# Diagnostic accuracy of methods for detecting *Anaplasma marginale* infection in lactating dairy cattle of Puerto Rico

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**Abstract.** Bovine anaplasmosis (BA) is a hemoparasitic disease of great importance in cattle within the tropical and subtropical regions of the world. Control programs for BA require accurate diagnostic assays but validation can be challenging because the true disease status of all animals is frequently not known with certainty. The objective of this study was to estimate the accuracy of assays for detection of *Anaplasma marginale* infection in lactating dairy cattle of Puerto Rico using Bayesian methods without a perfect reference test. There were 2,331 cattle with complete diagnostic results sampled from 79 herds, and the prevalence of BA was estimated as 22% (95% probability interval [PI]: 19–25%). The sensitivity (Se) and specificity (Sp) of a major surface protein 5 competitive enzyme-linked immunosorbent assay (MSP-5 cELISA) were estimated as 99% (95% PI: 96–100%) and 89% (95% PI: 87–92%), respectively. The Se and Sp of a quantitative polymerase chain reaction (qPCR) were 67% (95% PI: 60–74%) and 99% (95% PI: 99–100%). The Se and Sp of a card agglutination test were 34% (95% PI: 29–39%) and 99% (95% PI: 99–100%). Area under the receiver-operating characteristic curve for the MSP-5 cELISA was 0.748 (95% PI: 0.71–0.79). The MSP-5 cELISA appears to be the test of choice for screening cattle for subclinical BA based on the high estimated Se, rapidity of results, relative low cost, and ease of standardization.

Key words: Anaplasmosis; Bayesian; cattle; diagnostic testing; Puerto Rico.

#### Introduction

Bovine anaplasmosis (BA) is a hemoparasitic disease of great importance in cattle production systems in the tropical and subtropical regions of the world, including the island of Puerto Rico.<sup>8,33</sup> The disease is caused by the rickettsiae, *Anaplasma marginale* (order *Rickettsiales*, family *Anaplasmataceae*),<sup>9</sup> and is characterized by severe anemia and jaundice without hemoglobinemia and hemoglobinuria. Other clinical signs include weight loss, decreased milk production, abortions, hyperexitability (as a result of cerebral anoxia), and sudden death.<sup>29</sup> Recovered animals become persistently infected with *A. marginale* and serve as a reservoir of the organism within a herd.<sup>16</sup>

Available testing for *A. marginale* infection in cattle includes both direct and indirect detection methods.

stained peripheral blood smears and polymerase chain reaction (PCR) techniques. Indirect methods, which detect antibodies directed against A. marginale surface antigens, include the rapid card agglutination test and competitive enzyme-linked immunosorbent assay (cELISA) based on detection of antibodies specific for major surface protein 5 (MSP-5). The evaluation of peripheral blood smears is a commonly used technique that is most sensitive when used to evaluate animals that are clinically ill, typically during the acute phase of disease,<sup>12</sup> but parasites are seldom detected microscopically in chronic infections. Polymerase chain reaction detects DNA of the parasite and therefore recognizes active infection, and the relative amount of DNA detected correlates with the level of parasitemia.<sup>4</sup> The card agglutination test employs a suspension of intact A. marginale parasites, which have been separated from erythrocytes by lysis in a French pressure cell and stained with fast green dye.<sup>2,35</sup> The diagnostic sensitivity (Se) and specificity (Sp) of the card test has been estimated as 98% and 99%, respectively.<sup>26</sup> The diagnostic accuracy of the MSP-5 cELISA estimated relative to a nested PCR coupled with MSP-5 sequence analysis and hybridization at a cutoff point of 28% inhibition had a relative Se of 96% and Sp of 95%.<sup>31</sup>

Direct methods, which detect the organism or its DNA, include the evaluation of Wright–Giemsa-

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Diagnostic Se and Sp together represent the accuracy and vary with the expected use of the test.<sup>20</sup> Tests evaluated for diagnosis in acute infections might not have the same accuracy when used for screening chronically infected carrier animals. Validation of assays can be challenging because the true disease status of all animals is infrequently known with certainty. Highly specific tests (Sp  $\approx$  1) can provide evidence that an animal is truly infected but commonly are imperfectly sensitive (Se < 1). Statistical methods that do not require the assumption of a perfect reference test have been developed, 11,19,21 and these methods can be employed for the validation of diagnostic assays. The objective of the study reported here was to estimate the accuracy of assays for detection of A. marginale infection in lactating dairy cattle of Puerto Rico using Bayesian methods without a perfect reference test.

# Materials and methods

## Sample collection

The selection of farms and cattle within farms has been described in a previous report.<sup>32</sup> In brief, commercial dairy farms in Puerto Rico constituted the list frame and were randomly selected after stratification by the 4 major ecological zones of the island and the 3 herd sizes. Lactating cattle within herds were randomly selected based on either a simple random sample or systematically as cattle exited the milking parlor. The number of selected farms was based on estimation of a herd-level prevalence of A. marginale infection of 50% (to maximize sample size because previous information was not available) and the within herd sample size was calculated based on the minimum sample size to detect disease assuming at least an 8% prevalence in truly infected herds. Two additional volunteer dairy herds in Puerto Rico and a shipment of heifers from mainland United States were also included in the diagnostic investigations.

Two blood samples were collected from each selected cow after milking via coccygeal venipuncture. One sample was drawn into a 10-ml vacutainer tube containing no anticoagulant and another containing ethylenediamine tetra-acetic acid. Samples were transported on ice to the laboratory where blood films were immediately prepared, serum was separated, and serum and whole blood specimens were frozen at  $-25^{\circ}$ C until testing.

## **Diagnostic testing**

All diagnostic assays were performed by individuals blinded to the results of other tests.

*Wright–Giemsa-stained direct smears.* Blood films were prepared from anticoagulated blood, air dried, and stained with Wright–Giemsa stain by a single investigator (JHR) in a research laboratory at the University of Puerto Rico, Mayagüez Campus. Slides were transported to the Department of Physiological Sciences at the University of Florida and evaluated using light microscopy by a laboratory assistant who had no prior knowledge of other test results on any sample. Small (0.3–1.0  $\mu$ m in diameter), dark blue to black, round or irregular shaped inclusion bodies with the majority close to the margin of the erythrocyte<sup>34</sup> were considered a positive result for *A. marginale* infection.

Quantitative polymerase chain reaction. Quantitative PCR was performed in a research laboratory by investigators (MDD, ARA) at the University of Florida (Gainesville, FL). DNA was extracted from 200  $\mu$ l of whole, anticoagulated blood using the QIAamp DNA Mini Kit or QIAamp DNA Blood Mini Kit<sup>a</sup> according to the manufacturer's instructions. The DNA was resuspended in molecular biology grade water and stored at  $-20^{\circ}$ C until testing.

The OPAG2 gene sequence was amplified by quantitative PCR (qPCR) based on a previous report<sup>3</sup> employing 0.4  $\mu$ M of each primer (RVM06-amarg: 5'-AAAA-CAGGCTTACCGCTCCAA-3' and RVM07-amarg: 5'-GGCGTGTAGCTAGGCTCAAAG T-3') and 0.2  $\mu$ M of the probe (RVM08-PROBE-amarg: 5'-CTCTCCTCT-GCTCAGGGCTCTGCG-3') in a 25- $\mu$ l volume employing sequence detection system (SDS) software.

Each PCR reaction contained 12.5 µl of the master solution,<sup>b</sup> 0.25 µl of 0.4 µM RVM06 and RVM07 primers, 0.125 µl of the RVM08 probe, 6.875 µl of molecular biology-grade water, and 5 µl of purified DNA. Reactions were performed in an automated DNA thermal cycler<sup>c</sup> for 40 cycles according to the manufacturer's instructions. After an initial, one-time denaturing step of 20 sec at 95°C, each cycle consisted of 3 sec at 95°C for melting and 30 sec at 60°C for annealing/extending. Negative controls included reaction mixtures without target DNA. An OPAG2 construct in a concentration of  $4.025 \times 10^{11}$  copies/µl was serially diluted to create a standard curve composed of 9 points: 10<sup>9</sup>, 10<sup>8</sup>, 10<sup>7</sup>, 10<sup>6</sup>, 10<sup>5</sup>, 10<sup>4</sup>, 10<sup>3</sup>, 10<sup>2</sup>, and 10<sup>1</sup> OPAG2 copies. Copy numbers for each test sample were calculated based on the standard curves and specimens, with 11 or more OPAG2 copies were considered qPCR positive. The cutoff was chosen to limit the number of false positives and based on previous research suggesting a 10 copy detection limit for qPCR assays.<sup>6</sup>

Rapid card agglutination test. Anaplasma card tests<sup>d</sup> were performed by an investigator (GLD) in a research laboratory at Texas A&M University (College Station, TX) on serum samples using a previously published protocol<sup>2</sup> with addition of normal bovine sera.<sup>18</sup> Reagents and test serum were equilibrated to room temperature prior to testing. Thirty microliters of normal bovine serum, 30  $\mu$ l of test serum, and 15  $\mu$ l of anaplasma antigen were added to each test circle. The 3 components were mixed and cards were rotated at 100 rpm on an orbital ELISA plate shaker for 4 min. Reactions with visible agglutination immediately after the rotation step were classified as test positive.

*MSP-5 competitive ELISA*. Sera were tested for antibodies against *A. marginale* using a commercially available MSP-5 cELISA<sup>e</sup> by a single investigator (JHR) at the State Veterinary Diagnostic Laboratory Dr. Gabriel González-Calderín in Dorado, Puerto Rico. Test procedures were performed according to manufacturer recommendations and have been described in a previous report.<sup>32</sup> An ELISA

Population and tests	Parameter	Prior probability distribution ( $\beta$ )	Mode	Median	95% probability interval
Sample population	Prevalence	12.4, 37.3	0.24	0.25	0.141, 0.377
MSP-5 cELISA	Sensitivity	20, 1.8	0.96	0.93	0.774, 0.991
	Specificity	20, 2	0.95	0.92	0.762, 0.988
qPCR	Sensitivity	20, 2	0.95	0.92	0.762, 0.988
*	Specificity	200, 2	1.00	0.99	0.973, 0.999
Card	Sensitivity	20, 1.5	0.97	0.94	0.794, 0.995
	Specificity	40, 1.5	0.99	0.97	0.890, 0.997

**Table 1.** Beta prior probability distributions for unknown parameters in a Bayesian model to evaluate tests for bovine anaplasmosis in 2,331 dairy cattle from 79 herds in Puerto Rico in which the true infection status was unknown.\*

\* MSP-5 = major surface protein 5; cELISA = competitive enzyme-linked immunosorbent assay; qPCR = quantitative polymerase chain reaction.

microplate reader<sup>f</sup> linked to a computer software program<sup>g</sup> was used to measure and record optical densities (ODs) at 650 nm. Percent inhibition was calculated as (mean OD of negative control – mean OD of test sera)/(mean OD of negative control)  $\times$  100, and results were interpreted at a cutoff of 30% inhibition.<sup>26</sup> Samples with greater than or equal to 30% inhibition were considered positive.

#### Statistical analysis

Diagnostic accuracy of the card test and MSP-5 cELISA were estimated relative to qPCR results. Sensitivity was estimated as the proportion of positive test results for each test within those cattle that tested positive by qPCR. Specificity was similarly estimated within cattle that tested negative on qPCR. The design effect<sup>25</sup> was estimated to adjust for the clustered sampling design and 95% confidence intervals (CI) were calculated using available software.<sup>h</sup> Youden index was calculated as Se + Sp - 1.

Diagnostic accuracy of the card test, MSP-5 cELISA, and qPCR were estimated in a latent class analysis using a Bayesian framework (evaluation of direct smears were excluded because of few positive tests). Prior probability distributions for this analysis (Table 1) were based on published literature<sup>26,31</sup> and modified by expert opinion because previous studies employed different reference standards. A 3-test, single population model was used assuming conditional independence between pairs of diagnostic tests. All tests were dichotomized as positive or negative based on the descriptions in the previous sections for the estimation of Se, Sp, and prevalence. More information related to this modeling approach can be found elsewhere.<sup>14</sup>

Markov chain Monte Carlo (MCMC) techniques were employed using available statistical software<sup>i</sup> to iteratively estimate diagnostic accuracy. Autocorrelation among iterate values was assessed, and only every third value was retained to reduce the impact of this correlation. Convergence was assessed by evaluating plots of model parameter iterates for all variables and was reached when parameter values (iterates) had no discernible trend over successive iterations. Convergence was further assessed by calculating the Gelman–Rubin statistic available in the software. Iterate values obtained before convergence, termed the analysis burn-in, were not used for inferences. The first 200,000 iterations were discarded as the burn-in and inferences were made based on the subsequent 20,000 iterations. Median values and percentiles were used as point estimates and probability intervals (PI), respectively. The sensitivity analysis of model results to changes in prior probability distributions was assessed by replacing informative with noninformative priors and repeating the analysis.

An empirical Bayesian approach was used to investigate the accuracy of the MSP-5 cELISA. Prior probability distributions were generated based on the results of the 3test, single population model previously described (Table 2). The MSP-5 cELISA was evaluated quantitatively at 4 possible cutoff values, which were 15%, 30%, 55%, and 80% inhibition. These cutoff values appeared to provide adequate number of observations for each possible test result category. The analysis was performed assuming a single population, dichotomous interpretation of card and qPCR results, and conditional independence between tests. A similar analytic approach has been previously described for Johne's disease in cattle.<sup>15</sup>

Receiver-operator characteristic (ROC) curves were plotted for the 4 evaluated cutoffs by connecting the points of the 1 – Sp (x-axis) by Se (y-axis). Area under the estimated ROC curve (AUC) was calculated by the trapezoid approximation method.<sup>27</sup> Using this method, AUC is equal to the summation of areas corresponding to adjacent trapezoids formed by the mean value of successive sensitivities (mean height of trapezoid) and difference in successive specificities (base width). Category-specific likelihood ratios (LR) were estimated as the change in Se divided by the change in Sp ( $\Delta$ Se/ $\Delta$ Sp) between adjacent cELISA categories.

The quantitative cELISA model was also implemented using MCMC techniques in available software.<sup>i</sup> Autocorrelation among iterate values was assessed, and only every 10th value was retained. Convergence was assessed in the same manner as the previously described model. The first 200,000 iterations were discarded as the burn-in, and inferences were made based on the subsequent 20,000 iterations.

#### Results

There were 2,331 cattle sampled from 79 herds that had complete test result information. Only 5 cows were recognized to have *A. marginale* infection based

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**Table 2.** Beta prior probability distributions for unknown parameters in an empirical Bayesian model to evaluate a major surface protein 5 (MSP-5) competitive enzyme-linked immunosorbent assay (cELISA) for bovine anaplasmosis in 2,331 dairy cattle from 79 herds in Puerto Rico.\*

Population and tests	Parameter	Prior probability distribution ( $\beta$ )	Mode	Median	95% probability interval
Sample population	Prevalence	113, 401	0.22	0.22	0.185, 0.257
MSP-5 cELISA	Sensitivity	1, 1	NA	0.50	0.025, 0.975
	Specificity	1, 1	NA	0.50	0.025, 0.975
qPCR	Sensitivity	81, 40	0.67	0.67	0.584, 0.750
•	Specificity	264, 3	0.99	0.99	0.973, 0.998
Card	Sensitivity	57, 100	0.36	0.36	0.290, 0.440
	Specificity	264, 3	0.99	0.99	0.973, 0.998

\* qPCR = quantitative polymerase chain reaction; NA = not applicable because uniform (noninformative) prior where all values between 0 and 1 are equally likely.

on examination of peripheral blood smears, and this test was not included in diagnostic evaluations. One cow with a positive smear was negative on all other tests. Two cattle with positive smears were also positive on MSP-5 cELISA and qPCR but negative on the card test. The other 2 cattle were positive on MSP-5 ELISA and card but negative on qPCR. Fifteen percent (348/2,331) of sampled cattle were positive on qPCR, 7% (174/2,331) positive on the card test, and 30% (699/2,331) positive on the cELISA at the 30% inhibition cutoff (Table 3). The Se and Sp of the MSP-5 cELISA relative to qPCR were 94.2% (95% CI: 89.5–97.0%) and 81.1% (95% CI: 77.2-84.4%), respectively. The Se and Sp of the card test relative to qPCR were 27.3% (95% CI: 22.1-33.2%) and 96.2% (95% CI: 94.6–97.3%), respectively.

The Bayesian model based on dichotomized results estimated the Se of the card test to be only 33.6% (Table 4). The estimated Se of qPCR was also lower than expected at 67.0%. The Se and Sp of the MSP-5 cELISA were 99% and 89%, respectively. Sensitivity analysis did not suggest undue influence by prior distributions (data not shown). Youden indexes were 0.88, 0.66, and 0.33 for the MSP-5 cELISA, qPCR, and card test, respectively.

The distribution of MSP-5 cELISA results appeared bimodal but encompassed the range of possible values (Fig. 1). Sensitivity (95% PI) of the MSP-5 cELISA was 55% (49–61%), 52% (47–59%),

47% (42–53%), and 15% (12–19%) for the 15%, 30%, 55%, and 80% inhibition cutoffs, respectively. Specificity (95% PI) of the MSP-5 cELISA was 91% (88–93%), 96% (93–98%), 98% (96–1.0%), and 100% (100–100%) for the 15%, 30%, 55%, and 80% inhibition cutoffs, respectively. The resulting ROC curve based on all evaluated cutoffs (Fig. 2) had an AUC (95% PI) of 0.748 (0.711–0.787). Likelihood ratios (95% PI) for the MSP-5 cELISA were 0.50 (0.42–0.57), 0.44 (0.19–0.85), 2.4 (1.1–6.6), 22 (6.6–373), and 310 (58–1670) for the <15%, 15–29%, 30–54%, 55–79%, and ≥80% inhibition categories, respectively.

# Discussion

The prevalence of *A. marginale* infection was estimated to be 22% within lactating dairy cattle of Puerto Rico. This was slightly lower than the MSP-5 cELISA seroprevalence of 27% estimated within this sample<sup>32</sup> and toward the lower end of the range of prevalence reported for the Caribbean region.<sup>5</sup> There was a very low prevalence of cattle positive by direct examination of Wright–Giemsa-stained blood smears (5/2331) suggesting few acute infections and possible endemic stability within some herds on the island. Relative to qPCR results, the MSP-5 cELISA had a lower Sp (81%) than suggested by previous studies.<sup>26,31</sup> Sensitivity of the card test was also lower than suggested by previous literature<sup>26</sup> when estimated

 Table 3.
 Multinomial data used in statistical methods for the evaluation of tests for bovine anaplasmosis in 2,331 dairy cattle from 79 herds in Puerto Rico in which the true infection status was unknown.\*

		Counts in each MSP-5 cELISA category					
qPCR	Card	<15%	15–29%	30–54%	55-79%	≥80%	Total
_	_	1,179	422	127	95	83	1,906
_	+	10	5	7	19	36	77
+	_	6	10	32	102	101	251
+	+	0	0	8	35	54	97

\* qPCR = quantitative real-time polymerase chain reaction; MSP-5 = major surface protein 5; cELISA = competitive enzyme-linked immunosorbent assay; - = negative test results; + = positive test results.

**Table 4.** Estimates of bovine anaplasmosis prevalence and diagnostic test accuracy in 2,331 dairy cattle from 79 herds in Puerto Rico in which the true infection status was unknown (%).

Parameter	Median		
Prevalence	21.8 (19.4, 24.5)		
MSP-5 cELISA			
Sensitivity Specificity	98.8 (96.2, 99.9) 89.2 (86.8, 91.9)		
qPCR			
Sensitivity Specificity	67.0 (59.9, 73.6) 99.2 (98.7, 99.7)		
Card			
Sensitivity Specificity	33.6 (28.9, 38.6) 99.1 (98.5, 99.5)		

\* Numbers in parentheses indicate 95% probability interval. MSP-5 = major surface protein 5; cELISA = competitive enzymelinked immunosorbent assay; qPCR = quantitative polymerase chain reaction.

relative to qPCR. PCR frequently are considered to have high diagnostic Sp,<sup>7,13,22,24</sup> suggesting that it is a relatively good gold standard positive assay but can have less than perfect Se. When a test with almost perfect Sp but less than perfect Se (e.g., qPCR) is used as the reference standard, there will be some truly infected animals included in the noninfected group, but all noninfected animals will be correctly classified. Estimates of diagnostic accuracy for other tests (e.g., card, cELISA) calculated based on that reference standard will be in error because of this misclassification. It is therefore possible that the true Se of the MSP-5 cELISA and card test might be less than the relative estimates because of an underestimation of the number of false negative results.

Previous studies estimating the accuracy of various tests for bovine anaplasmosis have employed exper-



**Figure 1.** Distribution of bovine anaplasmosis serum major surface protein 5 competitive enzyme-linked immunosorbent assay results for 2,331 dairy cattle from 79 herds in Puerto Rico summed for 20 categories of percent inhibition values at 5% intervals. True infection status of animals was unknown.



**Figure 2.** Receiver-operating characteristic curve for a bovine anaplasmosis serum major surface protein 5 competitive enzyme-linked immunosorbent assay evaluated at 4 cutoffs (15%, 30%, 55%, and 80% inhibition) for 2,331 dairy cattle from 79 herds in Puerto Rico when the true infection status of animals was unknown.

imental infection or estimated relative measures of accuracy.<sup>10,17,23,26,28,31</sup> To the authors' knowledge, this is the first attempt at estimating accuracy of these tests using a Bayesian latent class approach. The MSP-5 cELISA had the highest accuracy of the 3 evaluated tests based on the dichotomous interpretation with a Youden index of 0.88. Sensitivity of the cELISA was estimated to be quite high (99%) suggesting that this assay would be an appropriate screening test in chronically infected or subclinical dairy cattle. The relatively low Sp (89%), however, suggested that in low-prevalence situations or in herds of undetermined infection status a more specific assay would be required to confirm positive cELISA results. The sensitivities of both qPCR and the card test were relatively low, suggesting that they would not be good first choices to use as screening tests. Both assays had high Sp, suggesting their possible use for confirmation. The specificities were comparable (99.2% vs. 99.1%), but the Se of qPCR was greater, and based on the biologic mechanisms of these tests, PCR should be considered a better choice for confirmatory testing. However, the card test might still have usefulness in some situations because of its low cost, technical simplicity, and rapidity of results.

The overall accuracy of the MSP-5 cELISA was also evaluated over multiple cutoffs employing an empirical Bayesian approach. The quantitative results at the 30% inhibition cutoff were different than the results of the dichotomous model evaluated at this cutoff. The Se was noticeably lower (52% vs. 99%) and the Sp higher (96% vs. 89%). The accuracies of the qPCR and card test and the prevalence did not demonstrate variability to this same extent (data not shown). Uniform (uninformative) priors were employed for the Se and Sp of the MSP-5 cELISA, but informative priors were used on the other unknown parameters, and this might explain why other measures did not differ greatly between analytic approaches. Estimated likelihood ratios suggest that lower values in the MSP-5 cELISA might not be extremely effective at ruling out *A. marginale* infection (LR = 0.5), but results in the higher categories would be effective at ruling in infection (LR = 22–310).

Validation of assays is important, and employed study designs should be appropriate for the expected use of the test. Such studies need to consider both sources of systematic and random error. Selection bias is a systematic error that can occur when the animals studied do not reflect the target population of the assay. The target population of this evaluation was clinically healthy adult lactating dairy cattle of Puerto Rico. A benefit of latent class analyses is that the target population can be accurately sampled without the concern of identifying animals that are considered gold standard positive or negative based on criteria that might make them systematically different than the proposed target population. Another important source of error in validation studies is the method of gold standard, or true status determination. Relative measures of accuracy are frequently estimated, but these will be biased when the reference test is not perfect. Despite their limitation, relative measures can be especially useful when the reference test has near perfect Sp and is the consensus test of choice for the condition under evaluation. Examples of common reference tests for the determination of relative accuracies include agent isolation techniques or histopathologic examinations.

Latent class analyses for test validation do not require identification of a reference test or the prior determination of the true disease status for sampled animals. This benefit comes at the cost of trading a biological definition of disease (or affected) for a statistical model that in essence estimates the probability of disease (or affected) in each category of test results (cross-classified table of counts). Unknown parameters are found that are most likely given the statistical model and observed data without any researcher control over disease definition. The shape of the likelihood function for the data and identification of the most likely values for diagnostic accuracy occur within complex systems and over multidimensional parameter spaces. Models based on the results of 2 tests in 2 populations have been studied to a greater extent than more complicated models. The variation in results for MSP-5 cELISA accuracy across the 2 modeling approaches likely reflects the complexity of the quantitative model.

Latent class modeling approaches require making strong assumptions that should be assessed.<sup>30</sup> These assumptions include different disease prevalence among sampled populations, equal diagnostic accuracy across populations, and conditional independence between tests. The employed model assumed results were from a single population, so the only relevant assumption is the conditional independence between tests. The 2 serologic tests, MSP-5 cELISA and card test, might be expected to be conditionally dependent within truly affected cattle because they are both designed to detect antibodies specific for A. marginale infection. The acid buffering of the card antigen<sup>2</sup> suggests that it might preferentially detect bovine immunoglobulin of the immunoglobulin G<sub>1</sub>  $(IgG_1)$  subclass as has been reported for the brucellosis agglutination tests.<sup>1</sup> The buffered pH of the anaplasma card test is higher than the brucellosis card test, and therefore the true subclass binding specificity is unknown. The cELISA should detect multiple antibody subclasses because all can compete with the monoclonal antibody for the antigen-binding sites on the ELISA plate. The possibility of important dependence terms was not assessed, however, because the 3-test single population model only provides 7 degrees of freedom for estimation, and there were already 7 unknown parameters (3 Se, 3 Sp, and prevalence). An additional conditional dependence term would make the number of unknown parameters greater than the number of degrees of freedom available for estimation. Incorporation of informative prior information in a Bayesian framework can relax the degrees of freedom requirement. However, the effect of adding the conditional dependence term would not be distinguishable from identifiability problems that might develop. Another important assumption is that the prior probability distributions do not have excessive influence on the observed results. Findings of the sensitivity analysis did not identify prior probabilities as an important source of variation.

Bayesian statistical models might not converge and this problem occurs more frequently in situations involving complicated likelihood functions. Results from a model that does not converge should not be used to make inferences. Convergence problems can occur if the assumptions of the statistical model are violated, if the model is not specified correctly, and if data do not contain enough information to estimate all unknown parameters. Convergence and model misspecification are serious problems that must be addressed for the valid interpretation of results from these analyses. All evaluated models appeared to converge, and this issue should not have adversely affected presented results.

Bovine anaplasmosis is an economically important condition of cattle in tropical and subtropical regions of the world. Control of this disease requires the development of economic and feasible testing strategies based on sound scientific principles. The MSP-5 cELISA appears to be the test of choice for screening subclinical cattle based on the high estimated Se, rapidity of results, relative low cost, and ease of standardization. The high estimated Sp of qPCR suggests that it would be an effective confirmatory test for cELISA-positive cattle. Confirmation would be necessary to increase the positive predictive value in low-prevalence-testing situations and when infection status (of animal or herd) must be known with a high degree of confidence. The card test would likely not be as effective for confirmation of cELISApositive cattle despite the high estimated Sp because results could be conditionally dependent within truly infected cattle. The card test, however, might be useful when qPCR confirmation is not possible because of time, cost, and availability constraints. Though not evaluated in this study, the card test might also show promise for diagnosis in clinically affected cattle because of the high Sp, low cost, and the ability to perform the test in the field.

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#### Sources and manufacturers

- a. Qiagen Inc., Valencia, CA.
- b. TaqMan<sup>®</sup> Fast Universal PCR Master Mix (2×), No AmpErase<sup>®</sup> UNG (PN 4352042), Applied Biosystems, Foster City, CA.
- c. 7500 Fast Real-Time PCR System, Applied Biosystems, Foster City, CA.
- d. Reagent 140-CMP, National Veterinary Services Laboratories, Ames, IA.
- e. Anaplasma Antibody Test Kit, cELISA, catalog no. 282-5; VMRD Inc., Pullman, WA.
- f. ELX800, BIOTEK Instruments Inc., Winooski, VT.
- g. IDEXX xChek<sup>TM</sup> 3.2, IDEXX Laboratories, Inc., Westbrook, ME.
- h. Epi Info version 6.04d for Windows, Centers for Disease Control and Prevention, Atlanta, GA.
- WinBUGS Version 1.4, MRC Biostatistics Unit, Cambridge, U.K.

### References

1. Allan GS, Chappel RJ, Williamson P, McNaught DJ: 1976, A quantitative comparison of the sensitivity of serological test

for bovine brucellosis to different antibody classes. J Hyg (Lond) 76:287–298.

- Amerault TE, Roby TO: 1968, A rapid card agglutination test for bovine anaplasmosis. J Am Vet Med Assoc 153: 1828–1834.
- Barbet AF, Agnes JT, Moreland AL, et al.: 2005, Identification of functional promoters in the msp2 expression loci of *Anaplasma marginale* and *Anaplasma phagocytophilum*. Gene 353:89–97.
- Barbet AF, Palmer GH, Myler PJ, McGuire TC: 1987, Characterization of an immunoprotective protein complex of *Anaplasma marginale* by cloning and expression of the gene coding for polypeptide Am105L. Infect Immun 55:2428–2435.
- Camus E, Montenegro-James S: 1994, Bovine anaplasmosis and babesiosis in the Lesser Antilles: risk assessment of an unstable epidemiologic situation. Vet Res 25:313–317.
- 6. Carelli G, Decaro N, Lorusso A, et al.: 2007, Detection and quantification of *Anaplasma marginale* DNA in blood samples of cattle by real-time PCR. Vet Microbiol 124:107–114.
- Checkley SL, Waldner CL, Appleyard GD, et al.: 2003, The comparison of 5 diagnostic tests for diagnosis of Johne's disease in Western Canada. J Appl Res Vet Med 1:196–205.
- 8. Crom RL: 1992, Eradication of *Boophilus microplus* (Acari: Ixodidae) in Puerto Rico. Ann N Y Acad Sci 653:64–71.
- 9. Dumler JS, Barbet AF, Bekker CP, et al.: 2001, Reorganization of genera in the families Rickettsiaceae and Anaplasmataceae in the order Rickettsiales: unification of some species of *Ehrlichia* with *Anaplasma*, *Cowdria* with *Ehrlichia* and *Ehrlichia* with *Neorickettsia*, descriptions of six new species combinations and designation of *Ehrlichia equi* and 'HGE agent' as subjective synonyms of *Ehrlichia phagocytophila*. Int J Syst Evol Microbiol 51:2145–2165.
- Duzgun A, Schuntner CA, Wright IG, et al.: 1988, A sensitive ELISA technique for the diagnosis of *Anaplasma marginale* infections. Vet Parasitol 29:1–7.
- Enøe C, Georgiadis MP, Johnson WO: 2000, Estimation of sensitivity and specificity of diagnostic tests and disease prevalence when the true disease state is unknown. Prev Vet Med 45:61–81.
- Eriks IS, Palmer GH, McGuire TC, et al.: 1989, Detection and quantification of *Anaplasma marginale* in carrier cattle by using a nucleic acid probe. J Clin Microbiol 27:279–284.
- Farcas GA, Zhong KJ, Mazzulli T, Kain KC: 2004, Evaluation of the RealArt Malaria LC real-time PCR assay for malaria diagnosis. J Clin Microbiol 42:636–638.
- Fosgate GT, Adesiyun AA, Hird DW, Hietala SK: 2006, Likelihood ratio estimation without a gold standard: a case study evaluating a brucellosis c-ELISA in cattle and water buffalo of Trinidad. Prev Vet Med 75:189–205.
- Fosgate GT, Scott HM, Jordan ER: 2007, Development of a method for Bayesian nonparametric ROC analysis with application to an ELISA for Johne's disease in dairy cattle. Prev Vet Med 81:178–193.
- French DM, Brown WC, Palmer GH: 1999, Emergence of *Anaplasma marginale* antigenic variants during persistent rickettsemia. Infect Immun 67:5834–5840.
- Gonzalez EF, Long RF, Todorovic RA: 1978, Comparisons of the complement-fixation, indirect fluorescent antibody, and card agglutination tests for the diagnosis of bovine anaplasmosis. Am J Vet Res 39:1538–1541.
- Howarth A, Hokama Y, Amerault TE: 1976, The modified card agglutination test: an accurate tool for detecting anaplasmosis in Columbian black-tailed deer. J Wildl Dis 12:427–434.
- 19. Hui SL, Walter SD: 1980, Estimating the error rates of diagnostic tests. Biometrics 36:167–171.

- Jacobson RH: 1998, Validation of serological assays for diagnosis of infectious diseases. Rev Sci Tech 17:469–526.
- Joseph L, Gyorkos TW, Coupal L: 1995, Bayesian estimation of disease prevalence and the parameters of diagnostic tests in the absence of a gold standard. Am J Epidemiol 141:263–272.
- 22. Kelley GO, Zagmutt-Vergara FJ, Leutenegger CM, et al.: 2004, Evaluation of five diagnostic methods for the detection and quantification of *Myxobolus cerebralis*. J Vet Diagn Invest 16:202–211.
- 23. Knowles D, Torioni de Echaide S, Palmer G, et al.: 1996, Antibody against an *Anaplasma marginale* MSP5 epitope common to tick and erythrocyte stages identifies persistently infected cattle. J Clin Microbiol 34:2225–2230.
- 24. Kurabachew M, Enger O, Sandaa RA, et al.: 2004, A multiplex polymerase chain reaction assay for genus-, groupand species-specific detection of mycobacteria. Diagn Microbiol Infect Dis 49:99–104.
- McDermott JJ, Schukken YH, Shoukri MM: 1994, Study design and analytic methods for data collected from clusters of animals. Prev Vet Med 18:175–191.
- 26. Molloy JB, Bowles PM, Knowles DP, et al.: 1999, Comparison of a competitive inhibition ELISA and the card agglutination test for detection of antibodies to *Anaplasma marginale* and *Anaplasma centrale* in cattle. Aust Vet J 77:245–249.
- 27. Munem MA, Foulis DJ: 1984, Calculus with analytic geometry, 2nd ed. Worth Publishers, New York, NY.
- 28. Nakamura Y, Shimizu S, Minami T, Ito S: 1988, Enzymelinked immunosorbent assay using solubilised antigen for

detection of antibodies to Anaplasma *marginale*. Trop Anim Health Prod 20:259–266.

- 29. Richey EJ, Palmer GH: 1990, Bovine anaplasmosis. Compend Contin Educ Pract Vet 12:1661–1668.
- Toft N, Jorgensen E, Hojsgaard S: 2005, Diagnosing diagnostic tests: evaluating the assumptions underlying the estimation of sensitivity and specificity in the absence of a gold standard. Prev Vet Med 68:19–33.
- 31. Torioni de Echaide S, Knowles DP, McGuire TC, et al.: 1998, Detection of cattle naturally infected with *Anaplasma marginale* in a region of endemicity by nested PCR and a competitive enzyme-linked immunosorbent assay using recombinant major surface protein 5. J Clin Microbiol 36:777–782.
- 32. Urdaz-Rodriguez JH, Fosgate GT, Alleman AR, et al.: 2009, Seroprevalence estimation and management factors associated with high herd seropositivity for *Anaplasma marginale* in commercial dairy farms of Puerto Rico. Trop Anim Health Prod 41:1439–1448.
- van Volkenberg HL: 1939, Observations of anaplasmosis as it occurs in Puerto Rico. Vet Med 34:234–236.
- 34. World Organization for Animal Health (OIE): 2008, Bovine anaplasmosis. *In:* Manual of diagnostic tests and vaccines for terrestrial animals, 6th ed., pp. 599–610. OIE, Paris, France.
- Wright IG: 1990, Immunodiagnosis of and immunoprophylaxis against the haemoparasites *Babesia* sp. and *Anaplasma* sp. in domestic animals. Rev Sci Tech 9:345–356.