



Animal &  
Plant Health  
Agency

# Early decision indicators to predict the severity of an FMD outbreak

A simulation modelling study by the QUADS epiteam

*C. Birch, T. Boyer, **C. Cook**, C. Dubé, F.D. Dorea, K. Forde Folle, M.G. Garner, K. Ståhl, R. Moir, K.A. Patyk, T. Rawdon, R.Sanson, T. Smylie, M.A. Stevenson, M. Van Andel, Z. Yu*

# Outline

- The QUADS epiteam
- Motivation
- Study design / model seeding
- Early decision indicators investigated
- Preliminary linear regression results
- Discussion
- Next steps

# The QUADs Epiteam

## Members

- Canada, USA, Australia, New Zealand, UK, Sweden
- All have independently developed models for simulating FMD outbreaks
  - Interspread plus (Canada and NZ)
  - North American Animal Disease Spread Model (USA)
  - Australian Animal Disease model (AADIS)
    - Previous QUADs studies have used AusSpread
  - Exodis-FMD (UK)
  - Davis Animal Disease Spread model (DTU-DADS)

## Motivation

- Bring together expertise in modelling and epidemiology
- FMD provides a focus for skills
- All countries are disease free without vaccination

# Motivation for study

## Early decision indicators (EDIs)

- Can epidemiological features early in outbreak predict severity of epidemic outcome
  - Large numbers of infected premises (IPs)
  - Long duration outbreaks lasting months
  - Large areas of the country under disease restrictions
- Early decisions can start vaccination earlier
  - Vaccine matching options
  - Stand-up vaccination resourcing contracts
  - Decisions on vaccination zones
  - Decisions on vaccine deployment strategies
- Modelling study
  - Create large numbers of outbreak iterations (10,000)
  - Cover a range of starting conditions
  - Investigate a number of different EDIs

# Study design & model seeding

## Study design (determined by each country)

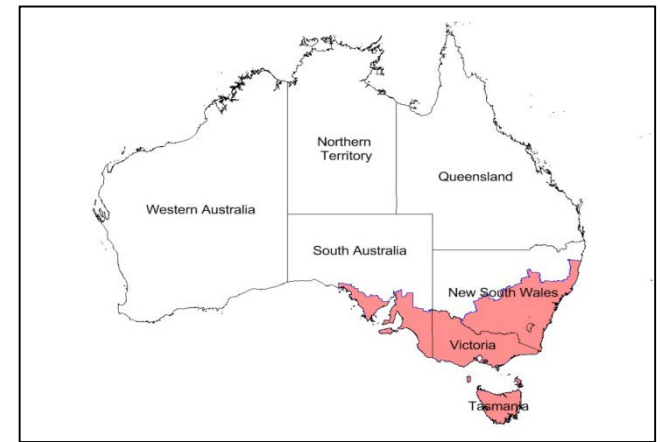
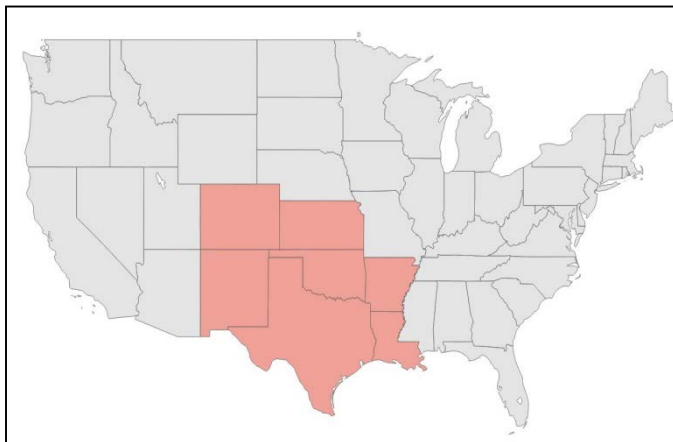
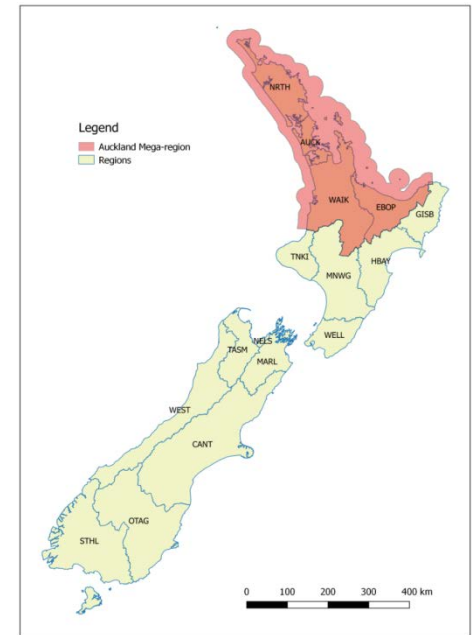
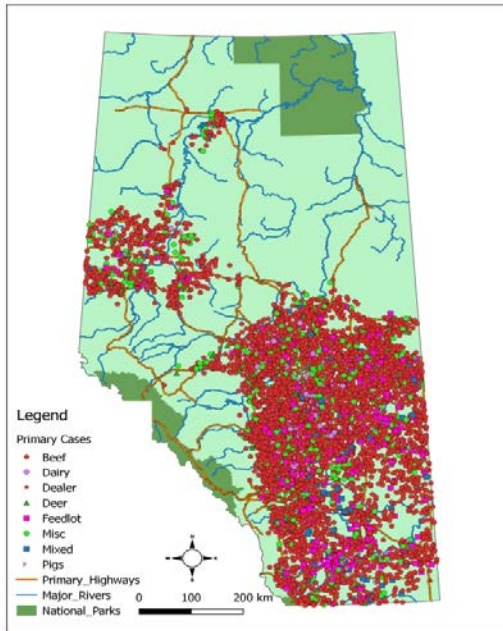
- Study area included range of farm density, species and practices
- First detection simulated based on reporting likelihoods for each country
- Control measures based on stamping out policy
  - Dangerous and contiguous culling and vaccination excluded at this stage
- Model iterations continued until eradication or 365 days elapsed

## Seeding

- Iterations seeded infection randomly over the study area
  - Some restrictions applied e.g. minimum number of animals present
- 10,000 iterations with random seeding for each iteration
  - Iterations without detection of infection are excluded

# Study design & model seeding

- Canada – Province of Alberta
- New Zealand – Auckland and surrounding regions for seeding
- USA – Texas and surrounding states
- Australia - SE Australia for seeding
- UK – England, Scotland and Wales



# Early decision indicators to be investigated

Explanatory variable	Comments
IPs	Cumulative IPs found up to 7, 14 and 21 days
Herd density	Density of herds using a 5 x 5 km cell centred on index farm
Cattle density	Density of cattle using a 5 x 5 km cell centred on index farm
Pig density	Density of pig using a 5 x 5 km cell centred on index farm
Sheep/goat density	Density of sheep/goats using a 5 x 5 km cell centred on index farm
Human population density	Gridded 2015 world population estimate will be used (available online), resolution of 5km <sup>2</sup> centered on index farm

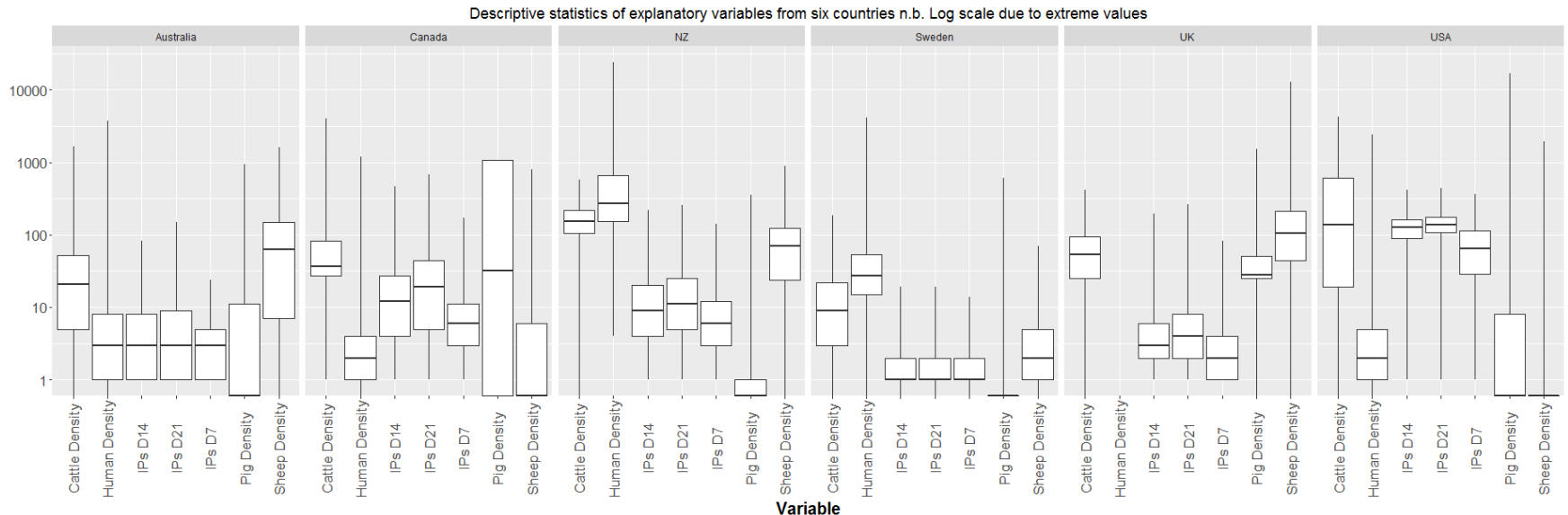
## Outbreak metrics

- Total number of Infected Premises (IPs)
- New IPs from a given time point
- Epidemic duration
- Area under control (AUC) – area of the study zone under FMD controls

# Descriptive statistics explanatory variables

Country	Australia	Canada	NZ	Sweden	UK	USA
Model	AADIS	ISP	ISP	DTU-DADS	Exodis-FMD	NAADSM
Number of simulations	9113	9879	8784	10000	10000	10000
Value	Median value of number of simulations					
Variable						
IPs day 7	3	6	6	1	2	64
IPs day 14	3	12	9	1	3	125
IPs day 21	3	19	11	1	4	138
Cattle Density (per km <sup>2</sup> )	21	37	152	9	53	136
Sheep Density (per km <sup>2</sup> )	62	0	70	2	104	0
Pig Density (per km <sup>2</sup> )	0	32	0	0	28	0
Human Density (per km <sup>2</sup> )	3	2	273	27	NA	2

## Variables distribution



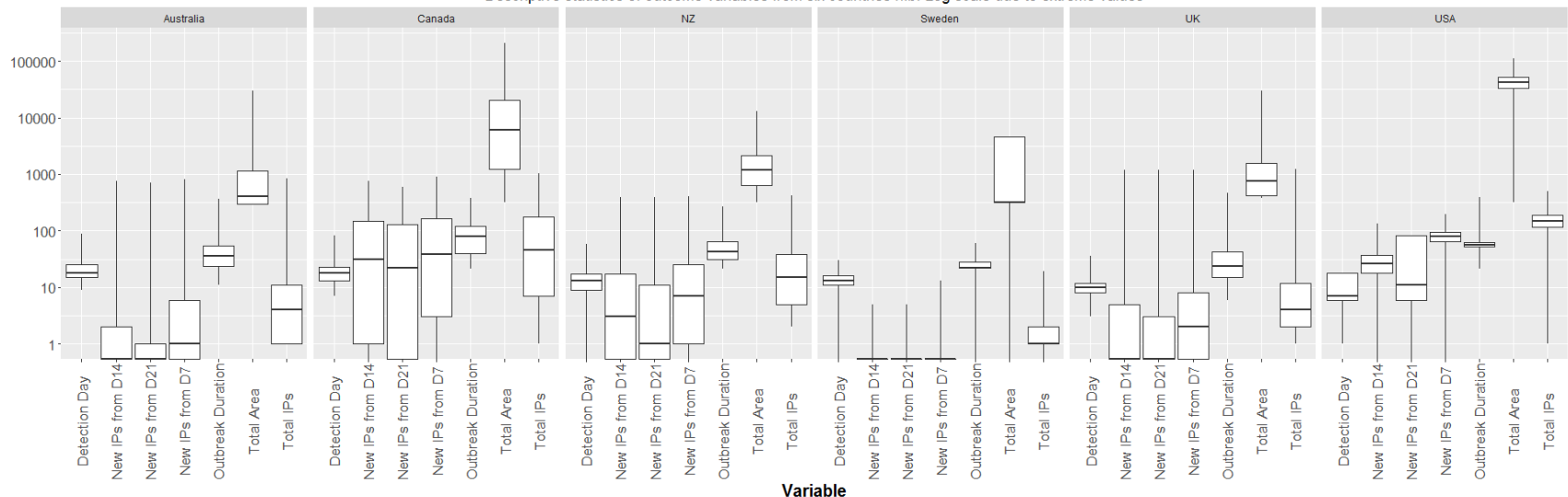


# Descriptive statistics outcome variables

Country	Australia	Canada	NZ	Sweden	UK	USA
Model	AADIS	ISP	ISP	DTU-DADS	Exodis-FMD	NAADSM
Number of simulations	9113	9879	8784	10000	10000	10000
Value	Median value of number of simulations					
Variable						
Detection Day	18	18	13	13	10	7
Total IPs	4	46	15	1	4	148
New IPs after day 7	1	39	7	0	2	80
New IPs after day 14	0	31	3	0	0	26
New IPs after day 21	0	22	1	0	0	11
Outbreak duration (days)	36	79	43	22	24	57
Total area (km <sup>2</sup> )	409	6020	1176	314	766	41521

## Outcome variables distribution

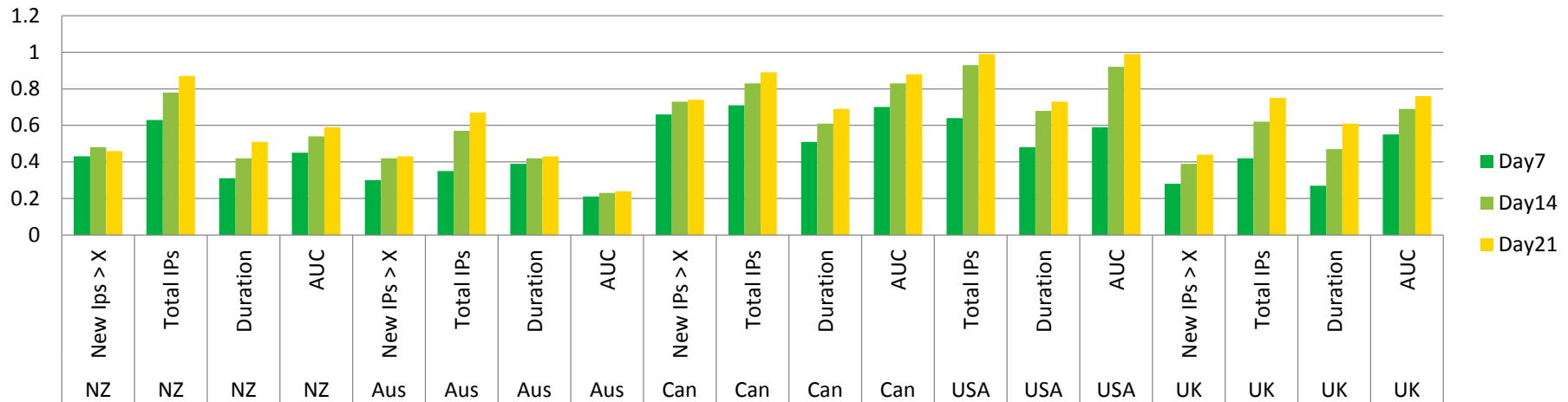
Descriptive statistics of outcome variables from six countries n.b. Log scale due to extreme values



# Linear Regression Model Fit

- Outcome variables
  - Duration, Total IPs, AUC, New IPs after day 'X' (New IPs > X)
- Simplified linear regression models for each country contained different explanatory variables
  - Most models dropped Human density as an explanatory variable
  - Number of IPs at day 'X' retained by all models
- Model fit increases from day 7 to day 21 data

**R<sup>2</sup> model fit results for simplified linear regression models**



# Linear Regression Predictive Results

- Ability for model to predict large or small outbreaks
  - Cut points for large and small outbreaks are arbitrary
  - Definitions of large and small differ between countries
- Individual countries concentrated on the most relevant time point
  - Area under control and total IP outcomes had the most correctly classified iterations
  - Number of IPs up to a given time point had the most predictive power across the countries

# Discussion

- Similar studies have focused on early data
  - Halasa et al (2013), Hutber et al (2006)
  - First fortnight spatial spread and first fortnight incidence
- We attempt to investigate other time points
  - Some countries will be able to mount a response before day 14 if required
  - Previous work has highlighted benefits of starting vaccination early
- Some explanatory variables are more useful than others
  - Total number of IPs is very explanatory
  - Relatively easy to access during an outbreak
  - Human density estimates were dropped from all models
  - Calculation of human density may not be ideal
- Incorrect deployment of vaccine has cost implications
  - Extended time under export restrictions
  - Cost of vaccination program
  - Management of vaccinated animals

# Next steps

- Other EDIs can be investigated from same model iterations
  - Pending culling, delays to culling from resource constraints
  - Seed farm type, interactions contributing to spread
  - Estimated dissemination rate, frequency of reporting IPs
  - IP density, clustering features of outbreaks
  - Different time points, more frequent intervals
- Original modelling outputs are retained as data library
  - Additional iterations of different control strategies
  - Additional iterations of different FMD virus characteristics

# We would like to thank

- Supporting Governments, Departments and Organisations
  - Department for Environment Food and Rural Affairs, Scottish Government and Welsh Government
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  - Alberta Agriculture and Forestry
  - U.S. Department of Agriculture
  - National Centre for Food Protection and Defense
  - Department of Agriculture and Water Resources
  - National Veterinary Institute
  - AsureQuality Ltd
  - University of Melbourne
  - University of Minnesota-Twin Cities
- QUADS Epi team members

Colin Birch, Tim Boyer, Caroline Dubé, Fernanda Dorea, Kimberly Forde Folle, Graeme Garner, Karl Ståhl, Ruth Moir, Kelly Patyk, Tom Rawdon, Robert Sanson, Tom Smylie, Mark Stevenson, Mary Van Andel and Zhidong Yu