

1 Associations between dairy cow inter- 2 service interval and probability of 3 conception

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8 Abstract

9 Recent research has indicated that the interval between inseminations in modern dairy
10 cattle is often longer than the commonly accepted cycle length of 18-24 days. This study
11 analysed 257,396 inseminations in 75,745 cows from 312 herds in England and Wales.
12 The interval between subsequent inseminations in the same cow in the same lactation
13 (inter-service interval, ISI) were calculated and inseminations categorised as successful
14 or unsuccessful depending on whether there was a corresponding calving event.
15 Conception risk was calculated for each individual ISI between 16 and 28 days. A
16 random effects logistic regression model was fitted to the data with pregnancy as the
17 outcome variable and ISI (in days) included in the model as a categorical variable. The
18 modal ISI was 22 days and the peak conception risk was 44% for ISIs of 21 days rising
19 from 27% at 16 days. The logistic regression model revealed significant associations of
20 conception risk with ISI as well as 305 day milk yield, insemination number, parity and
21 days in milk. Predicted conception risk was lower for ISIs of 16, 17 and 18 days and
22 higher for ISIs of 20, 21 and 22 days compared to 25 day ISIs. A mixture model was
23 specified to identify clusters in insemination frequency and conception risk for ISIs
24 between 3 and 50 days. A "high conception risk, high insemination frequency" cluster
25 was identified between 19 and 26 days which indicated that this time period was the true
26 latent distribution for ISI with optimal reproductive outcome. These findings suggest that
27 the period of increased numbers of inseminations around 22 days identified in existing
28 work coincides with the period of increased probability of conception and therefore likely
29 represents true return estrus events.

30 Keywords

31 Estrous cycle; inter-service interval; conception; pregnancy; dairy cow; mixture model

32 1. Introduction

33 Good reproductive performance in dairy herds is essential for efficient milk production.
34 At cow level, good reproductive performance involves two main steps: 'submitting' cows
35 for insemination in a timely manner, followed by conception and maintenance of
36 pregnancy. Successfully detecting and inseminating cows in estrus is important as it is
37 one of the most commonly used strategies to submit cows for artificial insemination,
38 particularly in the UK. A good understanding of the physiology of the cow's estrous cycle
39 has potential to improve both aspects. Better insight into expected interval between
40 estrus events can help with accurate heat detection monitoring, and has potential to
41 inform improved heat detection strategies on farm. Exploring associations between inter-
42 service interval (ISI) and subsequent fertility may provide insights which help to improve
43 conception risk (the probability of an insemination resulting in a pregnancy).

44

45 The average length of the estrous cycle of the cow is commonly quoted as 21 days, with
46 a normal range of 18 to 24 days [1, 2]. A number of small-scale studies have identified
47 mean estrous cycle lengths in excess of 21 days [3-5]. A much larger study evaluating
48 the time between successive inseminations in the same cow in the same lactation, the
49 inter-service interval (ISI), suggests that ISIs in excess of the normal range are
50 frequent, with 22 days being the modal interval and that the traditional normal range of
51 18 to 24 days may poorly reflect the observed distribution of intervals in the population
52 [6], a similar pattern has been identified in progesterone profiles [7]. Some of these
53 longer ISIs could be the result of late embryonic death [8-10], this may impact on their
54 chance of conception at the next insemination. It is not clear whether cows inseminated
55 at these apparently abnormal intervals are as likely to conceive as those inseminated
56 within the traditional expected range.

57

58 Estrous cycles in *Bos taurus* cattle typically consist of two or three follicular waves, with
59 three wave cycles tending to result in an inter-ovulatory interval (IOI) longer than that
60 of two wave cycles [11]. Some authors have hypothesised that due to the relatively
61 increased time taken for development of the pre-ovulatory follicle in two wave cycles
62 that these may be less fertile than three wave cycles. However there is no clear
63 consensus with some studies finding reduced conception risk in two wave cycles [12]
64 and others finding no difference [4, 13]. There are several potential mechanisms by
65 which ISI could plausibly impact on conception risk as well as late embryonic death.
66 Whilst follicular wave number, IOI and ISI may not necessarily correlate substantially,
67 there are potential mechanisms for conception risk to vary with ISI. To the authors'
68 knowledge, no studies exist evaluating the relationship between ISI and fertility on a
69 large number of cows.

70

71 The aim of this study was to investigate the variation in conception risk by ISI in a large
72 number of dairy cows in order to further our understanding of the possible effects of ISI
73 on fertility, and to explore the expected estrous cycle length of a previously inseminated
74 modern dairy cow. The authors hypothesise that conception risk will vary with ISI.

75 2. Materials and methods

76 2.1 Data collection, organisation and descriptive analysis

77 Management data was collected from farms that were clients of one of twenty veterinary
78 surgeons in England and Wales as part of larger project [14, 15]. Records for 468 dairy
79 farms considered to have good quality data were collated and converted to a standard
80 format. An assessment of data quality was carried out to identify herds with accurate
81 recording of calving and insemination. Measures used to screen for data quality included
82 the proportion of calving events with corresponding inseminations and the proportion of
83 inseminations leading to a pregnancy (see Hudson, Bradley [15] for more detail). This
84 left data for 257,396 inseminations in 75,745 cows from 312 herds. The data were
85 structured with a single insemination as a line of data, with the insemination, cow, parity
86 and herd identity recorded. For each insemination, the date of insemination as well as
87 the variables shown in Table 1 were recorded or calculated. The interval between
88 subsequent inseminations in the same lactation from the same cow was calculated
89 (inter-service interval, ISI); first inseminations were excluded. Inseminations were
90 categorised as successfully resulting in a pregnancy when the cow was recorded as
91 having calved 266 to 296 days after insemination, based on the expected range of
92 gestation length for the common dairy breeds [16, 17]. Where two inseminations
93 occurred within this range, the closest to 283 days gestation was categorised as
94 successful. Plots were produced to examine the distribution of ISIs between 3 and 50
95 days to visualise the increased frequency of insemination occurring at the expected time
96 of around 21-22 days. The distribution of the proportion of inseminations resulting in a

97 pregnancy (conception risk) at each ISI between 3 and 50 days was also plotted using
 98 GraphPad Prism (Version 7.02, California, USA); with confidence intervals for risk at
 99 each ISI calculated using the modified Wilson interval [18]. From this distribution, a
 100 range of 16 to 28 days was selected for further exploration as it appeared to encompass
 101 the range of increased conception risk and insemination frequency at which most first
 102 returns would be expected, predominantly reflecting accurately detected estrus events.
 103 This final dataset, used to fit the regression model, contained 60,094 ISIs from 33,122
 104 cows in 312 herds. Initial data restructuring and analysis was carried out in Microsoft
 105 Excel 2010 (Microsoft Corporation, Redmond, Washington).
 106

107 2.2 Statistical modelling

108 A logistic multivariable regression model with the binary event of insemination success
 109 as the outcome variable was fitted to the data to account for the potential effect of other
 110 measurable confounding variables on conception risk. A multilevel model was used with
 111 a three level structure, with insemination as the bottom level and cow and herd-level
 112 random effects used to account for clustering at each level. The model was created by
 113 stepwise forward selection, with each variable being offered to the model and retained if
 114 the magnitude of its estimated coefficient was at least double the standard error of the
 115 estimate (equivalent to $p < 0.05$). ISI was forced in to the model as a categorical
 116 variable, with each discrete one-day interval represented as a category. An ISI of 25
 117 days was selected as the reference ISI as it represented a conception risk in the middle
 118 of the range. Where one or more categories of a variable were significant, all the
 119 categories for that variable were retained in the model. A list of all variables offered to
 120 the model is given in Table 1. Polynomial functions were tested for all continuous
 121 variables up to power three. Biologically plausible first order interaction effects were also
 122 tested, including ISI with milk yield, days in milk, parity and service number. All rejected
 123 variables were re-offered to the final model, and retained if they met the criteria
 124 described above.
 125

126 The model took the conventional form

$$127 \text{Pregnancy}_{ijk} \sim \text{Bernoulli}(\text{mean} = \pi_{ijk}) \quad (1)$$

$$128 \ln\left(\frac{\pi_{ijk}}{1 - \pi_{ijk}}\right) = \beta_0 + \boldsymbol{\beta}\mathbf{x}_{ijk} + v_{0k} + u_{0jk} \quad (2)$$

$$129 v_{0k} \sim N(0, \sigma_{v0}^2) \quad (3)$$

$$130 u_{0jk} \sim N(0, \sigma_{u0}^2) \quad (4)$$

131 where Pregnancy_{ijk} is whether the i^{th} insemination in the j^{th} cow in the k^{th} herd resulted in
 132 a pregnancy; π_{ijk} is the fitted probability of Pregnancy_{ijk} ; β_0 is the regression intercept, $\boldsymbol{\beta}$ is
 133 the vector of coefficients for the vector of predictor variables \mathbf{x} ; v_{0k} and u_{0jk} are the
 134 random effects to represent herd and cow level variation respectively.
 135

136 The model was fitted using MLwiN version 2.35 [19]. Initial parameter estimates were
 137 calculated using iterative generalised least squares (IGLS) and final parameter estimates
 138 generated using a Bayesian approach, Markov Chain Monte Carlo (MCMC) with Gibbs
 139 sampling [20, 21]. A burn-in length of 5,000 iterations was used followed by a
 140 monitoring chain of 50,000 iterations. MCMC chains for the parameter estimates were
 141 visually checked to ensure adequate convergence. Model fit was checked by comparing
 142 observed and predicted number of pregnancies for each decile of risk, and ensuring that
 143 the observed number was within the 95% coverage interval of the predicted number for
 144 each decile.
 145

146 To aid in interpretation, the model was used to predict the probability of achieving
 147 pregnancy for an insemination following an ISI of each length, whilst all other
 148 explanatory variables were fixed at their population mean values. These predictions were

146 illustrated graphically by plotting predicted probability for each ISI as a bar chart, along
147 with the corresponding 95% credible intervals.

148

149 An unsupervised latent class analysis was conducted to identify and define clusters of
150 similar ISIs based on the daily frequency of inseminations and probability of conception.
151 The analysis was carried out in R version 3.3.1 [22] using the *mclust* package [23, 24].
152 A finite Gaussian mixture model was fit to the insemination frequency and conception
153 risk data using an expectation-maximisation algorithm, the optimum number of
154 classifications was selected based on maximising the Bayesian Information Criterion
155 (BIC) [23, 24]. The probability of each ISI falling within each classification was
156 calculated and graphical plots used to illustrate the results. ISIs were assigned to the
157 cluster that they had the highest probability of belonging to, the uncertainty was also
158 illustrated.

159 3. Results

160 Figure 1 shows the distribution of ISIs between 3 and 50 days: a clear increase in the
161 frequency of insemination occurring around 22 days is evident. Figure 1 also shows the
162 observed conception risk across the same range. A peak in conception risk is apparent
163 around multiples of the expected estrous cycle (around three and six weeks). The
164 conception risk is low at 16 days (27%) and increases from 18 days up to a peak of 44%
165 at 21 days, there is then a more gradual decline to a plateau of around 35% from 27
166 days ISI.

167

168 The final parameter estimates for the logistic regression model (with the outcome of a
169 pregnancy (yes or no) resulting from an insemination) are shown in Table 2. The
170 distribution of predicted mean conception risk by ISI is shown in Figure 2. Predicted
171 conception risk was significantly lower for ISIs of 16, 17 and 18 days (mean predicted
172 conception risk of 30, 27 and 32% respectively), whereas predicted mean conception
173 risk for ISI of days 20, 21 and 22 were significantly higher than the reference interval of
174 25 days. There was no significant difference in predicted mean conception risk between
175 ISIs of 21 or 22 days (47 and 46% respectively).

176

177 There were significant associations of milk yield, parity, days in milk, insemination
178 number, month and year of insemination with conception risk. As milk yield increased
179 conception risk tended to decrease, there was a trend for decreasing conception risk with
180 increasing parity, with a significant decline in conception risk for parity five or greater.
181 There was a quadratic association between the natural logarithm of days in milk and
182 conception risk: conception risk tended to increase up to around 160 days in milk and
183 then decline in later lactation. Third or later inseminations were less likely to result in
184 pregnancy than second inseminations.

185

186 Three latent classes (clusters) were identified in the data, broadly corresponding to days
187 with a lower chance of conception with lower number of inseminations (LL), a higher
188 chance of conception and lower number of inseminations (HL), a higher chance of
189 conception and a higher number of inseminations (HH). Figure 3 illustrates the estimated
190 probability for each ISI (day) being a member of each latent class. Inseminations carried
191 out between 19 and 26 days were most likely to fall in the HH classification. Figure 4
192 illustrates the clustering of each ISI by conception rates and number of inseminations on
193 each day.

194 4. Discussion

195

196 These findings are useful in reconsidering estimates of normal or expected ISI. The
197 lowest conception risk identified in the analyses were for inseminations given at ISIs of

198 less than 18 days (Figure 1). This supports the common interpretation that these
199 inseminations frequently represent inaccurately detected estrus events, with either the
200 first or the second insemination of the interval having occurred when the cow was not
201 truly in estrus [25, 26]. However, it is interesting to note that ISIs of 18 days
202 (traditionally considered to be within the normal cycle range) had outcomes similar to
203 the “short” intervals of 16-17 days and significantly lower than ISIs of 19 to 26 days.
204 This finding is supported by the findings of the mixture model, where by taking in to
205 account the number of inseminations and the average conception rate a , cluster of ISI
206 with high insemination frequency and high conception rate was identified between 19
207 and 26 days. This would seem to support the idea that 18 day ISIs more often represent
208 inaccurate heat detection than a normal cycle of this duration. It remains plausible that
209 18 day cycles predominantly represent true pairs of estrus events, but are associated
210 with reduced fertility. The fact that 18 day ISIs are similar to shorter intervals, both in
211 terms of frequency and outcome, would tend to support the theory that these are much
212 more commonly the result a “false positive” detection of estrus. In this case, 18 to 24
213 days would not be an appropriate expected range by which to define a normal ISI in the
214 modern dairy cow and 19-26 days may be more appropriate. This may have implications
215 for the interpretation of some standard methods for assessing distribution of ISIs as a
216 measure of heat detection performance, as well as for the generation of expected heat
217 dates in on-farm management systems.

218
219 The conception risk appears to peak at multiples of the expected cycle length (i.e around
220 22 and 44 days, Figure 1); it is likely these intervals predominantly represent pairs of
221 true estrus events. However, the conception risk remains markedly higher for intervals
222 of 28-37 days (i.e. those between the approximate expected lengths of one and two
223 cycles) than for intervals shorter than 18 days. This is likely to be due to different
224 possible explanations for ISIs within this range. This is also reflected in the uncertainty
225 of classifying these ISIs in the mixture model. In some cases, these intervals are likely
226 to be the result of cows being served outside of true estrus events. In this case, a
227 missed estrus and a wrongly identified estrus would need to occur in succession. As
228 these could occur in either order, the second insemination of the interval may or may
229 not be given when the cow is not in estrus, and a lower conception risk would therefore
230 be expected. These intervals may also occur following late embryonic death [8-10], or as
231 a result of pharmacological cycle manipulation following negative pregnancy diagnosis
232 [27]. In either case, the second insemination is likely to relate to a true ovulation event,
233 but would in some cases perhaps be expected to have a somewhat reduced risk of
234 conception (depending on the cause of LED, or the type of cycle manipulation
235 employed). Whilst the use of fixed time AI was not captured in the data, the authors
236 would expect the use of these techniques (particularly within 30 days of a previous
237 insemination) to be minimal in UK dairy herds at the time of data capture, this is
238 supported by the clear increase in frequency of ISIs at the expected unmanipulated cycle
239 lengths of three and six weeks. Any impact of cycle manipulation would also fall outside
240 of the 16-28 day window of interest. Finally, it is also possible that these may represent
241 normal physiological cycles of longer length than traditionally expected. The current
242 results suggest that 26 day intervals are associated with similar outcomes to the 25 day
243 reference category (Table 2), as are those at 23 and 24 days. Intervals of 27 or 28 days
244 were associated with a significantly decreased odds of pregnancy, which is likely to
245 reflect the combined impact of the possible explanations described above.

246
247 This study used ISI as a proxy for IOI; this was considered useful as it enabled a much
248 larger number of herds to be studied than has previously been the case in this field.
249 However, since this study excludes the first insemination of each lactation (where there
250 is no ISI), it is likely that late embryonic death (as described above), will mean that the
251 distribution of ISIs shown in Figure 1 is not likely to reflect accurately the distribution of
252 IOIs in the same population. Without a marker for the presence of the embryo, or a
253 group of “control” cattle that are not inseminated, it is impossible to know to what extent
254 the results are affected by embryonic death and how much is due to estrous cycle

255 length. However, recent work evaluating progesterone profiles of 1,418 estrous cycles in
256 1009 lactations has shown a markedly similar pattern in estrous cycle length [7]
257 independent of whether cows were inseminated. This is also consistent with studies on
258 smaller numbers of cattle where estrous cycles were found to be longer than expected
259 [3]. This suggests that the increased frequency of cows being inseminated at intervals
260 slightly greater than 24 days and the decreased frequency of inseminations carried out
261 at intervals of 18 days from a previous serve is consistent with the cow return estrous
262 cycle being longer than the traditionally accepted 18-24 days. This is important clinically,
263 but also in research, where some studies may incorrectly categorise estrous cycles
264 greater than 24 days as abnormal [7].
265

266 Individual studies commonly find significant differences between the durations of two-
267 and three-wave cycles, the mean IOI in each group varies substantially between studies,
268 with some reporting the mean duration of a three-wave cycle at around 22 days [13]
269 whilst others found this to be greater than 24 days [12], this variation in reported inter-
270 ovulatory interval is shown in supplementary material. Some authors have hypothesised
271 that fertility will be reduced in cows undergoing two-wave (and therefore shorter) cycles,
272 as a result of longer follicular maturation time [11]. The potential for substantial overlap
273 between the distributions of two- and three-wave cycles makes it impossible to
274 accurately separate cycles into follicular wave categories by ISI. This is especially
275 difficult where data comes from a large number of herds and is confounded by factors
276 such as embryonic death discussed previously. In this study, slightly shorter cycles (20-
277 21 days) tended to be slightly more fertile rather than less (compared to 23 days);
278 although speculative this would seem not to provide support for the two- versus three-
279 wave hypothesis as an important factor in determining conception risk across a large,
280 multi-herd dataset.
281

282 Other findings in this study are consistent with existing work, showing a negative
283 association of conception risk with increasing parity and increasing number of
284 inseminations as well as a non-linear association between days in milk and conception
285 risk [28]. There was a statistically significant but small negative association between
286 increasing milk production and conception risk. For categorical variables effect size can
287 be seen in Table 2 using the absolute predicted risk, for example month effects were
288 very small as the absolute risk is very similar across months. Care needs to be taken
289 when interpreting these associations and there are many confounding factors which
290 cannot be measured or were not available to include in the model [29]. There also
291 appeared to be a seasonal effect, with conception risks declining in the summer. This is
292 consistent with the likely effects of heat stress or nutritional changes during the summer
293 [30].
294

295 The data collected in this study represent a convenience sample of those farms where
296 data quality was sufficient for the analysis. It is possible that this would select for farms
297 with better management which may influence the results. Whilst care needs to be taken
298 before generalising these findings to all farms it seems unlikely that farm management
299 would influence the results to a great degree, and the hierarchical multilevel structure of
300 the regression model would account for any between farm variations in "baseline" ISI.
301

302 5. Conclusions

303 Inseminations carried out at intervals of 19-26 days following previous insemination
304 were significantly more likely to result in a pregnancy than those carried out at shorter
305 or longer intervals, within the 16 to 28 day range. This work also provides support for
306 the hypothesis that the expected range for inter-service interval in the modern dairy cow
307 should be considered longer than the traditional 18-24 days, with the alternative range
308 of 19-26 appearing to be most supported by this study.
309

310 Table 1. Variables tested for inclusion in a logistic regression model with the outcome of
 311 conception risk
 312

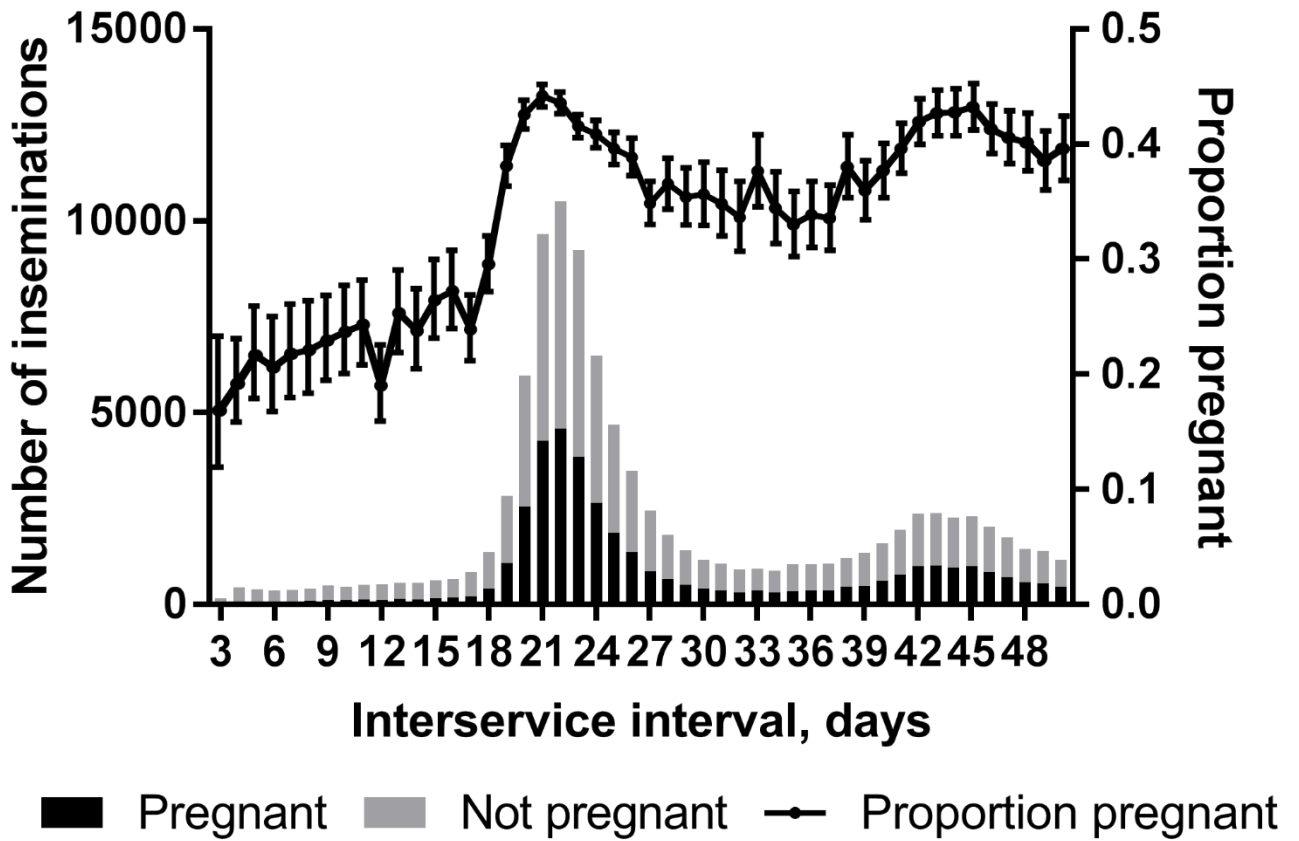
Variable	Type
Pregnancy	Outcome variable, binary 313
ISI, days	Categorical (16 days, 17 days...28 days)
Month of insemination ending ISI	Categorical 314
Year of insemination ending ISI	Categorical 315
Parity	Categorical (1,...,5+)
305 day lactation milk yield	Continuous
Days in milk at insemination ending ISI	Continuous
Number of inseminations (in this lactations)	Categorical (2,3+)
Cow ID	Random effect
Herd ID	Random effect

316 Table 2 Parameter estimates for a Bayesian multilevel logistic regression model with
 317 conception risk as an outcome variable and the inter-service interval (ISI) preceding the
 318 insemination forced in to the model as a categorical variable. *Absolute predicted risk
 319 has been calculated for all categorical variables by fixing all other model variables at
 320 their population means, and predicting absolute risk (with a 95% credible interval for the
 321 prediction) for each of the categories within the variable. Absolute predicted risks are not
 322 presented for continuous variables.

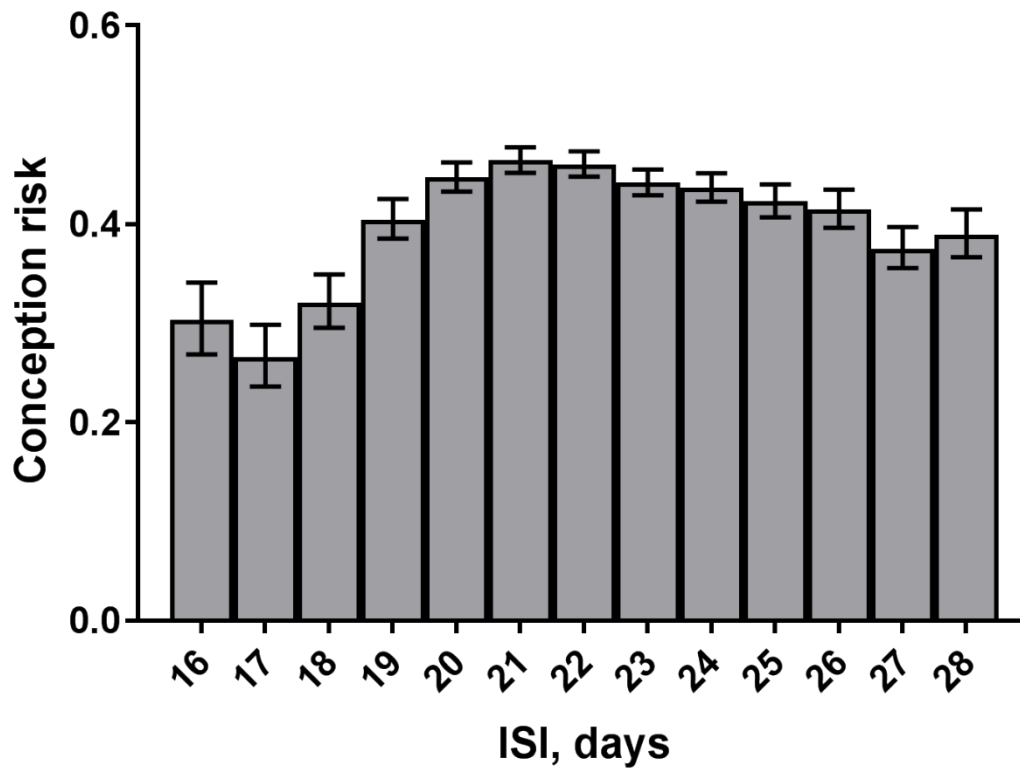
Variable	Coefficient estimate	Standard error	Odds ratio (95% credible interval)	Absolute predicted risk* (95% credible interval)
Pregnancy	Outcome			
Fixed Part				
Intercept	0.155	0.058		
ISI_16	-0.531	0.095	0.58(0.48-0.70)	0.3 (0.27-0.34)
ISI_17	-0.722	0.087	0.48(0.40-0.57)	0.27 (0.24-0.3)
ISI_18	-0.446	0.068	0.64(0.56-0.73)	0.32 (0.3-0.35)
ISI_19	-0.082	0.05	0.92(0.83-1.01)	0.4 (0.38-0.43)
ISI_20	0.098	0.04	1.10(1.01-1.19)	0.45 (0.43-0.46)
ISI_21	0.167	0.037	1.18(1.09-1.27)	0.46 (0.45-0.48)
ISI_22	0.152	0.037	1.16(1.08-1.25)	0.46 (0.45-0.47)
ISI_23	0.075	0.037	1.07(1.00-1.15)	0.44 (0.43-0.45)
ISI_24	0.054	0.04	1.05(0.97-1.14)	0.44 (0.42-0.45)
ISI_25	Reference			0.42 (0.41-0.44)
ISI_26	-0.034	0.047	0.96(0.88-1.05)	0.41 (0.4-0.43)
ISI_27	-0.205	0.053	0.81(0.73-0.90)	0.37 (0.36-0.4)
ISI_28	-0.144	0.058	0.86(0.77-0.97)	0.39 (0.37-0.41)
305 day milk yield ('000s of litres)	-0.022	0.005	0.97(0.96-0.98)	Continuous
Parity 1	Reference			0.45 (0.44-0.46)
Parity 2	-0.028	0.025	0.97(0.92-1.02)	0.45 (0.43-0.46)
Parity 3	-0.052	0.027	0.94(0.90-1.00)	0.44 (0.43-0.45)
Parity 4	-0.077	0.031	0.92(0.87-0.98)	0.43 (0.42-0.45)
Parity 5+	-0.276	0.026	0.75(0.72-0.79)	0.39 (0.38-0.4)
January	Reference			0.45 (0.44-0.47)
February	-0.038	0.035	0.96(0.89-1.03)	0.44 (0.43-0.46)
March	-0.068	0.036	0.93(0.87-1.00)	0.43 (0.42-0.45)
April	-0.12	0.039	0.88(0.82-0.95)	0.42 (0.4-0.44)
May	-0.053	0.041	0.94(0.87-1.02)	0.44 (0.42-0.46)
June	-0.126	0.042	0.88(0.81-0.95)	0.42 (0.4-0.44)
July	-0.202	0.045	0.81(0.74-0.89)	0.4 (0.38-0.42)
August	-0.188	0.047	0.82(0.75-0.90)	0.41 (0.39-0.43)
September	-0.27	0.046	0.76(0.69-0.83)	0.39 (0.37-0.41)
October	-0.079	0.041	0.92(0.85-1.00)	0.43 (0.41-0.45)
November	-0.094	0.037	0.91(0.84-0.97)	0.43 (0.41-0.44)

December	-0.037	0.033	0.96(0.90-1.02)	0.44 (0.43-0.46)
2002	Reference			0.49 (0.47-0.51)
2003	-0.063	0.04	0.93(0.86-1.01)	0.47 (0.46-0.49)
2004	-0.201	0.039	0.81(0.75-0.88)	0.44 (0.43-0.45)
2005	-0.265	0.039	0.76(0.71-0.82)	0.42 (0.41-0.44)
2006	-0.319	0.039	0.72(0.67-0.78)	0.41 (0.4-0.42)
2007	-0.327	0.038	0.72(0.66-0.77)	0.41 (0.4-0.42)
2008	-0.372	0.047	0.68(0.62-0.75)	0.4 (0.38-0.41)
Insemination number 2	Reference			0.44 (0.43-0.46)
Insemination number >2	-0.136	0.022	0.87(0.83-0.91)	0.41 (0.4-0.42)
Log_eDiM	0.17	0.035	1.18(1.10-1.26)	Continuous
(Log_eDiM)²	-0.345	0.071	0.70(0.61-0.81)	Continuous
Random Part				
Herd level variance	0.06	0.008		
Cow level variance	0.001	0		

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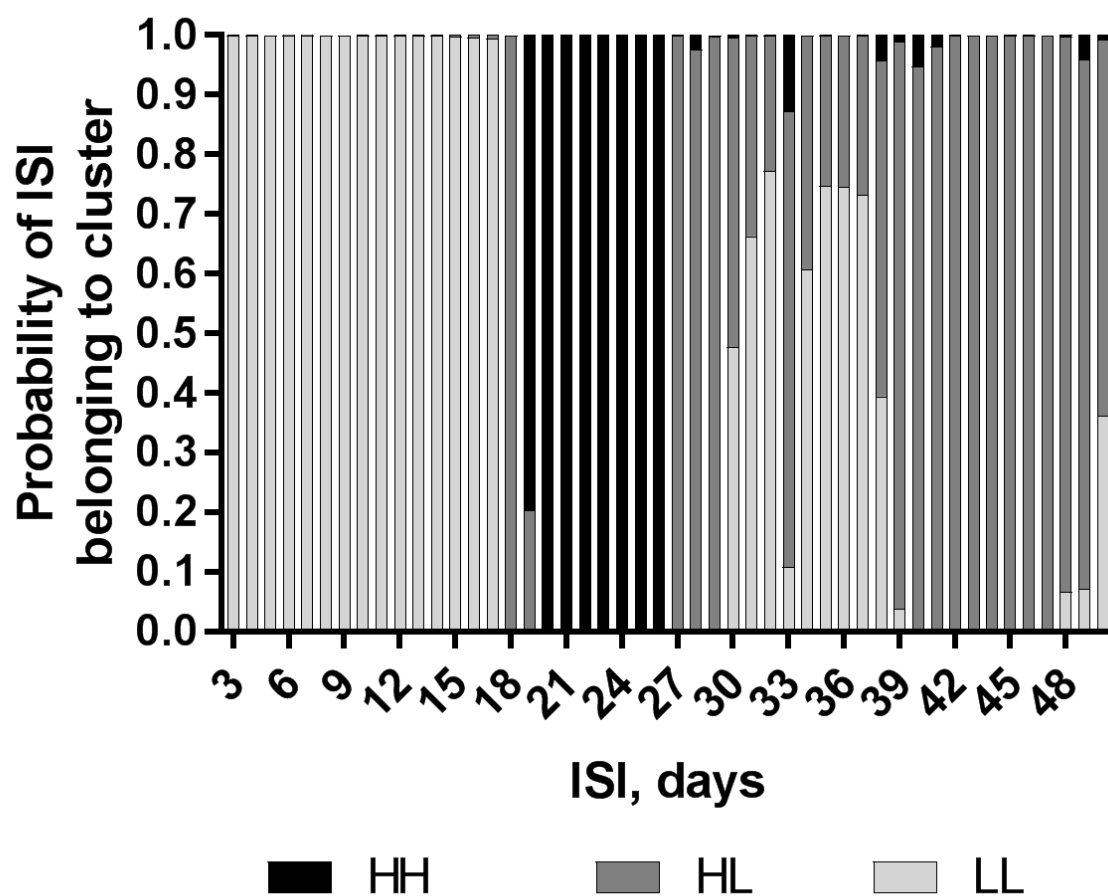
326
 327 Figure 1 The distribution of interservice intervals (ISIs) from a large dataset of UK dairy
 328 cows, showing the number of inseminations (left axis) both resulting in a pregnancy
 329 (black bars), the number not resulting in a pregnancy (grey bars) and the change in
 330 mean conception risk across the range of inter-service intervals (line) with 95%
 331 confidence intervals (error bars)(right axis).
 332



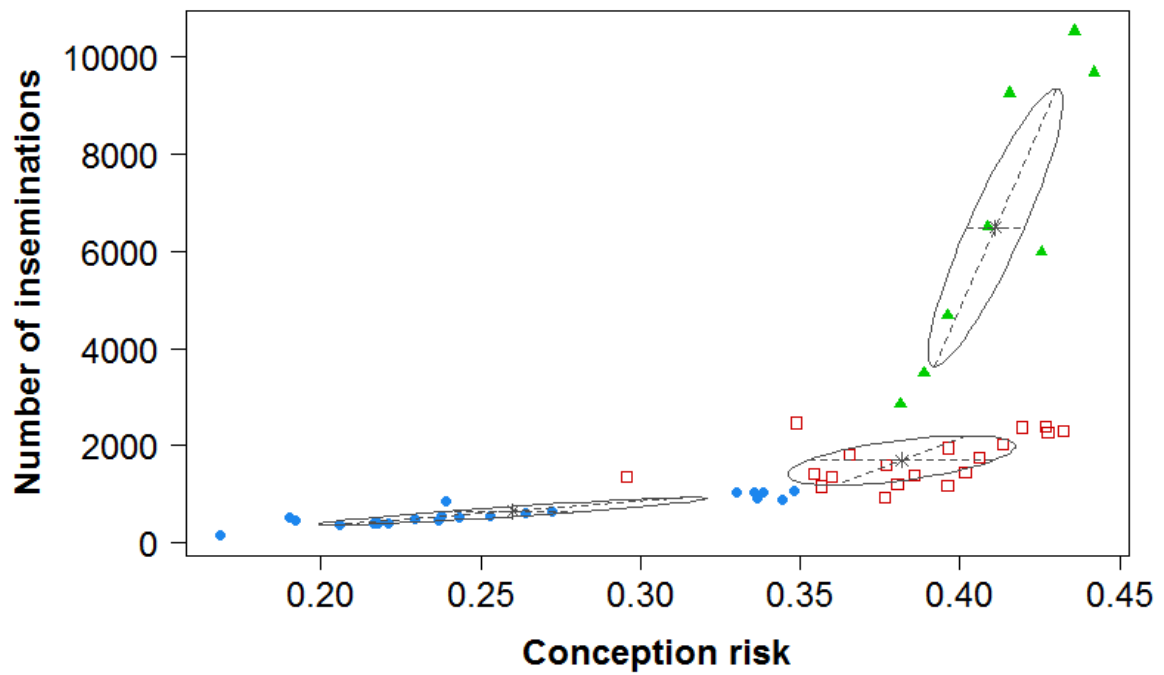
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335 Figure 2 Predicted mean conception risk from multilevel model for different inter-service
336 intervals, error bars show the 95% Bayesian credible interval. Bar height shows the
337 average predicted conception risk at inseminations of different inter-service intervals
338 (ISI) with all other explanatory variables fixed at the mean value

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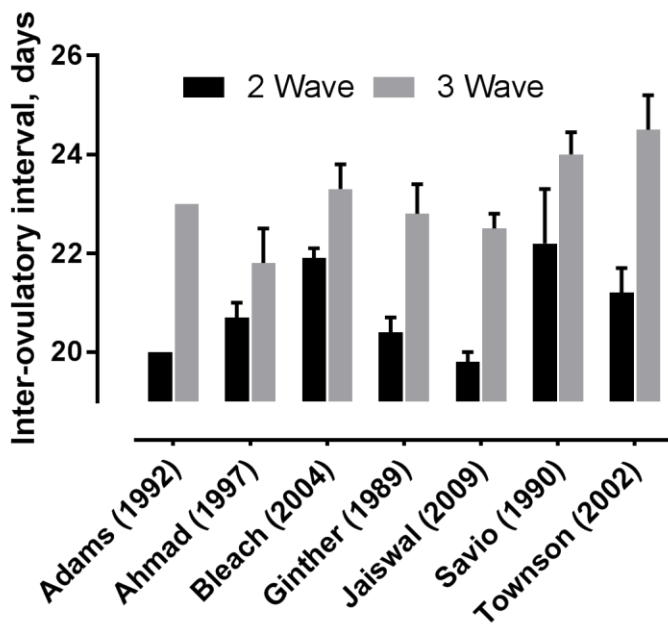


340 Figure 3 Probability of each ISI falling within the finite Gaussian model classifications:
 341 low conception rate, low number of inseminations (LL); Low number of inseminations,
 342 higher conception rate (LH); high number of inseminations and higher conception rate
 343 (HH)
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Figure 4 Finite Gaussian mixture model classification of ISIs by average conception risk and number of inseminations at each ISI, the identified clusters are shown by the different symbols (blue dots, LL; red squares, HL with; green triangles, HH) the mean of each cluster identified with the star



Summary of existing studies evaluating inter-ovulatory intervals in two and three follicular wave estrous cycles, bars show the mean IOI for two and three wave cycles, where present, error bars show stated standard error [4, 12, 13, 31-34]

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