005). Conversely,  
398 labour may also be consumed or released by changes on the farm. Labour management, for instance,  
399 has been reported as a major challenge after modernisation and expansion (Bewley et al., 2001).

400 In this study, the impact assessment was used as a supportive tool for decision-making to improve  
401 animal health management on organic dairy farms. By applying impact matrices, models of these  
402 farms were created based on the perceptions of stakeholders. This implies, that possible  
403 misconceptions and biases of participants were all encoded in the models. However, we believe that  
404 this weakness is clearly outweighed by the advantages of the approach, e.g. the ability to model  
405 complex systems where scientific information is limited, to access expert/local knowledge, and to  
406 consider both social and technical aspects of farm systems (and decision-making) (cf. Özesmi and  
407 Özesmi, 2004). The primary reason for using the impact assessment was to identify the most active  
408 variables for each farm, since changes in these variables can be expected to have largest effects. The  
409 fact that no variable was identified as the most active or least active on all farms, emphasises the  
410 heterogeneity between the farms. However, the typology (or roles) of some variables were found to be

411 more generalised than others, this being in line with a priori expectations. The important capacity of  
412 this approach, however, is that it can identify, for individual farms, deviations from such expectations,  
413 thereby supporting a farm specific selection of strategies and measures. The impact analysis is a means  
414 of arriving at hypotheses about the most effective (and efficient) strategies in the farm specific context  
415 for the purpose intended. In this study, due to high variable aggregation, the hypotheses are rather non-  
416 specific, for example, the hypothesis that a change in feeding regime can yield benefits for health  
417 status is of little value in determining specific management actions when very different specific  
418 actions would be required across farms due to their heterogeneity. Despite this lack of specificity, the  
419 method has the capacity to achieve system-understanding and to draw the attention to crucial areas.  
420 Time demands are critically important when evaluating the applicability of impact analyses. Farmers  
421 and advisors may be reluctant to apply a tool that takes a lot of time to use, especially if the tool do not  
422 provide concrete answers to pressing problems but merely gives hints to where solutions may be  
423 found. Improving (time) efficiency and usability of the outputs are challenges that will have to be dealt  
424 with in future applications of this type of approach. To increase specificity, i.e. to identify concrete  
425 measures, it will be necessary, after application of the impact matrix, to undertake a more detailed  
426 study of areas identified as important, based on sound diagnosis and in-depth knowledge. There might  
427 be merit in an iterative and hierarchical impact assessment approach, e.g. if the variable 'housing' is  
428 identified as critical or active, a second impact analysis on more specific housing variables can provide  
429 a more in-depth analysis. Another option may be to apply the impact assessment to more tightly  
430 defined health goals, such as improving udder health, and the use of specific variable sets related to  
431 these goals. Another critical issue is the knowledge required to use the tool. In our project setting  
432 participants were guided through the application process by trained researchers. If the tool was to be  
433 applied by advisors themselves, they would need thorough training.

#### 434 *4.4 User assessments*

435 An ideal validation of the method presented here would have required independent, externally-  
436 sourced, validating data. In the absence of outcomes data, however, all that was available was data  
437 from the follow-up survey, i.e. user self-assessment of the usefulness of the impact matrix. There are  
438 limitations to this approach, e.g. users may think the impact matrix is useful but in reality it does not



439 improve their performance. We assumed that farmers and externals can know whether a new decision-  
440 making aid will lead to better outcomes since they were able to see the tool in action and arrived at  
441 understandings and decisions that they know they would not have obtained otherwise. The consistency  
442 between the two groups that were asked to validate the method in terms of their assessments lends  
443 support to the idea that the evaluations are robust and meaningful. The respondents were generally  
444 much more positive than negative about the method. There was also a large degree of neutrality which  
445 might be interpreted as uncertainty on the part of the respondents about the value of the matrix. This  
446 does not mean that the method is not relevant, only that they could not, at the point of survey, work  
447 out whether it was relevant or not. This may result from more cautious respondents needing to see the  
448 matrix operating over a longer period, or over a wider range of situations, before they can make a  
449 judgement. However, it should also be pointed out that the follow-up survey took place a year after the  
450 use of the impact matrix and so farmers and their advisors would have had some time to assess  
451 whether the management actions arising from the assessment which they had implemented were  
452 proving to be effectual.

## 453 **5 Conclusion**

454 The systemic roles of variables were perceived to be very different between farms. This emphasises  
455 that very different measures may be most effective in reducing the prevalence of production diseases  
456 in organic dairy farms and stresses the need to apply farm-centric approaches that evaluate the specific  
457 relationships at work in those systems. The impact analysis, by involving stakeholder perception and  
458 expertise, can help to identify potential levers for change within the farm by explaining the context.  
459 Thus, it supports the formulation of hypotheses informing possible strategies for improved health  
460 management. Whether these hypotheses turn out to be true and the results of the exercise prove  
461 effective in fostering improvement must be tested in future applications of the method.

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