

# Bayesian analysis of culture and PCR methods for detection of *Campylobacter* spp. in broiler caecal samples

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# SUMMARY

The objective of this study was to estimate the sensitivity and specificity of a culture method and a polymerase chain reaction (PCR) method for detection of two *Campylobacter* species: *C. jejuni* and *C. coli*. Data were collected during a 3-year survey of UK broiler flocks, and consisted of parallel sampling of caeca from 436 batches of birds by both PCR and culture. Batches were stratified by season (summer/non-summer) and whether they were the first depopulation of the flock, resulting in four sub-populations. A Bayesian approach in the absence of a gold standard was adopted, and the sensitivity and specificity of the PCR and culture for each *Campylobacter* subtype was estimated, along with the true *C. jejuni* and *C. coli* prevalence in each sub-population. Results indicated that the sensitivity of the culture method was higher than that of PCR in detecting both species when the samples were derived from populations infected with at most one species of *Campylobacter*. However, from a mixed population, the sensitivity of culture for detecting both *C. jejuni* or *C. coli* is reduced while PCR is potentially able to detect both species, although the total probability of correctly identifying at least one species by PCR is similar to that of the culture method.

Key words: Campylobacter, Bayesian method, diagnostic test evaluation, foodborne zoonoses.

# INTRODUCTION

*Campylobacter* spp. is the most common bacterial cause of human gastrointestinal disease in most developed countries [1]. *C. jejuni* is the most common species in human campylobacteriosis followed by *C. coli* [2, 3]. Both species are frequently found in the alimentary tracts of a wide range of animals [4] with *C. jejuni* 

being most associated with the contamination of poultry flocks and poultry products, while *C. coli* is found predominantly in pigs [5, 6].

Poultry and poultry products remain one of the most important sources of human campylobacteriosis. A baseline survey carried out at European Union (EU) level, found the prevalence of *Campylobacter*-colonized broiler batches was 71.2% overall but this varied greatly between Member States (MS) from 2% to 100% [7]. *C. jejuni* and *C. coli* were found in 60.8% and 41.5%, respectively, of positive batches but the species distribution was highly variable across the EU. *C. jejuni* was the most common in 19 MS

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while in seven MS the frequency of *C. coli* ranged from  $76 \cdot 1\%$  and  $97 \cdot 7\%$  of the species identified. The reason for these large differences in the species prevalence in broiler flocks is unknown. However, microbiological methods based on culture and biochemical identification do not provide a true measure of the prevalence of the different species present in a sample as both the selective media used and the incubation atmosphere may have an impact on the species recovered [8–11], and at best provide an approximation of the prevalence of these species in broiler flocks.

Polymerase chain reaction (PCR)-based methods have been applied for the detection of *Campylobacter* spp. directly from caecal contents, and some methods are able to identify both *C. jejuni* and *C. coli* in samples with greater sensitivity than conventional culture methods [12]. The accurate estimation of the true prevalence of these two species in broiler flocks may allow a better understanding of their epidemiology in such populations and assessment of their relative importance for human infection.

During 2007–2009 a UK-wide, 3-year survey of broiler flocks was conducted to estimate the prevalence of Campylobacter-infected batches of birds at slaughter [13] by direct culture of caecal samples. A prerequisite for the determination of the actual prevalence of each Campylobacter species and hence their epidemiology is knowledge of the sensitivity and specificity of the culture test for these organisms. These performance criteria should be evaluated by comparison to a perfect (gold standard) reference test; however, for Campylobacter such a gold standard is not available to accurately determine infection status. As the true status of each batch was unknown, this created difficulties in assessing the true sensitivity and specificity of the caecal culture test. In recent years, the use of Bayesian modelling to estimate the sensitivity and specificity of a diagnostic test has been applied for this purpose [14–16]. For a Bayesian model to infer the sensitivity and specificity of a culture method a second conditionally independent test needs to be applied in parallel to ensure there are, at least, as many degrees of freedom in the data as there are parameters requiring estimation [14]. To this end, a PCR test was applied to the caecal samples in parallel with culture. The objective of this study was to apply a Bayesian framework to evaluate standard direct culture and PCR for the detection of C. jejuni and C. coli in broiler caecal samples, and use this framework to estimate the true prevalence of these species in broiler flocks in the UK.

#### MATERIALS AND METHODS

The *Campylobacter* status of a sample was considered 'mixed' when both *C. jejuni* and *C. coli* were detected in a sample. Samples, where *C. jejuni* alone was present, were denoted as '*C. jejuni*' (i.e. a non-mixed sample), and similarly for '*C. coli*'.

#### Sample and data collection

Caecal samples were collected from broiler slaughter batches as part of a 3-year randomized national prevalence survey [13]. Briefly, per slaughter batch, a single caecum was collected for sampling from 10 different broilers at the time of evisceration. Samples were selected according to the month of sampling and flock depopulation status (i.e. whether birds had previously been taken from the flock, sometimes known as 'thinning'). Caecal content was obtained from the caecum, stored at 4 °C and tested within 1 week after collection by bacteriological culture and PCR.

# Culture of pooled caecal sample

The method used for the detection and speciation of *Campylobacter* spp. in caeca was in accordance with the technical specifications set out in Annex I of Commission Decision 2007/516/EC and as reported previously [13]. For each slaughter batch, caecal contents were pooled from each of the ten caeca individually by homogenizing 0.02 g from each caecum in 2 ml phosphate buffered saline (PBS) (0.1 m, pH 7.2). A  $10\,\mu$ l volume of this was plated on mCCDA agar (CM739 base with SR155 supplement; Oxoid, UK) and incubated at  $41.5 \pm 1$  °C microaerobically (84%)  $N_2$ , 10% CO<sub>2</sub>, 6% O<sub>2</sub>). Plates were examined at 24 h and 48 h for grey flat, irregular and spreading colonies typical of *Campylobacter* spp. [17]. Up to five suspect colonies were subcultured micro-aerobically as described onto 7% sheep blood agar with 0.1% cyclohexamide (CM0055, Oxoid) before confirmation and species identification based on phenotypic methods described in ISO 10272–1:2006(E) [18]. The detection limit for the culture method for caecal samples using mCCDA has been estimated as  $10^2$  c.f.u./g [19] and for the PCR as  $10^5$  c.f.u./g [12].

Each sample, was considered culture positive if at least one colony recovered was confirmed as thermophilic *Campylobacter* spp. Speciation tests were performed on one single colony per positive batch as described previously [13].

### **DNA extraction and PCR test**

Extractions were performed within 7 days of caecal collection using an ExtractMaster<sup>™</sup> Fecal DNA Extraction kit (Epicentre Biotechnologies, USA). A  $250\,\mu$ l sample of caecal suspension in  $750\,\mu$ l PBS was centrifuged for  $5 \min$  at 13000 g and the pellet was re-suspended in  $5\,\mu$ l Tris buffer (1 m, pH 8) and extraction continued following the manufacturer's protocol. DNA preparations were stored at -20 °C until PCR testing for C. jejuni and C. coli as described previously [12]. A cycle threshold ( $C_t$ ) of between 10 and 32 was viewed as a positive result for either the mapA probe (C. jejuni) or ceuE probe (C. coli). A negative result was recorded for mapA and ceuE probes if the  $C_t$  value was >32 and the  $C_t$  value of the internal amplification control (IAC) probe was <40; however, when there was no  $C_t$  value for the IAC probe the result was invalid.

# Statistical methods

All statistical analysis was conducted in WinBUGS 1.4, using a modified version of the approach used in [14], in which a Bayesian method is proposed for estimating the sensitivity and specificity of two tests applied to two populations in the absence of a gold standard. In this study, there were four populations:

- (1) First batch removed from flock, non-summer (October–March).
- (2) First batch removed from flock, summer (June–September).
- (3) Previously partly depopulated, non-summer (October–March).
- (4) Previously partly depopulated, summer (June-September).

Each pooled caecal sample was tested by PCR and culture. As the culture result was based on a single colony, it was only possible to detect one species of *Campylobacter*, although both *C. jejuni* and *C. coli* may have been present in the sample. In light of this, there were 12 possible outcomes for each sample tested.

For each population k=1,..., 4, the observations were condensed into a descriptive 12-dimensional vector  $\mathbf{y}_{\mathbf{k}}$ . These vectors, for each of the four populations, were assumed to have independent multinomial sampling distributions,

 $\mathbf{y}_{\mathbf{k}} \sim \text{multinomial}(n_k, \mathbf{p}_{\mathbf{k}}),$ 

where  $n_k$  represents the number of observations in population k, and  $\mathbf{p}_k$  denotes the vector of probabilities associated with each of the 12 possible outcomes.

Elements of the vector  $\mathbf{p}_{\mathbf{k}}$  are defined by weighting the sensitivity and specificity with the proportion of samples deriving from each of the four possible population statuses: *C. jejuni* only ( $\pi_j$ ), *C. coli* only ( $\pi_c$ ), both species ( $\pi_m$ ), or *Campylobacter*-free, with the sum of the prevalence estimates for each species constrained to be no more than 1. A detailed description of the elements of the vector  $\mathbf{p}_{\mathbf{k}}$  is given in the Supplementary material (Table S1).

It was assumed that the sensitivity of PCR to detect *C. jejuni* and *C. coli* would be unaffected by whether the sample contained both species. Similarly, the sensitivity of culture was estimated for both *C. jejuni* and *C. coli* for samples with separate estimates when only one species of *Campylobacter* was present and for mixed samples. Furthermore, for culture the sensitivity of *Campylobacter* spp. is likely to be affected by the relative proportions of mixed species samples in the population, therefore account was taken of the relative proportions of mixed/*C. jejuni/C. coli* samples in each population.

### Priors

The model was initially run with non-informative priors throughout, except for specificity of culture. The sensitivity of the model results to the choice of priors was examined by (i) running the model with informative priors for the sensitivity of culture (as given in Table 1) and (ii) with non-informative priors for all parameters. Where informative priors were used, beta-distributed priors were based on previous studies [9, 12, 20] (Table 1). BetaBuster software (University of California, Davis, USA) was used to determine the parameters for each variable.

Data for the prior elicitation for the sensitivity of culture to detect *C. jejuni* and *C. coli* were derived from a previous study, where caeca, boot swabs and faecal samples were collected in parallel from 36 flocks [9]. In this study, Bayesian methods were used to estimate the sensitivity of each of the sampling methods to detect *C. jejuni* and *C. coli*, where the samples were from a mixture of flocks with both species or *C. jejuni* alone (no flocks had *C. coli* only). The required prior for the sensitivity of culture to detect *C. coli* in a mixed sample,  $\lambda_{cm}$ , was available from [9]. The priors for the sensitivity of culture to detect *C. jejuni* in a non-mixed sample ( $\lambda_{ij}$ ), and a mixed

Parameter	Description	Prior	Source
$\theta_{ii}$	Sensitivity of PCR to detect C. jejuni	Beta(1,1)	Non-informative
$\tilde{\theta_{cc}}$	Sensitivity of PCR to detect C. coli	Beta(1,1)	Non-informative
$1 - \theta_{if}$	Specificity of PCR (for C. jejuni)	Beta(1, 1)	Non-informative
$1 - \theta_{cf}$	Specificity of PCR (for C. coli)	Beta(1, 1)	Non-informative
λ <sub>ii</sub>	Sensitivity of culture to detect C. jejuni	(i) $Beta(1,1)$	(i) Non-informative
55	(with no C. coli present)	(ii) Beta(17.7, 1.86)	(ii) From Vidal <i>et al.</i> [9]
	· · · · ·		Mode of 95.1%, 95% sure >77.9
$\lambda_{cc}$	Sensitivity of culture to detect C. coli	(i) $Beta(1,1)$	(i) Non-informative
	(with no C. jejuni present)	(ii) Beta(17.7, 1.86)	(ii) Same prior as $\lambda_{ii}$
$\lambda_{jm}$	Sensitivity of culture to detect C. jejuni	(i) $Beta(1,1)$	(i) Non-informative
J	in mixed sample	(ii) Beta(2·46, 4·04)	Derived from Vidal et al. [9]
	-		95% sure >11.1%, mode of $32.5%$
$\lambda_{cm}$	Sensitivity of culture to detect C. coli	(i) $Beta(1,1)$	(i) Non-informative
cint	in mixed sample	(ii) Beta(7.36, 5.99)	(ii) Derived from Vidal <i>et al.</i> [9]
			95% sure >33.0%, mode of 56%
$1 - \lambda_{if}$	Specificity of culture for C. jejuni	Beta(102.4, 3.1)	Woldemarium et al. [20]
JJ	· · · · · · · · · · · · · · · · · · ·		95% sure >94% and mode of 98%.
$1 - \lambda_{cf}$	Specificity of culture for C. coli	Beta(102.4, 3.1)	Woldemarium et al. [20]
0	1		95% sure >94% and mode of 98%.

Table 1. Priors used for the Bayesian model to estimate the sensitivity and specificity of PCR and caecal culture for detection of Campylobacter in broiler chickens

Table 2. Number of Campylobacter-positive batches from PCR by species ( $C_t < 32$  to be designated positive) and the respective result of culture methods, applied to the four broiler populations, based on caecal samples (taken from broilers at slaughter as part of a national prevalence survey)

		Culture result			
Population: description (number of batches)	PCR result	C. jejuni	C. coli	Negative	
1. First batch removed	C. jejuni	22	0	1	
(November-March)	C. coli	0	3	1	
(n=91)	Mixed	3	3	1	
	Negative	17	2	38	
2. First batch removed	C. jejuni	23	1	2	
(June-September)	C. coli	2	2	1	
(n = 59)	Mixed	6	10	3	
	Negative	1	0	8	
3. Previously partly depopulated	C. jejuni	87	4	14	
(November–March)	C. coli	1	3	0	
(n = 179)	Mixed	11	18	1	
	Negative	20	1	19	
4. Previously partly depopulated	C. jejuni	47	2	2	
(June–September)	C. coli	0	6	0	
$(n = 107)^{1}$	Mixed	11	21	2	
× /	Negative	9	3	4	

sample  $(\lambda_{jm})$ , were obtained by splitting the positive flocks into *C. jejuni* only and flocks with both *C. jejuni* and *C. coli*, and estimating the sensitivity of culture of *C. jejuni* in each case. For the sensitivity of culture of mixed samples, a Dirichlet distribution was used to

represent the priors, to ensure that  $\lambda_{jm}$ ,  $\lambda_{cm}$  were each between 0 and 1 and that the sum of the probabilities  $\lambda_{cm}$ ,  $\lambda_{jm}$ , and the probability of a false-negative mixed sample  $(1-\lambda_{cm}-\lambda_{jm})$  summed to 1 (see Supplementary material for further details and choice of priors).

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Table 3. Number of Campylobacter-positive batches from PCR (for  $C_t < 32$  and  $C_t < 36$ ) and culture methods applied to the four broiler populations, based on caecal samples (taken from broilers at slaughter as part of a national prevalence survey)

		Species	PCR positives			
Population: description (no. of batches)	Season		C <sub>t</sub> <32 for positive	C <sub>t</sub> <36 for positive	Culture positive	
1. First batch removed (n=91)	Non-summer (November–March)	C. <i>jejuni</i> C. coli Mixed Total	23 (25·3%) 4 (4·4%) 7 (7·7%) 34 (37·4%)	26 (28.6%) 5 (5.5%) 9 (9.9%) 40 (44.0%)	43 (47·3%) 8 (8·8%) n.a. 51 (56·0%)	
2. First batch removed $(n=59)$	Summer (June–September)	C. <i>jejuni</i> C. coli Mixed Total	26 (44·1%) 5 (8·5%) 19 (32·2%) 50 (84·7%)	24 (40·7%) 4 (6·8%) 22 (37·3%) 50 (84·7%)	32 (54·2%) 13 (22%) n.a. 45 (76·2%)	
3. Previously partly depopulated (n=179)	Non-summer (November–March	C. <i>jejuni</i> C. coli Mixed Total	105 (58·7%) 4 (2·2%) 30 (16·8%) 139 (77·7%)	98 (54·7%) 5 (2·8%) 44 (24·6%) 147(81·6%)	119 (66·5%) 26 (14·5%) n.a. 145 (81·0%)	
4. Previously partly depopulated ( <i>n</i> =107)	Summer (June–September)	C. <i>jejuni</i> C. coli Mixed Total	51 (47·7%) 6 (5·6%) 34 (31·8%) 91 (85·0%)	49 (45·8%) 4 (3·7%) 45 (42·1%) 98 (88·8%)	67 (62.6%) 32 (29.9%) n.a. 99 (92.5%)	

n.a., Not applicable.

We assumed that PCR would correctly classify the *Campylobacter* species. Due to the possibly imperfect nature of the hippurate test for speciation, some misclassification was allowed for culture in the model. A similar approach was adopted as for setting priors for sensitivity of culture of mixed samples, i.e a Dirichlet distribution was used for  $\lambda_{jj}$ ,  $\lambda_{jc}$ . It was assumed that  $\lambda_{cj} = \lambda_{jc}$ , i.e. an equal probability of misclassification for either species. We also assumed vague (uniform in the range 0–1) priors for the specificity and sensitivity of PCR, and for the batch prevalence for each group of birds (season and thinning status).

The cut-off value used for designating a sample positive by PCR was  $C_t \leq 32$  [12]. However, the Bayesian model was also used to explore the impact of increasing the cut-off to 36 on the sensitivity and specificity of PCR to detect each *Campylobacter* species.

# RESULTS

Overall, samples from 436 slaughter batches, originating from 22 abattoirs in the UK were tested by PCR and culture methods. There were very few samples with only *C. coli* present; the majority also contained *C. jejuni* detected by PCR (the number of mixed samples greatly outnumbered the number of *C. coli* PCR positives). Furthermore, PCR appeared to be less sensitive than culture, with a much higher number of PCR-negative samples being positive for culture (19, 1, 21 and 12 for populations 1–4, respectively; Table 2) compared to samples that were negative by culture but positive by PCR (3, 6, 15 and 4 for populations 1–4, respectively; Table 2). The apparent prevalence of *C. jejuni* was markedly higher (range 47·3–66·5%) than that of *C. coli* (range 8·8–22%) in all four populations tested by culture (Table 3).

There was also evidence of a higher sensitivity of culture to detect *C. coli*, in line with the prior for relative sensitivity of culture to detect both species in a sample, as for mixed samples a total of 31 (3+6+11+11) were positive for *C. jejuni* by culture, compared to 52 (3+10+18+21) positive for *C. coli* by culture (Table 2).

#### Estimates from Bayesian model

An important impact of season on the true prevalence estimates of *C. coli* was observed. The estimated proportion of batches containing *C. coli* (the sum of the *C. coli*-only and mixed batches, Table 4) increased

Population: description	Season	Species	Percentage infected (median)	95% CrI
1. First batch removed	Non-summer (November–March)	<i>C. jejuni</i> <i>C. coli</i> Mixed Total	42·7 4·1 9·6 56·4	$\begin{array}{c} (31 \cdot 2 - 53 \cdot 7) \\ (0 \cdot 5 - 10 \cdot 6) \\ (4 \cdot 3 - 17 \cdot 5) \end{array}$
2. First batch removed	Summer (June–September)	<i>C. jejuni</i> <i>C. coli</i> Mixed Total	40·4 2·7 41 84·1	$\begin{array}{c} (27 \cdot 3 - 53 \cdot 8) \\ (0 \cdot 1 - 10 \cdot 6) \\ (28 \cdot 4 - 55 \cdot 3) \end{array}$
3. Previously partly depopulated	Non-summer (November–March)	<i>C. jejuni</i> <i>C. coli</i> Mixed Total	66·7 0·8 21·4 88·9	$\begin{array}{c} (58 \cdot 8 - 73 \cdot 9) \\ (0 - 3 \cdot 4) \\ (15 \cdot 2 - 28 \cdot 6) \end{array}$
4. Previously partly depopulated	Summer (June–September)	<i>C. jejuni</i> <i>C. coli</i> Mixed Total	54·7 3·7 40 98·4	(44·2–65·2) (0·2–11) (29·6–51·2)

Table 4. Estimated prevalence of Campylobacter in batches of broilers from four populations, using a Bayesian model applied to caecal sampling data\*

CrI, Credible interval.

\* A threshold value of  $C_t < 32$  was used for a positive designation by PCR.

from 13.7% in non-summer to 43.7% during the summer months for flocks that had not been previously partly depopulated and from 22.2% in non-summer to 43.7% during the summer months for previously depopulated flocks. For C. jejuni, the impact of season appeared to be important only for batches that had not been previously partly depopulated; in this case the prevalence decreased from 81.4% in the summer to 52.3% in non-summer. For batches that had been previously partly depopulated there was very little change in C. jejuni prevalence between non-summer (88.1%) and summer (94.7%). The increase in C. coli during the summer months was mainly due to an increase in mixed positive samples with the corresponding reduction in the proportion of samples that contained only C. jejuni in batches of chickens from the previously depopulated flocks.

There was also an impact of the depopulation status of the flock on the true prevalence estimates of *Campylobacter* (Table 4). In the non-summer months, there was a marked difference in the total of *Campylobacter* prevalence between batches that were the first to be removed from the flock (56·4%) and previously partly depopulated batches (88·9%). In the summer, the *Campylobacter* prevalence of first removed batches was very high (84·1%), and even though the prevalence increased to  $98\cdot4\%$  for previously partly depopulated batches, the relative change was much smaller than for non-summer.

Given a batch with only one species of *Campylobacter* present, culture had high sensitivity (97.5% and 83.3% for *C. jejuni* and *C. coli*, respectively), with a lower sensitivity for PCR (81.4% and 86.51% for *C. jejuni* and *C. coli*, respectively) (Table 5). Themodel results suggested a lower specificity of PCR (3.4% and 2.9% probability of a negative sample being designated as *C. jejuni* and *C. coli*, respectively) compared to culture (2.2.% and 1.0% for *C. jejuni* and *C. coli*, respectively). When analysis used a threshold of  $C_t < 36$  to designate a PCR test positive, there was a small increase in sensitivity and a similar decrease in specificity (see Supplementary Table S2).

For mixed samples, the results indicated a bias in favour of culture detecting *C. coli* in preference to *C. jejuni*, with a 59.9% likelihood of a mixed sample being positive for *C. coli* compared to 37.3% of being positive for *C. jejuni* (Table 5).

There were differences of the order of <1% between the sensitivity of culture to detect *Campylobacter* spp. for each of the four sub-populations 1–4 (Table 6). The sensitivity of culture to detect *C. jejuni* was equal to or higher than that to detect *C. coli*; when there was a difference, it was more marked in the

Table 5. Bayesian model estimates (plus 95% credible intervals) of the true sensitivity and specificity of PCR	
(using a threshold of $C_t < 32$ for a positive designation) and culture for detection of Campylobacter by species	
(applied to caecal samples from broilers)	

	Probability of PCR result, % (95% CrI)		Probability of culture result, % (95% CrI)		
Campylobacter in sample	C. jejuni	C. coli	C. jejuni	C. coli	
C. <i>jejuni</i> only	81.4 (76.7-85.7)		97.5 (93.3–99.6)	1.4 (0.06–5.2)	
<i>C. coli</i> only		86.1 (75.6–97.0)	1.4 (0.06-5.2)	83.3 (35.8–98.3)	
Mixed	Assumed same as fo	or non-mixed samples	37.3 (28.1-47.2)	59.9 (49.9-69.3)	
None	3.4 (0.2–11.2)	2.9 (0.2–9.9)	2.2 (0.12-8.2)	1.2 (0.06-4.3)	

CrI, Credible interval.

Table 6. Sensitivity of culture to detect Campylobacter spp., C. jejuni, and C. coli in each of the four sub-populations sampled in the study (i.e. taking into account the proportion of mixed samples cultured)

	Bayesian estimate of culture sensitivity (95% CrI)			
Population	Campylobacter spp.	C. jejuni	C. coli	
1. First batch removed (November-March)	0.96 (0.91–0.99)	0.86 (0.77-0.93)	0.66 (0.52–0.79)	
2. First batch removed (June-September)	0.97 (0.93-0.99)	0.67 (0.57-0.76)	0.61 (0.51-0.71)	
3. Previously partly depopulated (November-March)	0.97 (0.94-0.99)	0.83(0.77-0.87)	0.61 (0.51 - 0.7)	
4. Previously partly depopulated (June–September)	0.97 (0.93–0.99)	0.72 (0.64–0.79)	0.62 (0.52–0.71)	

CrI, Credible interval.

non-summer months, where the sensitivity of culture was 20% higher for *C. jejuni* than for *C. coli*, whereas for the summer months the difference was 5-10%, both for 'first batch removed' and for 'previously depopulated' batches.

# Sensitivity of posterior estimates to prior assumptions

There was little difference in the results between the model with informative priors for culture sensitivity and specificity and results with only informative priors for culture specificity (the baseline model), except for the sensitivity of culture for *C. coli* (i.e. non-mixed) samples. The estimate of sensitivity for *C. coli* increased from 0.83 to 0.92 (but both with wide cred-ible intervals) when informative priors were used for its sensitivity (Supplementary Table S3).

When non-informative priors were used for all parameters, there were few differences between the parameters compared to the baseline model, except for: (i) the estimate of the sensitivity of PCR to detect *C. jejuni* (in non-mixed samples) increased from 0.81 to 0.87, and (ii) the estimate of the specificity of culture reduced from 0.98 to 0.74.

#### DISCUSSION

This study has estimated the sensitivity and specificity of direct culture on mCCDA and a real-time PCR for detection of C. jejuni and C. coli from broiler caecal samples. Direct culture on mCCDA was the diagnostic test used to determine Campylobacter prevalence in a recent 3-year survey [13] and was also used in the EU baseline survey [21]. Results indicate imperfect sensitivity and specificity of both PCR and culture, with potentially important differences in sensitivity of culture by species. This imperfect sensitivity suggests a likely underestimation of the prevalence of Campylobacter in the UK survey (see Table 6) where an overall prevalence of 79.2% was observed with 74.8% and 25.1% of the positive broiler batches being contaminated with C. jejuni and C. coli, respectively [13]. The overall sensitivity of culture for both C. jejuni and C. coli varies between the subpopulations considered in the present study, probably due to differences in the relative prevalence and contamination levels of C. jejuni/C. coli/mixed samples in each sub-population. Estimation of the overall sensitivity of culture for each species indicates that there will be a greater underestimation of the C. coli

prevalence than that of *C. jejuni* (Table 6). For samples where both species are present, there will be greater underestimation of *C. jejuni* than *C. coli* (Table 6).

Specificity of culture was found to be close to that obtained by a previous study (~98%) [20], although it was higher for *C. coli* than *C. jejuni*. One possible cause of false positives and thus imperfect specificity of culture is the misclassification of species due to the hippurate test. The sensitivity of culture estimated in the present study is higher (64%) than that reported in [18] but comparison between the two studies is difficult owing to markedly different methodologies used for collection, transportation and culture of the samples. Other studies [10, 19] have also reported lower sensitivity of culture, but used a different matrix and therefore the culture tests are not directly comparable with the present study.

The analysis of *Campylobacter* results by species prompts the need for a more complicated expression for the likelihood of the data compared to the standard two 2-test model [14]. Due to the larger number of prevalence and test sensitivities that need to be estimated in the Bayesian model here, it was considered important to obtain informative parameters for some of the parameters, in order to assist with model identifiability. The sensitivity analysis indicated that models with informative priors for the sensitivity and specificity of culture produced estimates with reasonably close agreement to those obtained using non-informative priors. One of the main differences in using non-informative priors was that the estimate of the sensitivity of culture to detect C. coli in a non-mixed sample was lower (83%) than the estimate with an informative prior (92%). This sensitivity of the estimate of C. coli culture to the choice of prior is likely to be due to the relatively small number of Campylobacter-positive samples that contain only C. coli and not C. jejuni; out of 436 samples only 19 were identified as C. coli-only positives by PCR (at a cut-off of 32). This leads to difficulties in robust statistical inference for the sensitivity of culture to detect C. coli from the present study data alone. The estimate for the specificity of culture for C. jejuni when it was the only species present was also influenced by the choice of prior; with non-informative priors it dropped from 0.97 to 0.74. There is a potential lack of identifiability in the infection status of samples that were C. *jejuni* positive for culture but C. *jejuni* negative for PCR. However, the estimate of specificity of 0.74 is not credible in the light of previous work [20] or the recent EU survey on *Campylobacter* in broilers, with apparent prevalence in pooled caecal samples being as low as 2% in one MS [21].

The aim of the inclusion of an informative prior scenario as part of the sensitivity analysis was to determine how sensitive the model results were to changes in the priors. It turned out that the priors generated for the sensitivity of culture for mixed samples from a previous study [9] were very close to the posteriors when non-informative priors were used, indicating good agreement with the present study.

A very high proportion of flocks detected as having C. coli by culture were co-infected with C. jejuni by PCR testing. This finding may indicate that in most cases where C. coli has colonized a flock, it does so at a higher level than C. jejuni at time of slaughter, similar to the findings of [22], albeit with a limited number of C. coli and C. jejuni strains. When both species are present, C. coli is generally present in higher numbers and hence more likely to be the species detected by culture (J. Rodgers, AHVLA, unpublished data). This might suggest a different epidemiology for the two species such as different contamination or multiplication rates; once C. coli colonization has occurred, C. jejuni may also colonize the flock but does not reach such high levels when C. coli is present. Further difference in the epidemiology of the two species is reflected by the impact of whether a batch was the first to be removed from the flock, and the impact of seasonality on the prevalence of Campylobacter. For Campylobacter spp. and C. jejuni these were consistent with previous studies, where prevalence was higher in thinned flocks, and in the summer [13]. However, for C. coli, there was little difference in prevalence between the first batch and previously partly depopulated flocks, although there was a clear seasonal difference. Thinning or partial depopulation does not seem to increase the prevalence of C. coli; this may imply that other factors affect flock colonization with this species such as environmental and climate conditions. It may also indicate different times of colonization as an earlier colonization would allow more time for C. coli to become established and predominate in the flock. Further investigations are required to explore this hypothesis.

Although high, the sensitivity of PCR was lower than the culture method. This is possibly due to the intrinsic higher limit of detection of the PCR  $(>10^5 \text{ c.f.u./g})$  [12] compared to culture  $(>10^2 \text{ c.f.u./}$ g) [19] and therefore caecal samples with lower concentrations of bacteria will not be detected by PCR.

By contrast, PCR exhibited higher specificity over culture than that of 80% reported previously [12], but it should be noted on a much smaller number (n=52) of samples. Furthermore, the latter study only tested a single flock population and was not able to apply Bayesian methods in the absence of a gold standard, therefore the adoption of culture as the reference standard may have influenced their results. The higher specificity found here is consistent with our experience of applying PCR to a large number of samples in Campylobacter surveys, where there were fewer culture-negative samples testing positive by PCR (data not shown). Furthermore, test validation of the PCR with several bacterial species underlines its high specificity [23]. A high specificity (96.2%) of a real-time PCR relative to culture as the reference standard was also reported when applied to faeces from experimentally infected pigs [24], and, by extension from above, the actual specificity could be even higher if some samples were false-negative by culture.

It would interesting to explore further the optimal choice of  $C_t$  threshold at which to determine a sample as positive by PCR, since changing this did have an effect on the sensitivity and specificity of the test. One method of doing this would be to use recently developed Bayesian methods that are able to analyse the PCR data without using a specific cut-off, i.e. the actual  $C_t$  value is used in the analysis [25]. Such an approach would result in a more powerful dataset, since the model will have information on definite and borderline positives for each species, and provide further strength to the model inference.

In conclusion, the season of sampling had an important impact, especially for C. coli, which was more prevalent in the summer while for C. jejuni the effect of season was only marked for the batches first removed from the flock. Previous partial depopulation of the flock also had an important impact, with lower prevalence of both Campylobacter species (with a larger change for C. jejuni) for batches that were the first birds removed from the flock than for previously partly depopulated batches. Culture was more sensitive than PCR for both species in samples derived from populations infected with a single species of Campylobacter but its sensitivity was reduced for C. jejuni or C. coli in mixed populations although it was less marked for the latter. The PCR method is potentially able to detect both species in mixed samples but the total probability of correctly identifying at least one species by this method was similar to culture.

#### SUPPLEMENTARY MATERIAL

For supplementary material accompanying this paper visit http://dx.doi.org/10.1017/S0950268814000454.

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### **DECLARATION OF INTEREST**

None.

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