Herd-level risk factors of bovine tuberculosis in England and Wales after the 2001 foot-and-mouth disease epidemic

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SUMMARY

Objectives: We present the results of a 2005 case–control study of bovine tuberculosis (bTB) breakdowns in English and Welsh herds. The herd management, farming practices, and environmental factors of 401 matched pairs of case and control herds were investigated to provide a picture of herd-level risk factors in areas of varying bTB incidence.

Methods: A global conditional logistic regression model, with region-specific variants, was used to compare case herds that had experienced a confirmed bTB breakdown to contemporaneous control herds matched on region, herd type, herd size, and parish testing interval.

Results: Contacts with cattle from contiguous herds and sourcing cattle from herds with a recent history of bTB were associated with an increased risk in both the global and regional analyses. Operating a farm over several premises, providing cattle feed inside the housing, and the presence of badgers were also identified as significantly associated with an increased bTB risk.

Conclusions: Steps taken to minimize cattle contacts with neighboring herds and altering trading practices could have the potential to reduce the size of the bTB epidemic. In principle, limiting the interactions between cattle and wildlife may also be useful; however this study did not highlight any specific measures to implement.

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1. Introduction

Bovine tuberculosis (bTB) is an infectious bacterial disease of cattle and other mammals (including humans) caused by Mycobacterium bovis, and is a significant burden to the cattle industry in Great Britain. Despite the nationwide implementation of a cattle testing and slaughter program in 1950 by the Ministry of Agriculture and Fisheries (now the Department for Environment, Food and Rural Affairs (Defra)), which initially dramatically reduced the incidence of bTB, incidence has increased over the last 25 years, particularly in the wake of the 2001 foot-and-mouth disease (FMD) epidemic. Within Great Britain, the number of infected cattle slaughtered and the financial burden of bTB have been greatest in England and Wales. In England, bTB cost the taxpayer £63m in 2009, excluding research and development, and over 25 000 cattle were slaughtered as a result of routine bTB controls;1 in Wales, over 11 500 cattle were slaughtered in 2009 and almost £120m has been spent on compensating farmers for bTB-related loss of cattle since 2000.2

The role of the Eurasian badger (Meles meles) population as a potential reservoir of infection has been established3,4 and the effectiveness of badger culling in bTB control has been assessed during the Randomised Badger Culling Trial (RBCT) in England5,6 and during the East Offaly Project7 and the Four Area Project8 in the Republic of Ireland. The TB99 case–control study associated with the RBCT9 and other independent studies in Great Britain,10–17 the Republic of Ireland,18–22 mainland Europe,23 the Americas,24–27 and Eastern Africa,28–30 have also highlighted the role of livestock husbandry and management practices in wildlife-to-cattle and cattle-to-cattle transmission of M. bovis.
Stocking regimes (set-stocking, rotational grazing, or strip grazing), stocking densities, habitat types on the farm, and the intensification of livestock production systems influence the potential of direct and indirect (through feces and urine) exposure of cattle to the wildlife reservoir on pastures.\textsuperscript{14,17,23,31–33} The sharing of feeds or water between cattle and wildlife inside cattle housing or on pastures,\textsuperscript{20,29} the storing of manure indoors,\textsuperscript{15} and the type of housing\textsuperscript{9} are also associated with the differential risk of bTB transmission between the reservoir and the cattle populations. The most frequently reported parameters affecting risk of herd-to-herd transmission of bTB relate to herd movements and trading. General trading of cattle,\textsuperscript{27,50} or purchase of cattle from markets,\textsuperscript{15,29} from herds inside high bTB risk areas\textsuperscript{10} or from infected herds,\textsuperscript{12,20,23,25} have all been linked to increased risk of bTB outbreaks for the recipient herd.

To identify the herd-level predictors of bTB breakdowns on cattle farms enrolled in the RBCT, a case–control study (known as the TB99 study) was initiated in 1999 in three RBCT regions (known as ‘triplets’), with the aim of identifying potential recommendations on farm management and husbandry practices expected to reduce bTB risk in southwest England.\textsuperscript{9} The 2001 FMD epidemic interrupted data collection and a second case–control study (known as the CCS2005) was initiated in 2005. In this paper, we report the results of the CCS2005 case–control study, comparing herds in two areas of England and one area in Wales that experienced a confirmed bTB breakdown in 2005/2006 to matched control herds that did not experience a breakdown during the same period. A range of herd management, health, and biosecurity measures were examined in an attempt to provide a post-FMD picture of the herd-level risk factors in areas of medium and high bTB incidence that might be integrated into a package of measures to tackle bTB, contributing to “a balanced programme” as recently announced by the UK Government in its latest public consultation on bTB.\textsuperscript{1}

2. Methods

2.1. Study sites and case and control herd selection

Data were collected from regions administered by four Animal Health Divisional Offices (AHDOS) in England and Wales that included areas with a range of bTB incidence: Stafford (including Staffordshire, Cheshire, and Derbyshire), Taunton (including Somerset and part of Dorset), Carmarthen (covering west Wales), and Carlisle (covering Cumbria). We targeted a total of 125 case herds randomly selected from all the bTB breakdowns occurring in each region in 2005/2006, except in Carlisle where all breakdowns were targeted. Monthly target numbers were then set to reflect the typical temporal distribution of breakdowns and to ensure collection of data throughout the year. On a weekly basis, staff from the AHDOS contacted managers of breakdown herds from a list sorted in a random order, proceeding down the list until the allocation for the week had been obtained. The target numbers of case herds included both confirmed breakdowns (i.e., had either a positive culture of \textit{M. bovis} or gross lesions consistent with bTB visible at necropsy in at least one test reactor, or lesions typical of bTB identified at the slaughterhouse and subsequently confirmed by bacteriological culture\textsuperscript{\textsuperscript{34}}) and unconfirmed breakdowns (i.e., no cattle reactor with bTB-like lesions or a positive \textit{M. bovis} culture).

Two controls were selected for each case from the same AHDO region and parish testing interval (defined as annual, two-, three- or four-yearly), which is set according to the parish bTB herd breakdown incidence (higher incidence translates to more frequent testing) – ‘partially matched controls’. One of the controls was also matched to the case on herd size class, defined as small (≤50 animals), medium (>50 to ≤100 animals), large (>100 to ≤150 animals), or very large (>150 animals) and herd type, defined as beef, dairy, or other (usually mixed herds) – ‘fully matched controls’. Both control herds must have had at least one clear herd bTB test in the 12 months prior to the date of the disclosing test of the case herd; have not been under any bTB-related restrictions over that period and not have been overdue a herd test. Using Defra’s Animal Health Information System (VetNet), two lists of potential controls (one for partially matched and one for fully matched) for each week’s cases were generated as random selections from all herds fitting the inclusion criteria. Staff from the AHDOSs recruited controls in the randomized sequence from these lists until all required controls for that week were obtained. More detailed information on the recruitment of herds is available in the Supplementary Information (Supplementary Information 1).

2.2. Data collection

Data collection was carried out during face-to-face interviews, conducted by staff from the AHDOSs between February 2005 and March 2006, with a mean time between herd breakdown and interview of 79 days (range 16–290 days). Data were collected using a questionnaire (see Supplementary Information 2) investigating herd management practices (including numbers of animals of various ages and types, housing, feeds and water sources for cattle), potential contacts with neighboring cattle herds, and observed wildlife activity on the farm.

A map of each farm was generated from Defra’s Integrated Administration and Control System (IACS) Rural Payments Agency database: the extent of the land depicted in the maps was verified with the participant during the interview and modified if required. Land cover and soil type data for each farm was determined by linking the maps to the CORINE land cover dataset (http://dataservice.eea.europa.eu/dataservice/metadataDetails.asp?id=1011). Information on the movement of cattle between farms was extracted from the Cattle Tracing System (CTS) database. The bTB-testing history of case herds, control herds, all the herds that cases and controls reported contacts with, and all of the herds that cases and controls sourced animals from, were determined using the VetNet system.

2.3. Data analysis

A conditional logistic regression analysis of cases and their fully-matched control (matched on AHDO, testing interval, herd type, and herd size), and an unconditional logistic regression analysis using the partially-matched controls (matched only on AHDO and testing interval) were performed. Two sets of analyses for each logistic regression were undertaken using (1) confirmed bTB breakdowns and (2) total breakdowns (both confirmed and unconfirmed) as cases. All analyses were performed using the data pooled across all AHDOs in the first instance, before building region-specific models. The results of the conditional regression analyses based on confirmed bTB outbreaks are presented in the main text. The results of all other analyses, which were broadly consistent with those presented below, are included in the Supplementary Information (Supplementary Information 1).

Construction of the conditional logistic regression models (Proc Logistic, The SAS System) was undertaken using a forward stepwise approach. All non-categorical variables were log-transformed before inclusion in these analyses. Initial screening of the variables was based on the ratio between the log odds ratio for each variable in a univariable model and its standard error. Variables with ratios greater than 1.28 (equivalent to a Z-test with \( p = 0.2 \)) were considered for the first round of model construction. Before model construction began, continuous variables were eliminated if more than 25% of the observations had missing data.
Categorical variables were eliminated if there were few (less than five) observations in one or more of the categories and meaningful aggregations of categories could not be created. Correlations between variables were identified and only those variables under consideration with the strongest effects (as estimated in the screening logistic regression models) were retained. For construction of the regression model, the variable with a significant parameter estimate ($p < 0.05$) that minimized the ratio of the model deviance to the number of observations was added to the model, the remaining candidate variables were screened against this new model and another variable added. Variables were added until no further variables were significant in the constructed model. Using this preliminary model, all of the variables in the dataset were re-screened and a second round of model construction undertaken using any identified variables. When this second round was complete, all two-way interactions between the variables included in the final model were tested for significance, one at a time.

3. Results

3.1. Cases and controls

The target numbers of 125 cases and two controls per case were attained in the Carmarthen, Stafford, and Taunton offices, and 27 cases with matched controls were obtained from the Carlisle office (Supplementary Information 1, Table S2). Overall, 56% of the cases were confirmed breakdowns and data collected from the questionnaire broadly agreed with the herd size and herd type matching based on VetNet data (Table 1).

3.2. Conditional logistic regression – pooled analysis of confirmed bTB breakdowns across the four AHDOs

A total of 218 confirmed case–control pairs were available for analysis (Table 1). The final conditional logistic regression model retained 13 variables (Table 2).

3.2.1. Environmental factors

Case herds were less likely than control herds to have deep clay soil (odds ratio (OR) 0.21, 95% confidence interval (CI) 0.07–0.62) or seasonally wet soil on the farm (OR 0.49, 95% CI 0.26–0.91), but were more likely to report the finding of dead badgers on the farm (OR 3.10, 95% CI 1.40–6.84).

3.2.2. Farming practices

Case herds were less likely than control herds to keep different types of cattle (i.e., replacement heifers, cows) together in groups (OR 0.32, 95% CI 0.16–0.62) and not provide housing for cattle at grazing (OR 0.36, 95% CI 0.14–0.95). Case herds were operated over more premises (ORS doubling No. premises 2.41, 95% CI 1.46–4.01) and added fewer calves to the herd in a typical year (ORS doubling No. calves 0.85, 95% CI 0.76–0.96) than control herds. Providing feed outside of the housing had a protective effect (OR 0.41, 95% CI 0.22–0.76), while providing feed inside the housing (OR 4.89, 95% CI 1.19–20.12) increased the risk of a confirmed bTB breakdown.

Table 1
Attributes of cases and their fully-matched controls as identified from the questionnaire. Data from confirmed bTB breakdowns for 2005/2006 are presented for all four AHDOs

<table>
<thead>
<tr>
<th>Herd type: number of herds in each category (% of total number of herds)</th>
<th>Carlisle</th>
<th>Carmarthen</th>
<th>Stafford</th>
<th>Taunton</th>
</tr>
</thead>
<tbody>
<tr>
<td>Beef</td>
<td>5 (71%)</td>
<td>3 (43%)</td>
<td>19 (31%)</td>
<td>15 (25%)</td>
</tr>
<tr>
<td>Dairy</td>
<td>1 (14%)</td>
<td>1 (14%)</td>
<td>40 (66%)</td>
<td>38 (62%)</td>
</tr>
<tr>
<td>Other</td>
<td>1 (14%)</td>
<td>3 (43%)</td>
<td>2 (3%)</td>
<td>8 (13%)</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Herd size:</th>
<th>Mean</th>
<th>SE</th>
<th>Parish testing interval: number of herds in each category (% of total number of herds)</th>
</tr>
</thead>
<tbody>
<tr>
<td>Number</td>
<td>298.00</td>
<td>194.14</td>
<td>196.90</td>
</tr>
<tr>
<td>Proportion</td>
<td>182.61</td>
<td>214.56</td>
<td>197.43</td>
</tr>
</tbody>
</table>

| Number | 2 (29%) | 2 (29%) | 3 (5%) | 3 (5%) |
| Proportion | 22 (24%) | 22 (24%) | 21 (35%) |
| Proportion | 21 (35%) |

bTB, bovine tuberculosis; AHDO, Animal Health Divisional Office; SE, standard error of the mean.

Table 2
Factors identified in the conditional logistic regression of the probability of a herd experiencing a confirmed bTB breakdown in 2005/2006 using the data pooled from all four AHDOs. Odds ratios for covariates correspond to a doubling in the value of the variable, and for proportions to an additional 10% of the variable

<table>
<thead>
<tr>
<th>Factor</th>
<th>OR</th>
<th>95% CI</th>
</tr>
</thead>
<tbody>
<tr>
<td>Any deep clay soil on the farm</td>
<td>0.21</td>
<td>0.07–0.62</td>
</tr>
<tr>
<td>Keeping different types of cattle together in groups</td>
<td>0.32</td>
<td>0.16–0.62</td>
</tr>
<tr>
<td>Providing no housing at grazing (type 4)</td>
<td>0.36</td>
<td>0.14–0.95</td>
</tr>
<tr>
<td>Providing feed outside of the housing</td>
<td>0.41</td>
<td>0.22–0.76</td>
</tr>
<tr>
<td>Having seasonally wet soils on the farm</td>
<td>0.49</td>
<td>0.26–0.91</td>
</tr>
<tr>
<td>Number of calves added to the herd in a typical year</td>
<td>0.85</td>
<td>0.76–0.96</td>
</tr>
<tr>
<td>Proportion of cattle sourced from herds in four-yearly testing parishes</td>
<td>0.93</td>
<td>0.86–0.99</td>
</tr>
<tr>
<td>Number of confirmed breakdowns experienced by contacted herds in previous 24 months</td>
<td>2.00</td>
<td>1.54–2.62</td>
</tr>
<tr>
<td>Number of premises over which the farm is operated</td>
<td>2.41</td>
<td>1.46–4.01</td>
</tr>
<tr>
<td>Sourcing any cattle from a herd that had a breakdown in the previous 2 years</td>
<td>1.99</td>
<td>1.00–3.82</td>
</tr>
<tr>
<td>Any direct contacts with cattle from contiguous farms</td>
<td>2.24</td>
<td>1.20–4.06</td>
</tr>
<tr>
<td>Finding dead badgers on farm</td>
<td>3.10</td>
<td>1.40–6.84</td>
</tr>
<tr>
<td>Providing feed inside the housing</td>
<td>4.89</td>
<td>1.19–20.12</td>
</tr>
</tbody>
</table>

bTB, bovine tuberculosis; AHDO, Animal Health Divisional Office; OR, odds ratio; CI, confidence interval.
3.2.3. Contact and trading

Case herds were less likely to source cattle from herds in four-yearly tested parishes (OR per additional 10% of sourced cattle 0.93, 95% CI 0.86–0.99), but more likely to source cattle from a herd that had experienced a breakdown in the previous 2 years (OR 1.90, 95% CI 1.00–3.62) than control herds. Conversely, case herds had more direct contacts with cattle from contiguous herds (OR 2.24, 95% CI 1.24–4.05) and had more confirmed breakdowns in the previous 2 years among the herds they reported having had contact with (OR doubling No. breakdowns 2.00, 95% CI 1.54–2.62).

3.3. Conditional logistic regression – region-specific analyses of confirmed bTB breakdowns for the three main AHDOs

Too few breakdowns were recorded inside the Carlisle AHDO (Table 1) to support meaningful region-based analysis and those

![Figure 1](image-url)
Table 3
Factors identified in the conditional logistic regression of the probability of a herd experiencing a confirmed bTB breakdown in 2005/2006 analyzing the data for the three main AHDOs separately. Odds ratios for covariates correspond to a doubling in the value of the variable, and for proportions to an additional 10% of the value of the variable.

<table>
<thead>
<tr>
<th>Factor</th>
<th>OR</th>
<th>95% CI</th>
</tr>
</thead>
<tbody>
<tr>
<td>Carmarthen</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Number of hectares of farmland on all premises</td>
<td>0.24</td>
<td>0.07–0.84</td>
</tr>
<tr>
<td>Number of calves added to the herd in a typical year</td>
<td>0.46</td>
<td>0.28–0.78</td>
</tr>
<tr>
<td>Number of calves typically taken from the herd in a year</td>
<td>1.78</td>
<td>1.18–2.68</td>
</tr>
<tr>
<td>Number of confirmed breakdowns by contacted herds in the previous 24 months</td>
<td>2.76</td>
<td>1.48–5.16</td>
</tr>
<tr>
<td>Stafford</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Providing salt outside the housing</td>
<td>0.08</td>
<td>0.02–0.30</td>
</tr>
<tr>
<td>Providing feed outside the housing</td>
<td>0.24</td>
<td>0.08–0.72</td>
</tr>
<tr>
<td>Number of animals moved out of the herd per year</td>
<td>1.80</td>
<td>1.10–2.94</td>
</tr>
<tr>
<td>Number of contiguous farms with domestic stock other than cattle</td>
<td>1.88</td>
<td>1.10–1.20</td>
</tr>
<tr>
<td>Number of breakdowns experienced by contacted herds in the previous 24 months</td>
<td>2.13</td>
<td>1.20–3.78</td>
</tr>
<tr>
<td>Operating the farm over more than one premises</td>
<td>7.53</td>
<td>1.87–30.25</td>
</tr>
<tr>
<td>Sourcing any cattle from a herd that had a breakdown in the previous 2 years</td>
<td>8.48</td>
<td>2.23–32.20</td>
</tr>
<tr>
<td>Taunton</td>
<td></td>
<td></td>
</tr>
<tr>
<td>Dead ‘other’ wildlife found on the farm</td>
<td>0.09</td>
<td>0.02–0.51</td>
</tr>
<tr>
<td>Moving any animals into the herd from a market</td>
<td>0.18</td>
<td>0.03–0.91</td>
</tr>
<tr>
<td>Maintaining a completely closed herd</td>
<td>0.18</td>
<td>0.04–0.77</td>
</tr>
<tr>
<td>Number of calves added to the herd in a typical year</td>
<td>0.64</td>
<td>0.48–0.87</td>
</tr>
<tr>
<td>Proportion of source herds in an annually tested parish</td>
<td>1.41</td>
<td>1.11–1.81</td>
</tr>
<tr>
<td>Using set-stocking grazing management</td>
<td>4.78</td>
<td>1.32–17.32</td>
</tr>
</tbody>
</table>

bTB, bovine tuberculosis; AHDO, Animal Health Divisional Office; OR, odds ratio; CI, confidence interval.

3.3.1. Environmental factors
The environmental factors explored by the questionnaire seemed to be poor indicators of the risk of a confirmed bTB breakdown at the region-level, with the exception of the Taunton AHDO where dead ‘other’ wildlife on farms had a reduced risk of a confirmed bTB breakdown (OR 0.09, 95% CI 0.02–0.51).

3.3.2. Farming practices
Most of the farming practices identified as having an impact on a herd’s risk of a confirmed bTB breakdown in the regional analyses are in accordance with the results from the pooled conditional logistic regression. For example, operating a farm over several premises resulted in an increased risk of a bTB breakdown in the Stafford AHDO (OR 7.53, 95% CI 1.87–30.25), while case herds added fewer calves to the herd in a typical year than control herds in both the Carmarthen (OR, doubling No. calves 0.46, 95% CI 0.28–0.78) and Taunton (OR, doubling No. calves 0.64, 95% CI 0.48–0.87) AHDOs. Similarly, providing feed outside of the housing was associated with a decreased risk (OR 0.24, 95% CI 0.08–0.72). The region-based analyses also highlight the localized impact of other farming practices. Case herds tended to be associated with smaller land areas in the Carmarthen AHDO (OR, doubling No. hectares 0.24, 95% CI 0.07–0.84) and with a set-stocking grazing regime in the Taunton AHDO (OR 4.78, 95% CI 1.32–17.32), while providing salt outside the housing offered some protection against bTB in the Stafford AHDO (OR 0.08, 95% CI 0.02–0.30). Case herds tended to have more calves taken from the herd in a typical year (OR, doubling No. calves 1.78, 95% CI 1.18–2.68) than control herds in the Carmarthen AHDO.

3.3.3. Contact and trading
In accordance with the results from the pooled conditional logistic regression, there were more breakdowns in the previous 2 years among herds reported as contacts of case herds in both the Carmarthen (OR, doubling No. confirmed breakdowns 2.76, 95% CI 1.48–5.16) and Stafford AHDOs (OR, doubling No. total breakdowns 2.13, 95% CI 1.20–3.78). Similarly, case herds in the Stafford AHDO were more likely to source cattle from a herd that had experienced a breakdown in the previous 2 years (OR 8.48, 95% CI 2.23–32.20) than control herds. Common to all three region-specific models (Table 3) was an increased risk of a confirmed bTB breakdown associated with either contacting (i.e., over shared boundaries or mixing of cattle) or trading with a herd with a recent history of bTB or at higher risk (annually tested herds). More specific to the Taunton AHDO, maintaining a completely closed herd (OR 0.01, 95% CI 0.04–0.77) and moving animals into the herd from a market (OR 0.18, 95% CI 0.03–0.91) were both associated with a decreased risk of a confirmed bTB breakdown, whereas sourcing cattle from herds in annual-tested parishes increased the risk of a breakdown (ORper additional 10% of source herds 1.41, 95% CI 1.11–1.81).

4. Discussion
The net reproduction number (Rc) for bTB among cattle herds in Great Britain under the current test and remove control scheme has been estimated to be 1.1.15 suggesting that relatively modest improvements either in diagnostic testing (test performance or frequency) or in reducing the transmission to cattle could be sufficient to bring the bTB epidemic under control. While other studies have investigated risk factors of bTB herd breakdowns post-FMD,10,11 they have mainly focused on the bTB risk associated with UK herds that had been restocked after the FMD epidemic10 or compared the bTB risk of herds that had been restocked with herds that remained continuously stocked throughout the 2001 FMD epidemic.15 Our study is the first case–control study post-FMD to explicitly investigate the contribution of farming practices, herd management and husbandry, trading, and wildlife activity to the herd-level bTB risk in the wider population of cattle herds across a range of bTB risk areas.

The principal finding of this study indicates that there is an increased localized risk of a breakdown related to the occurrence of breakdowns among neighboring and/or contacted herds and possibly a shared external exposure (i.e., wildlife). This study also provides some evidence that the provision of close-quarters opportunities and further evidence that the sourcing of animals from high-risk herds and/or areas, increases the risk of experiencing a breakdown. Many risk factors tended to vary between regions, a pattern probably indicative of the complexity of the bTB problem and the possible need for disease control recommendations to reflect localized risk. These findings are discussed more extensively below.
It should be noted at this point that causal interpretations of the factors identified in this type of analysis must be treated with caution as a result of potential biases, unobserved confounders, and correlations between the large numbers of explanatory variables investigated in this study. In addition, spurious associations cannot be ruled out due to the large number of factors assessed. There was a lack of independence between some factors that we have attempted to address by identifying correlations and retaining only those factors with the strongest associations with the risk of being a case herd. This, alongside our approach to model construction that assessed the impact on the parameter estimates and standard errors of factors already in the model as further factors were added, might be expected to yield regression models with mostly independent effects. General conclusions may be drawn, as those factors ultimately included in the regression models will be representative of a group of related factors.

Evidence of a localized risk of bTB was found in the pooled model where new confirmed bTB breakdowns were associated with breakdowns among contiguous herds and/or contacts with cattle from contiguous herds. This risk associated with contacted herds may be a reflection of a common local exposure to infected cattle or an external source of infection such as a wildlife reservoir. Environmental factors may also play a role here. Increasing the number of farm premises, a risk factor identified in a case–control study of English herds before FMD, and the resulting fragmentation of the herd across many land parcels, increases the number of contiguous herds. Wildlife may be involved as the source of the infection for the group of contiguous herds, since the number of dead badgers on a farm was associated with a higher risk of a confirmed bTB breakdown. Soil types, identified as significant environmental variables, may influence the behavior or abundance of wildlife: seasonally wet or deep clay soils may be less favorable to badgers. Likewise, the presence of other wildlife on the farm (as identified in the Taunton model) may deter badgers from entering the premises. To counter these effects, a large farm area was found to be protective in the Carmarthen AHDO, possibly indicating a greater ability for isolating the cattle herd from contacts with neighboring herds by concentrating grazing areas in the centre of the farm. However, no data on this type of land use were available to test this hypothesis.

A number of factors were identified that may be indicative of opportunities for close-quarters contacts either between cattle or between cattle and badgers; these factors appear to be correlated with the risk of a bTB breakdown. For example, providing feeding inside the housing may promote closer associations by bringing cattle and/or badgers together, whereas not providing housing for cattle at grazing, possibly encouraging fewer close contacts, was associated with a lower risk. Cattle in housing tend to be in closer proximity than when at pasture, potentially providing a greater opportunity for cattle-to-cattle bTB transmission and for interactions with wildlife visiting the buildings. A counter point to this, and a demonstration of the potential regional variation, is that set-stocking grazing, where grazing herds have constant access to all the pasture, was found to increase the risk of a confirmed bTB breakdown in the Taunton AHDO. Such practice may promote dispersal among cattle and interactions between badgers and cattle at pastures.

Sourcing of cattle from herds with a recent history of bTB was associated with an increased risk of a confirmed bTB breakdown, whereas sourcing more cattle from herds in four-yearly tested parishes (low bTB risk areas) was associated with a lower risk of a breakdown in the pooled conditional logistic regression. Similarly, contacts with or sourcing cattle from herds that may be infected with M. bovis was recognized as the only consistent risk factor across the three AHDOs modeled individually. Concurring with these results, Gilbert and colleagues found that the most important predictor of future bTB occurrence was the proportion of animals moved into the area from infected areas; whereas Carrique-Mas et al. found that trading with ‘highly tested’ herds (equivalent to annually-tested herds or herds undergoing repeated contiguous herds tests) or herds with a history of bTB, increased the risk of a breakdown for UK herds restocked after the 2001 FMD epidemic. Trading is clearly identified as a risk-prone activity in terms of bTB. As a result of the limitations of the current bTB testing regime, undiscovered infection may remain in a source herd with a recent history of bTB even after the lifting of trading restrictions. It is therefore not surprising to find that completely closed herds, as observed in the Taunton AHDO, are at significantly lower risk of a confirmed bTB breakdown.

The simple beef/dairy/other herd type classification used in the study may not have fully accounted for variation between herd types. For example, keeping different types of cattle together and retaining calves inside the herd were both found to reduce the risk of a confirmed bTB breakdown in both the pooled and region-specific models. Both of these practices are most commonly associated with beef herds (calves are more likely to be removed from dairy herds) and possibly reflect differences in bTB risk between dairy and non-dairy herds rather than differences in bTB risk linked to farming practices. In future, closer matching of herd types may be advisable.

As one of the consequences of a bTB breakdown is the imposition of movement restrictions, this can make interpretation of effects of the movement of animals on the risk of a bTB breakdown difficult when case herds have a recent history of a breakdown. For example, the number of movements out of the herd was generally correlated with the number of movements into the herd, a recognized risk factor, but the number of outward movements was more strongly associated with bTB confirmed breakdowns. This association may be a consequence of the bTB history of the case herds: while control herds were required to have been free of bTB-related movement restrictions in the previous year, case herds could have been subjected to such restrictions and may have had excess stock on the farm that were subsequently moved out in the period between breakdowns. When the case–control pairs where the case had been under bTB-related movement restrictions for at least part of the 12 months before the breakdown considered in this study were excluded (19% of all pairs), the movement of animals out of the herd failed to enter the regression models. Likewise, movement of any animals to or from a market, which were all associated with a lower risk of bTB in the Taunton models, were not included in models excluding case–control pairs where the case had been under restriction in the previous 12 months. Thus care should be taken when setting inclusion criteria and developing measures of the numbers of cattle movements.

In conclusion, it was evident from the case–control data that coming into contact with herds with a history of bTB (either through local contacts or as sources of bought-in cattle) increased the risk of a bTB breakdown. Steps taken to limit these contacts by minimizing opportunities for contacts with neighboring herds and by altering trading patterns would have the potential to reduce the size of the bTB epidemic. Based on our findings, we would recommend that information such as bTB history of the individual source herd, as well as the area in which the source herd is located, should be considered as part of standard trading practice. In principle, limiting the interactions between cattle and wildlife may be useful given the observed increased localized risk; however this study did not highlight any specific measures to implement. The ideal means to assess the effectiveness of control measures would be some sort of prospective trial of specific measures or a package of measures. However, the required scale of this type of trial (numbers of farms and time of observation), coupled with the wide
range of potential measures, makes meaningful experimental studies difficult and expensive to implement. This leaves observational studies as the more practical alternative.\textsuperscript{38} The current study utilized a broad-brush approach; a wide ranging questionnaire with relatively simple questions designed to identify trends in the data, but which has already proved useful in predicting the occurrence of ‘prolonged’ (\textasciitilde 240 days)\textsuperscript{39} and recurrent\textsuperscript{40} bTB breakouts. Building on the results reported here, a better targeted approach, i.e., more detailed questioning on a smaller range of potentially region-specific topics, may provide more specific guidance for farmers.

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\textit{Conflict of interest:} FJB, DRC, CAD, CG, JPM, WIM and RW were formerly members of the Independent Scientific Group on Cattle TB (ISG) for which they received fees for time spent on ISG work and reimbursement of expenses from Defra. WTJ was formerly employed as a research assistant working with the ISG at Imperial College London. FV was employed as a research assistant working with CAD at Imperial College London. RSC–H, PC and APM are employed by the Animal Health Veterinary Laboratories Agency, an executive agency of the UK Government. Ethical approval was not required.

Appendix A. Supplementary data

Supplementary data associated with this article can be found, in the online version, at doi:10.1016/j.ijid.2011.08.004.

References