

# Using NAADSM: Strengths, Limitations, and Appropriate Use

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# Team Collaboration

- Animal Population Health Institute, CSU
  - Canadian Food Inspection Agency
  - Ontario Ministry of Agriculture and Food
  - United States Department of Agriculture
  - University of Guelph, Ontario
- 
- Input from experts from other countries

# NAADSM Characteristics

- Stochastic
- State transition
- Spatial and temporal
- Built-in economic components
- Herd based

# Applications

- Emergency planning and preparedness
  - Exercise design
  - Discussion, awareness forums
  - Training

# Applications

- Developing plans for emergency response procedures and strategies
  - North American FMD vaccine bank issues
  - Lab capacity
  - PRV vaccine
- Learning and discussion tool in emergency preparedness

# Applications

- Model disease spread under different conditions
  - Compare levels of spread and detection
  - Test population variation – density and production types
- Control Strategies
  - Compare the effects movement control, mass depopulation, vaccination

# Limitations

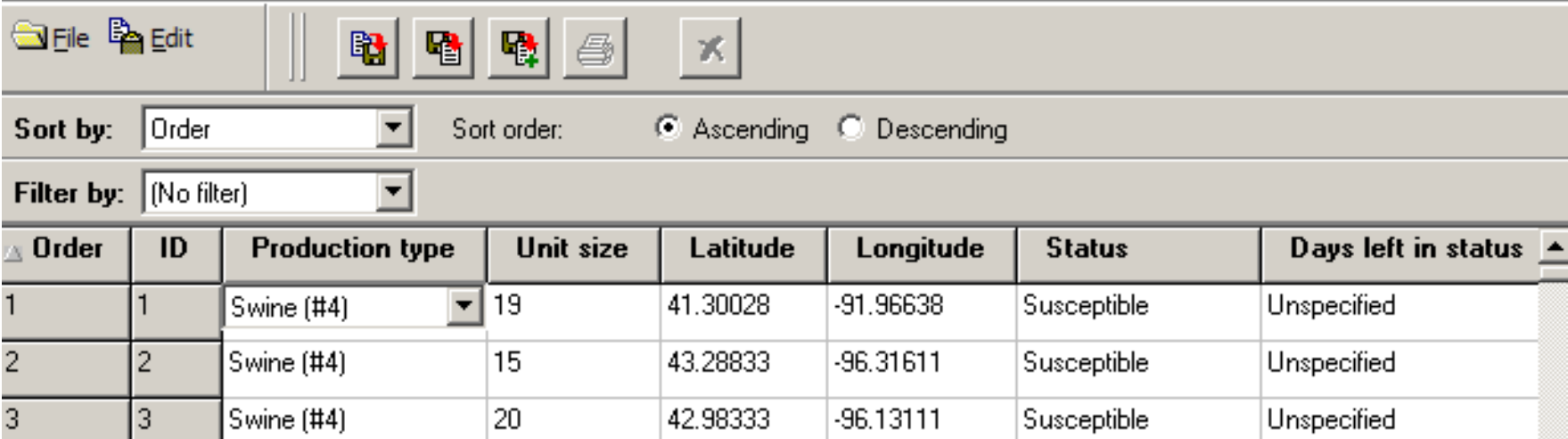
- Vector borne diseases
- Slow spread (BSE)
- Wildlife diseases – populations don't exist as agricultural units

# Using NAADSM

## Population Data

- Characteristics of herds - location, type of operation, animal number, status

### Set up starting units



Order	ID	Production type	Unit size	Latitude	Longitude	Status	Days left in status
1	1	Swine (#4)	19	41.30028	-91.96638	Susceptible	Unspecified
2	2	Swine (#4)	15	43.28833	-96.31611	Susceptible	Unspecified
3	3	Swine (#4)	20	42.98333	-96.13111	Susceptible	Unspecified



# Using NAADSM

## Disease Parameters

- State characteristics: latent period, subclinical, infective, vaccine immune, natural immune, for each operation type
- Probability of spread, given contact between infectious and susceptible
- Use distributions rather than point estimates
- Describe herd situation, not individual animals

# Using NAADSM

## Disease

Production types

- Cattle (#1)
- Swine (#4)

### Cattle

**Transition the disease in units of this production type**

Latent period: ▲

Cattle latent period ▼

*Fiacewise*

Infectious subclinical period: ▲

Cattle shedding subclinical ▼

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Infectious clinical period: ▲

Infectious clinical period ▼

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Immune period: ▲

Immune period ▼

*Fiacewise*

# Using NAADSM

## Contact

- Direct, indirect movements and airborne spread
- Frequency, distance
- For each type of operation

# Using NAADSM

## Detection parameters

- Time before disease is identified, based on two factors:
  - Days that the herd is in the contagious period
    - The longer, more clinical animals, more chance of the producer and veterinarian identifying signs of disease
  - Days since disease outbreak was first detected
    - Expect more awareness of foreign disease after first case in area/country has been identified

# Using NAADSM

## Control

- Vaccination, Destruction, Movement control,
- Define circumstances, available resources for vaccination and destruction

# Using NAADSM

## Operational Cost

- Appraisal, C&D, Indemnification, Euthanasia, Carcass disposal, Vaccination

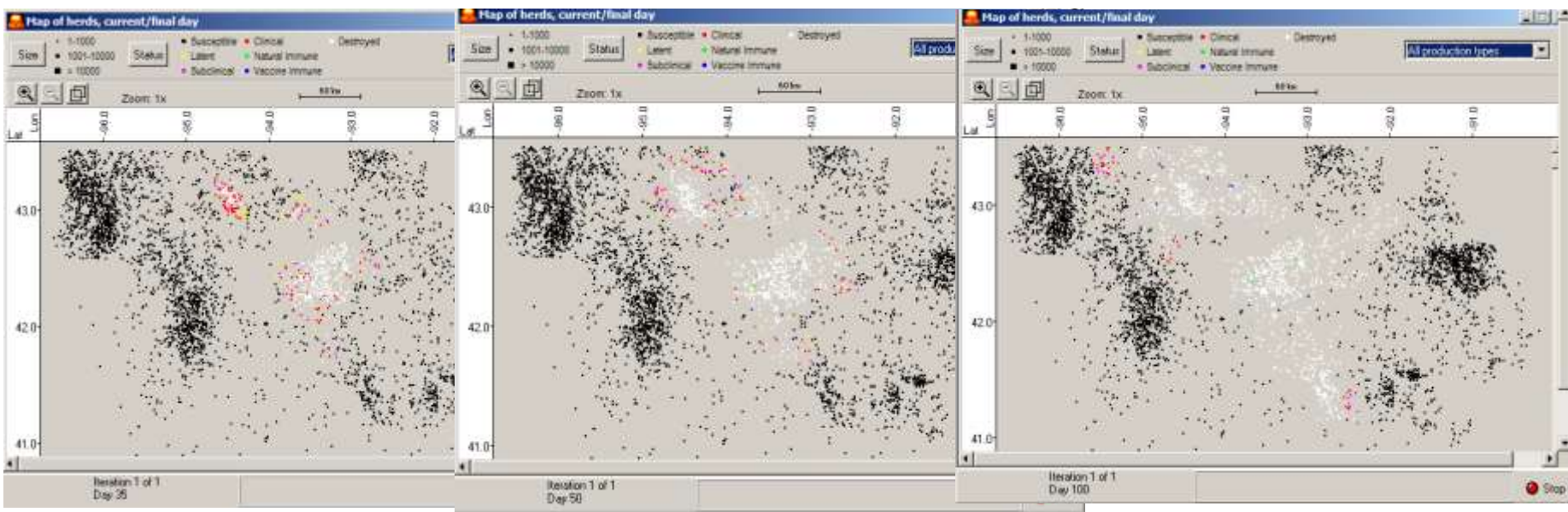
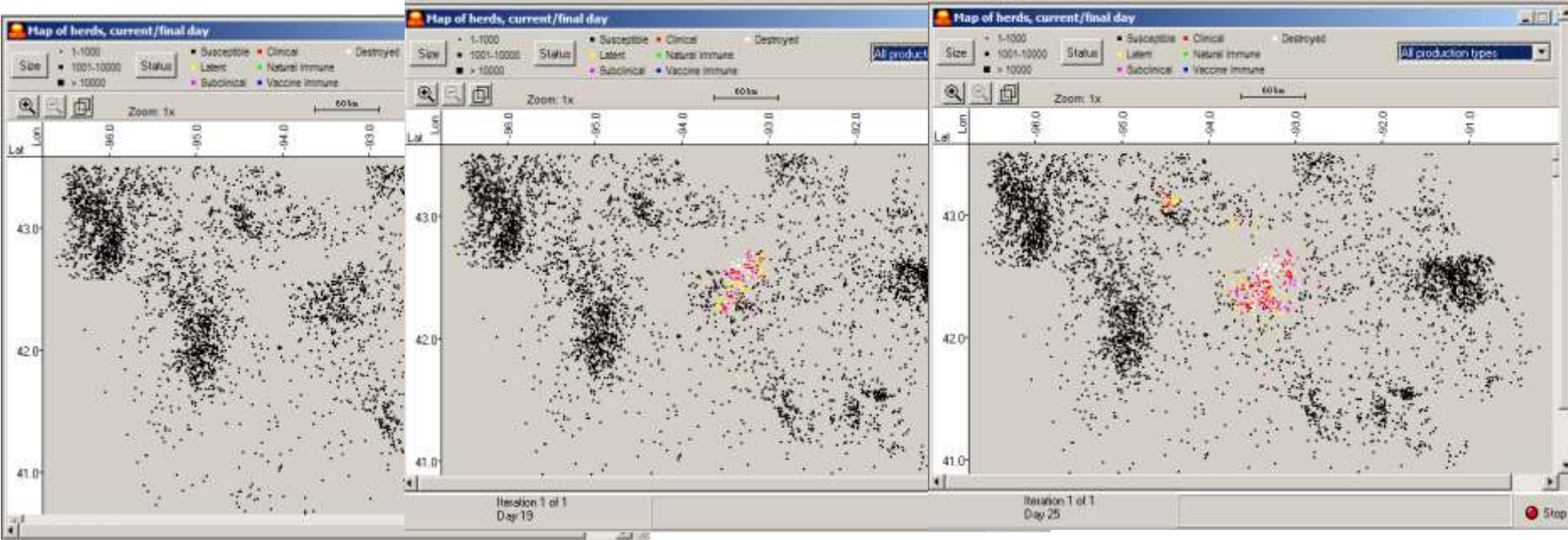
# Using NAADSM

Cost accounting	
Production types	<b>Cattle</b>
Cattle (#1)	
Swine (#4)	
	<input checked="" type="checkbox"/> <b>Track direct costs for this production type</b>
	Destruction costs:
	Cost of appraisal (per unit): \$ <input type="text"/>
	Cost of cleaning and disinfection (per unit): \$ <input type="text"/>
	Indemnification (per animal): \$ <input type="text"/>
	Euthanasia (per animal): \$ <input type="text"/>
	Carcass disposal (per animal): \$ <input type="text"/>
	Vaccination costs:
	Cost of site setup (per unit): \$ <input type="text"/>
	Baseline vaccination cost (per animal): \$ <input type="text"/>
	Number of animals that may be vaccinated before the cost increases: <input type="text"/>
	Additional cost for each animal vaccinated beyond the threshold (per animal): \$ <input type="text"/>

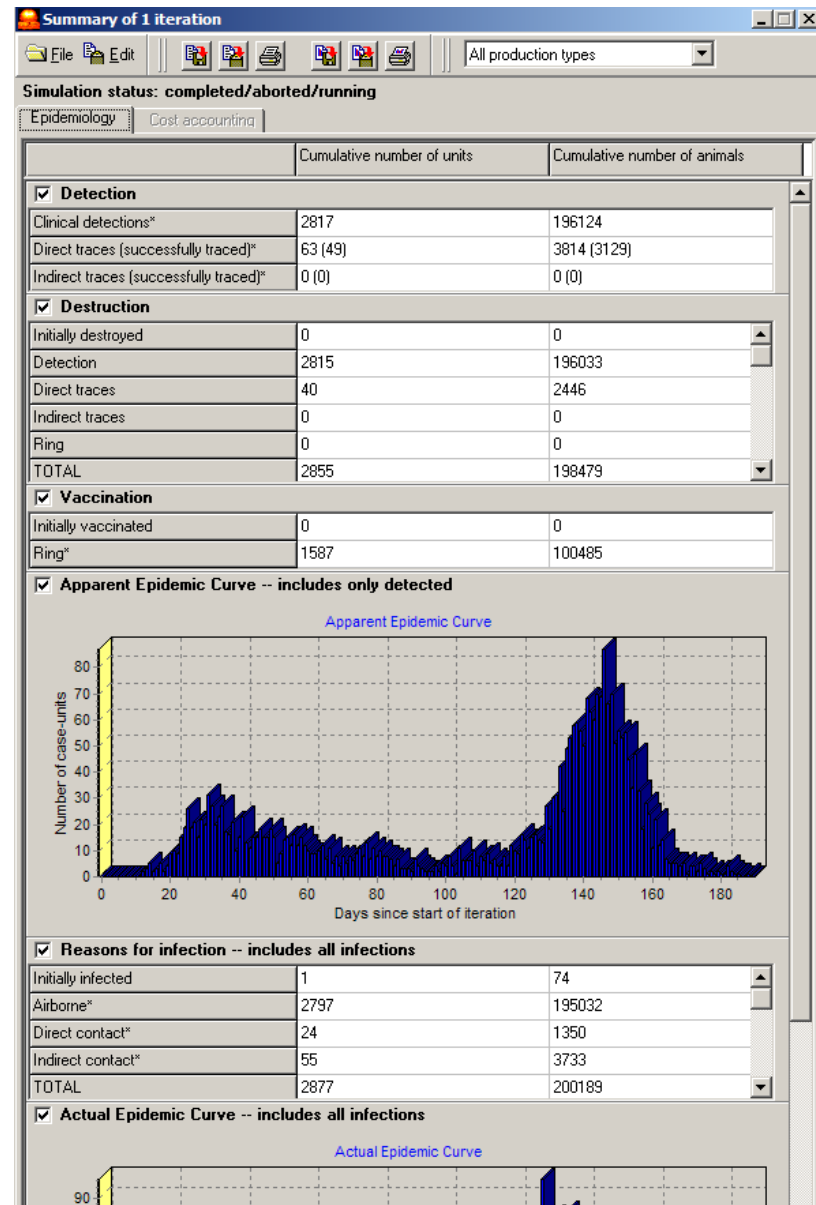
# Using NAADSM

- Run multiple simulations
- Change parameters - situation or control activities - run again if desired
- Analyze output - number of herds and animals in different statuses, costs associated with activities





- Analyze output - number of herds and animals in different statuses, costs associated with activities



# Using NAADSM

## Review output

- Map, chart
- Statistics for all iterations
- Details for last iteration
- Summarized
  - Maximum, minimum, average, percentiles, for each variable for multiple iterations
  - Calculated values for time to end of outbreak and time to first detection for multiple iterations
  - Epidemic curve
  - Day by day statistics for all variables and daily units detected for multiple scenarios

## Interpret output

- Determine what outputs are important – how do you define success?
  - Faster eradication
  - Less expensive
  - Fewer animal killed
  - Fewer farms infected
  - Confining disease to one geographic area or production type
- Interpretation requires knowledge of how the model works, as well as inputs and assumptions
- Disease experts need to compare their opinion to model output, raise areas for discussion, further investigation, etc.



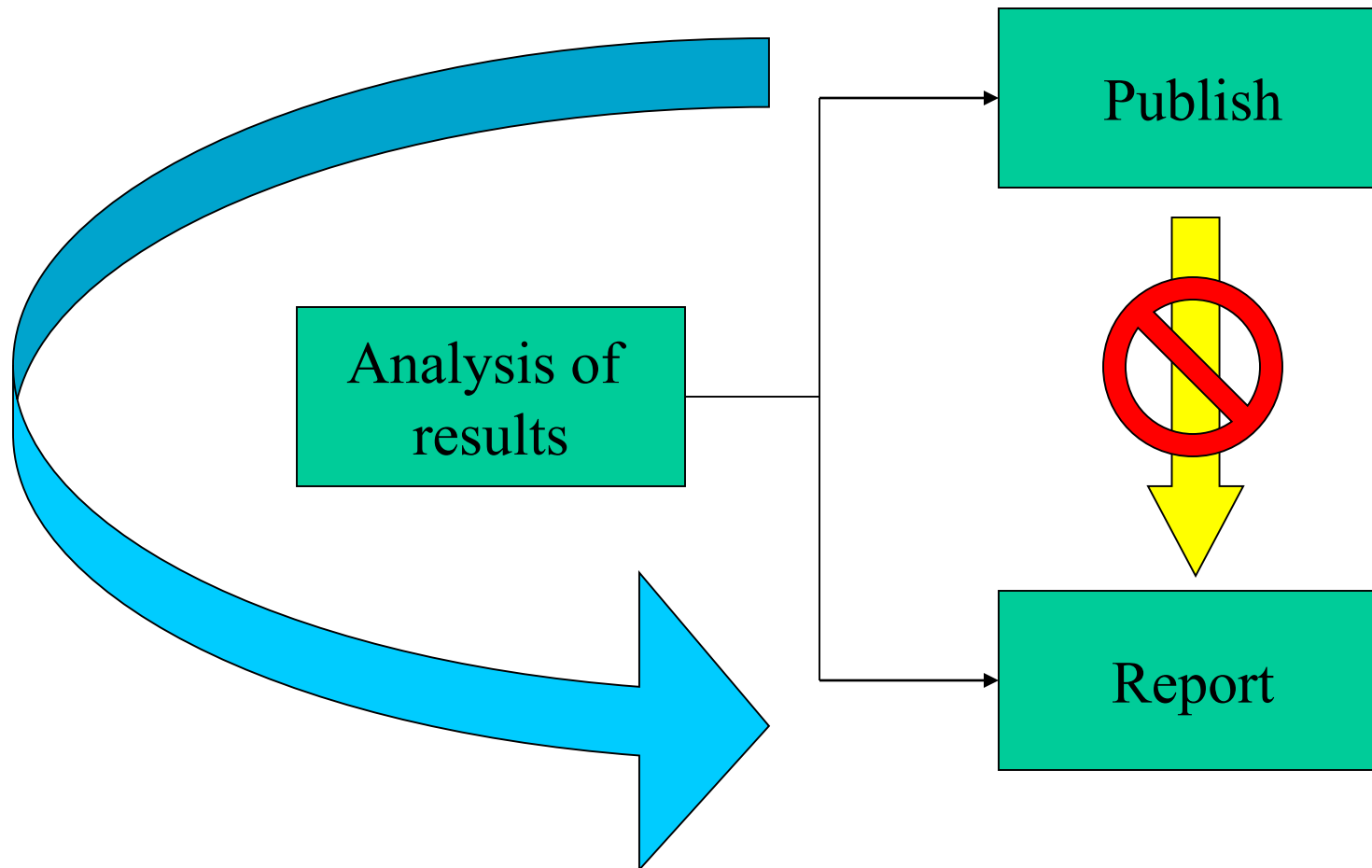
# Communication of results

Model

Reality

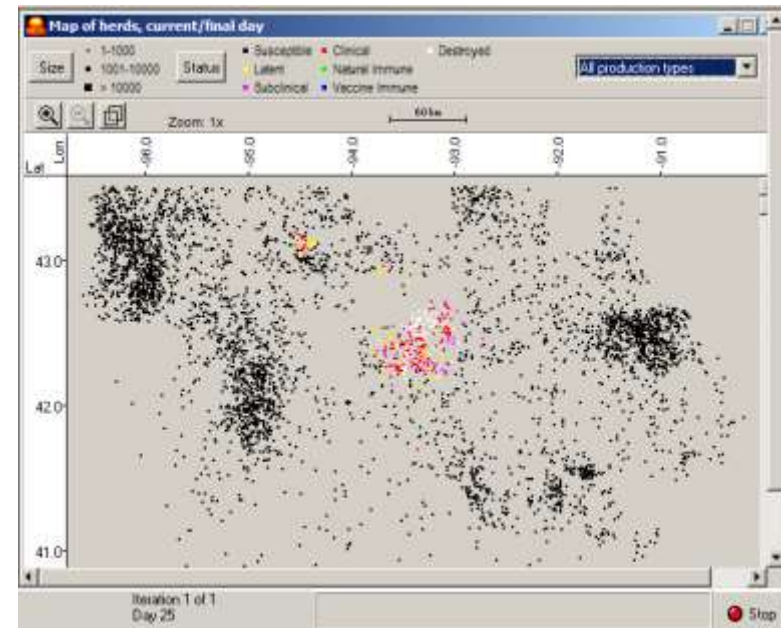
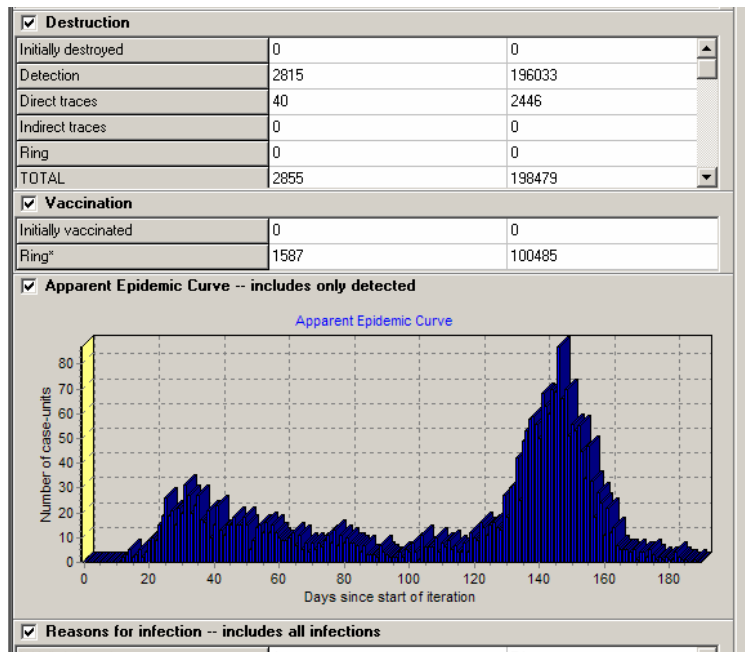


# Communication of results



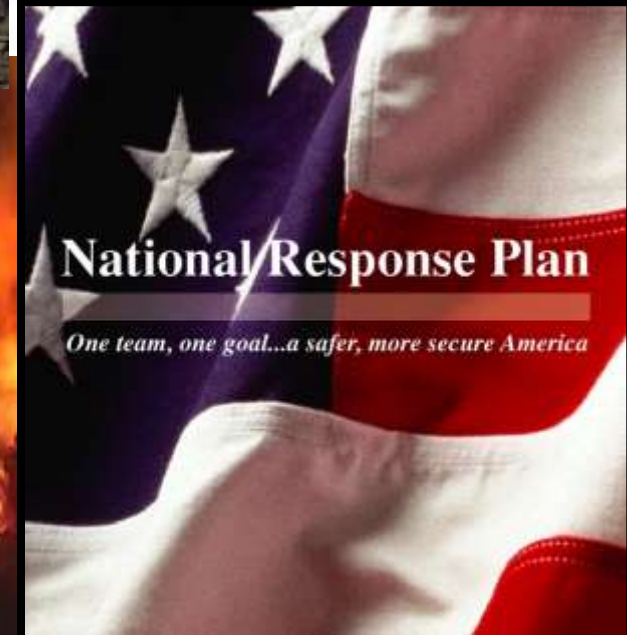
# Communication of results

## Model



# Communication of results

Reality





# Communication of results

PNAS

## Predicting the global spread of H5N1 avian influenza

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Communicated by Hans R. Herren, Millennium Institute, Arlington, VA, October 19, 2006 (received for review April 26, 2006)

The spread of highly pathogenic H5N1 avian influenza into Asia, Europe, and Africa has resulted in enormous impacts on the poultry industry and presents an important threat to human health. The pathways by which the virus has and will spread between countries have been debated extensively, but have yet to be analyzed comprehensively and quantitatively. We integrated data on phylogenetic relationships of virus isolates, migratory bird movements,

commercial trade in wild birds (4), making this another potentially important pathway unless all imported birds are quarantined, tested for avian influenza, and culled where necessary.

We determined the most likely pathways for the introduction of H5N1 into each of 52 countries by using global data on country-to-country imports and exports of live poultry, trade in wild birds, and the migration and wild weather movements of



# Communication of results

*Rev. sci. tech. Off. int. Epiz.*, 2006, 25 (1), 000-000

## Use and abuse of mathematical models: an illustration from the 2001 foot and mouth disease epidemic in the United Kingdom

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### Summary

Foot and mouth disease (FMD) is a major threat, not only to countries whose economies rely on agricultural exports, but also to industrialised countries that maintain a healthy domestic livestock industry by eliminating major infectious diseases from their livestock populations. Traditional methods of controlling diseases such as FMD require the rapid detection and slaughter of infected

# Communication of results



## The North American animal disease spread model: A simulation model to assist decision making in evaluating animal disease incursions

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The North American Animal Disease Spread Model Project,  
Month #, 2007

Simulation models have the potential to play a significant role in the development and testing of animal disease control and eradication plans. The North American Animal Disease Spread Model (NAADSM) is one such model, intended to simulate the spread and control of highly contagious foreign animal diseases in susceptible livestock populations.

Development of NAADSM is now an international collaborative activity involving researchers from the Animal Population Health Institute at CSU, the Canadian Food Inspection Agency, the Department of Computing and Information Science at the University of Guelph, the Ontario Ministry for Food and Rural Affairs, and USDA-APHIS-Veterinary Services, as well as subject matter experts from all over the world.

Among the goals of the NAADSM project are the following:

- To produce a practical modeling application suitable for the study of highly contagious foreign animal disease spread in the absence of an actual outbreak;
- To offer a tool for the evaluation of proposed disease control strategies, preparedness planning, and policy formation;
- To aid the assessment of potential economic impacts of disease and associated control measures;
- To offer training in the use of disease models in general and of NAADSM in particular to the scientific and veterinary medical communities.

NAADSM has the following key characteristics:

- NAADSM is a stochastic simulation model: it attempts to imitate the random processes responsible for disease spread. Each simulated outbreak is the end result of a unique series of random events and processes.
- NAADSM simulates spatial and temporal aspects of disease spread.
- NAADSM is a state transition model: each newly infected herd undergoes a progression from a susceptible state through several infected states to an immune (recovered) state.
- NAADSM includes cost accounting components: the direct costs associated with simulated outbreaks may be estimated.
- NAADSM has sufficient flexibility to allow it to be used for a variety of diseases. Questions concerning foot-and-mouth disease, highly pathogenic avian influenza, pseudorabies, classical swine fever, and exotic Newcastle disease are now being addressed by researchers using NAADSM.

Development of NAADSM is an on-going process, and continues to involve a broad, international pool of livestock health experts, disease modelers, and other specialists. New capabilities to simulate enhanced surveillance, disease control zones, and variability of within-herd disease prevalence are now being tested by the development team. The simulation of disease control and surveillance zones will improve our ability to fine-tune the application of control measures. Implementation of a model of disease mortality, enhanced trading capabilities, modeling of diagnostic testing for disease detection, and refining the simulated effects of vaccination are planned for subsequent versions.