

A comparison of three simulation models  
using FMD outbreak in Denmark as a model  
– “the EpiLab Project”

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## Project partners

- Professor George Milne, The University of Western Australia
- Associated professor Annette Ersbøll, Faculty of Life Science, University of Copenhagen
- University of California, Department of Medicine and Epidemiology, Davies, USA
- University of Warwick, Department of biological sciences, ecology and epidemiology group, Great Britain
- Massey University, New Zealand

## Outline

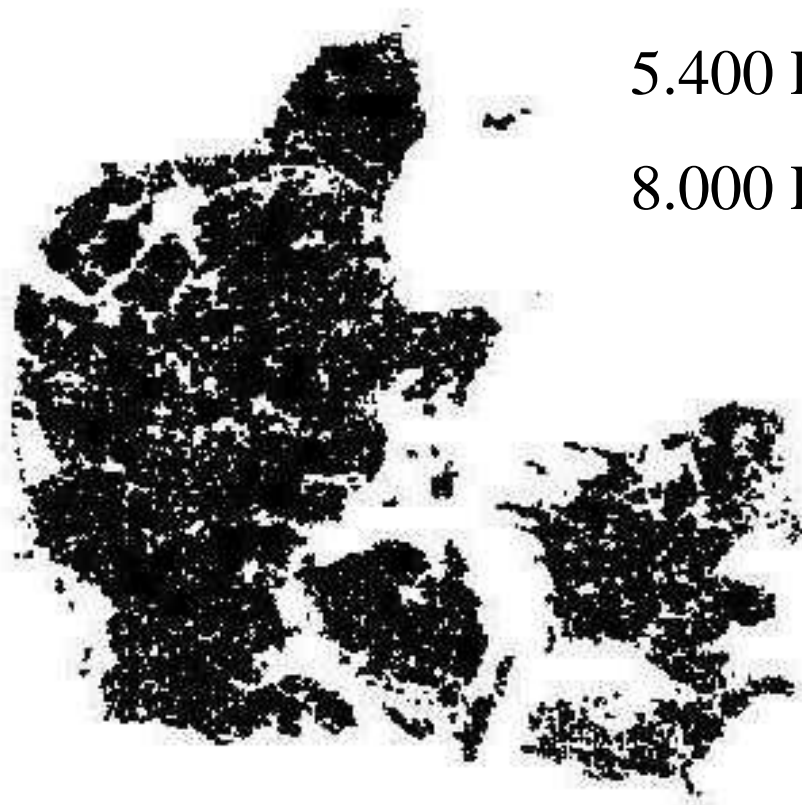
- Background
- Aim and objective of the project
- Materials and methods
- Results
- Conclusion
- Experience gain from the project



## Background: Animal production in Denmark 2006

5.400 Dairy herds, 555.000 cows

8.000 Pig herds, 13 mill pigs



Size of Denmark:

43.094 km<sup>2</sup>, ~50% agriculture

## Background: Last outbreak of FMD in Denmark

- 1982-1983
- According to epidemiological studies:
  - Multiple windborne introduction
  - 23 affected herds
  - Mode of transmission from index herd
    - Practising veterinarian (4)
    - Milk truck (4)
    - Collection of slaughter pigs (3)
    - unknown



## Aim of this project

- ... to provide the decision basis for the choice of control strategies (culling and vaccination) against FMD in Denmark in case of an outbreak
- ❖ The assessment should account for livestock demographics and disease control capacity

## Research hypothesis

- The result from stochastic simulation models for the spread of FMD can partly be explained by method-specific factors, i.e. by the choice of modelling software.

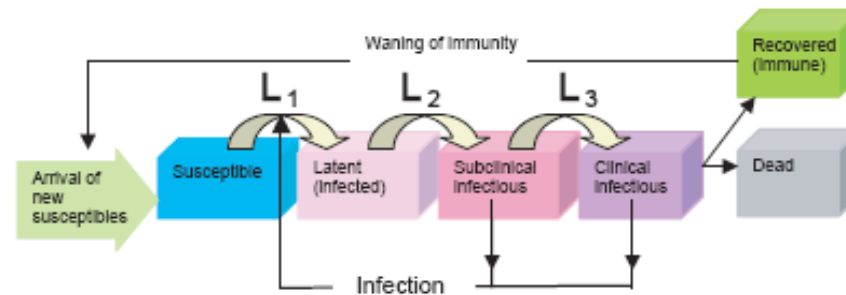
# Materials and methods





## Conceptual model used in the project

- We used a state-transition concept



- The most important parameter is the rule that defines the transition from susceptible to the infected state

## Models used in the project

- Explicit time-space stochastic models:
  - the Warwick model
  - InterSpread Plus
  - the Davies model



## Key features of mechanisms of between-herd transmission of FMD

1. Animal movement
2. Indirect movement
3. Windborne spread
4. Local spread



## Features of how the models includes mechanism of between-herd transmission of FMD

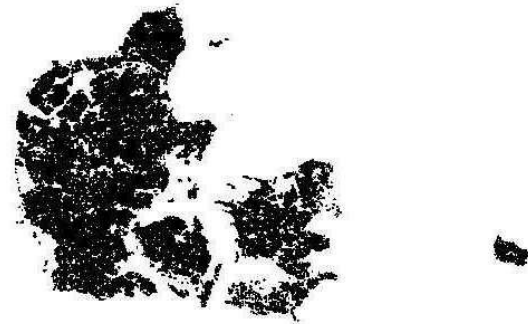
- In the Warwick model, the transmission is model as a function based on a transmission kernel and include all mechanism of transmission.
- InterSpread Plus and the Davies model handle each mechanism separately. Windborne transmission was not considered in these models

## Data used in the simulation

- Herd-specific data:
  - Location of holdings
  - Type of holding
  - Species
  - Production type
  - Number of animals in relevant categories (species, age, sex)
  - Number of animal movements in and out of the herd

## Restrictions and assumptions in the simulation

- Wildlife, small ruminants and non-registered backyard populations was not considered in the simulations
- Only herds in Jutland were included in the simulation
  - ~27,000 herds with cattle, swine or cattle and swine
- Susceptibility of swine equal to the susceptibility of cattle



## Outbreak scenarios

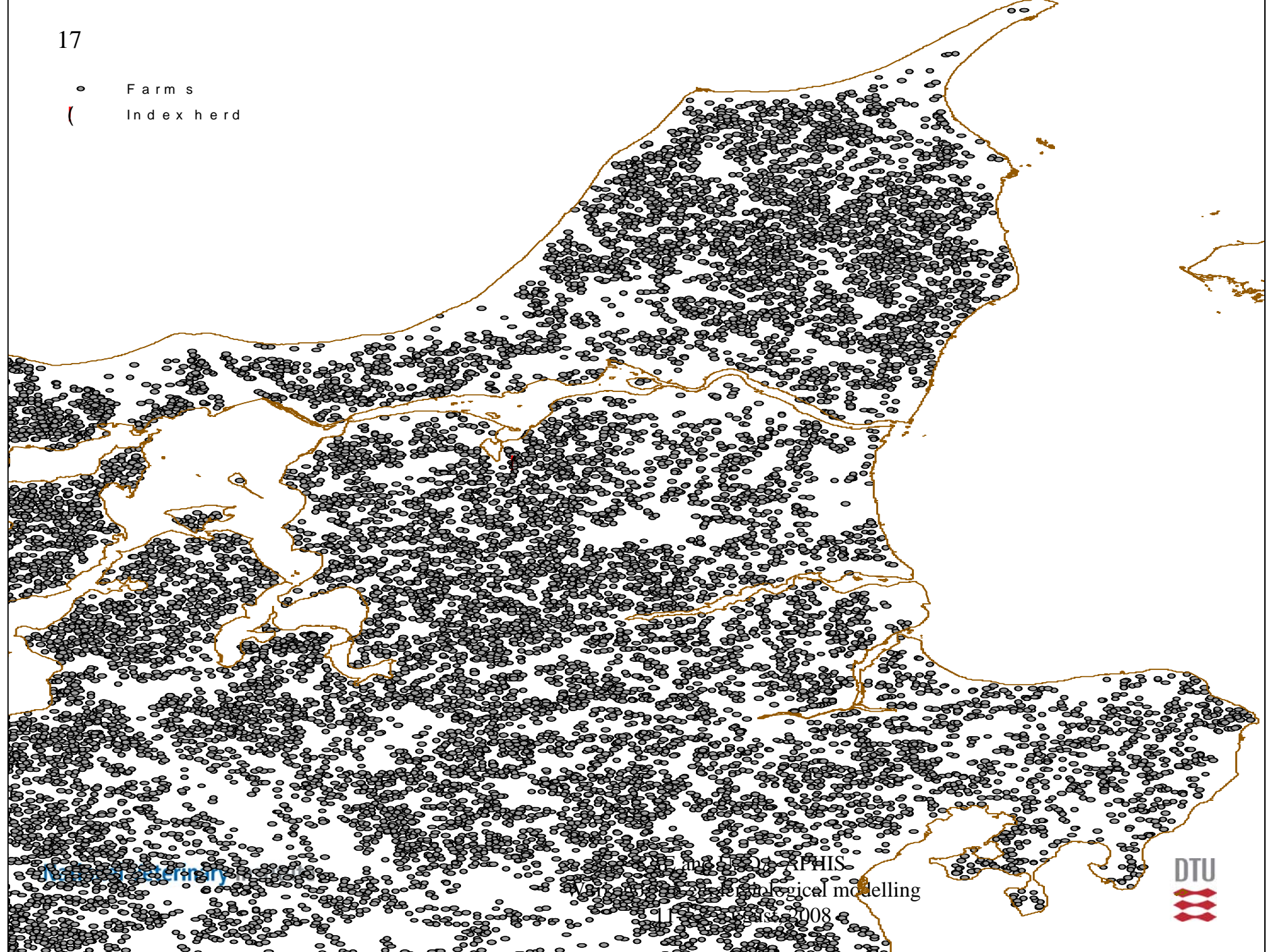
- Two outbreak scenarios were simulated
  - Small outbreak scenario
  - Large outbreak scenario

## Small outbreak scenario

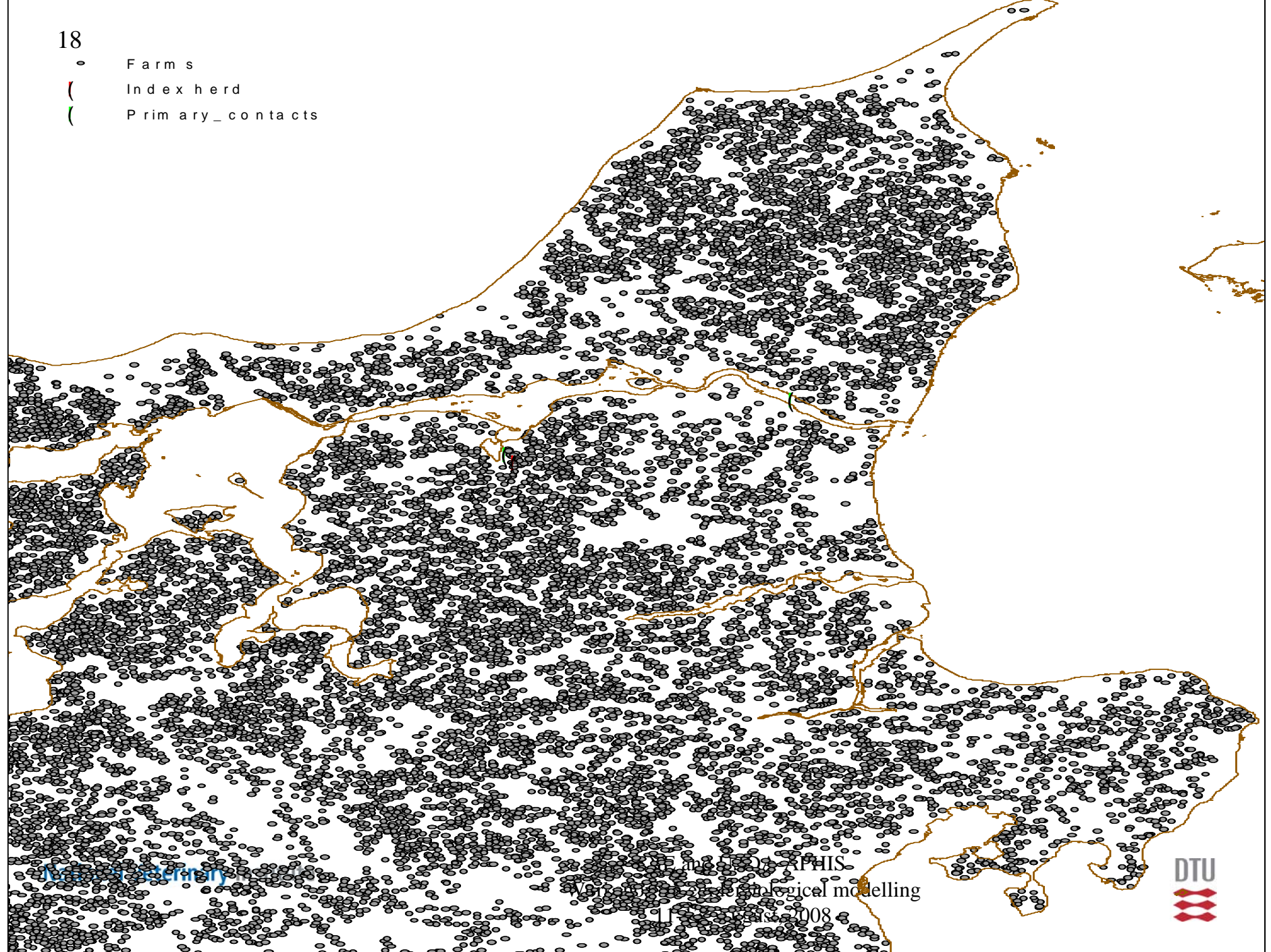
- The index herd was a random swine herd with contact to a mixed herd
- During the silent period of 16 days, all direct and indirect contacts to the index herd were traced – in total 6 infected herds before detection
- Standstill at day 17
- All contact is infective
- Local spread in a 3 km. radius



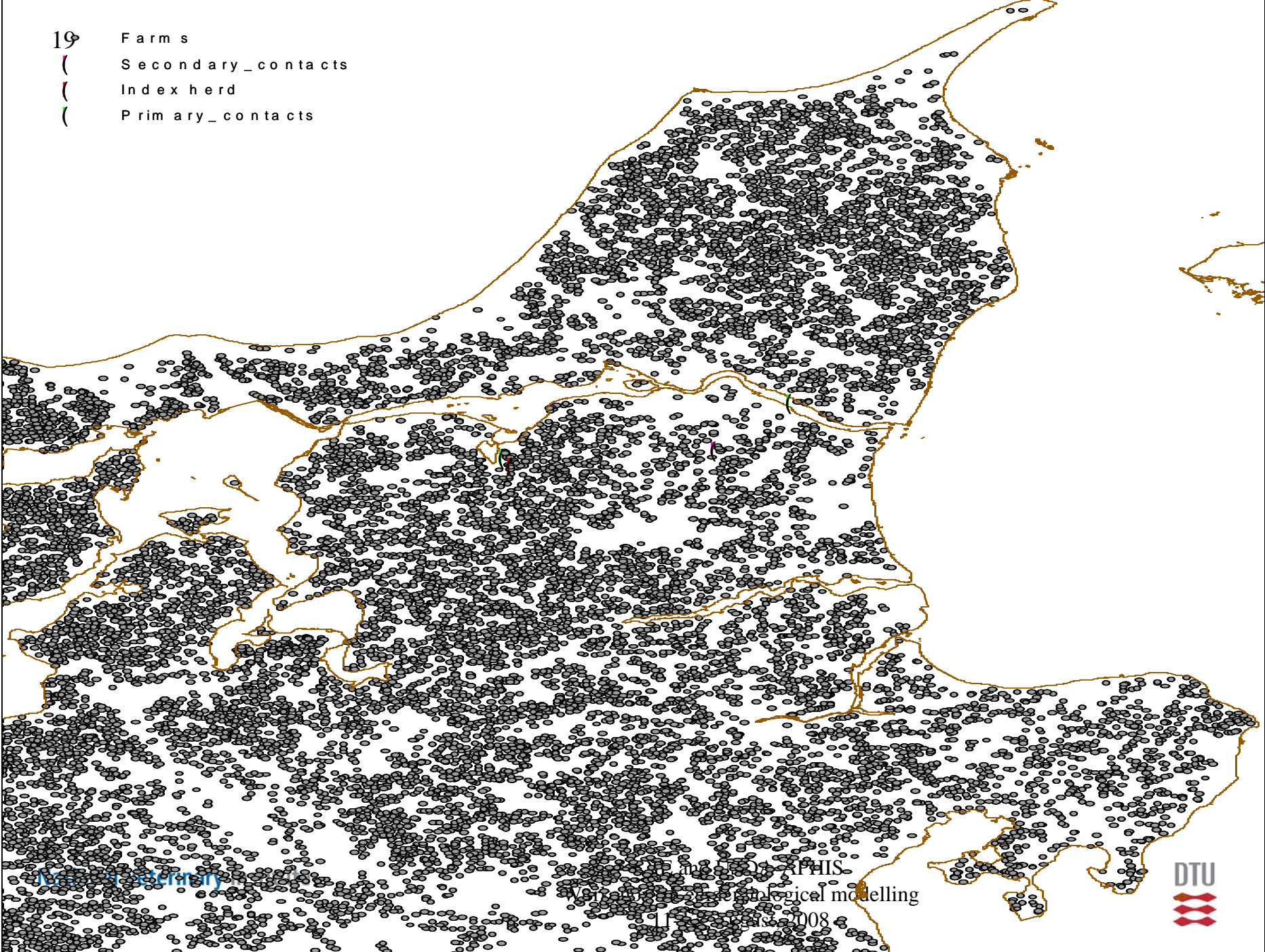
- Farms
- ( Index herd



- Farms
- ( Index\_herd
- ( Primary\_contacts



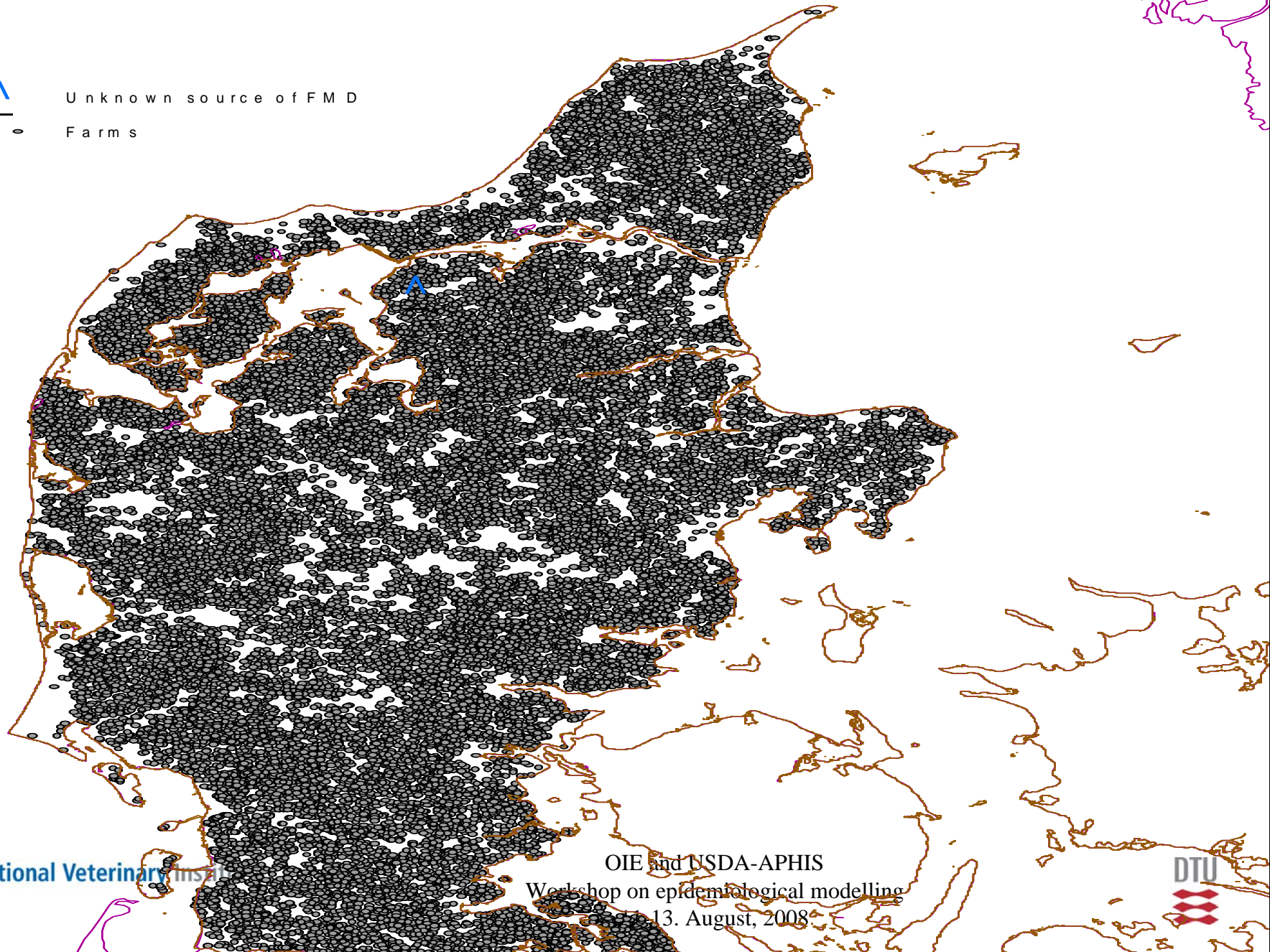
- 19 Farms
- ( Secondary\_contacts
- ( Index\_herd
- ( Primary\_contacts



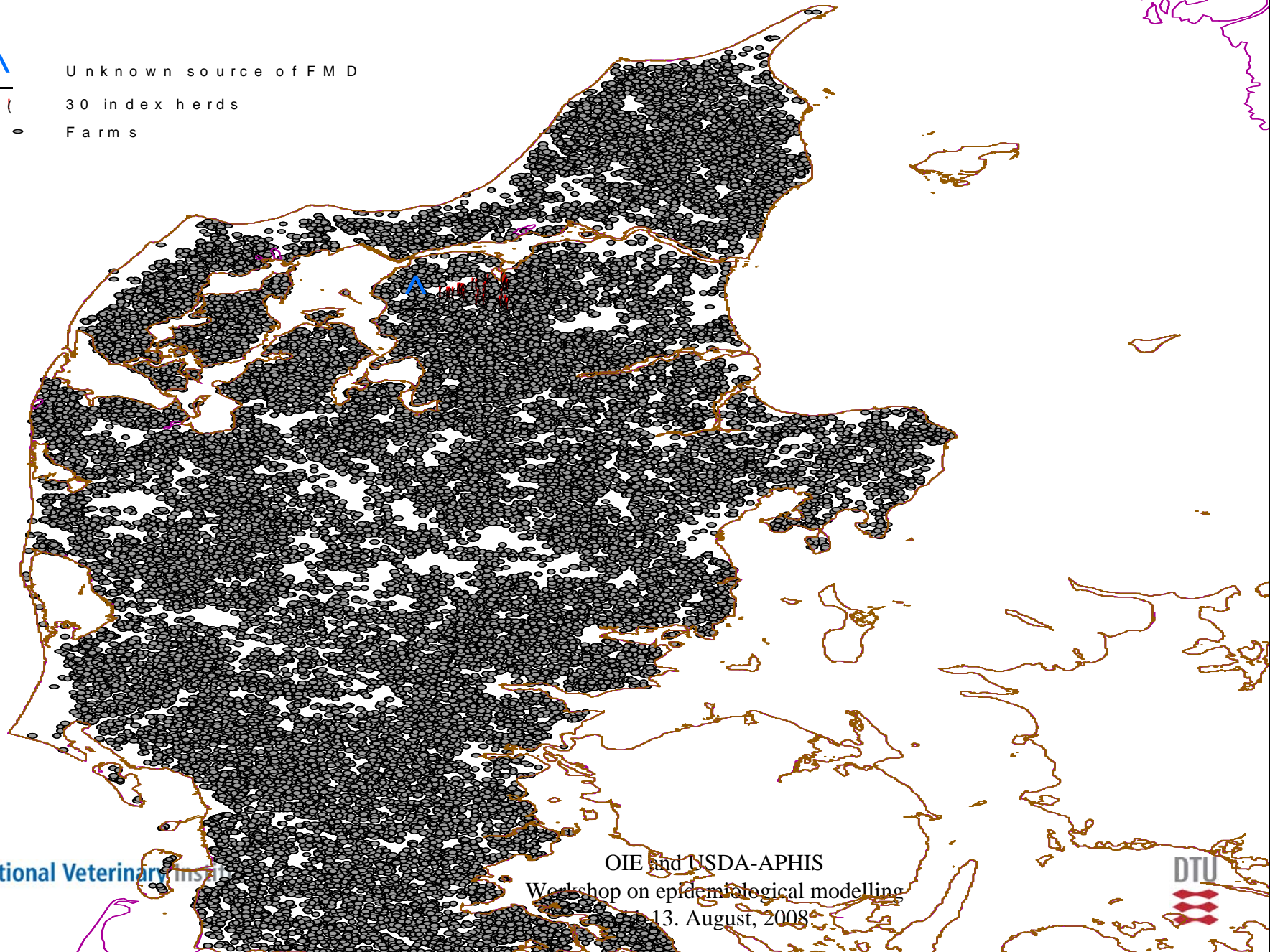
## Large outbreak scenario





- Unknown source of FMD at a random coordinate
- Plume spread by western wind at day 1 to 30 dairy herds (index herds)
- During the silent period of 16 days, all direct and indirect contacts to the index herds were traced – in total 106 infected herds before detection
- All contact is infective
- Local spread in a 3 km. radius
- Standstill at day 17

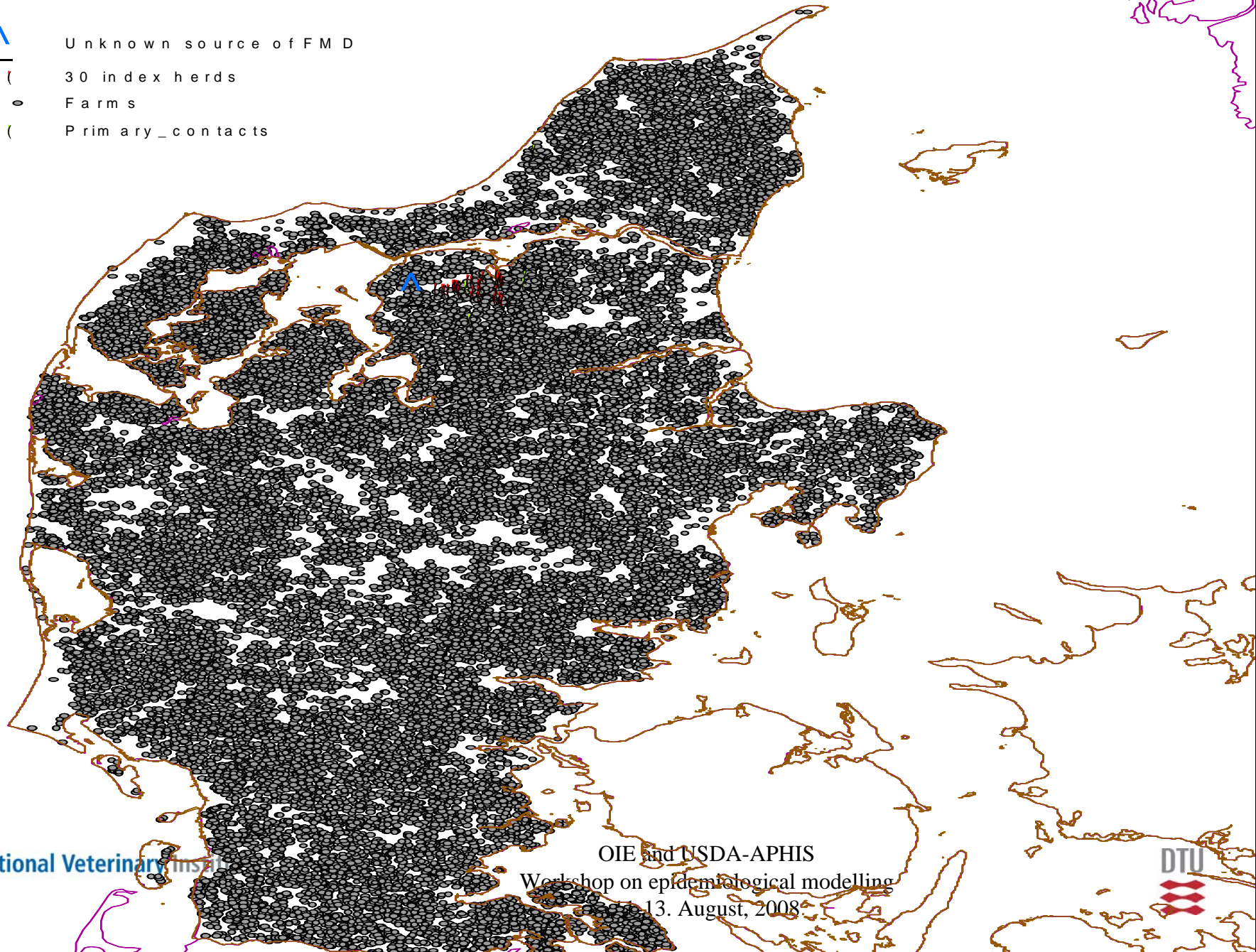
- ^ Unknown source of FMD
- o Farms



- ▲ Unknown source of FMD
- 30 index herds
- Farms



-  Unknown source of FMD
-  30 index herds
-  Farms
-  Primary\_contacts





Unknown source of FMD



30 index herds



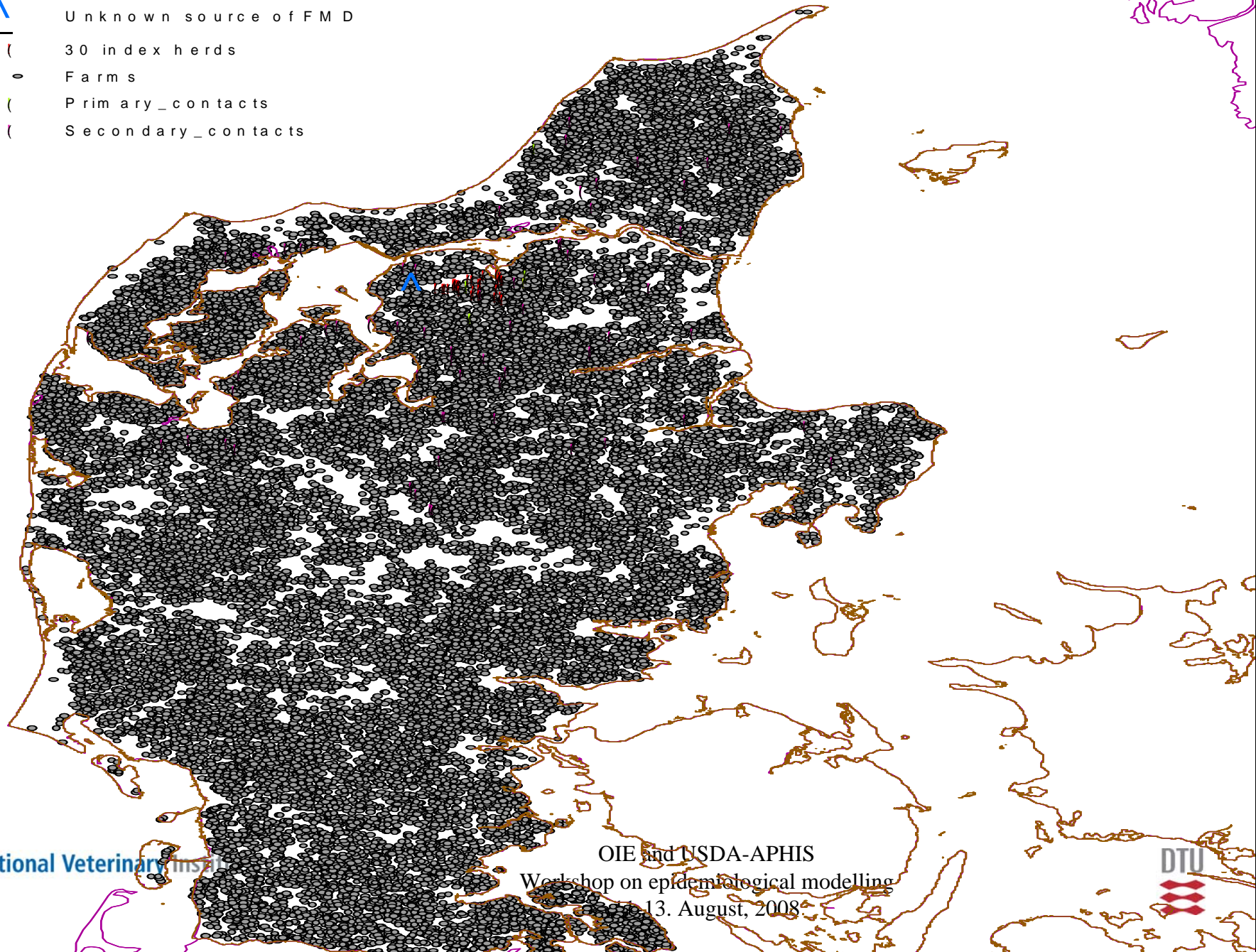
Farms



Primary\_contacts



Secondary\_contacts





## Simulated control options from day 17 and onwards

1. Culling of infected herds and dangerous contacts
2. 1 + culling in 1 km radius of infected premises
3. 1 + vaccination of cattle in 3 km radius of infected herds
4. 1 + vaccination of cattle in 7 km radius of infected herds

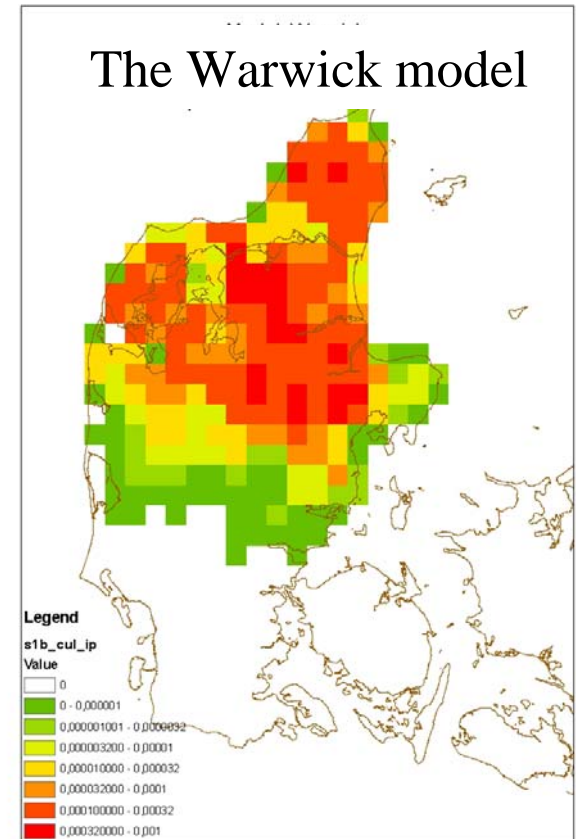
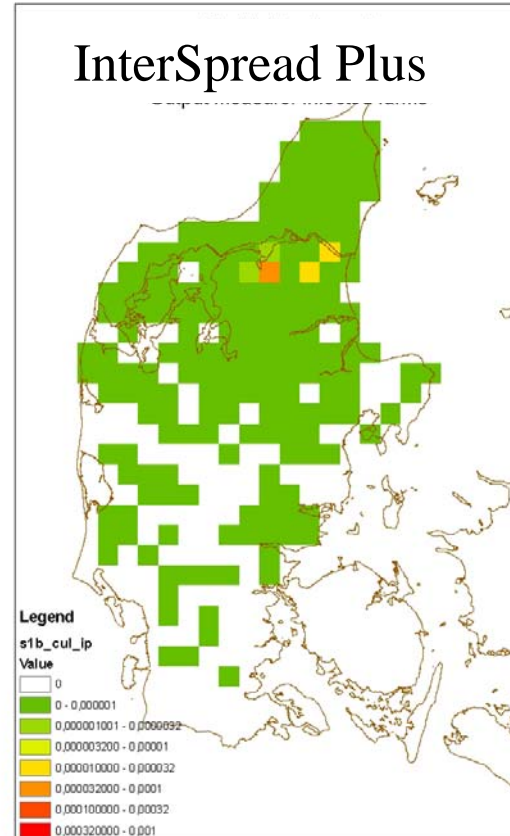
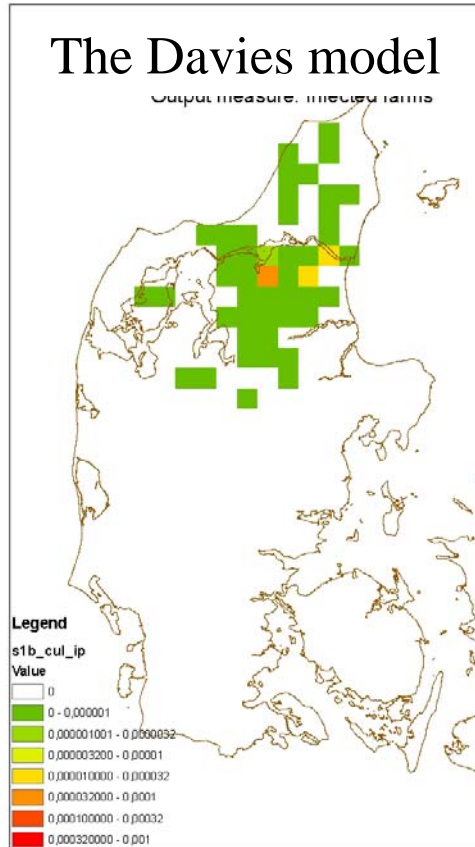
# Simulation

- # simulations
  - 1,000 simulations at each scenario and control strategy
- Input to the models
  - Explicit spatial animal demographics
  - Movement data was included as distributions
- Simulation restricted to Jutland
  - ~27,000 herds with cattle, swine or cattle and swine

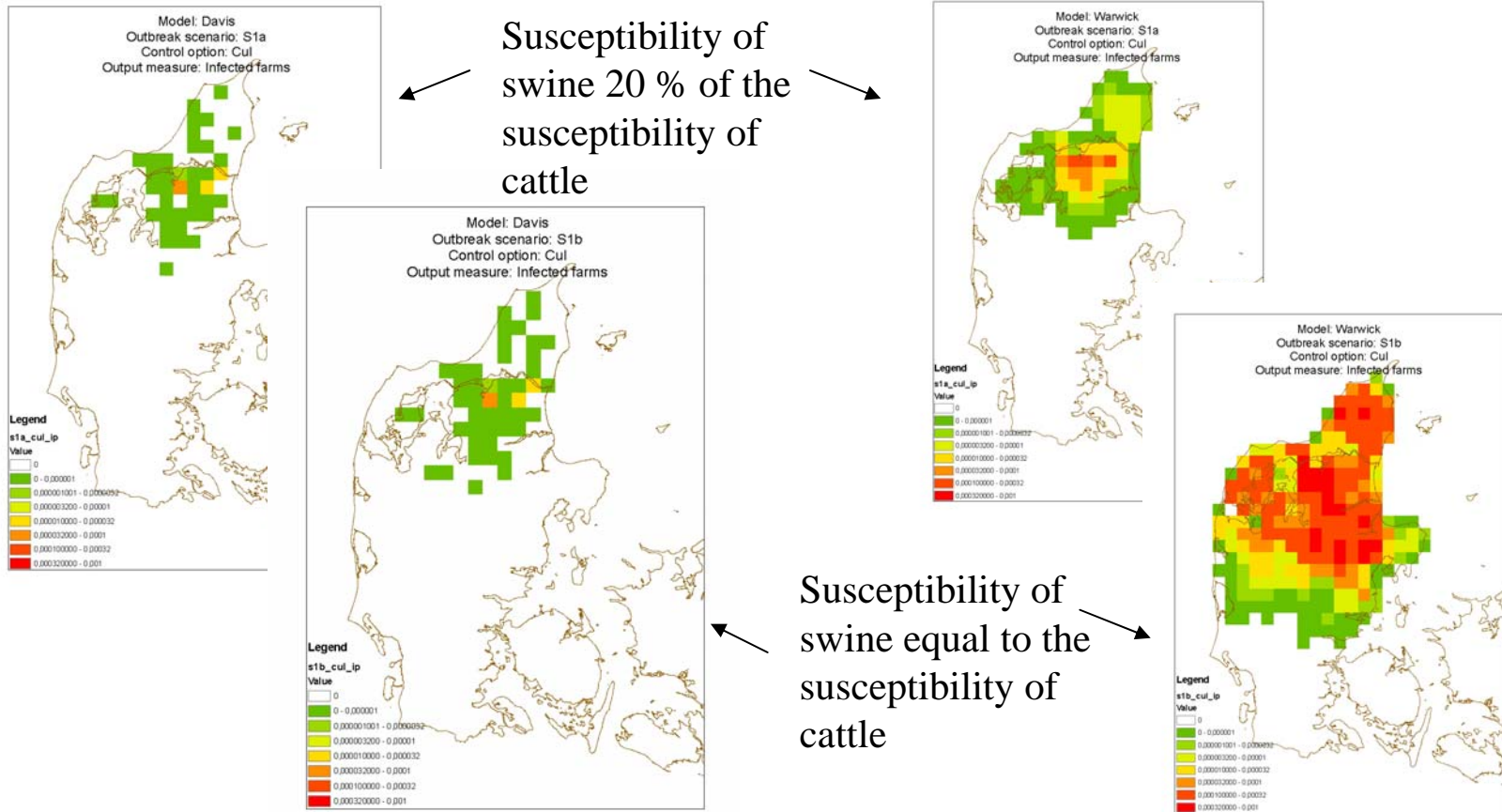
## Results

- Heat maps showing the geographical extend and intensity of the outbreak after 120 days
- Cumulative number of infected and culled herds after 120 days

# Heat maps of small outbreak scenario and use of culling as control – different models

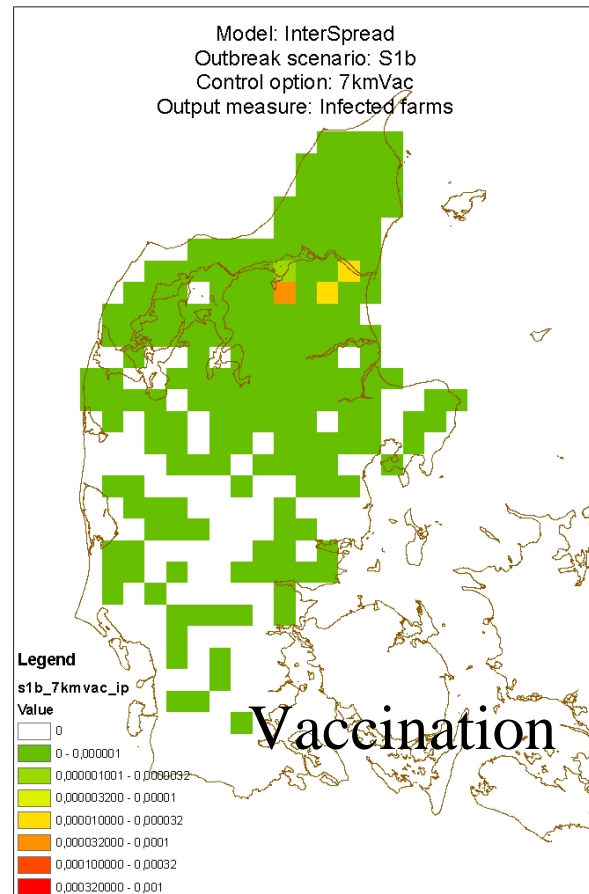
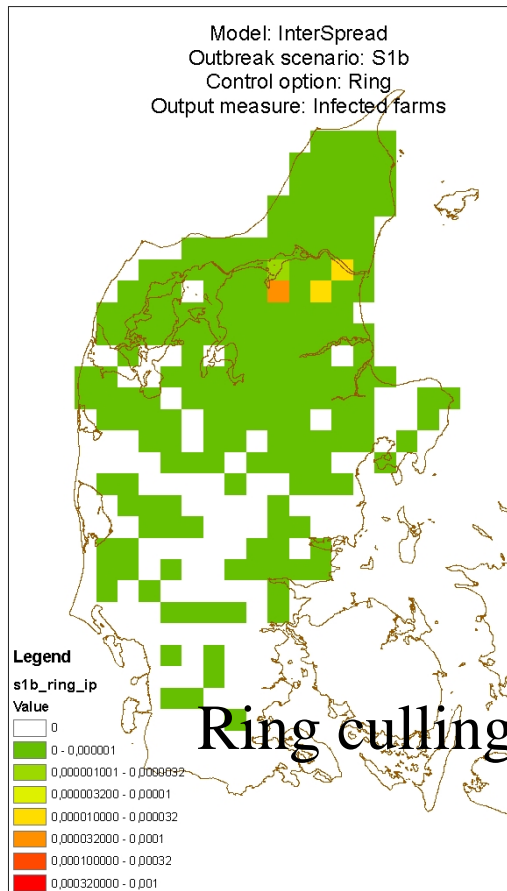
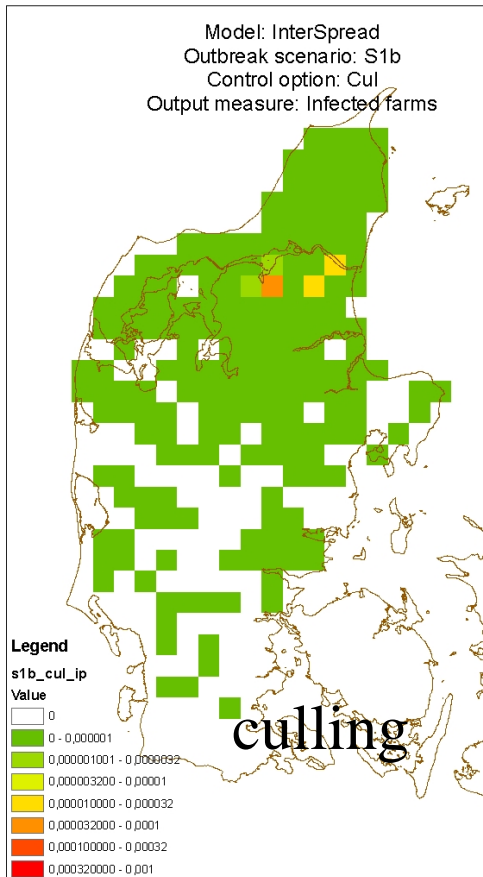


# Heat maps of small outbreak scenario varying the susceptibility of swine compared to the susceptibility of cattle and use of the culling control strategy: Davies (left) and Warwick model (right)

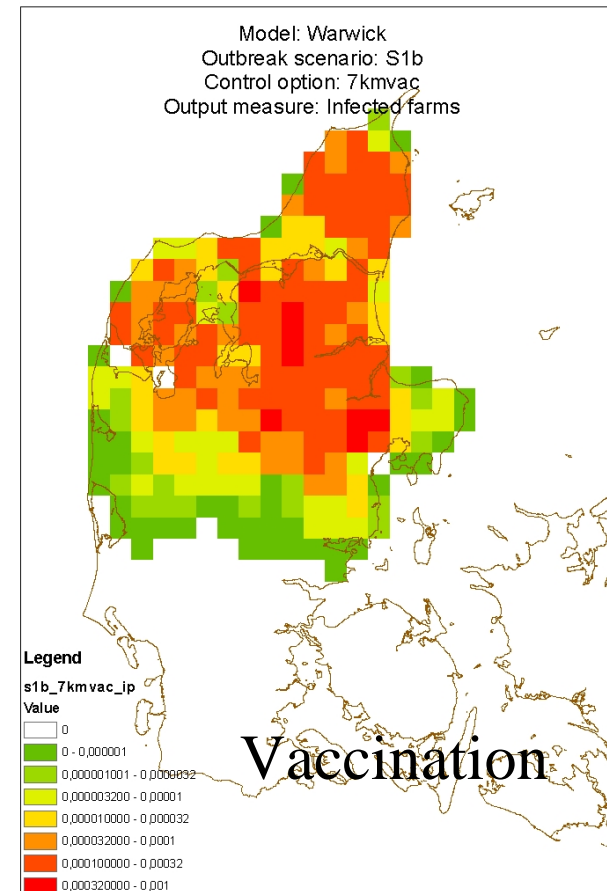
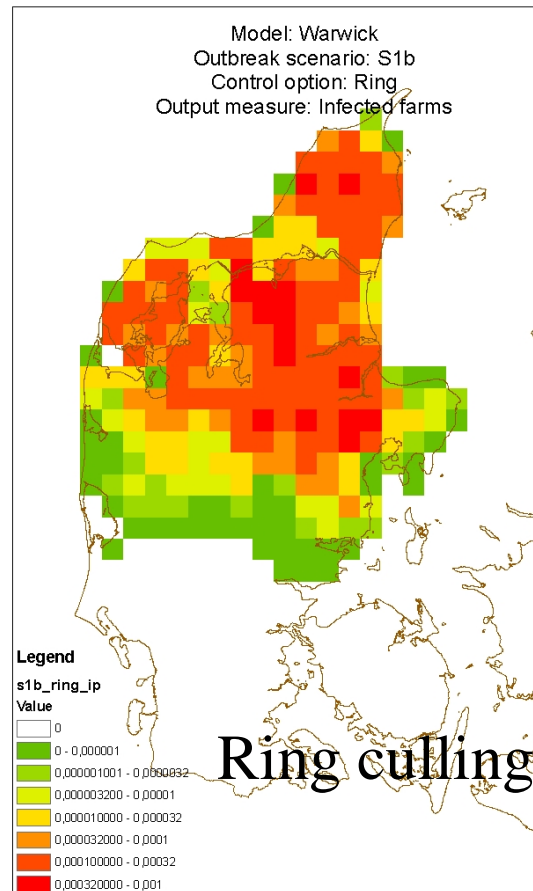
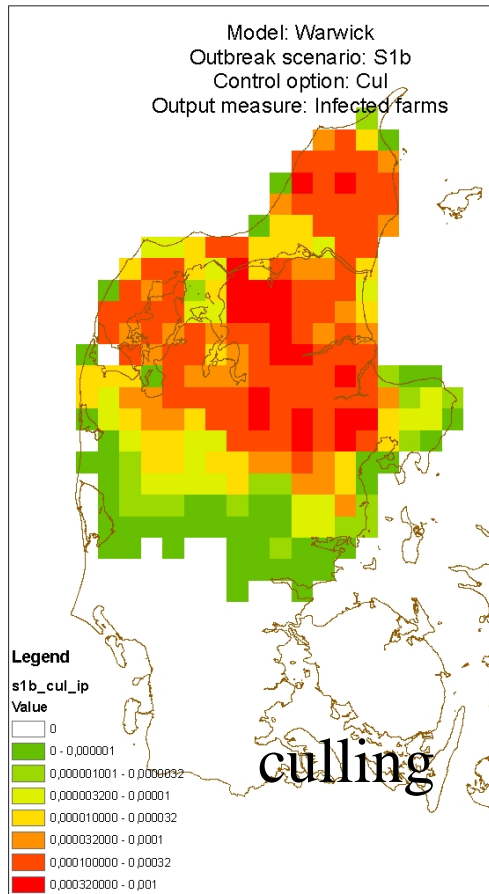




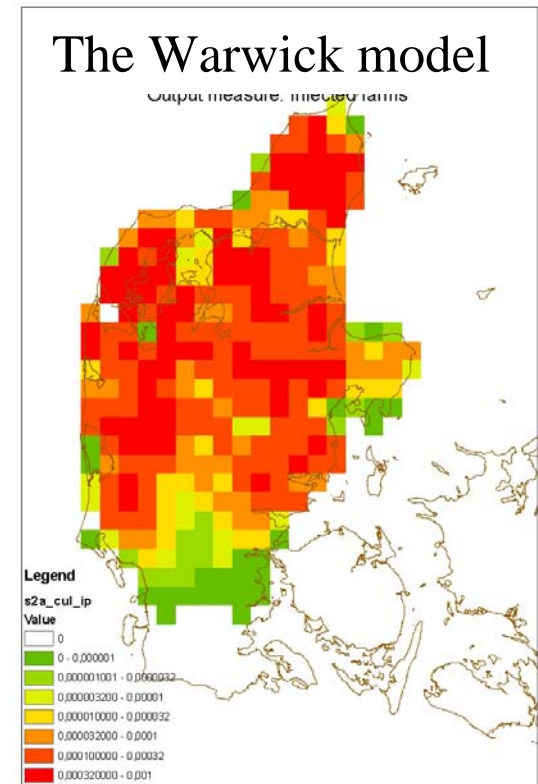
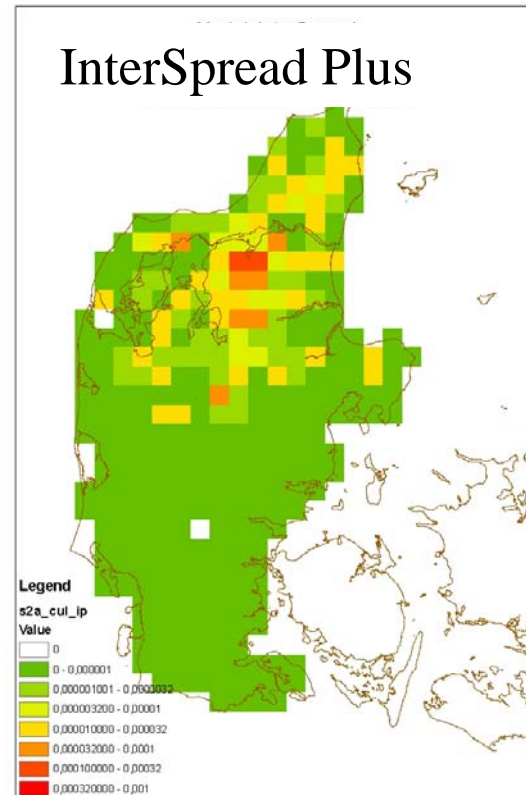
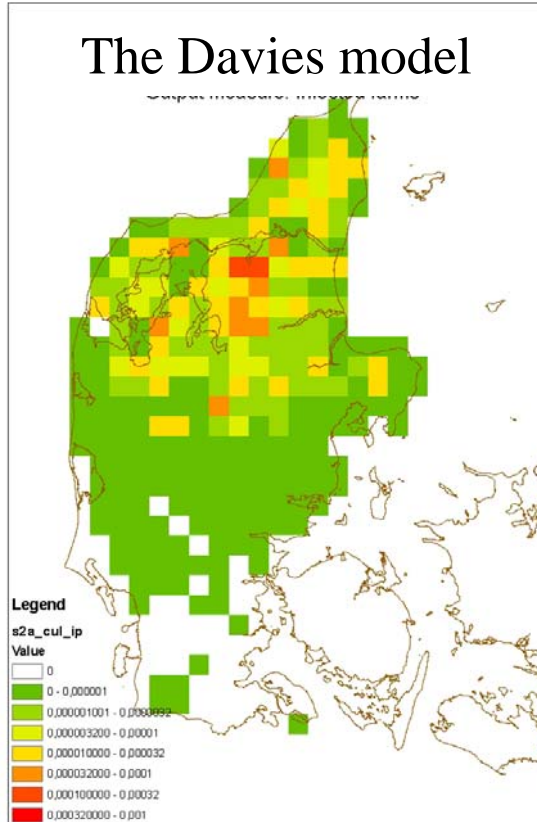
# Heat maps of small outbreak scenario and use of different control strategies – simulation done in InterSpread Plus



# Heat maps of small outbreak scenario and use of different control strategies – simulation done in the Warwick model

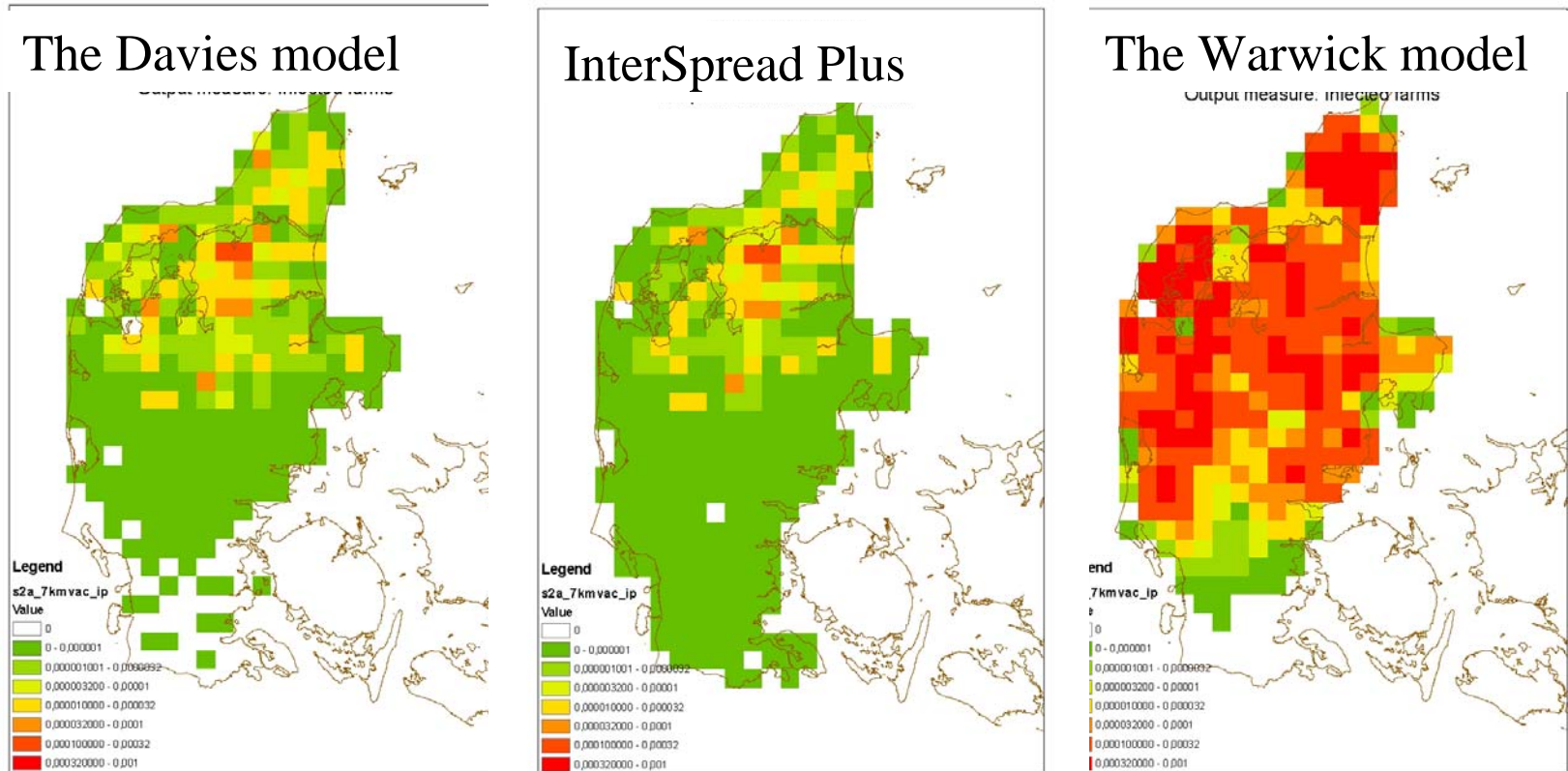


# Heat maps of large outbreak scenario and use of culling as control – simulation done in three different models

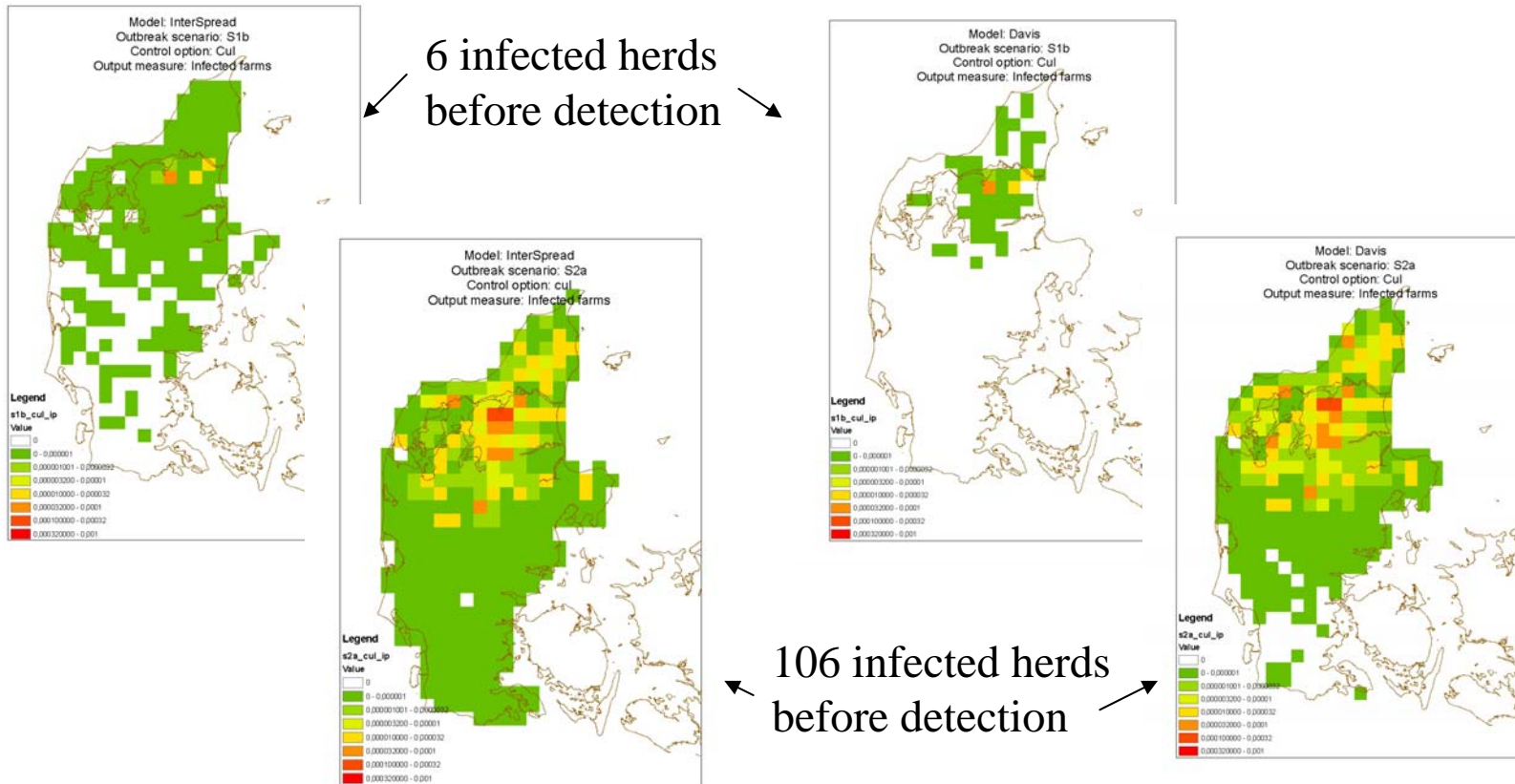




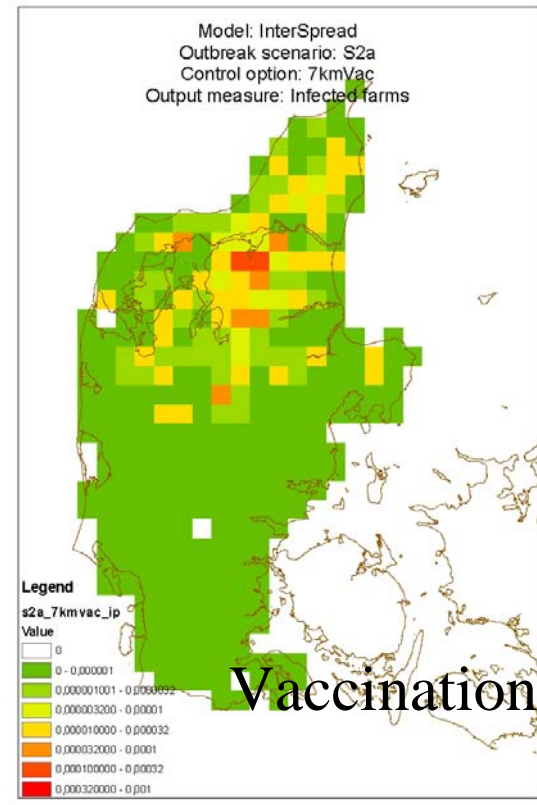
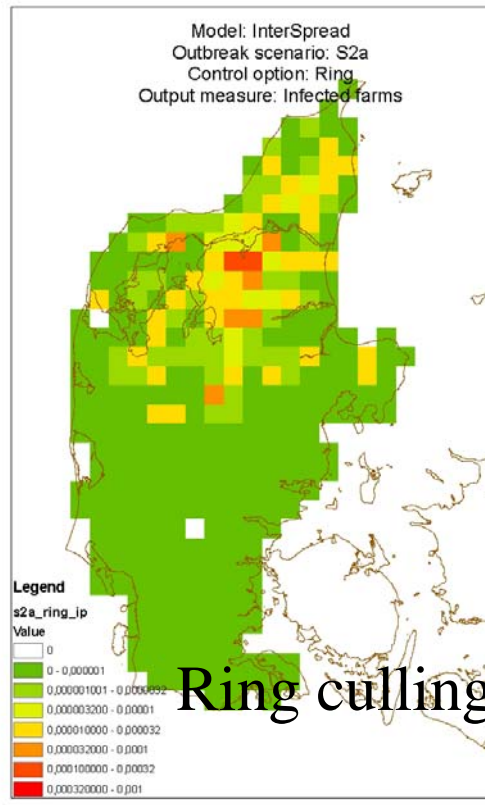
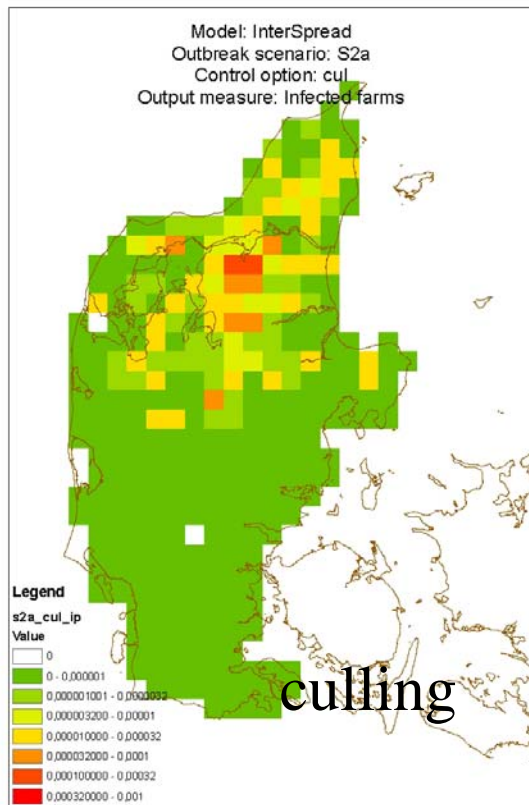
# Heat maps of large outbreak scenario and use of vaccination as control – simulation done in three different models



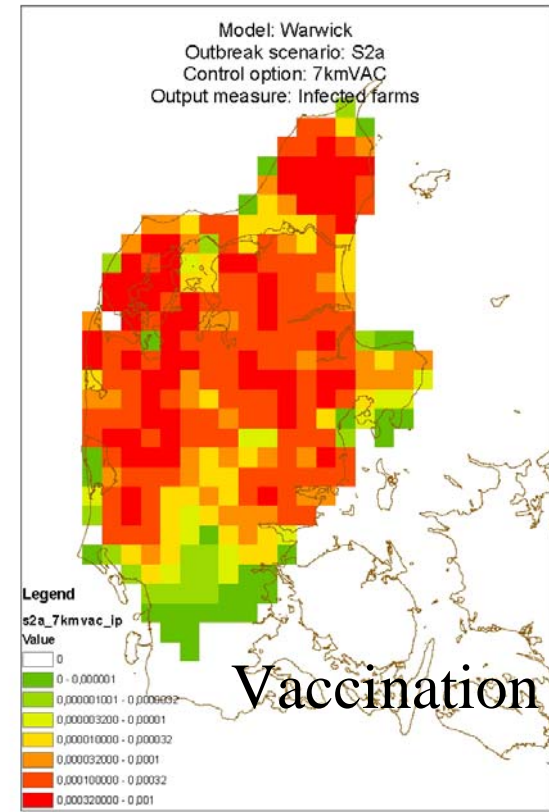
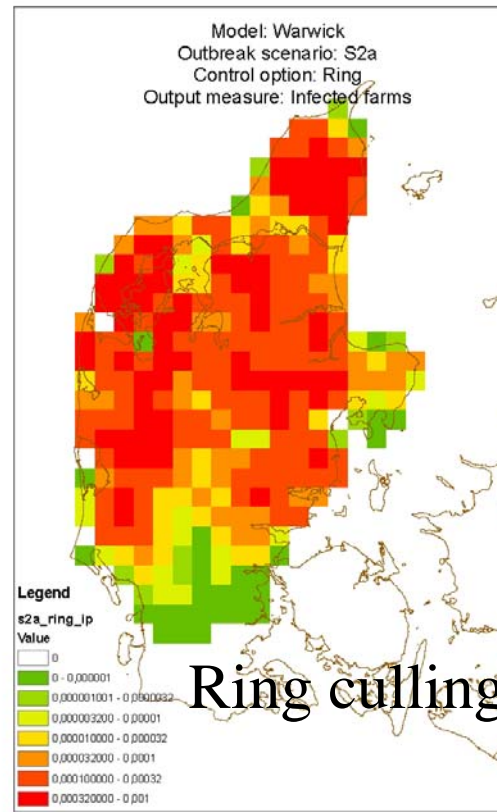
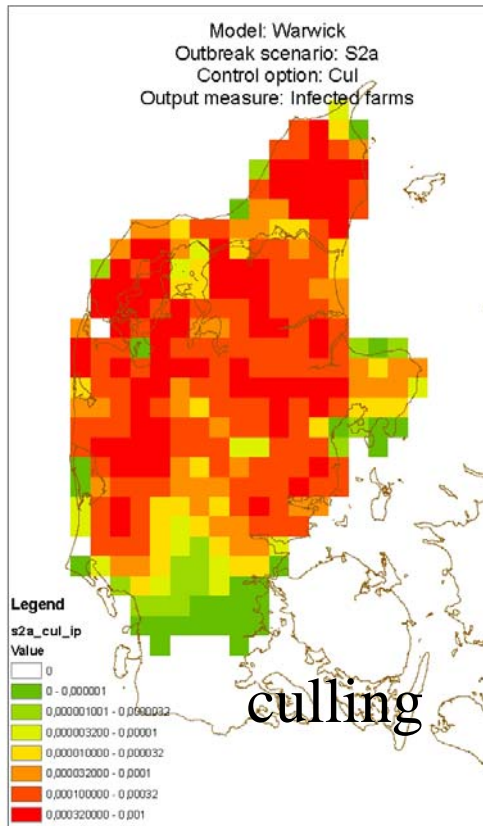
# Comparing the effect of initial number of infected herds: InterSpread Plus (left) and the Davies model (right) and use of culling as control strategy



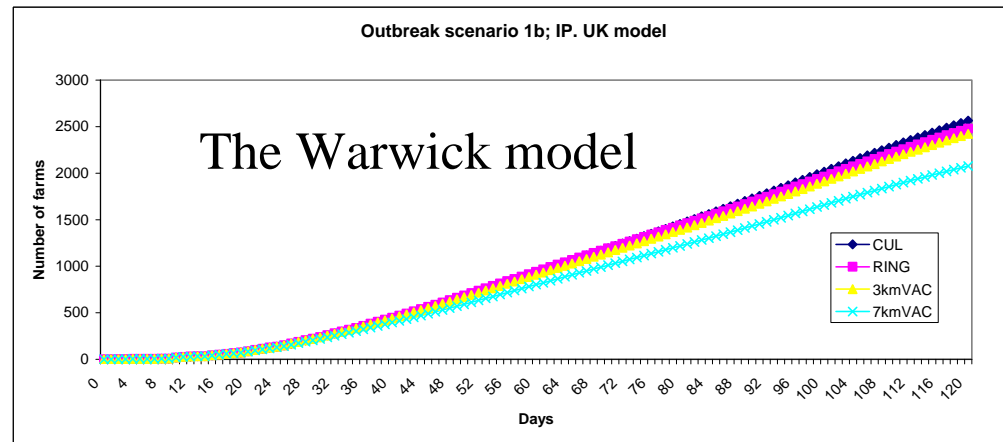
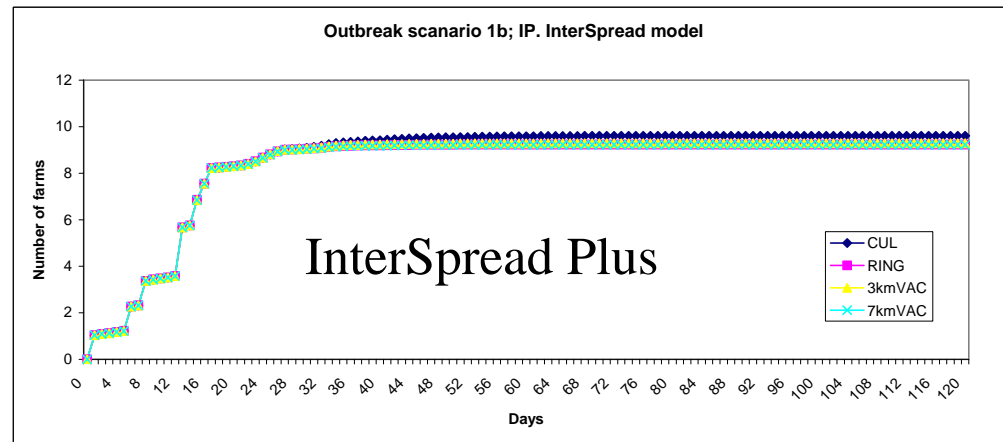
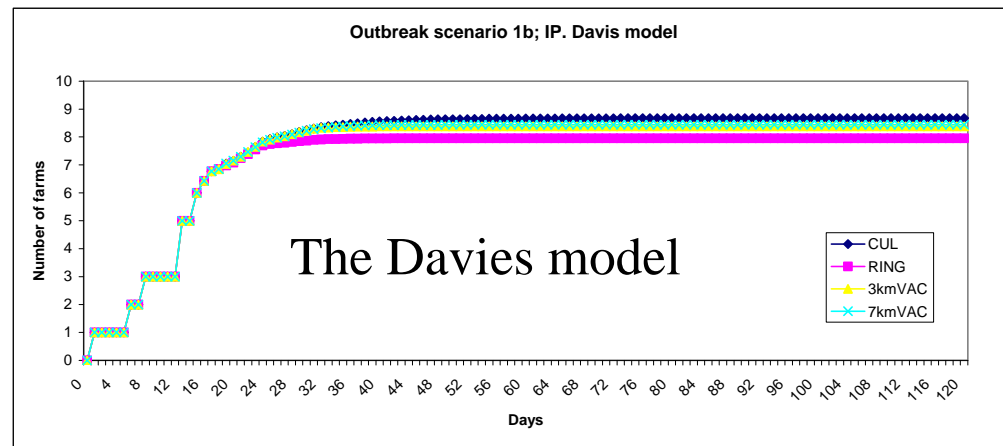
# Heat maps of large outbreak scenario and use of different control strategies – simulation done in InterSpread Plus



# Heat maps of large outbreak scenario and use of different control strategies – simulation done in the Warwick model

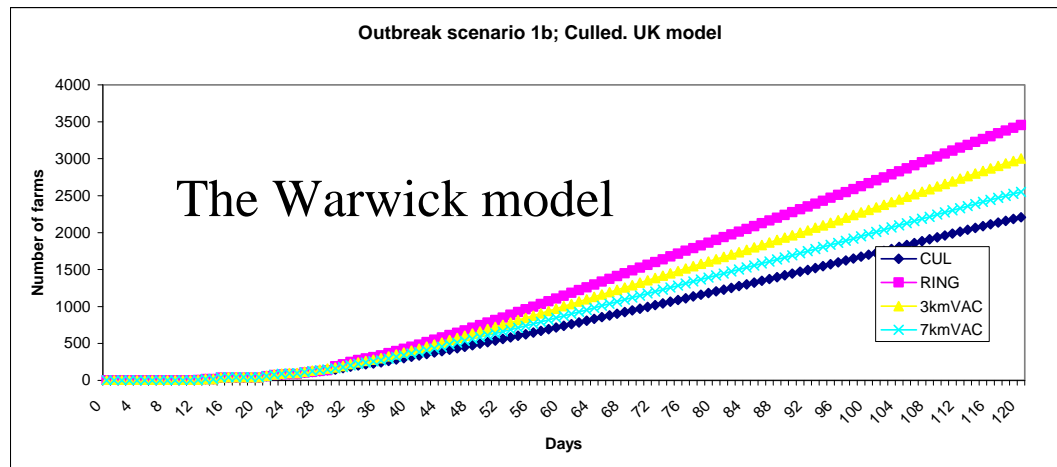
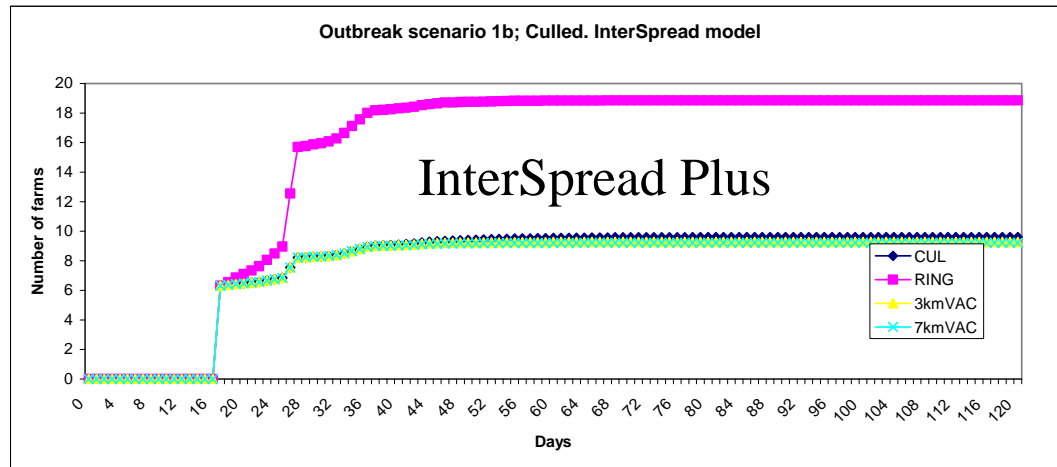
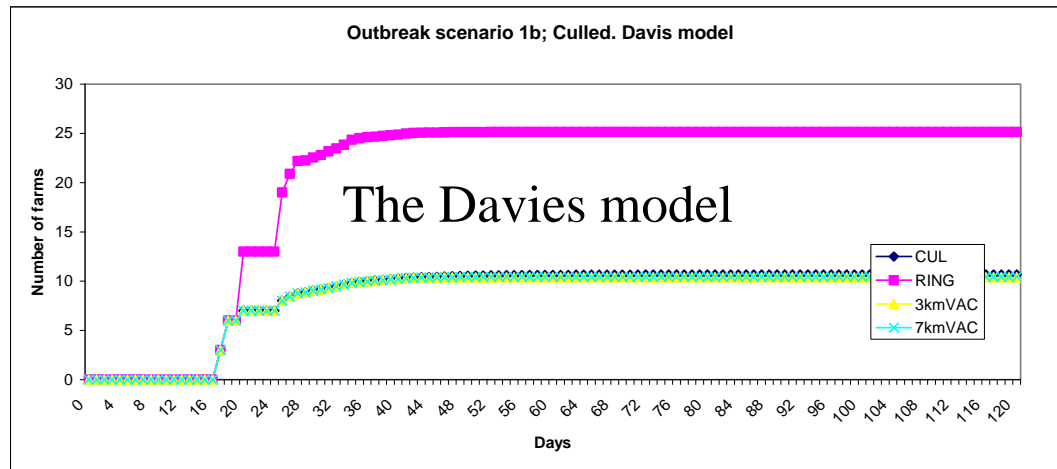


Number of  
infected herds  
in the small  
outbreak  
scenario after  
120 days

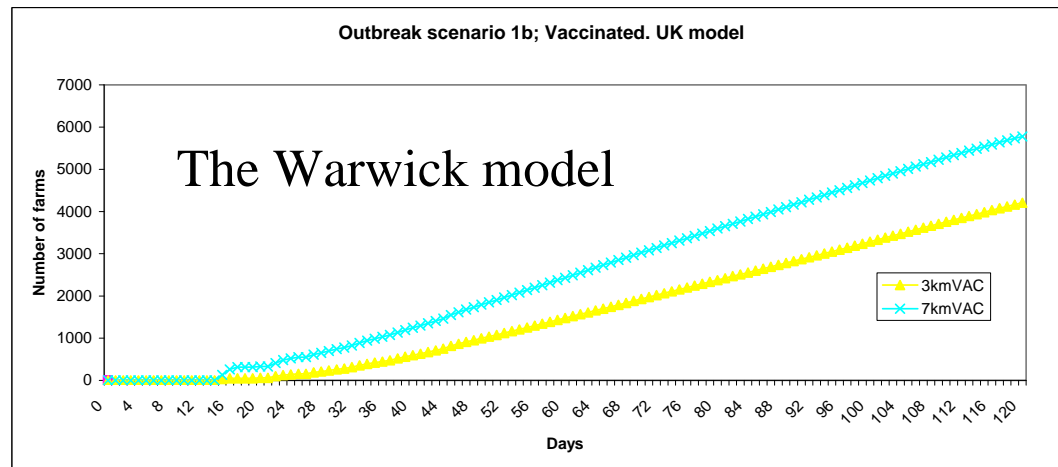
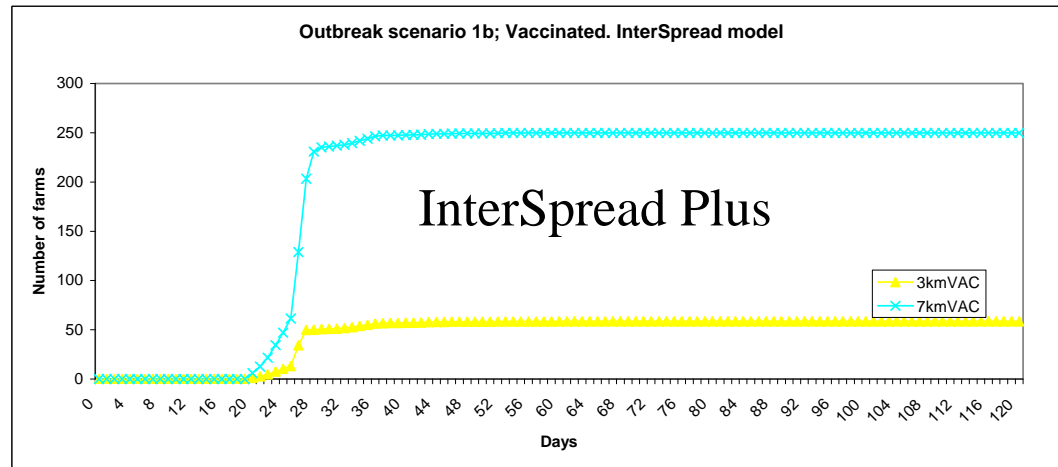
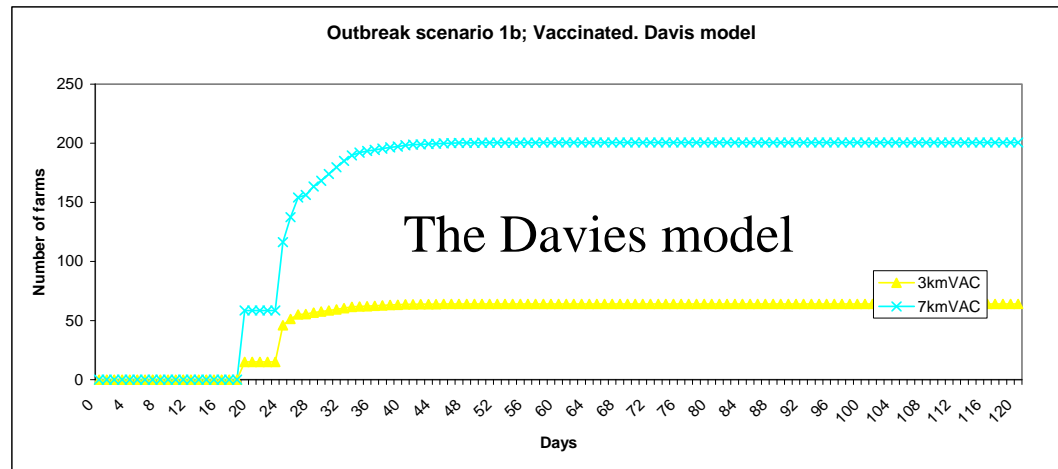




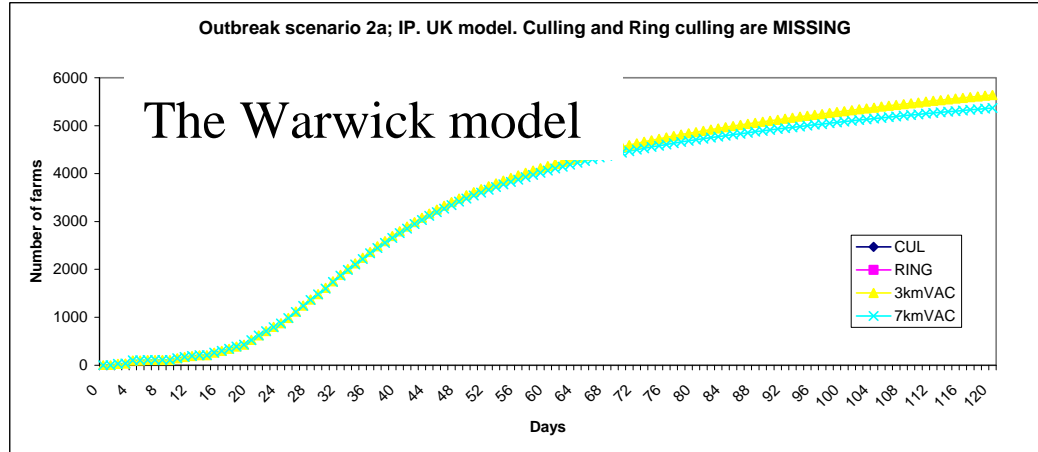
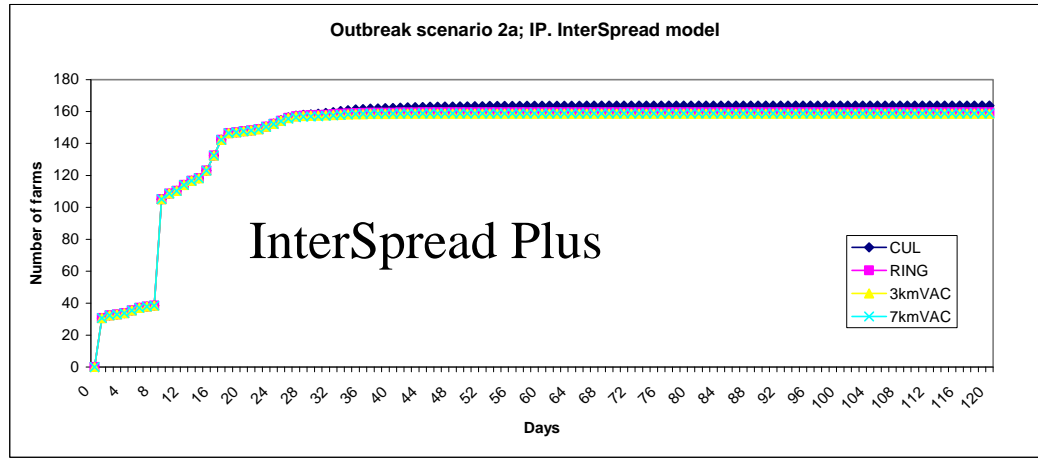
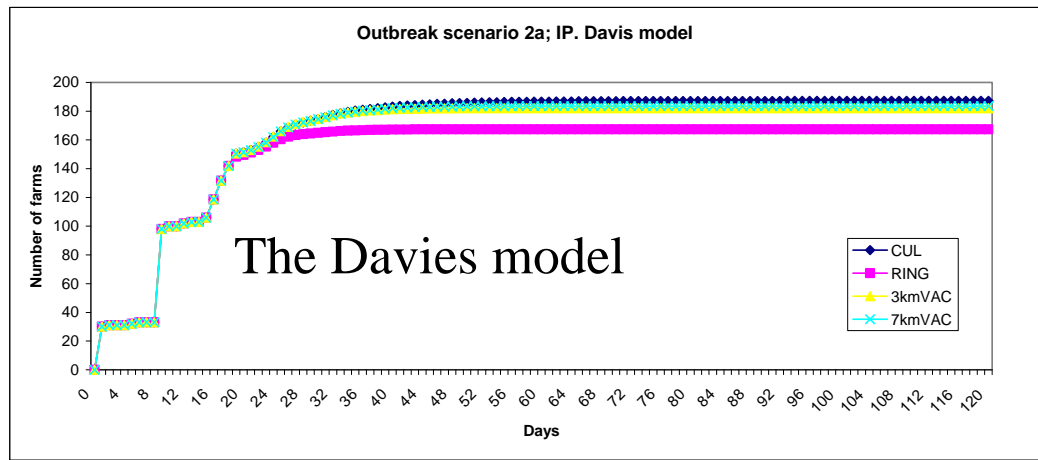
Number of culled herds in the small outbreak scenario after 120 days



Number of vaccinated herds in the small outbreak scenario after 120 days

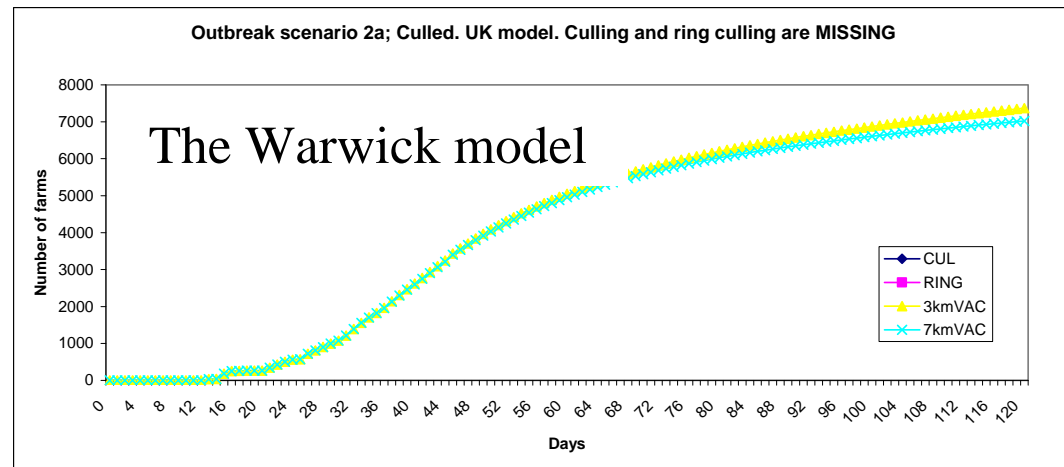
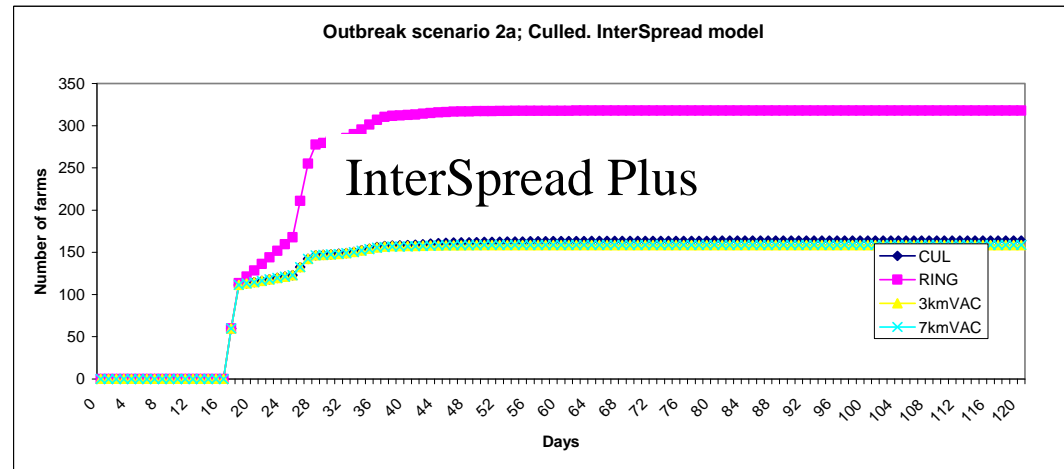
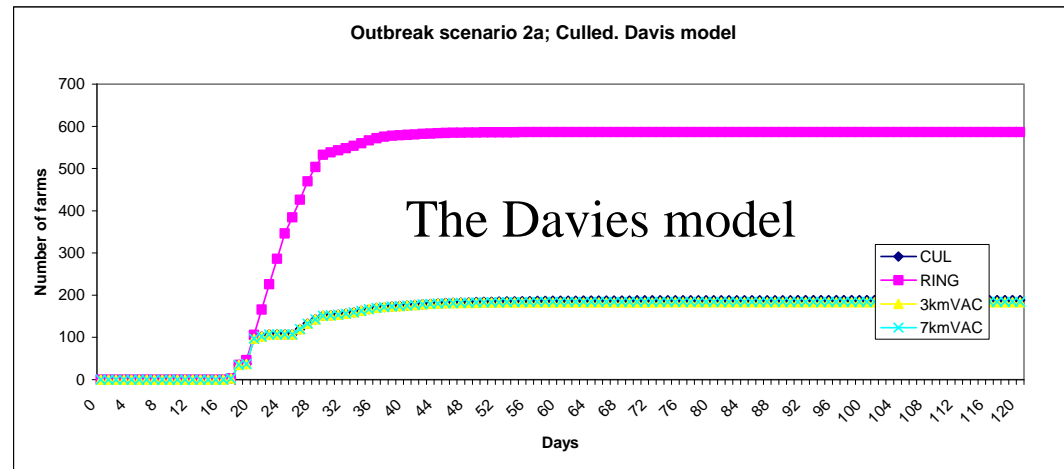


Number of infected herds in the large outbreak scenario after 120 days

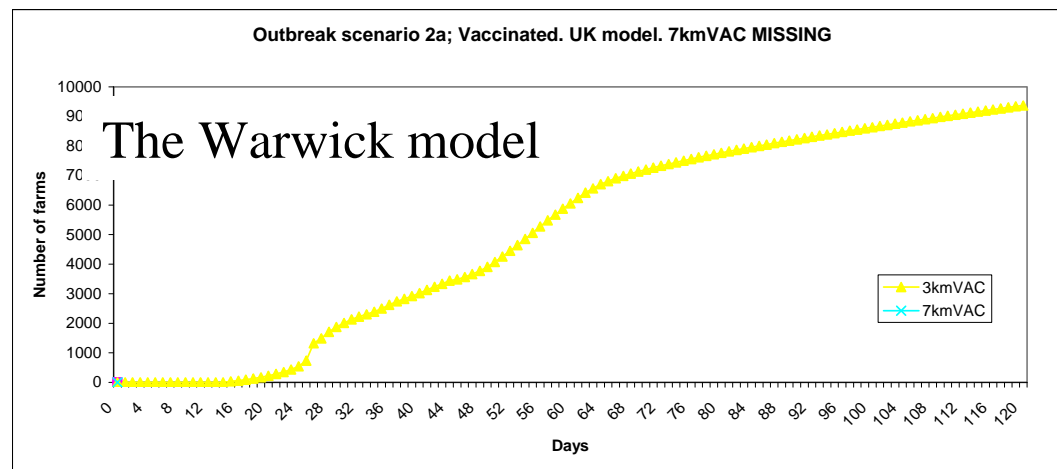
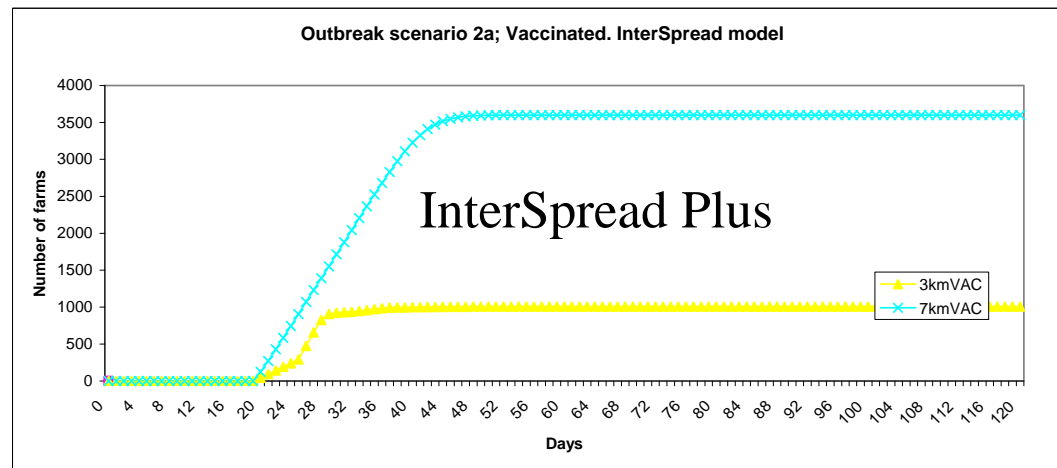
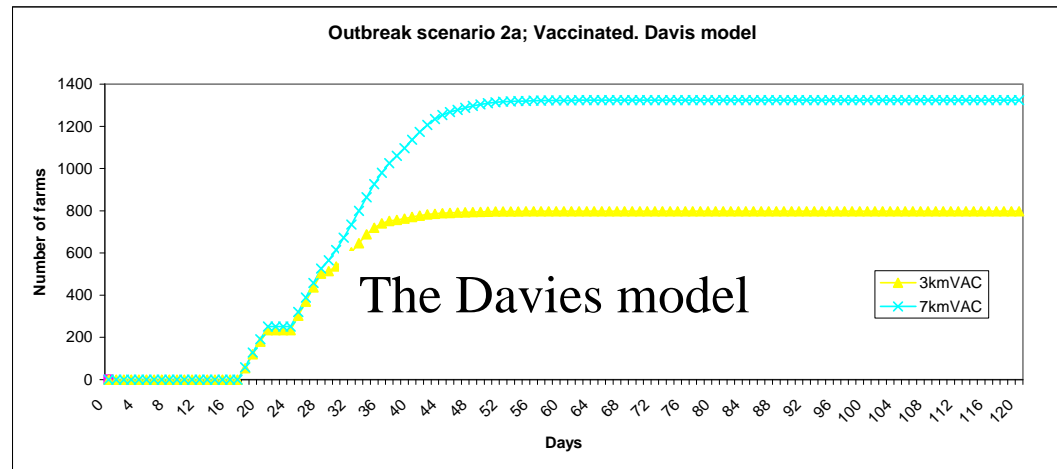




Number of  
culled herds in  
the large  
outbreak  
scenario after  
120 days



# Number of vaccinated herds in the large outbreak scenario after 120 days



## General conclusions

- Significant different in the behaviour of the outbreak
  - The Warwick model gave relatively long lasting outbreaks
  - The Warwick model gave relatively large outbreaks with many infected herds
- Interaction between type of scenario (seed, initial conditions) and model.
  - Some 'seeds' did not generated large differences

## Critical aspects of the Davies model and InterSpread Plus

- You have to believe in the parameter estimates used in the model.
- The values of the parameters used in the models are very often based on gut feelings and not obtained from experimental and observational studies
- Need to understand the biological process in disease transmission

## Critical aspects of the Warwick model

- Parameter estimates theoretical based on the transmission pattern in real outbreaks – UK 2001.
- Limited flexibility
  - Assuming this was an average outbreak
  - Transmission curve includes the effect of: virulence of the FMD virus, windborne spread, illegal movement, indirect contact
  - The transmission curve can not be adjusted given specific knowledge to some of the parameters
- Driven by herd density – high herd density increase the spread.



## Important aspects of FMD epidemiology that the models ignore

- The effect of quantity of virus: relation between amount of infectious particles and incubation time
- Do not include specific details about transmission between pig-pig, pig-cow, cow-pig, pig-sheep and sheep-pig because of missing knowledge
- Susceptibility and transmission rates are not well known, and these have major influence on the transition probabilities. Small changes in these parameters may have dramatically effects on the output
- The character of any FMD epidemic is decided by a series of stochastic events during the first days during the silent period. These events have large effect of the output of models.

## Experience gained from the project - I

- Importance of output parameters may differ depending on the country.
  - In Denmark we are focusing on the duration of the outbreak because of the possibilities to regain export opportunities
- No standardized approach to compare output of models

## Experience gain from the project - II

- Interaction between the effect of control measures, 'seed' and model used in the simulation
- Depending on the reason for simulation, even if the models behave very different, the conclusion that is based on the model output can be the same



## Acknowledgement

- Rene Bødger
- Matthias Greiner
- Søren Alexandersen

...

and a lot of other people both in Denmark  
and in other countries