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How to cite this manuscript

If you make reference to this version of the manuscript, use the following information:

McReynolds, S. W., Sanderson, M. W., Reeves, A., & Hill, A. E. (2014). Modeling the impact of vaccination control strategies on a foot and mouth disease outbreak in the Central United States. Retrieved from <http://krex.ksu.edu>

Published Version Information

Citation: McReynolds, S. W., Sanderson, M. W., Reeves, A., & Hill, A. E. (2014). Modeling the impact of vaccination control strategies on a foot and mouth disease outbreak in the Central United States. *Preventive Veterinary Medicine*, 117(3-4), 487-504.

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Digital Object Identifier (DOI): doi:10.1016/j.prevetmed.2014.10.005

Publisher's Link: <http://www.sciencedirect.com/science/article/pii/S0167587714003213>

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1 **Modeling the impact of vaccination control strategies on a foot and mouth disease outbreak in**
2 **the Central United States.**

3

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5

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13

14 **Abstract**

15 The central United States (U.S.) has a large livestock population including cattle, swine, sheep and
16 goats. Simulation models were developed to assess the impact of livestock herd types and vaccination
17 on Foot and Mouth Disease (FMD) outbreaks using the North American Animal Disease Spread
18 Model. In this study, potential FMD virus outbreaks in the central region of the U.S. were simulated to
19 compare different vaccination strategies to a depopulation only scenario. Based on data from the U.S.
20 Department of Agriculture National Agricultural Statistics Service, a simulated population of 151,620
21 livestock operations characterized by latitude and longitude, production type, and herd size was
22 generated. For the simulations, a single 17,000 head feedlot was selected as the initial latently infected
23 herd in an otherwise susceptible population. Direct and indirect contact rates between herds were
24 based on survey data of livestock producers in Kansas and Colorado. Control methods included ring
25 vaccination around infected herds. Feedlots $\geq 3,000$ head were either the only production type that was
26 vaccinated or were assigned the highest vaccination priority. Simulated vaccination scenarios included
27 low and high vaccine capacity, vaccination zones of 10 km or 50 km around detected infected premises,
28 and vaccination trigger of 10 or 100 detected infected herds. Probability of transmission following
29 indirect contact, movement controls and contact rate parameters were considered uncertain and so were
30 the subjects of sensitivity analysis. All vaccination scenarios decreased number of herds depopulated
31 but not all decreased outbreak duration. Increased size of the vaccination zone during an outbreak
32 decreased the length of the outbreak and number of herds destroyed. Increased size of the vaccination
33 zone primarily resulted in vaccinating feedlots ≥ 3000 head across a larger area. Increasing the
34 vaccination capacity had a smaller impact on the outbreak and may not be feasible if vaccine
35 production and delivery is limited. The ability to vaccinate all the production types surrounding an
36 infected herd did not appear as beneficial as priority vaccination of feedlot production types that have
37 high numbers of indirect contacts. Outbreak duration, number of herds depopulated and the
38 effectiveness of vaccination were sensitive to indirect contact transmission probability and movement

39 restrictions. The results of this study will provide information about the impacts of disease control
40 protocols which may be useful in choosing the optimal control methods to meet the goals of rapid
41 effective control and eradication.

42

43 **Introduction**

44

45 Foot and Mouth Disease (FMD) is a highly contagious disease that affects all cloven-hooved
46 animals and is endemic in parts of Asia, Africa and South America. The FMD virus can spread rapidly
47 through susceptible livestock populations prior to the recognition of clinical signs (Burrows,
48 1968;Burrows et al., 1981); consequently, early detection prior to the spread of the disease is difficult.
49 FMD is a major constraint to international trade because countries currently free of FMD, like the
50 United States (U.S.), take every precaution to prevent the entry of the disease. The U.S. livestock
51 population is naïve to FMD with the last outbreak occurring in 1929 (Graves, 1979).

52 The potential impact of an outbreak in the U.S. would likely be devastating. A secure food
53 supply is vital to the economy with U.S. farms selling \$297 billion in agriculture products through
54 market outlets in 2007 (USDA-NASS 2007). In the U.S. the concern for FMD virus re-introduction
55 and the potential economic impacts have risen with the increase of international travel and trade of
56 animals and animal products. At the same time agriculture has become more concentrated with larger
57 capital investments (Hueston, 1993) resulting in increased risk to agricultural production and business
58 continuity.

59 Because FMD is a foreign animal disease in the U.S., there are few avenues available for the
60 study of potential impacts of and effective control strategies for the disease in the event of an
61 introduction. Epidemiological disease modeling is one such avenue. In such models, various control
62 measures, such as movement restrictions, increased biosecurity, depopulation, pre-emptive culling, and
63 vaccination have been implemented in various combinations to evaluate the spread of simulated

64 outbreaks (Ferguson et al., 2001; Gibbens et al., 2001; Bouma et al., 2003; Suttmoller et al., 2003; Perez
65 et al., 2004; Pluimers, 2004; Yoon et al., 2006; Volkova et al., 2011). Depending on the size of the
66 outbreak, timeliness of control implementation, the workforce capacity, and the available resources, the
67 optimal control strategy may vary. The efficacies of different control measures under different
68 conditions can be readily compared using epidemiological modeling.

69 In the U.S., epidemiological disease models have been used to estimate the potential economic
70 impacts of an outbreak. Pendell et al. (2007) estimated economic losses of an outbreak confined to
71 Kansas ranged from \$43 to \$706 million depending on the type of livestock herd that was initially
72 infected. In an economic model of the impact to the entire U.S., Paarlberg et al. (2002) estimated that
73 a FMD outbreak could decrease U.S. farm income by approximately \$14 billion and in 2012 it was
74 estimated that an outbreak originating from the proposed National Bio- and Agri-Defense Facility in
75 Kansas could exceed \$100 billion in costs (NBAF, 2012).

76 Epidemiological disease models are dependent on accurate estimates of the frequency and
77 distance distribution of contacts between livestock operations to estimate disease spread and impact,
78 and to guide control measures (Gibbens et al., 2001; Woolhouse and Donaldson, 2001; Dickey et al.,
79 2008; Premashthira et al., 2011). Previous studies that have modeled FMD outbreaks in the central
80 U.S. have relied on expert opinion or contact rates adapted from other regions (Pendell et al., 2007;
81 Greathouse, 2010; Premashthira, 2012). In order to improve the validity of models of this region of the
82 U.S., we used the results of a recent survey of livestock producers (McReynolds et al., 2014a) to inform
83 model parameters used in the current study.

84 The primary objective of this study was to model FMD outbreaks in the Central U.S., using the
85 best available information to establish rates of contact among herds in this region, to identify optimal
86 vaccination control strategies based on their effectiveness in minimizing simulated outbreak durations
87 and numbers of herds depopulated. A secondary objective was to analyze the sensitivity of the model
88 to specific input parameters, including movement controls, direct contact rate, indirect contact rate, and

89 probability of indirect transmission.

90

91 **Materials and Methods**

92

93 *Study Population*

94

95 The number of herds, type of herds and herd sizes at the county level were generated from the
96 U.S. agricultural census 2007 NASS data (NASS, 2007) and adjusted according to criteria by Melius et
97 al. (2006). The study area included Wyoming, South Dakota, Colorado, Nebraska, Kansas, the
98 northern region of New Mexico and Oklahoma, and the Texas Panhandle (Fig. 1). There were 151,620
99 livestock herds in the study area in 2007 (USDA, 2007) including 86,655 cow/calf, 3,232 dairy, 979
100 large feedlots ($\geq 3,000$ head), 25,096 small feedlots ($< 3,000$ head), 1,071 large swine ($\geq 1,000$ head),
101 6,463 small swine ($< 1,000$ head), 5,159 beef and swine, and 22,965 small ruminant herds (Table 1).
102 NASS data do not account for mixed production types such as beef-swine yet data suggest
103 approximately 7% of Kansas and Colorado herds report having both beef cattle and swine
104 (McReynolds et al., 2014a) To account for this production type seven percent of beef and swine
105 operations were randomly re-designated in the NASS data set from the population of cow/calf
106 operations and small swine in Kansas, Nebraska, Eastern Colorado, and Oklahoma (McReynolds et al.,
107 2014a). The total population was 39,413,228 animals in all production types (Table 1). Heterogeneous
108 random locations within counties were generated for herds using a weighting scheme based on altitude,
109 flatness, and human population developed by Lawrence Livermore National Laboratory for USDA
110 (Hullinger et al., 2009). This method assures that number of herds, number of animals in each herd and
111 production types match at the county level (herds are always allocated to the county they reside in
112 based on NASS data). The geo-located population data set was provided to the authors by USDA.

113

114 *Simulation model*

115

116 The North American Animal Disease Spread Model (NAADSM), an open source) herd-based
117 spatial stochastic epidemic simulation model (Harvey and Reeves, 2010; Harvey et al., 2007) was used
118 to model FMD eradication strategies. Scenarios were simulated for various FMD vaccination
119 protocols, and were compared to a scenario that made use of only depopulation of detected infected
120 herds and traced forward direct contacts of infected herds (Scenario 1). Modeled scenarios are listed in
121 Table 2 and include variations in vaccine capacity, vaccination zone diameter, and the number of
122 infected herds before a vaccination program is initiated. Simulated vaccination protocols included low
123 and high vaccine capacity, which were defined based on results from a Kansas and Colorado livestock
124 producer survey (McReynolds et al., 2014a). The livestock survey asked producers to report the time it
125 would take to vaccinate, tag, and keep records for their entire herd. Vaccination was carried out either
126 for large feedlots only (low vaccine capacity 1 herd per day by day 22 and 3 herds per day by day 40
127 and high vaccine capacity 8 herds per day by day 22 and 15 herds per day by day 40) or for all herd
128 types (low vaccine capacity 5 herds per day by day 22 and 10 herds per day by day 40 and high vaccine
129 capacity 50 herds per day by day 22 and 80 herds per day by day 40). When vaccination capacity was
130 limiting, herds were vaccinated according to a priority scheme based on production type. Vaccination
131 priority from highest to lowest for scenarios where all herd types could be vaccinated was: large feedlot
132 ($\geq 3,000$ head), small feedlot ($< 3,000$ head), large swine ($\geq 1,000$ head), small swine ($< 1,000$ head),
133 beef-swine, dairy, cow-calf, and small ruminant. Feedlots are prioritized for vaccination because the
134 large number of cattle on a premises makes it difficult to depopulate all of the cattle in a timely fashion
135 and because they are terminal animals that fit a vaccinate to slaughter strategy thus conserving
136 destruction capacity and production value. The low vaccine capacity was to simulate administration by
137 USDA personnel and the high capacity producer administration of vaccine. The vaccinated animals
138 remain in the population unless infected after their immune period ends.

139 The distributions for within herd prevalence of FMDV for NAADSM were produced using a
140 within herd prevalence model (WH) (Reeves, 2012a) based on estimates for the latent, subclinical
141 infectious, and clinical infectious stages. The WH model operates at the level of the individual animal,
142 and incorporates sources of individual-level variation such as variability in the durations of incubating
143 and infectious periods, the stochastic nature of the disease spread among individuals, the effects of
144 vaccination, and disease mortality (Reeves, 2012b). Distributions of the clinical stages of FMD in
145 individual animals were based on a meta-analysis of the duration of the disease states where the
146 infectious period was reported including the subclinical and clinical periods (Mardones et al., 2010).
147 The reported clinical period in Mardones et al., (2010) is the time when clinical signs are apparent
148 which includes a period when the animal is no longer infectious. The WH model requires durations for
149 the latent, subclinical infectious and clinical infectious stages. Distributions for the latent and
150 subclinical states were used directly as they are reported in Mardones et al. (2010) but the reported
151 distributions were not suitable for the clinical infectious period in WH and required adjustment for the
152 period when the animal is not infectious. As reported in figure 1 of Mardones et al. (2010) the
153 $\text{Subclinical period} + \text{Clinical period} = \text{Infectious period}$
154 *therefore*
155 $\text{Infectious period} - \text{Subclinical period} = \text{Clinical period}$
156 The clinical infectious period distribution for cattle, swine and small ruminants was calculated for *WH*
157 by using monte-carlo simulation (@Risk 5.01, Palisade Corp., Ithaca, NY, USA) to sample 10,000
158 values from the subclinical infectious period and the infectious period reported in Mardones et al.
159 (2010). When the sampled value from the infectious period was greater than the sampled value for the
160 subclinical period, the value for the subclinical period was subtracted from the sampled values for the
161 infectious period. The resulting distribution of values was fit to a theoretical distribution (@Risk 5.0.1)
162 to estimate the clinical infectious period for use in WH to estimate the within herd prevalence over time
163 for each production type. The probability of infection following a direct contact in NAADSM was

164 based on within-herd prevalence of the infected herd as a function of time since infection.

165 Model parameters were set to allow virus to spread by direct contact, indirect contact, and

166 airborne/local spread. In NAADSM a direct contact represents the movement of infected livestock

167 between premises. An indirect contact represents the movement of a fomite such as contaminated

168 vehicle, equipment, clothing, or a person between premises. Direct and indirect contacts between

169 livestock production types were based on a livestock contact survey in the central U.S. (McReynolds et

170 al., 2014a) (Appendix Tables A1 and A2). The direct contact rate was calculated from the reported

171 count of contacts between specific production types to provide an overall production type specific

172 number of contacts per day. Destination to source combinations for indirect contact were calculated

173 based on the total number of indirect contacts reported for each production type, multiplied by the

174 proportion of all indirect contact made to the respective production type to produce the number of daily

175 indirect contacts between each destination to source combination. For example if cow-calf operations

176 received 0.7 total visits from potential indirect contacts per day, and 18.8% of all potential indirect contacts

177 (across all production types) were to Cow-Calf operations then in 0.133 visits per day the previous production

178 type exposure of the indirect contact was a Cow-Calf operation resulting in an indirect contact between two

179 Cow-Calf operations ($0.7 * 18.8\% = 0.133$ contacts per day as shown in Table 2A). The daily indirect contact

180 rate between each production type was adjusted based on the assumption that not all production types

181 are equally connected (e.g. beef operations are more connected with each other than with swine

182 operations). The daily mean number of direct and indirect contacts between production types were

183 used to parameterize the model. Generation of actual direct and indirect contacts between production

184 types in the NAADSM model were stochastically generated for each infected herd each day from a

185 Poisson distribution with lambda equal to the calculated mean contact rate (direct and indirect) for that

186 production type combination (Tables A1 and A2). Specific susceptible recipient herds of direct or

187 indirect contacts were selected based on a random draw from the respective distance distribution for

188 contacts between specific production types (Tables A1 and A3). The probability of airborne/local

189 spread at 1 km was 0.5% per day and declined linearly to 0% at the maximum distance of spread of 3
190 km. The probability of local/airborne transmission was calculated based on distance between the
191 infected and susceptible herd, herd size and within herd prevalence. Actual transmission between the
192 infectious and susceptible herd was generated based on generation of a random number r between 0
193 and 1 where infection is transmitted when r is less than the calculated probability of transmission.

194 Days to first disease detection was a generated output by the NAADSM model based on the
195 probability of disease recognition within infected herds as a function of the amount of time the herd has
196 been clinical infectious. Actual detection of a clinical herd (both the initial and subsequent herds) was
197 based on generation of a random number r between 0 and 1 where the infected herd is detected when
198 when r is less than the calculated probability of recognition. The probability of recognition increased
199 over time within a herd peaking at 100% by day 10 in all herd types except small ruminants where
200 recognition probability did not reach 100% until day 14 following introduction of disease to that herd.

201 For all scenarios,

- 202 a) All herds detected positive and the forward traced direct contacts of detected herds were
203 depopulated.
- 204 b) The probability of indirect disease transmission following indirect contact between an
205 infected and susceptible herd was held fixed at 20% for all production types except swine
206 which was set at 30% to account for increased FMD virus shedding by swine based on
207 subject matter expert opinion solicited by USDA.
- 208 c) Direct contact through animal movement was linearly reduced to 10% of pre-outbreak
209 levels and indirect contacts were linearly reduced to 30% of pre-outbreak levels by day 7
210 after the first disease detection to allow for time delays in implementation and enforcement
211 of movement controls based on subject matter expert opinion solicited by USDA.
- 212 d) Depopulation capacity was linearly increased from 0 to 8 herds/day by day 10 and 16
213 herds/day by day 30 after first disease detection.

214 e) A 100% effective quarantine of infected premises and a ban on livestock movement from
215 known infected premises was assumed.

216 Depopulation was set to begin on day 2 after first disease detection of the outbreak. All scenarios
217 were run for 200 iterations. The mean, 5th and 95th percentiles of outbreak duration, number of
218 destroyed herds and number of animals vaccinated were monitored for convergence. The end of the
219 active disease phase (i.e., the point in time at which no infected herds remained in the population) was
220 the endpoint for all scenarios. Conditions of the NAADSM model used in this study of a hypothetical
221 outbreak in the central U.S.were:

- 222 a) There are eight defined livestock operation production types in the study region (Table 1)
223 and wildlife are not included.
- 224 b) All herds in the same production type have the same disease parameters. Probability density
225 functions characterize the length of the disease periods and this length is determined
226 stochastically by a random draw from the distributions for each new infected herd.
- 227 c) The population is closed and constant. Herds only exit the population by depopulation.
- 228 d) There is no mortality from FMD during the simulated outbreak.
- 229 e) There are no virus carrier states for recovered animals.
- 230 f) Vaccine is 100% effective following a 7 day delay after vaccination.
- 231 g) Quarantine of infected herds is 100% effective for all contacts and implemented until the
232 herd is depopulated.
- 233 h) Detection of positive herds was based on the probability of visual, clinical disease
234 recognition within infected herds as a function of time the herd has been clinical infectious.

235

236 *Experimental design*

237

238 In all scenarios, a single 17,000 head feedlot in Northeast Colorado was latently infected and

239 served as the index herd for the outbreak. Seventeen different disease mitigation scenarios were
240 simulated as described in Table 2.

241

242 *Sensitivity Analysis*

243

244 Values of selected uncertain parameters were varied from baseline values in a sensitivity
245 analysis to assess their independent influence on the disease modeling results. The 17 scenarios were
246 simulated for each variable change. The baseline probability of transmission given indirect contact was
247 20% and the sensitivity analysis assessed it at 15% and 25%. Sensitivity analysis of the contact rates
248 were also completed with the direct contact rates adjusted to +/- 20% and +/-50% of the baseline rate
249 parameter. Sensitivity of the indirect contact rates for each production type combination was assessed
250 by changing all production type combination rates by +/- 20% from the calculated parameter for all
251 scenarios. Lastly the influence of indirect movement controls was assessed by changing the baseline
252 indirect movement control of 30% of pre-outbreak levels to 20% and 40% of pre-outbreak movement
253 levels to represent a relatively wide range of indirect movement control.

254

255 *Data analysis*

256

257 The NAADSM model produced results for each day of the outbreak for each iteration. The
258 results from each scenario were aggregated into weekly outcome counts for each iteration of each
259 scenario. Summary statistics were generated for each of the scenarios. Outbreak duration was
260 calculated from the first day of the simulation to the end of the active disease phase of the outbreak.
261 Analysis was performed in commercially available software (Stata12.1, (StataCorp., 2011) and in open
262 source 64 bit R 2.15.2 (R development core team, 2011). To test the statistical differences between
263 scenarios, a Kruskal-Wallis one-way analysis of variance was used to identify significant differences in

264 outbreak duration and number of herds depopulated controlling for multiple comparisons at $p < 0.05$
265 according to the method of Holm (1979) implemented in *R*.

266

267 **Results**

268

269 The mean, 5th and 95th percentiles of outbreak duration, number of destroyed herds and
270 number of animals showed less than 4% change at 200 iterations for all scenarios. Most scenarios
271 converged at approximately 100 iterations and all scenarios converged before 200 iterations. In all
272 scenarios the main source of new infections was indirect contacts; approximately 95% of infected herds
273 resulted from an indirect contact and the remaining 5% were infected from direct contact or
274 airborne/local-area spread. In all scenarios the median first day of detection was at 10 or 11 days. The
275 median day of first vaccination was 17-22 days following first detection for scenarios where
276 vaccination was initiated after 10 herds were detected positive. For scenarios where vaccination was
277 initiated after 100 herds were detected the median day of first vaccination was 57-65 days after the first
278 detection.

279 For scenario 1 with no vaccination, there was a sharp peak in the weekly number of detected herds
280 compared to the scenarios with vaccination (Figure 2). In scenario 1 there were 104 new herds
281 detected during week 18 and during week 28, 342 herds were detected. By comparison, in scenario 2,
282 which used a small vaccine capacity and small vaccination zone, 74 new herds were detected during
283 week 18 and 60 herds were newly detected during week 28. The total median number of herds
284 detected as clinically infected per outbreak in scenario 1 was 10,139, which represented approximately
285 6.5% of the herds in the region. All vaccination scenarios had fewer detected clinical herds: for
286 example, scenario 2 had a median of 2,183 clinically infected herds per outbreak, and scenario 4 had a
287 median of 419 clinically infected herds per outbreak.

288

289 *Outbreak Duration*

290 The model outcomes are reported in Table 3. The scenarios with vaccination zones of 50 km
291 (scenarios 4, 5, 8, 9, 12, 13, 16, and 17), had a shorter median and 90th percentile durations compared to
292 the scenarios with 10 km vaccination zones (scenarios 2, 3, 6, 7, 10, 11, 14, and 15): the best eight
293 ranked scenarios for shortest median duration all had 50 km vaccination zones (Table 3). Scenario 16
294 had the shortest median outbreak duration, followed by scenarios 4, 8, 12, and 17. The vaccination
295 capacity and the number of herds infected prior to starting vaccination had less impact on median
296 outbreak duration than the size of the vaccination zones: scenarios with both high and low vaccination
297 capacity and number of herds infected to initiate vaccination were among the top ranked scenarios.
298 Scenario 1 ranked 10th in median outbreak duration. Scenarios 7, 10, and 2 had the three longest
299 median outbreak durations and all had vaccination zones of 10 km. Additionally, scenarios 7 and 10
300 had a late vaccination trigger of 100 herds infected prior to the initiation of vaccination.

301

302

303 *Depopulation*

304 All vaccination scenarios decreased the median number of herds depopulated compared to
305 scenario 1. The 7 scenarios with the lowest median number of depopulated herds all had a vaccination
306 zone radius of 50 km, ranging from median numbers of depopulated herds from 252 to 1,735. Scenario
307 1 had a median of 6,890 herds depopulated per simulated outbreak. The distribution was heavily
308 skewed toward larger numbers depopulated (Table 3). In scenario 1, the median number of herds
309 depopulated included all large feedlot and dairy herds in the population. Also, scenario 1 was the only
310 scenario with herds waiting to be depopulated at the end of the active disease phase (median 2,830
311 herds waiting per simulated outbreak, data not shown). Scenario 16 depopulated the fewest number of
312 herds followed by scenarios 4, 8, and 17 which did not significantly differ from one another.

313

314 *Vaccination*

315 In the best 8 scenarios in terms of vaccinating the smallest median number of herds, only large
316 feedlots were vaccinated. None of these scenarios were among the best scenarios in terms of median
317 outbreak duration or median number of herds depopulated. Scenario 11 vaccinated the fewest number
318 of herds followed by scenarios 3 and 7, which did not differ significantly from each other (Table 3).
319 The only scenarios in which all production types were vaccinated were scenarios 6 and 14, which had a
320 high vaccine capacity and a small zone size. Due to vaccine capacity in the remaining scenarios, only
321 large and small feedlots were vaccinated. The number of herds vaccinated differed greatly between the
322 scenarios. Scenarios 16 and 8 had a high vaccine capacity with large feedlots having first priority and
323 vaccinated approximately 10,000 herds, compared to scenarios 4 and 12, which had a low vaccine
324 capacity and vaccinated approximately 1,800 herds. However, in scenario 17 only large feedlots were
325 vaccinated resulting in 1,329 herds vaccinated and the number of herds depopulated was similar to
326 scenarios 4, 8 and 12.

327 In scenarios with large feedlot vaccination priority, a large vaccination zone and high vaccine
328 capacity (scenarios 8 and 16) there was a sharp peak at the beginning of the outbreak in the number of
329 animals vaccinated but it dropped off sooner than the scenarios with a small zone and high capacity
330 (scenarios 6 and 14) (Figure 3). The median of the maximum number of animals vaccinated in a 1
331 week period ranged from 163,124 to 963,427, and the maximum 90th percentile ranged from 251,883 to
332 2.5 million animals in one week depending on vaccine capacity and zone size.

333

334 *Sensitivity analysis*

335 When the probability of transmission following indirect contact was increased to 25% and
336 decreased to 15%, it was influential in determining the duration of the outbreak, the number of herds
337 depopulated, and the numbers of herds and animals vaccinated. Vaccination was less beneficial in
338 mitigating the effects of an outbreak when probability of transmission following indirect contact was

339 decreased to 15%. In all such scenarios, the median duration of the outbreak was approximately 100
340 days (range 93-150) (Figure 4) and the median number of herds depopulated was approximately 50
341 (range 36-83) (Figure 5). The number of herds depopulated decreased by over 90% in most scenarios
342 (range 82-99%) when the probability of indirect transmission was 15%, and increased by over 200% in
343 all but scenario 1 when the probability of indirect transmission was 25% (range 218-1381%). When
344 the probability of indirect transmission was 25% the median duration of the outbreak was over 500
345 days for most scenarios (range 418-792) (Figure 4), and the median number of herds depopulated was
346 over 5000 for all scenarios except 8, 16 and 17 (Figure 5). In scenarios with vaccination zones of 50
347 km, when the probability of indirect transmission was increased to 25%, the median duration of the
348 outbreak increased by over 100% compared to an increase of less than 5% in the scenarios with
349 vaccination zones of 10 km. All scenarios with a vaccination zone of 50 km except scenario 12 still
350 had shorter duration and fewer herds depopulated compared to scenarios with a 10 km vaccination
351 zone.

352 Changes in the effectiveness of indirect contact movement controls were also influential within
353 the range examined in determining the outbreak duration, the number of herds depopulated and
354 vaccinated (Figures 7, 8, 9). When indirect movement controls were increased to achieve 20% of pre-
355 outbreak levels (as opposed to 30% in the baseline scenarios), the median duration of all scenarios was
356 approximately 100 days (range 85-120) (Figure 7). The median numbers of herds depopulated
357 decreased 65-95% to approximately 50 herds (range 39-66) in all scenarios (Figure 8). When indirect
358 movement controls were set at 40% of pre-outbreak levels, median duration of the outbreak was
359 approximately 500 days for all scenarios (range 481-726) (Figure 7), and the median number of herds
360 depopulated increased over 200% for all but scenario 1 to over 5000 for all scenarios except 8 and 16
361 (Figure 8).

362 Changes in the indirect contact rates between herds were influential in the number of herds
363 depopulated, but less so on outbreak duration. When indirect contact rates were decreased by 20% the

364 10th percentile of outbreak duration was decreased approximately 25-72% and the median by 33-72%
365 (Figure 10). Median number of herds depopulated decreased 65-97% to 58 to 584 herds (Figure 11).
366 When indirect contact rates were increased by 20% the median number of herds depopulated increased
367 60-89% to greater than 5,000 herds for all scenarios except 4, 8, 16 and 17.

368 Sensitivity analysis scenarios ranked similarly to the baseline with scenario 16 or 17 always
369 having the fewest median number of herds depopulated for all sensitivity scenarios. Scenarios 8 and 4
370 were also among the best ranking scenarios for the lowest median number of herds depopulated.
371 Scenario 1 was ranked in the best 5 scenarios for number of herds depopulated when movement
372 controls were either 20% or 40% of pre-outbreak indirect contact levels or when the indirect contact
373 rate was increased by 20% (Table 4). The sensitivity analysis scenario rankings for outbreak duration
374 showed more variation from the baseline and among the sensitivity scenarios. Scenario 4 was always
375 among the best five scenarios for outbreak duration and scenario 16 was among the best five in all
376 sensitivity scenarios except when indirect movement control was 40% of pre-outbreak indirect contact
377 levels. Scenario 1 was ranked best for outbreak duration when indirect movement control was 40% of
378 pre-outbreak indirect contact levels and among the best five scenarios for outbreak duration when
379 indirect transmission probability was 25% and when the indirect contact rate was increased by 20%
380 (Table 4).

381 Increasing direct contact rate by 20% or 50% had little impact of the outcome of the results
382 (data not shown).

383

384 **Discussion**

385 *General discussion*

386 Modeling is a widely used method for assessing the impact of an FMDV introduction in the
387 U.S. and the effectiveness of control because of its nature as a highly infective foreign animal disease.
388 Control methods in the face of an outbreak of FMD include movement controls on livestock and

389 support industries, increased biosecurity such as disinfection of traffic on and off the farm, slaughter of
390 affected and in contact or high risk animals, and vaccination. In this study probability of indirect
391 transmission, movement controls, and vaccination protocols were analyzed to determine the impact of
392 the different control methods. We interpret probability of indirect transmission as a surrogate for
393 disinfectant or biosecurity practices on farm in the sensitivity analysis.

394 The number of herds depopulated was greatest for scenario 1 and the least for scenario 16
395 (Table 3). In scenario 1, the number of herds depopulated was much higher than the scenarios that
396 included vaccination. The outbreak in scenario 1 spread rapidly and it was the only scenario with herds
397 waiting to be depopulated at the end of the active disease phase, having exceeded the depopulation
398 capacity. Scenario 16, which had a large vaccination capacity as well as a large vaccination zone, was
399 able to contain the spread. Due to workforce and vaccine capacity, the high capacity vaccination in a
400 large zone might not be feasible during an outbreak. In the scenarios with a larger vaccination zone,
401 vaccination was advantageous in controlling depopulation and duration suggesting a threshold level of
402 vaccination necessary to bring the outbreak under rapid control. The results reported here represent
403 onset of immunity at 7 days after vaccination and a predominantly indirect contact infection challenge.
404 These results support the value of vaccination strategies, particularly those with large vaccination
405 zones, to control disease impact. The model assumed 100% vaccine efficacy so this is clearly an upper
406 bound of the potential vaccine effect. NAADSM does not currently allow for variation in vaccine
407 efficacy and further studies examining the effect of vaccine are warranted. High potency vaccines
408 formulated for emergency vaccination have shown 100% efficacy by 2-4 days after vaccination in
409 small studies of cattle and pigs challenged by indirect aerosols (Cox and Burnett, 2009). Efficacy was
410 only 70-75% at 10 days after vaccination when a direct exposure to shedding animals was used as the
411 challenge (Cox and Burnett, 2009).

412 Scenarios 7, 10, and 2 (each of which had small vaccination zone and low vaccination capacity)
413 had a longer duration of outbreak when compared to scenario 1 (only depopulation). The duration of

414 the outbreak may potentially be shorter in scenario 1 due to rapid expansion and burnout without
415 vaccination to slow the spread of the virus. Limited vaccination programs may reduce the number of
416 infections without effectively bringing the outbreak to an end. Perez et al. (2004) concluded from the
417 Argentina outbreak in 2001 that mass vaccination can be useful in controlling a large epidemic but that
418 it could take a long time to bring the outbreak under control (Perez et al., 2004). The number of herds
419 depopulated in the results reported here however, was decreased in all vaccination scenarios including
420 scenarios 2, 7 and 10. Based on number of herds depopulated, scenario 2, 7, and 10 control methods
421 are advantageous compared to scenario 1 despite the longer duration of outbreak. An economic
422 analysis of a subset of these scenarios however indicated that outbreak duration was a major
423 determinant in increasing outbreak cost (Schroeder et al. accepted).

424 Despite the large region represented in the model, in reality not all movements would be
425 confined to the modeled area as in this hypothetical FMD outbreak, so a real outbreak could spread
426 further. The duration of a hypothetical epidemic modeled in the Texas Panhandle region had a median
427 of 25-52 days (Ward et al., 2009) which was much shorter than the results in the study reported here
428 where median duration ranged from 181-608 days. Ward et al. (2009) was confined to an eight county
429 region and the outbreak could easily be larger following spread to other regions. We chose an initially
430 latent herd in the central location of our population to allow the most geographic freedom of disease
431 spread and minimize any geographic boundary effect in the results.

432 The median number of herds detected as clinically infected for scenario 1 represented
433 approximately 6.5% (10,139 /151,620) of the herds in the study population and scenario 2 represented
434 1.4% (2,183/151,620) of the herds. The results of scenario 2 are comparable to the 2001 U.K. FMD
435 outbreak where 1.4% of herds (2030/146,000) were reported as infected (Anderson, 2002) and an FMD
436 model of 3 counties in California where 2% of herds were infected (Bates et al., 2003b). In the study
437 reported here, scenario 16 had the lowest number of infected herds detected at 0.16% followed by
438 scenario 4 at 0.3% of the herds detected as clinically infected.

439 Our data is consistent with a large vaccination zone having the biggest impact on the duration of
440 the outbreak. Bates et al. (2003b) found that vaccinating all herds within 50 km of an infected herd
441 was an effective strategy to reduce duration of the outbreak when modeling an FMD outbreak in a 3-
442 county region of California. In that regional study the outbreaks in scenarios with the large vaccination
443 zone lasted the shortest number of days despite not all the herds in the zone getting vaccinated due to
444 capacity limitations.

445 Our low vaccination capacity scenarios were meant to represent vaccine administration by
446 USDA personnel only. Livestock production type had priority over days waiting in queue for
447 vaccination so the only scenarios where any production type besides feedlots were vaccinated were
448 scenarios that had a high vaccination capacity and a small vaccination zone. However, these small
449 zone and high capacity scenarios had outbreaks that lasted longer, leading to more herds being
450 vaccinated compared to high capacity and large zone scenarios. The two scenarios that had the highest
451 number of herds vaccinated (scenarios 14 and 6) had high vaccination capacity, a small zone,
452 vaccinated all herd types and exceeded 30,000 herds vaccinated. However, they were never among the
453 top ranked scenarios for outbreak duration or number of herds depopulated. Because of the high
454 percent of infections resulting from indirect contacts in these models, the ability to vaccinate all the
455 production types surrounding an infected herd did not appear as beneficial as priority vaccination of
456 feedlot production type that have high numbers of indirect contacts.

457 The high vaccine capacity scenarios were meant to represent vaccination being carried out by
458 the farmers and ranchers as was done in the 2001 Uruguay outbreak. Data from the Uruguay outbreak
459 indicates an average vaccination rate of 350,000 cattle per day in each round of vaccination (Sutmoller
460 et al., 2003) which is a higher rate than the requirement in our high vaccine capacity scenarios where
461 the median of the maximum animals vaccinated in a 1 week period was 963,427, and similar to the 90th
462 percentile (2.5 million animals in one week). In the U.S., animal health officials could have some
463 concerns regarding producers administering FMD vaccine themselves, as it is a restricted and

464 controlled vaccine. While reliable procedures for administering vaccine and identifying vaccinates
465 would be necessary, allowing producers and private veterinarians to perform vaccination would
466 increase the capacity dramatically.

467 Minimizing the number of herds vaccinated is not the most appropriate measure of the best
468 vaccination strategy, but is useful for identifying the most efficient use of vaccination. The scenarios
469 with the shortest duration of outbreak and the lowest number of herds depopulated varied in the number
470 of herds vaccinated, but were consistently scenarios with large vaccination zones.

471 The top five ranking scenarios for outbreak duration and number of depopulated herds
472 contained scenarios with both 10 and 100 herds infected prior to the initiation of vaccination suggesting
473 the decision to vaccinate may not need to be made at the very beginning of the outbreak allowing
474 additional time to produce adequate vaccine supplies to meet demand and to evaluate the need for
475 vaccination. These results also suggest that a proper vaccination plan could decrease the number of
476 personnel needed for depopulation to partly make up the likely increased personnel requirements to
477 implement vaccination. Vaccination zone size was the most important factor determining the outbreak
478 duration and the number of herds depopulated. All five top ranked scenarios for the duration of the
479 outbreak and number of herds depopulated had large vaccination zones. Vaccination does not require
480 the time or the quantity of labor that are needed for depopulation and disposal of carcasses. The
481 disadvantages of vaccination are imperfect efficacy, the delay before protection of almost a week (Salt
482 et al., 1998), the challenge of producing sufficient quantities of strain specific vaccine, the lack of cross
483 immunity between strains, and the trade implications of vaccinating and recovering disease free status
484 (Office International des Epizooties/World Organisation for Animal Health, 2013).

485 Some previous research has found that vaccination protocols in the control of a FMD outbreak were not
486 economically beneficial (Schoenbaum and Disney, 2003; Elbakidze et al., 2009). Bates et al. (2003) in
487 a benefit-cost analysis model of a FMD outbreak in 3 counties in California, found vaccination would
488 be a cost-effective strategy if vaccinated animals were not subsequently depopulated (Bates et al.,

489 2003a). Vaccinated herds in the scenarios reported here were not depopulated and all vaccination
490 scenarios in this study did decrease the number of herds depopulated compared to depopulation only.
491 Further, an economic analysis of these results found that vaccination was also advantageous to
492 decreasing the median economic impact of the outbreak (Schroeder et al., accepted).

493 FMD simulation models have found that targeting high-risk production types can increase the
494 efficiency of vaccination (Keeling et al., 2003). In the current study large feedlots were prioritized for
495 vaccination due to their high contact rate and the large number of feedlots in the central region of the
496 U.S. Large feedlots have a high number of indirect contacts (McReynolds et al., 2014a) potentially
497 increasing their risk of becoming infected and spreading infection during an outbreak. In this study, the
498 scenarios with large vaccine zones and feedlot vaccination priority, predominantly vaccinated large and
499 small feedlots but had a similar impact on the outbreak as scenarios where only large feedlots were
500 vaccinated. Scenario 17 is of note as a top ranking large feedlot only vaccination scenario with high
501 capacity (8 herds by 22 days and 15 herds by 40 days) and large vaccination zone. This suggests there
502 may be methods to efficiently apply vaccination to high risk groups and efficiently use resources
503 (Keeling et al., 2003; Keeling and Shattock, 2012). Animals in large feedlots are also a natural
504 vaccinate to die (slaughter) population perhaps facilitating restoration of FMD free without vaccination
505 status, without the cost of depopulation or the loss of valuable protein for human nutrition. However,
506 vaccinating to live versus to die has different implications from an international trade perspective. In
507 vaccinate to live scenarios, export market access would likely be delayed at least 3 additional months
508 relative to a depopulating all vaccinated animals.

509

510 *Sensitivity of input values*

511 The operational validity of the model was assessed using a sensitivity analysis to determine the
512 impact of uncertainty in contact and control methodologies (Frey and Patil, 2002; Garner and
513 Hamilton, 2011). Indirect contacts are a potential risk for disease spread particularly for a highly

514 contagious disease such as FMD (Cottral, 1969; Ellis-Iversen et al., 2011) and in our scenarios
515 approximately 95% of the infections were transmitted through indirect contacts. The sensitivity
516 analysis was used to determine the impact of changes in the disease control methods and the contact
517 rates on the model results. The sensitivity analysis of the direct contact rate demonstrated that the
518 model was not sensitive to changes in the direct contact rate, which may be due in part to the 100%
519 quarantine of infected herds within the model. The model was sensitive to changes in the indirect
520 contact rate. This highlights the need for accurate data regarding indirect contacts between livestock
521 producers. Indirect contact rates used here are based on a survey of producers in Kansas and Colorado
522 (McReynolds et al., 2014a) representing all modeled production types and provide the best available
523 estimates of direct and indirect contacts between production types for the region being simulated.
524 When the indirect contact rates for all production types were decreased by 20%, the median duration of
525 the outbreak and number of herds depopulated decreased substantially. The ranking of the best
526 scenarios by number of herds depopulated remained similar (Table 8) but the impact of vaccination was
527 substantially decreased.

528 When the indirect contact rates increased 20%, scenarios with a small vaccination zone had
529 larger outbreaks than scenario 1. Again scenario 1 did appear to spread quickly with the number of
530 herds exposed to the virus and waiting for depopulation being the largest of all the scenarios. When the
531 indirect contact rate was increased the number of infected herds increased rapidly and the vaccination
532 capacities modeled were not sufficient to control the outbreak. In the face of an outbreak that is
533 spreading rapidly vaccine capacity appears to be important. In the Taiwan outbreak inadequate vaccine
534 supply was one of the potential factors in the large epidemic (Yang et al., 1999). This may also be a
535 factor in our scenarios where the vaccination zone was small and the outbreak lasted longer than the
536 depopulation alone scenario.

537 Due to the impact of movement controls on an agriculture community and on animal welfare, a
538 sensitivity analysis on the impact of movement controls within the model was simulated. Feed

539 delivery, supplies, and labor are indirect movements that must be maintained for business continuity
540 and for animal welfare reasons in the face of a FMD outbreak. The minimum amount of movements
541 that will be necessary will vary for different production types. Decreasing indirect movement from
542 30% to 20% of pre-outbreak levels substantially decreased the number of herds depopulated and the
543 duration of the outbreaks to similar levels in all scenarios. None of the vaccination scenarios were
544 different from scenario 1 for number of herds depopulated and duration of outbreak. While decreasing
545 movement was effective in decreasing the number of herds depopulated, the ability to achieve a
546 decrease in indirect movement to 20% of the pre-outbreak level without animal welfare issues is not
547 clear. The animal welfare consequence of these movement controls on un-infected or infected herds
548 awaiting depopulation has been found to be significant (Laurence, 2002). If this level of movement
549 control is achievable in the face of an outbreak consistent with acceptable animal welfare, it may be
550 sufficient and vaccination may have little additional benefit. When indirect movement control was set
551 at 40% of pre-outbreak levels, the duration of the outbreaks were all similar to scenario 1, lasting 500
552 to 700 days and scenario 1 had the third lowest number of herds depopulated. This demonstrates that if
553 strict indirect movement controls are not possible, vaccination might not be effective in disease
554 outbreak control. Because the range of estimates of indirect movement control (20% to 40% of pre-
555 outbreak levels) used in the sensitivity analysis identified substantial variation in the outcomes,
556 additional estimates outside that range were not evaluated. Achievable movement controls consistent
557 with acceptable animal welfare require additional investigation to support more refined modeling.

558 Probability of transmission given an indirect contact showed a similar effect in the sensitivity
559 analysis. When the probability of indirect transmission was decreased from 20% to 15% the number of
560 herds depopulated and the outbreak duration decreased substantially in all scenarios. The probability
561 of transmission following indirect contact between an infected and susceptible herd could represent a
562 measure of the biosecurity practices applied to traffic and people on and off the farm. Important
563 aspects include truck washing, boot washing and control of visitor contact with animals. With

564 increased biosecurity, vaccination did not offer any benefit over the depopulation alone control strategy
565 but again the impact and ability to achieve this level of biosecurity is unknown. Increased biosecurity
566 would be an important aspect of control efforts and could be a welfare friendly option to control spread
567 compared to increased movement controls. Alternately, decreased probability of transmission
568 following indirect contact may be representative of FMD strains with lower transmissibility. When the
569 probability of transmission given an indirect contact was increased from 20% to 25% the number of
570 herds depopulated was substantially increased and the impact of vaccination decreased. Biosecurity
571 and movement controls are known to be important aspects of a control strategy during a FMD outbreak
572 due to the potential risk of disease spread (Anderson, 2002; Cottral, 1969; Ellis-Iversen et al., 2011).
573 Additionally, identifying the personnel requirements to achieve sufficient levels of biosecurity and
574 movement controls is needed, as well as the impact on animal welfare.

575 The estimates of the probability of indirect transmission and achievable movement controls are
576 uncertain parameters, based solely on USDA subject matter expert opinion. Model outputs are quite
577 sensitive to these parameters and an improved knowledge of the efficacy of biosecurity practices and
578 the ability to achieve movement controls to limit direct and indirect transmission are necessary for
579 more focused planning of optimal control efforts.

580 The validity of results reported here are dependent on application of sufficient resources
581 required to implement the controls. Depopulation has been a mainstay of FMDV control plans however
582 the ability to depopulate large feedlots may be questionable (McReynolds et al 2014b), and further
583 modeling may be necessary to assess alternatives.

584 Finally, the results reported here do not account for the potential of a reservoir of FMDV
585 infection in the wildlife population. FMDV can infect deer and feral swine and establishment in these
586 populations could substantially complicate eradication efforts (Ward et al., 2007).

587

588 *Conclusion*

589 In this simulation study of an FMD outbreak in the central U.S., scenarios with large
590 vaccination zones had shorter median outbreak durations and fewer numbers of herds destroyed.
591 Increasing the vaccination capacity had a small impact on the outbreak and may not be feasible if
592 vaccine production and delivery is limited. In these scenarios, feedlots $\geq 3,000$ head had the highest
593 vaccination priority and even with larger vaccine capacity few other production types were vaccinated
594 in some scenarios. Outbreak size and number of herds depopulated were sensitive to biosecurity
595 practices and movement controls and to a lesser extent indirect contact rates. The level of biosecurity
596 required to achieve a given probability of indirect transmission and the ability to restrict indirect
597 movement consistent with acceptable animal welfare is uncertain. Vaccination was not beneficial
598 compared to depopulation alone to control the outbreak when biosecurity and movement controls were
599 increased. A better understanding of the biosecurity changes necessary during an outbreak to attain
600 these levels is needed. The results of this study will provide information about the impacts of disease
601 control protocols which may be useful in choosing the optimal control methods to meet the goal of
602 rapid effective control and eradication. The results and impact of the control methods however may not
603 be applicable to other regions due to the variability of livestock production systems that are found in
604 different regions in the U.S.

605

606 Acknowledgements:

607 Acknowledgement: This material is based upon work supported by the US Department of Homeland
608 Security under Award #2010-ST-016-AG0002. The views and conclusions contained in this document
609 are those of the authors and should not be interpreted as necessarily representing the official policies,
610 expressed or implied, of the US Department of Homeland Security.

611 The funding agency had no role in design, analysis, interpretation or decision to publish.

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738

Table 1. Simulation population of the 8-state region in the central U.S. that was used in NAADSM with the number of animals and herds by production type.

Production Type	Animals	Herds
Cow-calf	9,698,630	86,655
Feedlot-Large ($\geq 3,000$ head)	9,147,279	979
Feedlot-Small ($< 3,000$ head)	7,377,698	25,096
Dairy	1,062,276	3,232
Swine-Large ($\geq 1,000$ head)	9,227,569	1,071
Swine-Small ($< 1,000$ head)	663,465	6,463
Beef-swine mix	520,283	5,159
Sheep	1,716,028	22,965
Total	39,413,228	151,620

Table 2. Description of vaccination strategy for 17 simulated scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.

Scenario	Large	Vaccination Capacity ^c	Vaccination Trigger (herds)	Size of
	Feedlots Vaccination ^b			Vaccination Zone (km)
1 ^a	-	-	-	-
2	Priority	5,10	10	10
3	Only	1,3	10	10
4	Priority	5,10	10	50
5	Only	1,3	10	50
6	Priority	50,80	100	10
7	Only	8,15	100	10
8	Priority	50,80	100	50
9	Only	8,15	100	50
10	Priority	5,10	100	10
11	Only	1,3	100	10
12	Priority	5,10	100	50
13	Only	1,3	100	50
14	Priority	50,80	10	10
15	Only	8,15	10	10
16	Priority	50,80	10	50
17	Only	8,15	10	50

^a Scenario 1 baseline depopulation without vaccination

^b Priority – from highest to lowest: large feedlot ($\geq 3,000$ head), small feedlot ($< 3,000$ head), large swine ($\geq 1,000$ head), small swine ($< 1,000$ head), beef-swine, dairy, cow-calf, and small ruminant.

Only – Large feedlots only vaccinated.

^c The capacity for vaccination protocols in number of herds per day by 22 days after disease detection and by 40 days after disease detection

Table 3. Median duration of outbreak, number of herds depopulated, number of animals depopulated, number of herds vaccinated, and number of animals vaccinated for each scenario (10th - 90th percentiles) [rank most to least optimal] of a potential foot and mouth disease virus outbreak in a central region of the U.S.

Scenario	Outbreak Duration (days)	Number of Herds Depopulated	Number of Animals Depopulated (1000)	Number of Herds Vaccinated	Number of Animals Vaccinated (1000)
1	527 ^f (87-621)	6,890 ^h (32-8,101) [17]	13,663 (196-17,611)		
2	608 ⁱ (102-767)	2,227 ^g (42-2,449) [13]	9,921 (222-10,600)	5,709 ⁱ (657-7304)	7,644 (0-8,500)
3	530 ^{fg} (48-687)	2,248 ^g (10-3,156) [11]	9,939 (72-11,500)	472 ^b (0-514) [3]	4,319 (0-4,764)
4	223 ^b (86-310)	416 ^b (31-879) [2]	1,736 (238-3,214)	1,876 ^g (494-2,736)	16,400 (1,490-
5	389 ^e (286-559)	1,735 ^e (1,326-2,063)	7,508 (5,774-8,591)	1,043 ^e (725-1,460) [6]	10,300 (7,000-
6	459 ^{fg} (45-721)	1,991 ^f (9-2,301) [9]	9,098 (65-10,000)	30,594 ^k (0-51,136) [15]	19,600 (0-23,832)
7	550 ^{ghi} (64-753)	2,249 ^g (15-5,133) [15]	10,000 (81-12,500)	458 ^b (0-488) [2]	4,183 (0-4,600)
8	202 ^{ab} (131-390)	440 ^b (233-616) [3]	1,863 (1,071-2,395)	10,000 ^j (6,400-24,560)	14,900 (10,000-
9	342 ^d (256-528)	1,605 ^d (1,242-3,712)	6,950 (5,600-10,400)	1,044 ^e (784-1,398) [7]	10,400 (7,400-
10	596 ^{hi} (154-800)	2,203 ^g (49-3,270) [12]	9,968 (341-11,121)	5,165 ^h (0-7,030) [11]	7,132 (0-8,330)

11	540 ^{fgh} (90-709)	2,276 ^g (32-7,318) [16]	10,000 (268-15,000)	425 ^a (0-463) [1]	3,851 (0-4,263)
12	250 ^c (146-318)	855 ^c (234-1,150) [5]	3,702 (968-4,727)	1,800 ^g (635-2,420) [9]	17,200 (6,250-
13	369 ^{de} (244-579)	1,848 ^f (1,320-7,904)	8,008 (6,275-16,360)	859 ^d (528-1,098) [5]	8,461 (4,833-11,000)
14	527 ^{fghi} (77-791)	1,925 ^f (22-2,174) [8]	9,098 (141-10,000)	37,928 ^l (746-59,380)	21,600 (205-25,800)
15	545 ^{fgh} (363-706)	2,238 ^g (1,681-2,648)	9,922 (8,017-10,675)	499 ^c (432-525) [4]	4,561 (3,850-4,860)
16	181 ^a (123-366)	252 ^a (107-427) [1]	1,028 (515-1,644)	11,902 ^j (6,923-26,654)	15,500 (10,000-
17	241 ^{bc} (133-568)	440 ^b (87-850) [4]	1,754 (521-3,373)	1,329 ^f (528-2,718) [8]	13,100 (5,000-

Values within columns with different superscripts are different $p < 0.05$ (adjusted p-value accounting for multiple comparisons)

Table 4. The top 5 rankings of the scenarios with the lowest number of herds depopulated and shortest outbreak duration of a potential foot and mouth disease virus outbreak in a central region of the U.S. Rankings based on a Kruskal-Wallis one-way analysis of variance.

Sensitivity Analysis Parameter	Lowest number of herds depopulated					Shortest outbreak duration				
	Rank	1	2	3	4	5	1	2	3	4
Baseline Scenarios	16	4	8	17	12	16	4	8	12	17
Indirect Transmission 15%	17	16	4	10	6	17	16	4	8	10
Indirect Transmission 25%	16	8	4	17	1	4	1	11	16	3
Indirect Movement Control 40% of baseline	16	8	1	4	17	1	17	11	4	3
Indirect Movement Control 20% of baseline	16	4	17	8	1	16	4	17	8	7
Indirect Contact Rate - 20%	16	4	17	8	12	16	4	17	8	12
Indirect Contact Rate +20%	16	8	4	17	1	4	16	7	1	11

Appendix 1. Disease state and spread parameters

Table A1. Calculated mean daily direct contact rates per herd used to parameterize the NAADSM model based on livestock contact survey results in Colorado and Kansas.

Source Production Type	Destination Production Type	Mean Number of Contacts per Day per Herd	Movement distance in km
Cow/Calf	Cow/Calf	0.027	Exponential (116.88)
Cow/Calf	Large Feedlot	0.002	Weibull (1.35,344.40)
Cow/Calf	Small Feedlot	0.002	Weibull (1.35,344.40)
Cow/Calf	Beef/Swine	0.027	BetaPERT (1.60,80.50,241.40)
Dairy	Dairy	0.065	Pearson 5 (1.01,7.73)
Large Feedlot	Large Feedlot	0.005	Gamma (6.87,71.25)
Large Swine	Large Swine	0.186	LogLogistic (1.10,66.10,1.24)
Small Feedlot	Large Feedlot	0.019	Weibull (1.46,547.06)
Small Feedlot	Small Feedlot	0.017	Beta (8.04,33.76,0.00,2643.80)
Small Swine	Small Swine	0.013	BetaPERT (0,20,181)
Small Swine	Beef/Swine	0.013	Lognormal (166.74,748.64)
Beef/Swine	Cow/Calf	0.027	Exponential (116.68)
Beef/Swine	Large Feedlot	0.003	Weibull (1.35,344.40)
Beef/Swine	Small Feedlot	0.003	Weibull (1.35,344.40)
Beef/Swine	Beef/Swine	0.026	Lognormal (166.74,748.64)
Beef/Swine	Small Swine	0.013	Lognormal (166.74,748.64)
Small Ruminant	Small Ruminant	0.024	Exponential (116.88)

^aAll combinations that are not listed above had a mean daily contact rate of 0.

^bBeta distribution is a continuous distribution defined by four parameters: α_1 , α_2 , a minimum value, and a maximum value.

Table A2. Calculated mean daily indirect contact rate (per herd per day) by production type used to parameterize the NAADSM model based on livestock contact survey results in Colorado and Kansas.

TO	FROM							
	Cow/Calf	Small Feedlot	Large Feedlot	Dairy	Small Swine	Large Swine	Small Ruminant	Beef/Swine
Cow/Calf	0.133	0.090	0.123	0.181	0.005	0.026	0.018	0.009
Small Feedlot	0.141	0.095	0.131	0.191	0.005	0.028	0.019	0.009
Large Feedlot	1.711	1.155	1.589	2.326	0.063	0.337	0.229	0.114
Dairy	0.623	0.420	0.578	1.045	0.026	0.136	0.093	0.041
Small Swine	0.020	0.014	0.019	0.030	0.003	0.014	0.003	0.003
Large Swine	0.044	0.030	0.041	0.066	0.015	0.086	0.015	0.013
Small Ruminant	0.052	0.035	0.048	0.078	0.002	0.008	0.070	0.001
Beef/Swine	0.092	0.062	0.086	0.125	0.007	0.033	0.012	0.006

Table A3. Distance distributions of indirect contacts

Production type of movement source	Movement distance in km for indirect contacts
Cow/calf	Beta (8.39,18.78,0.00,887.39)
Dairy	Beta (7.41,8.86,0.00,1580.40)
Large feedlots	Gamma (6.87,71.25)
Small feedlots	Beta (8.04,13.76,0.00,2463.80)
Large swine	Beta (4.55,4.35,0.00,1143.80)
Small swine	Beta (4.42,4.19,0.00,1167.00)
Beef/swine	Beta (5.48,14.55,0.00,791.36)
Small ruminants	Beta (5.21,4.26,0.00,332.66)

^aBeta distribution is a continuous distribution defined by four parameters: α_1 , α_2 , a minimum value, and a maximum value.

Table A4. Defining the duration of the *disease state* periods in days by production type^a

Production type	Duration of the <i>latent period</i>	Duration of the <i>subclinical, infectious period</i>	Duration of the <i>clinical, infectious period</i>	Duration of the <i>immune period</i>
Cow/calf	Neg. binomial (12,0.77)	Poisson (1.77)	Gamma (35.94,0.65)	Gaussian (1095, 180)
Dairy	Neg. binomial (20,0.85)	Poisson (1.74)	Gamma (26.72,1.03)	Gaussian (1095, 180)
Large feedlots	Neg. binomial (26,0.87)	Binomial (9,0.19)	Gamma (170.51,0.23)	Gaussian (1095, 180)
Small feedlots	Neg. binomial (16,0.82)	Poisson (1.70)	Gamma (48.01,0.58)	Gaussian (1095, 180)
Large swine	Neg. binomial (4, 0.58)	Poisson (2.05)	Gamma (81.90,0.49)	Weibull (5, 985)
Small swine				
and beef/swine	Neg. binomial (4, 0.56)	Poisson (2.10)	Gamma (12.78,1.66)	Weibull (5, 985)
Small ruminants	Neg. binomial (14, 0.74)	Neg. binomial (14,0.85)	Gamma (15.78,1.22)	Gaussian (930, 90)

^a from Mardones et. al., 2010 see text for details.

Figure 1. An 8-state outlined region of central U.S. selected for modeling the potential of a foot and mouth disease outbreak initiated in a large feedlot in Northeast Colorado.



Figure 2. Median number of new herds detected as clinically infected by week of a potential foot and mouth disease virus outbreak in a central region of the U.S.

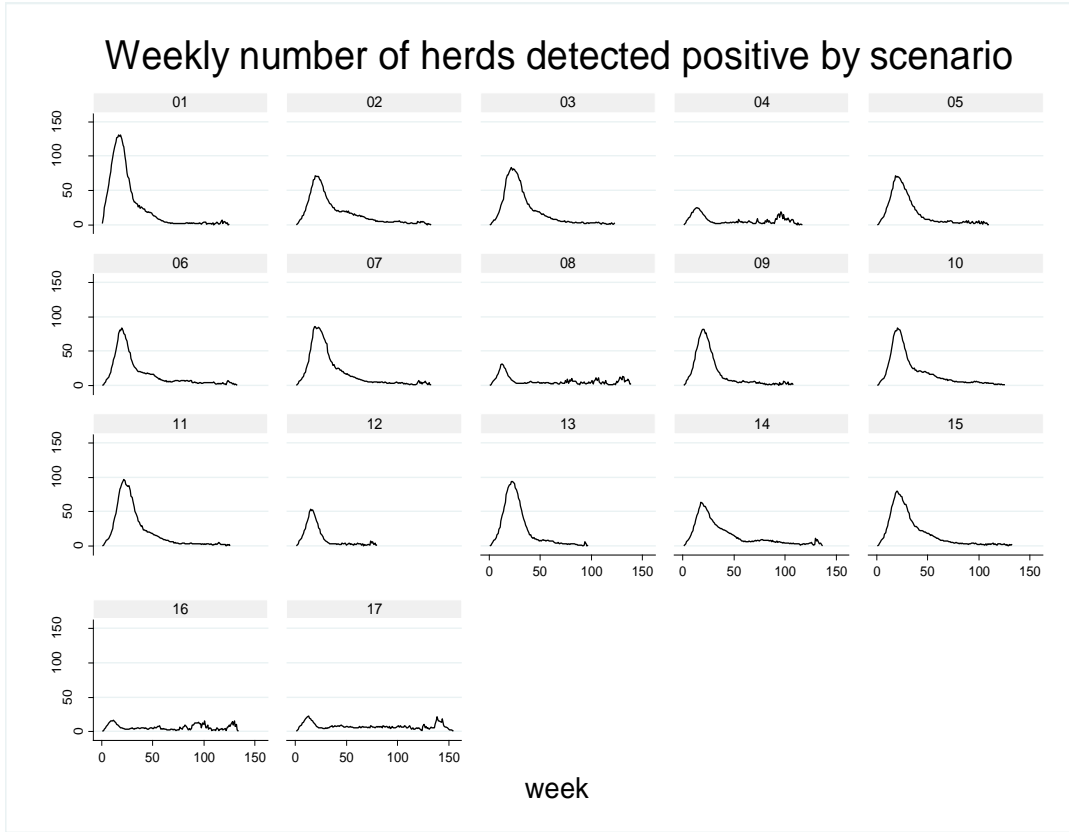


Figure 3. The total number of animals vaccinated each week by scenario number of a potential foot and mouth disease virus outbreak in a central region of the U.S.

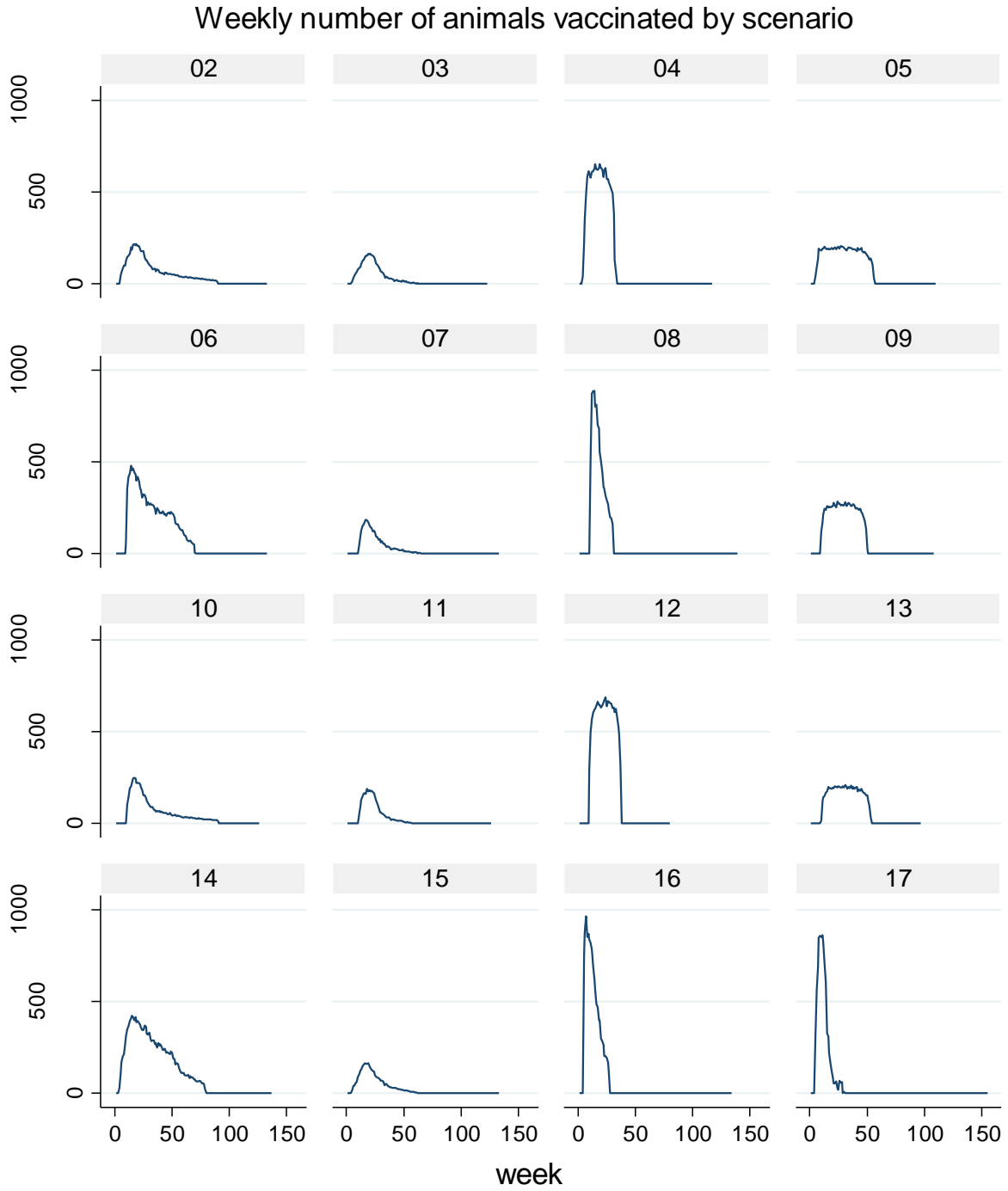
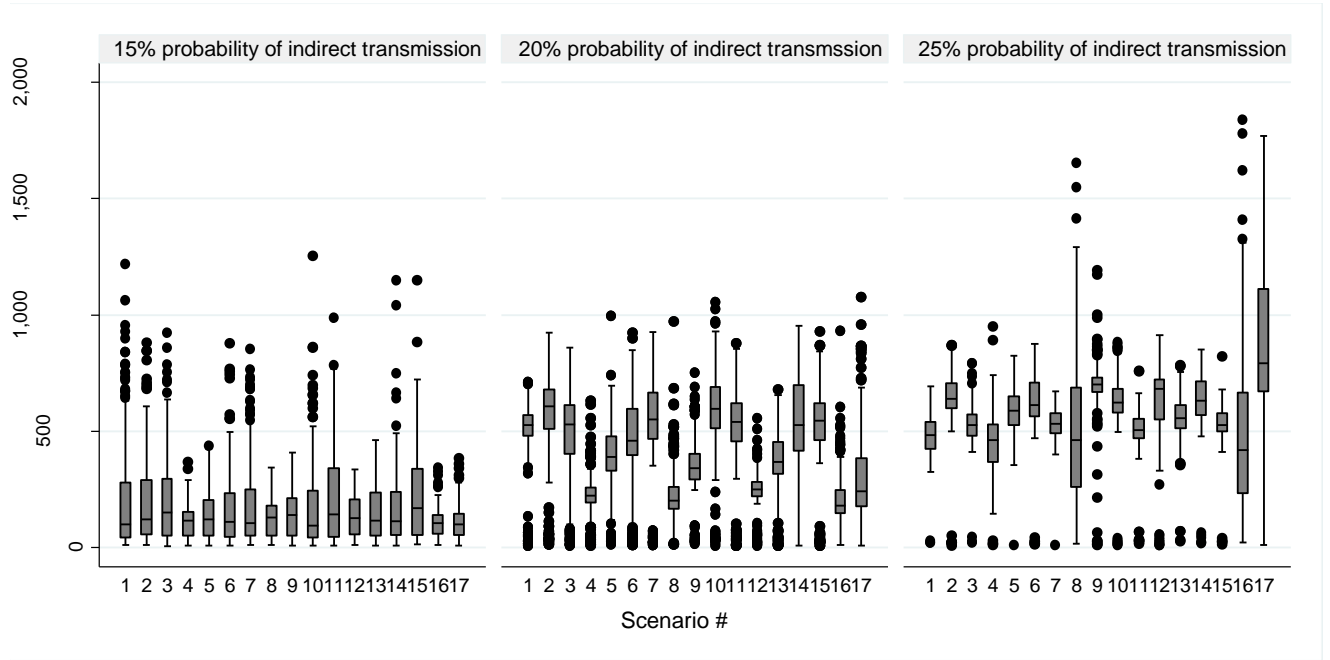
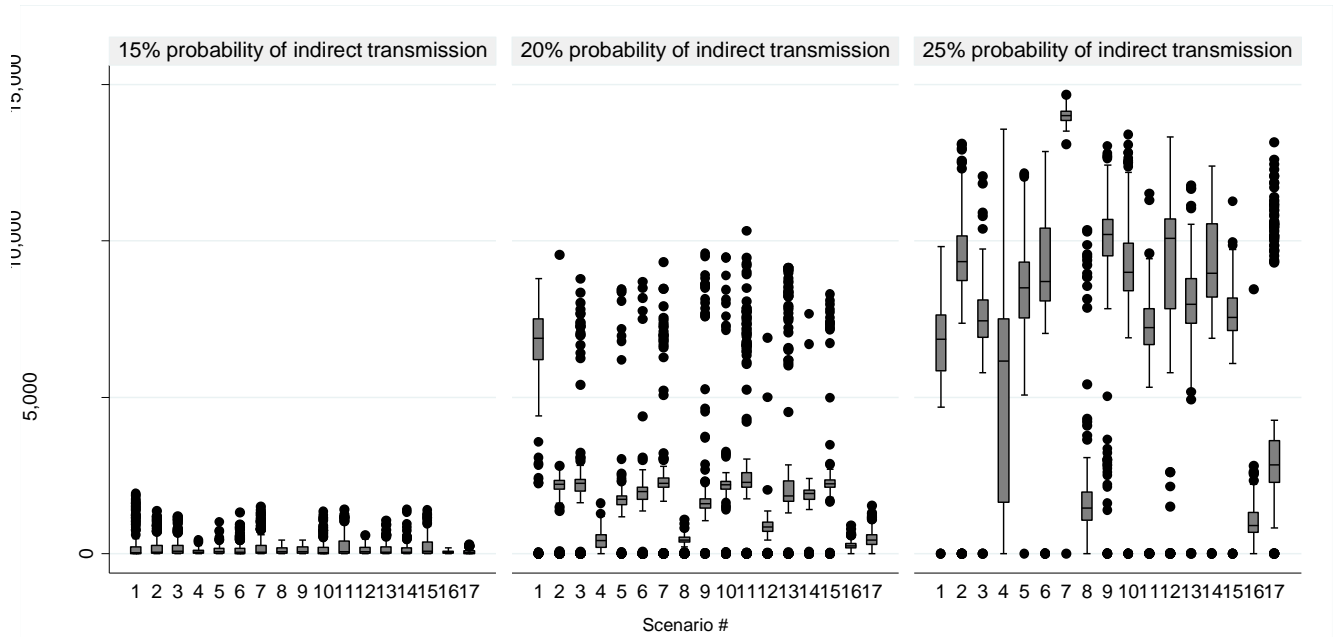


Figure 4. Box plots of the duration of the active disease phase for the sensitivity analysis of the probability of transmission given indirect contact is at 15%, 20%, and 25% for all scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.



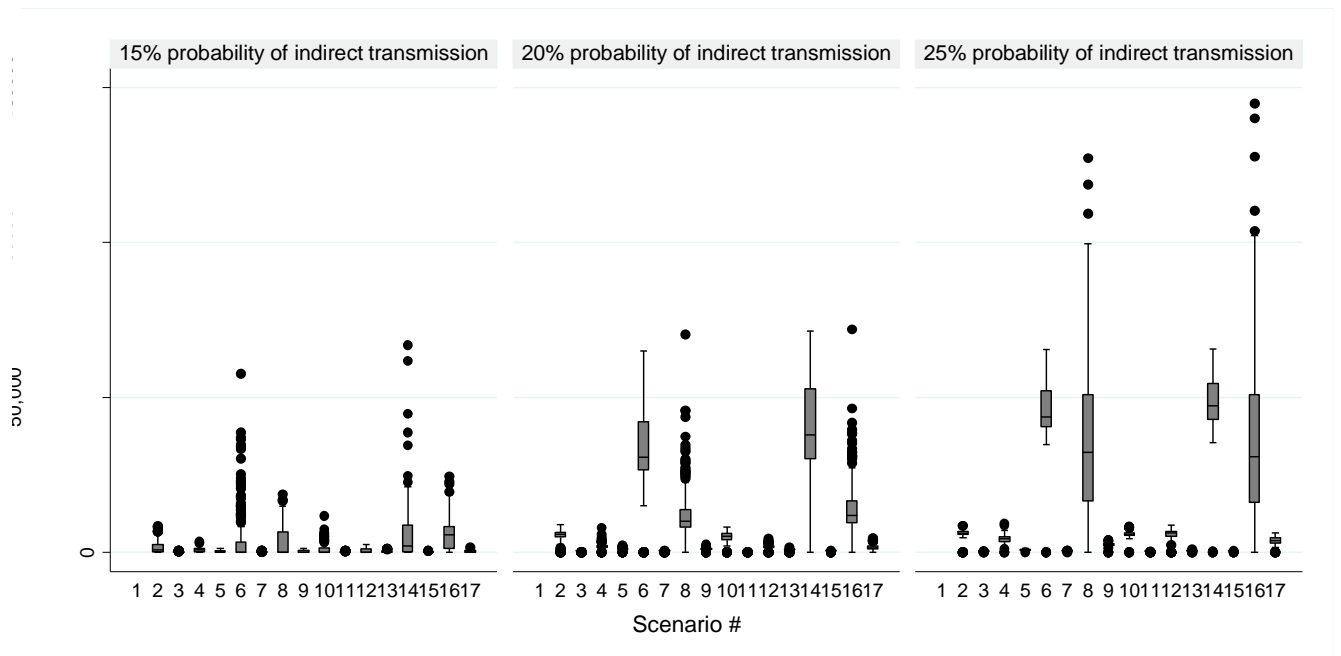
^aThe box plot parameters are boxes at 25th and 75th percentiles, the line in the box is the median, whiskers are 5th and 95th percentiles and dots are outliers.

Figure 5. Box plots of the number of herds depopulated for the sensitivity analysis of the probability of transmission given indirect contact at 15%, 20%, and 25% for all scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.



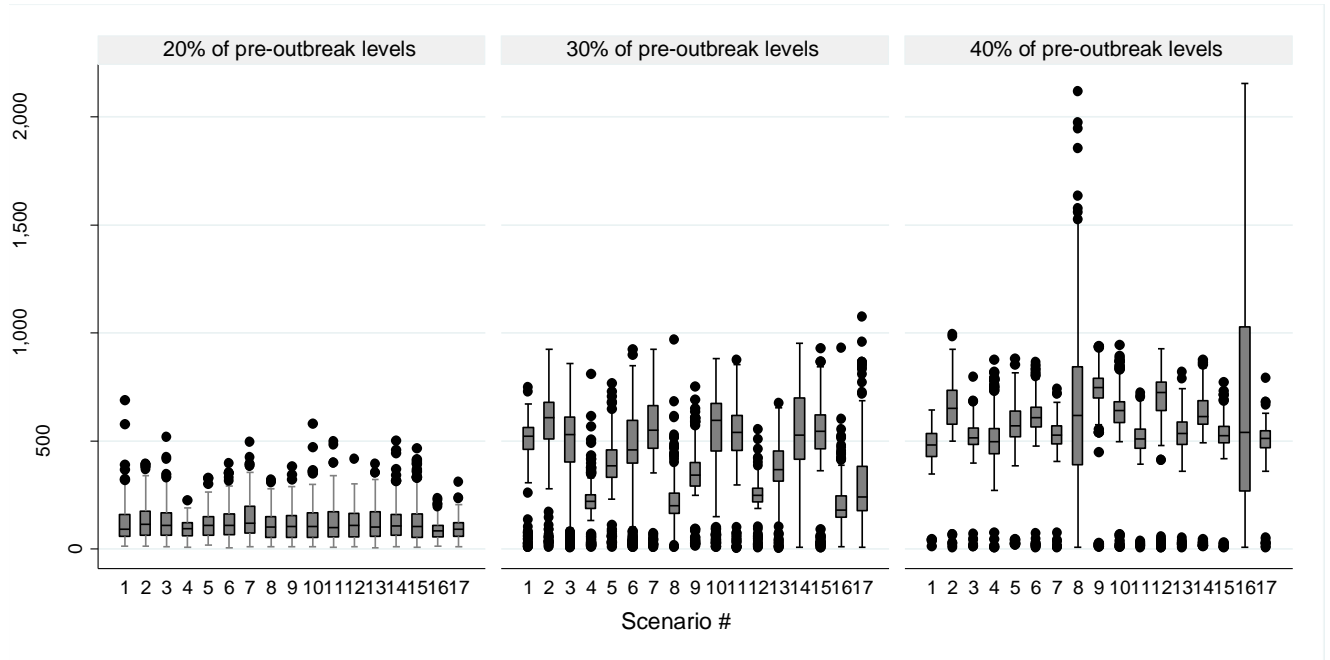
^aThe box plot parameters are boxes at 25th and 75th percentiles, the line in the box is the median, whiskers are 5th and 95th percentiles and dots are outliers.

Figure 6. Box plots of the number of vaccinated herds for the sensitivity analysis of the probability of transmission given indirect contact is at 15%, 20%, and 25% for all scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.



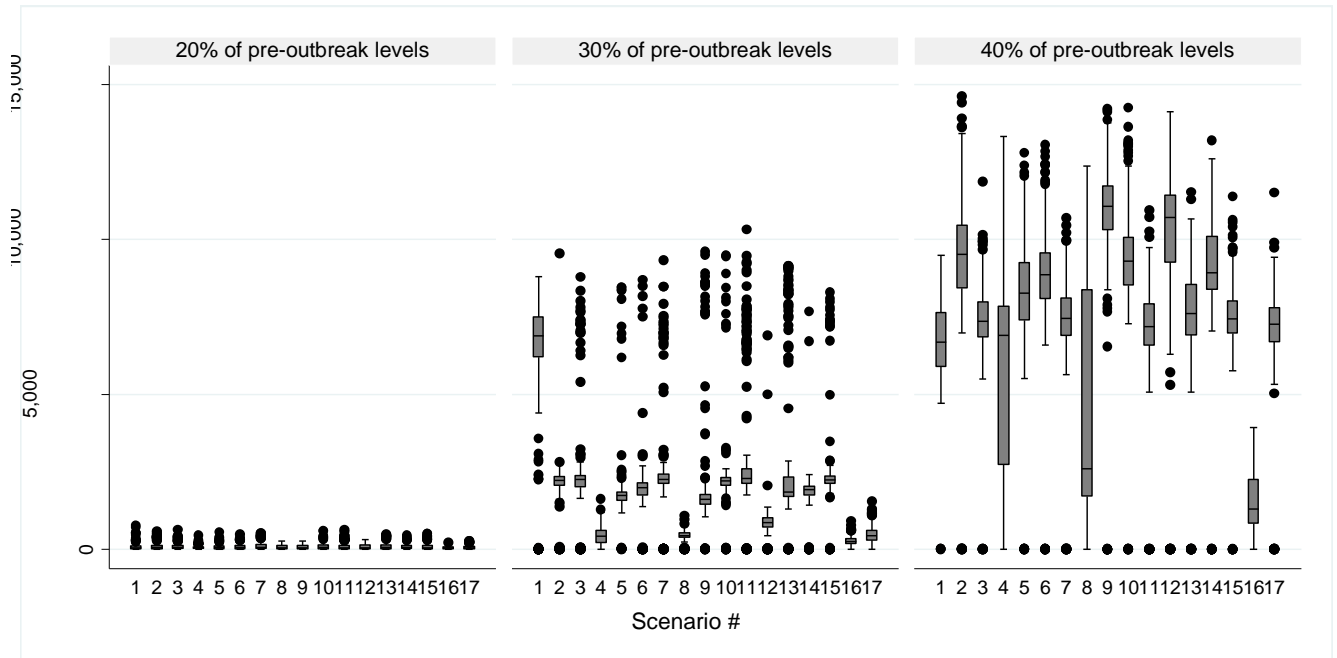
^aThe box plot parameters are boxes at 25th and 75th percentiles, the line in the box is the median, whiskers are 5th and 95th percentiles and dots are outliers.

Figure 7. Box plots of the duration of the active disease phase for the sensitivity analysis of the movement controls at 20%, 30%, and 40% of pre-outbreak levels for all scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.



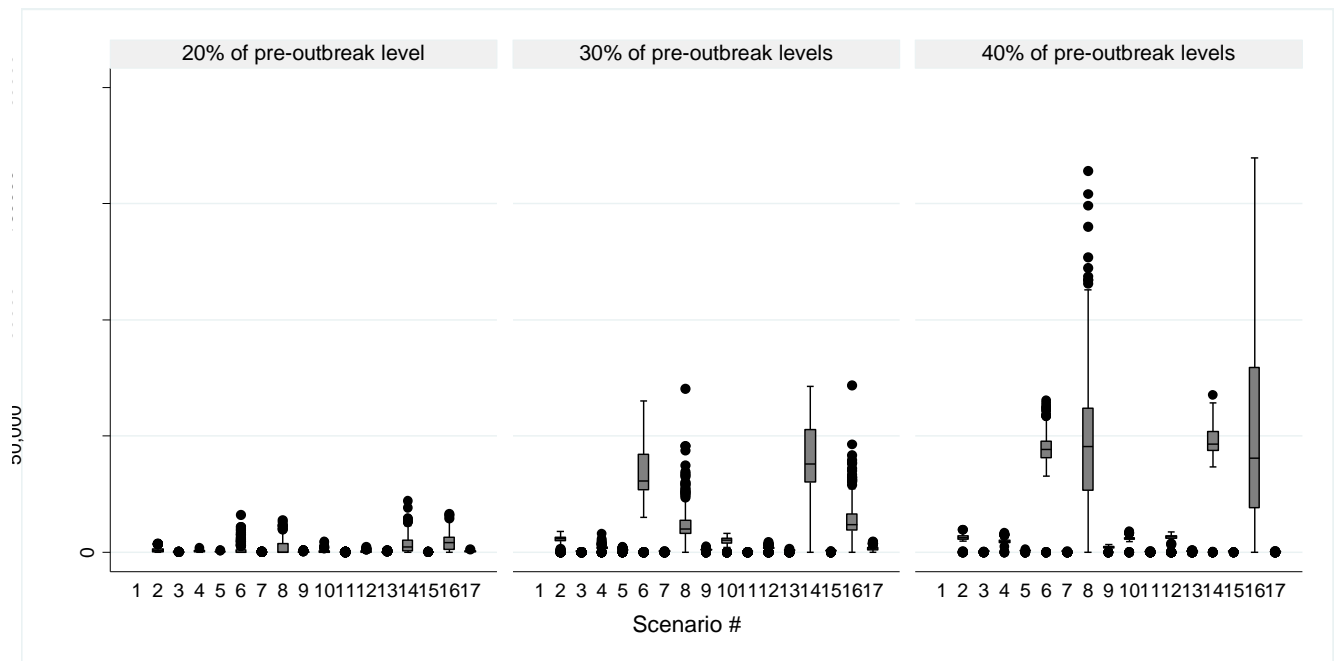
^aThe box plot parameters are boxes at 25th and 75th percentiles, the line in the box is the median, whiskers are 5th and 95th percentiles and dots are outliers.

Figure 8. Box plots of number of herds depopulated for the sensitivity analysis of the movement controls at 20%, 30%, and 40% of pre-outbreak levels for all scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.



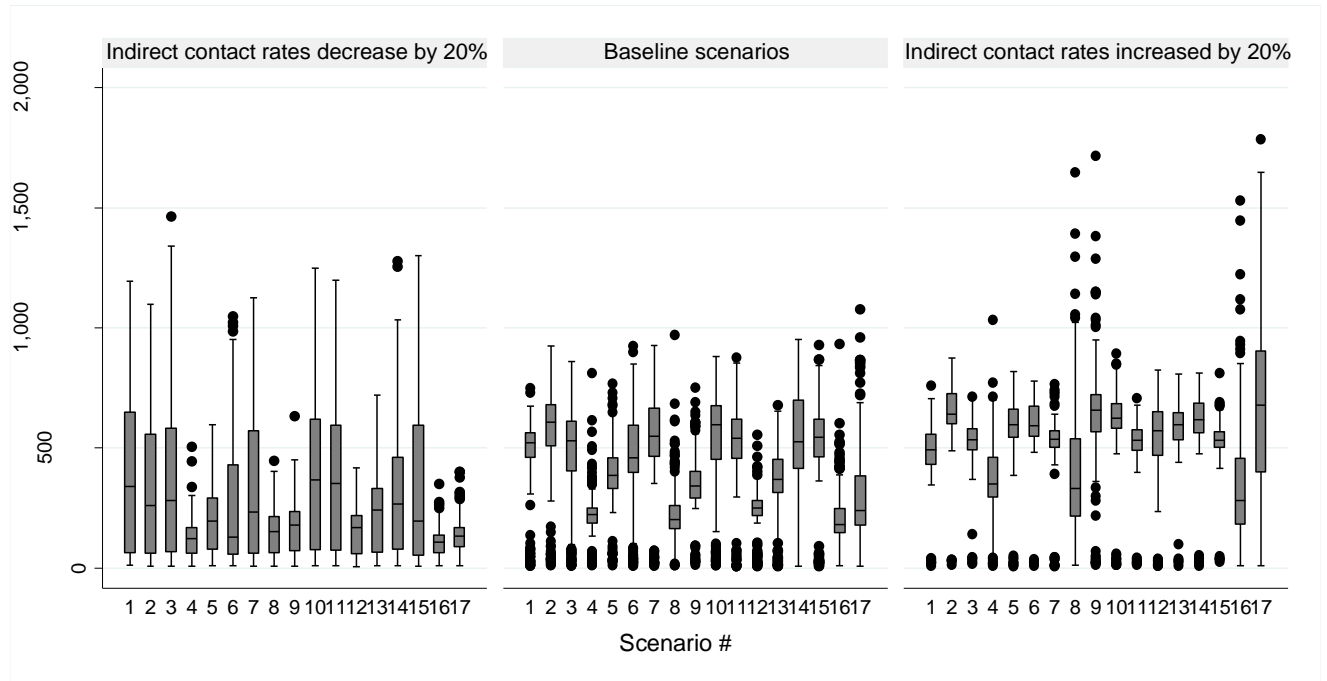
^aThe box plot parameters are boxes at 25th and 75th percentiles, the line in the box is the median, whiskers are 5th and 95th percentiles and dots are outliers.

Figure 9. Box plots of number of herds vaccinated for the sensitivity analysis of the indirect movement controls at 20%, 30%, and 40% of pre-outbreak levels for all scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.



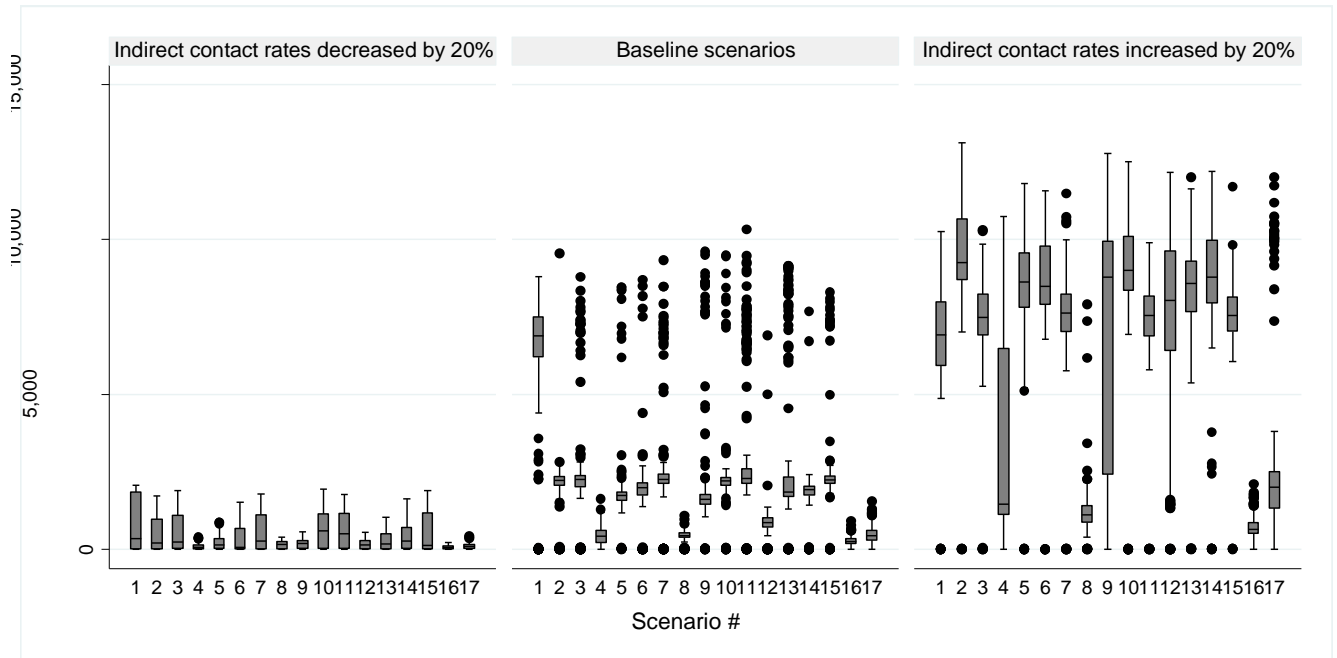
^aThe box plot parameters are boxes at 25th and 75th percentiles, the line in the box is the median, whiskers are 5th and 95th percentiles and dots are outliers.

Figure 10. Box plots of the duration of the active disease phase for the sensitivity analysis of the indirect contact rate and the baseline indirect contact rate for all scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.



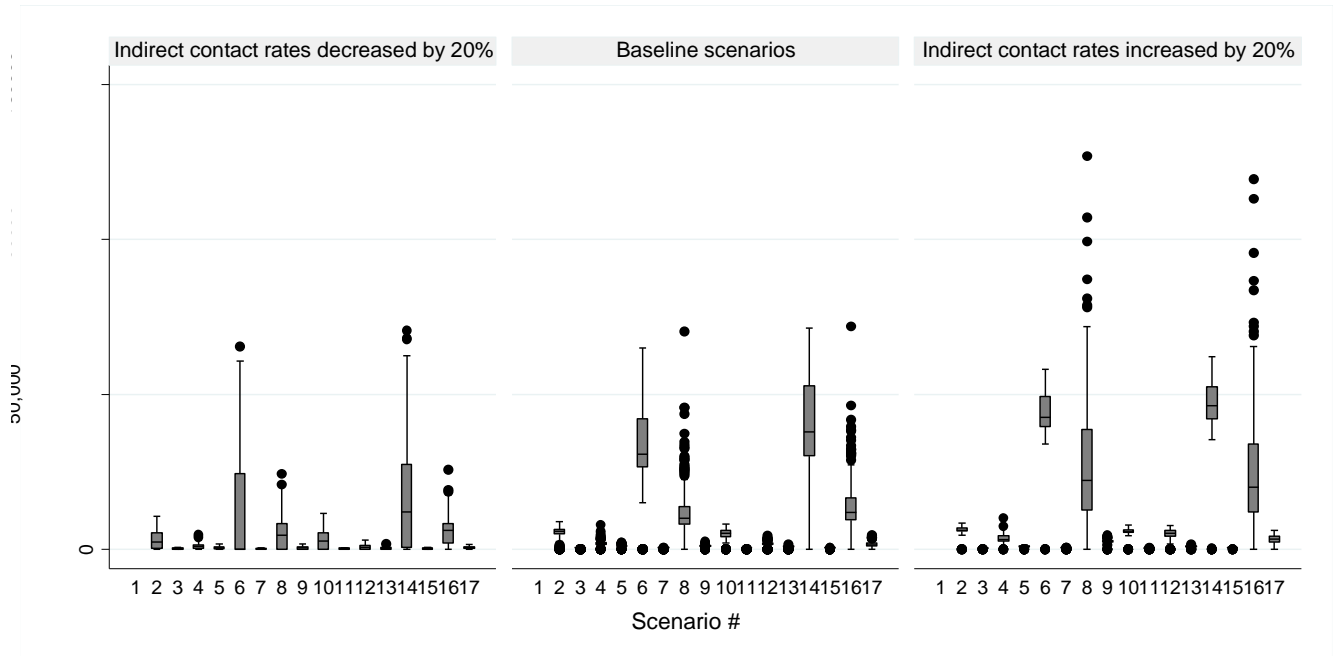
^aThe box plot parameters are boxes at 25th and 75th percentiles, the line in the box is the median, whiskers are 5th and 95th percentiles and dots are outliers.

Figure 11. Box plots of the number of herds depopulated for the sensitivity analysis of the indirect contact rate and the baseline indirect contact rate for all scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.



^aThe box plot parameters are boxes at 25th and 75th percentiles, the line in the box is the median, whiskers are 5th and 95th percentiles and dots are outliers.

Figure 12. Box plots of the number of herds vaccinated for the sensitivity analysis of the indirect contact rate and the baseline indirect contact rate for all scenarios of a potential foot and mouth disease virus outbreak in a central region of the U.S.



^aThe box plot parameters are boxes at 25th and 75th percentiles, the line in the box is the median, whiskers are 5th and 95th percentiles and dots are outliers.