

# Assessing intervention responses against H5N1 avian influenza outbreaks in Bangladesh

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<sup>2</sup> The University of Manchester, UK

<sup>3</sup> Université Libre de Bruxelles, Belgium

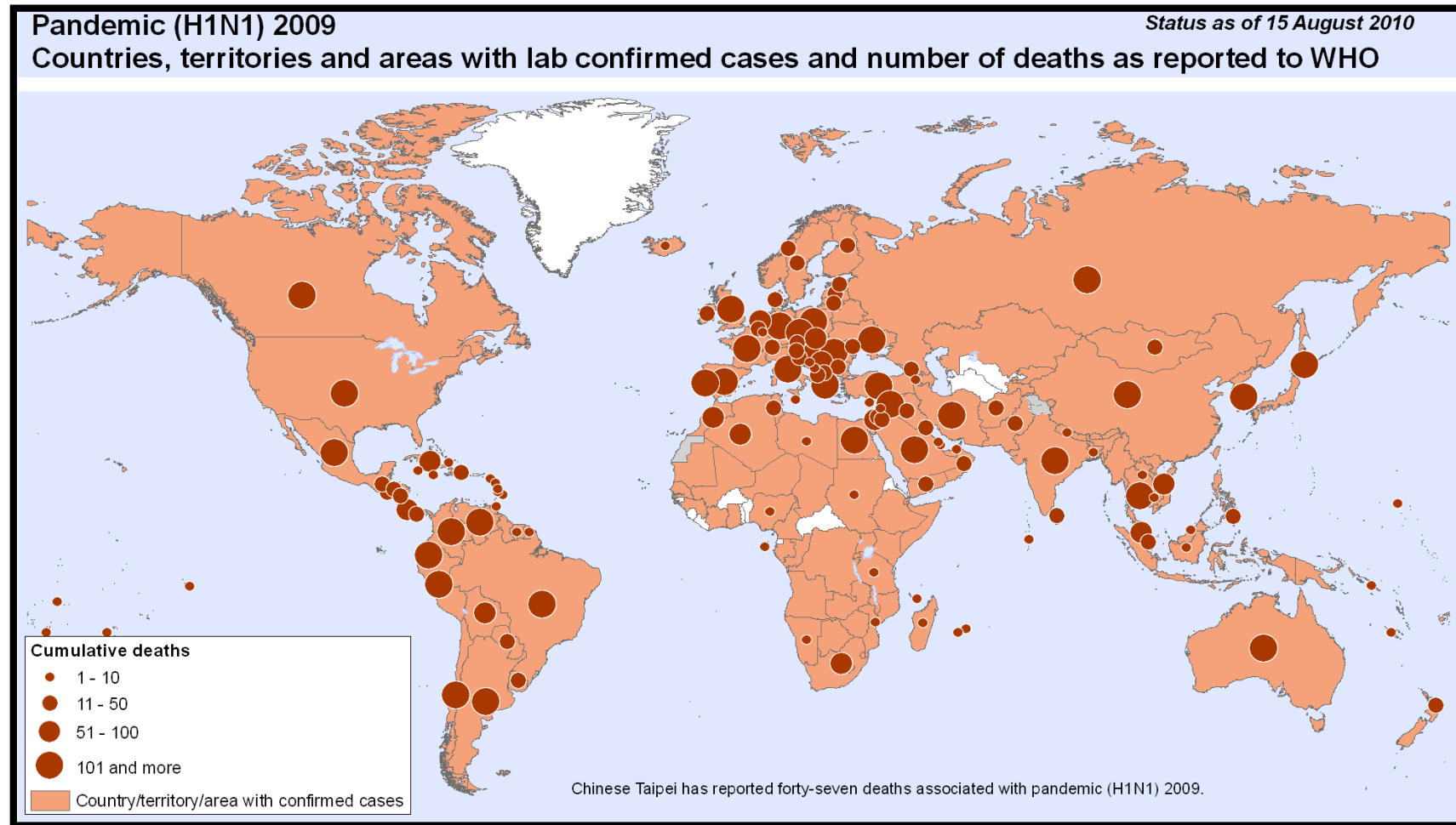
<sup>4</sup> FAO, Italy

<sup>5</sup> Department of Livestock Services, Bangladesh

<sup>6</sup> University of Oklahoma, USA

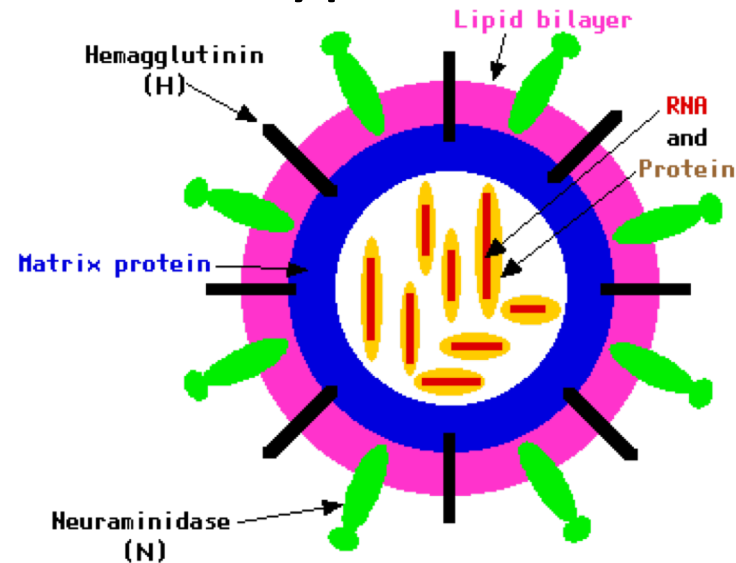
# Impact of influenza pandemics

1918 flu pandemic: Infected 500 million, killed 20-40 million.



# Why are influenza A viruses capable of causing global pandemics?

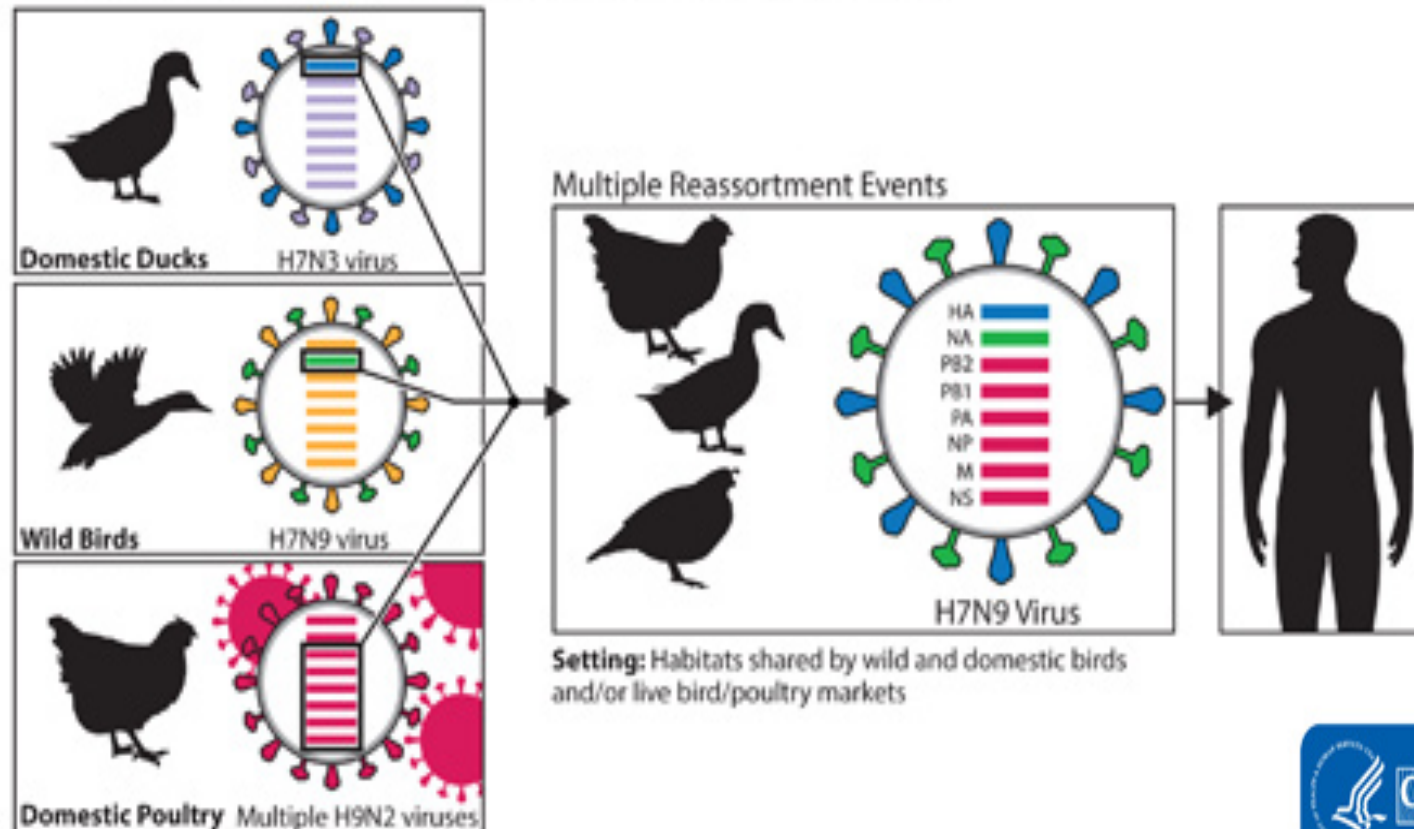
- There are several Influenza A virus strains, categorised into subtypes.



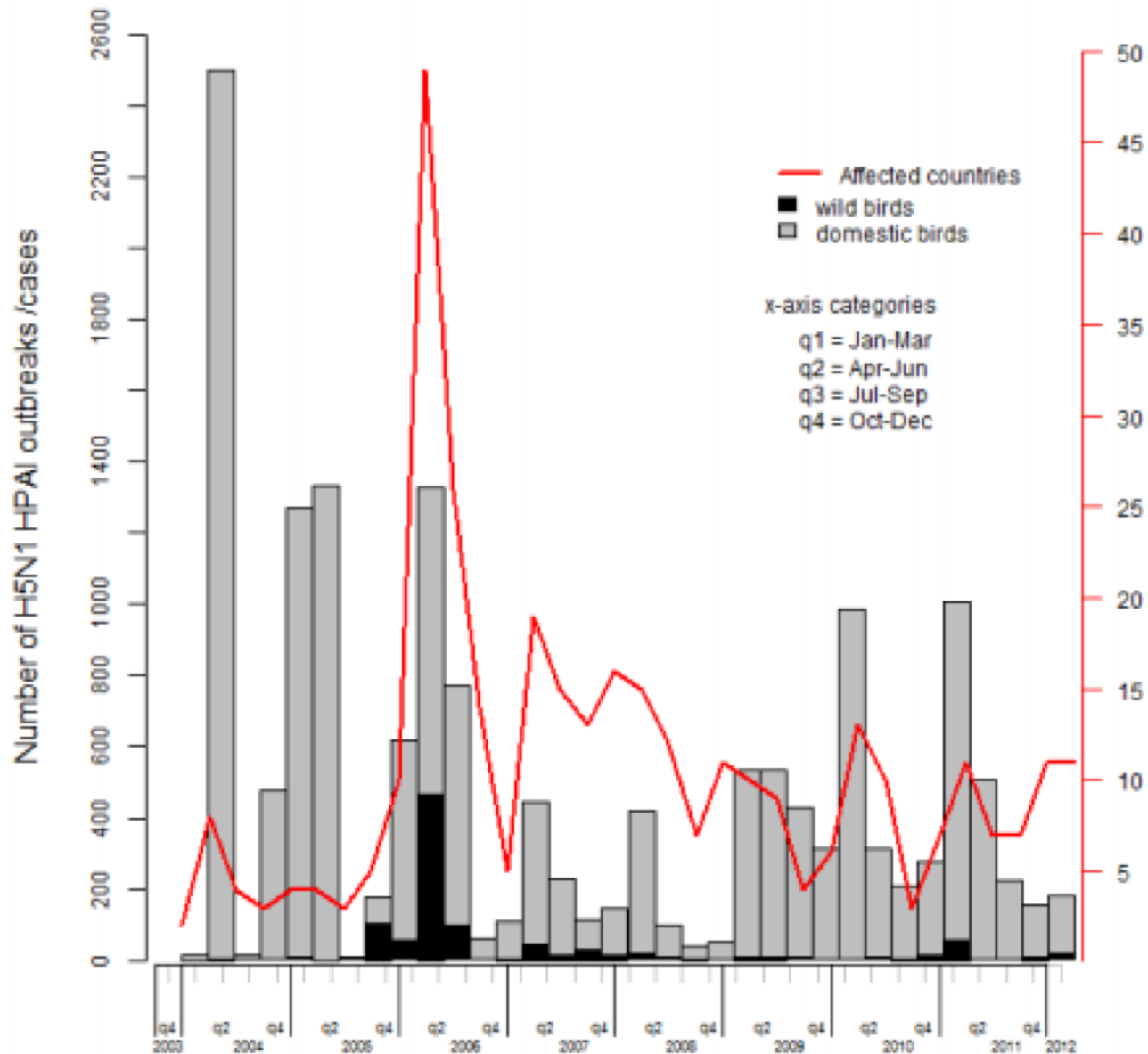
- Virus is notable for following dynamics:
  - **antigenic drift**
  - **antigenic shift**

# Antigenic shift

Genetic Evolution of H7N9 Virus in China, 2013

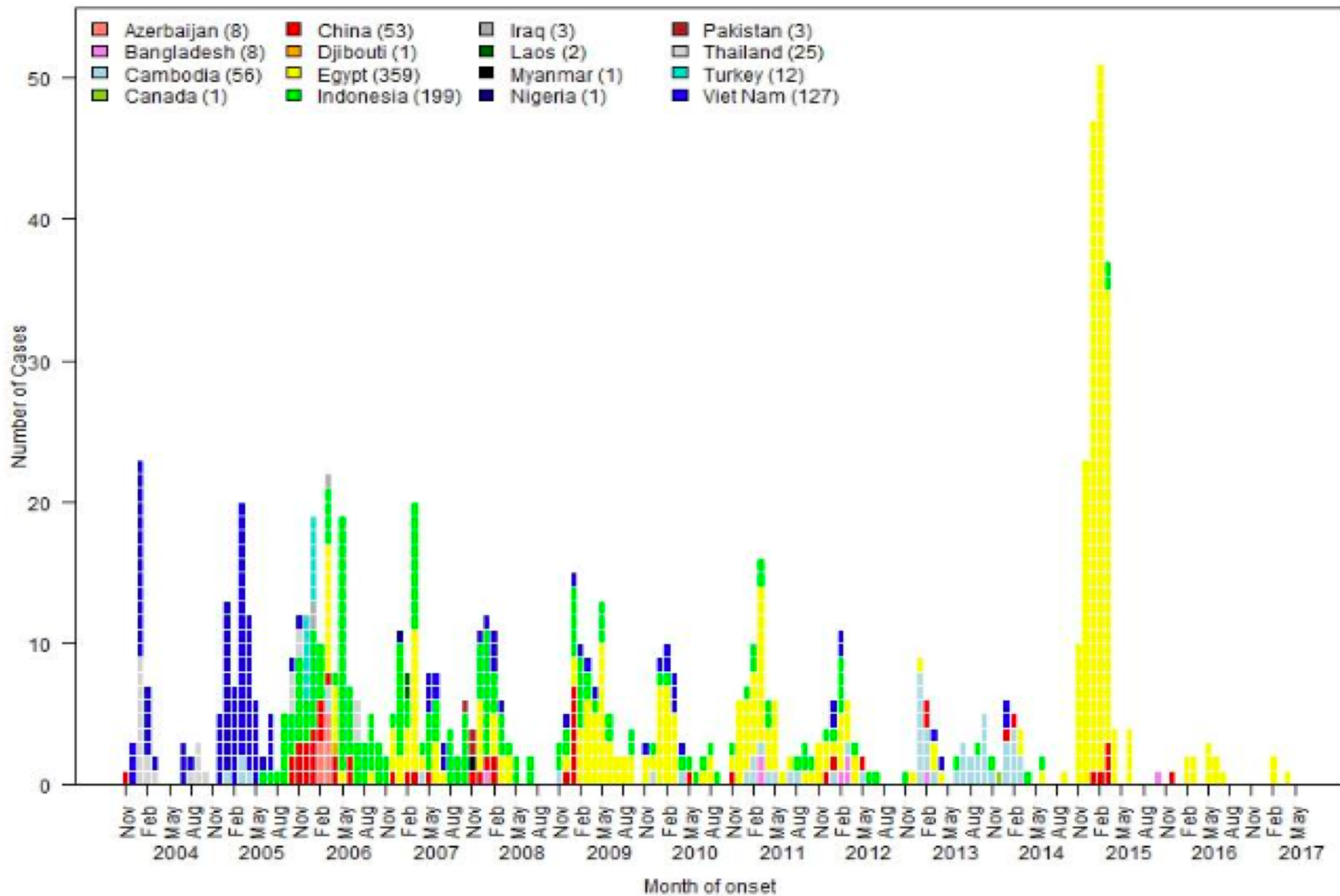


**Figure 1:** Epidemiological curve of H5N1 cases in poultry premises, 2003-2012.



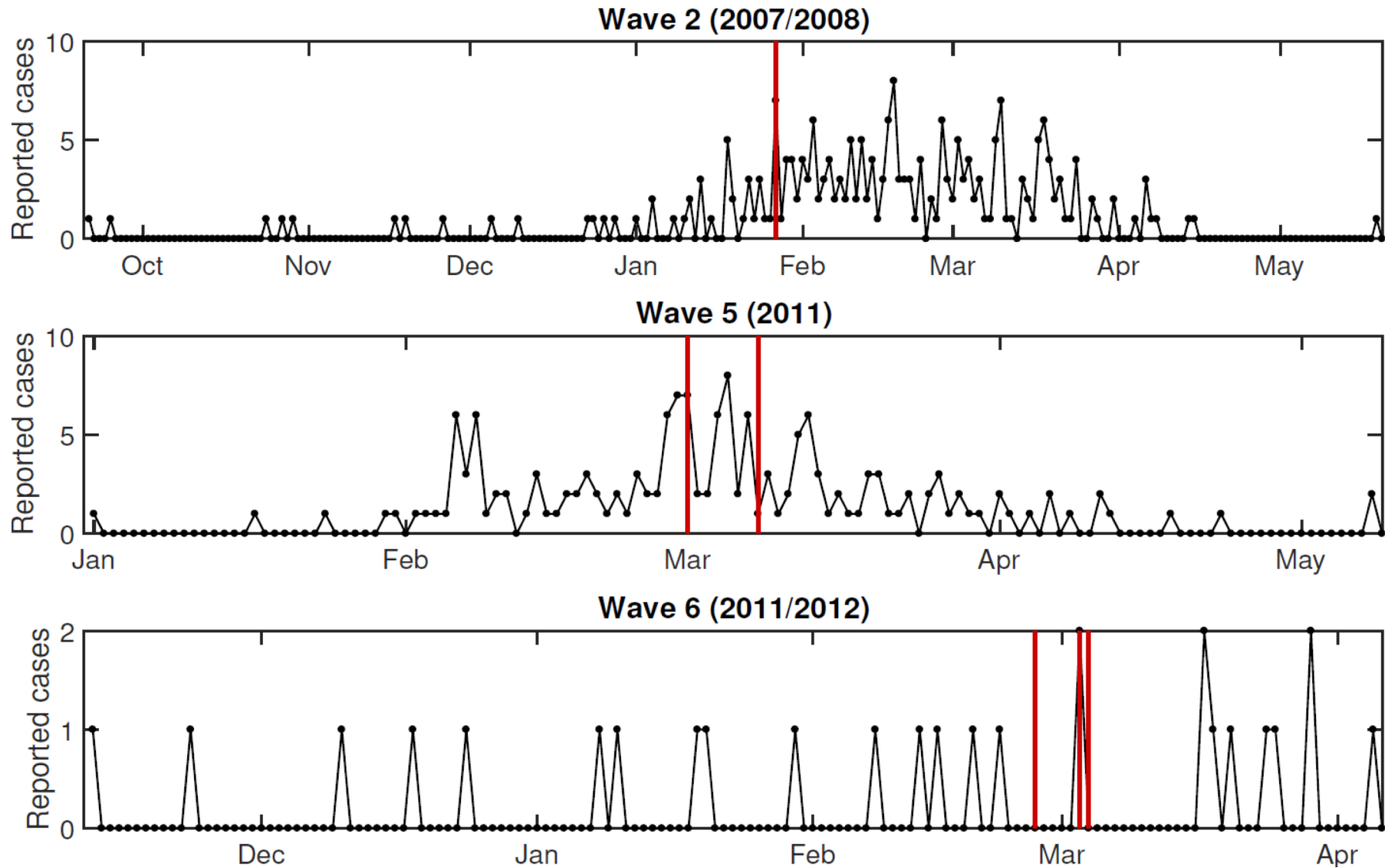
**Source:** FAO (2012) H5N1 HPAI Global Overview – Issue No. 31

**Figure 2:** Epidemiological curve of lab-confirmed avian influenza A(H5N1) cases in humans by month of onset, 2003-2017.



**Source:** WHO (2017) Monthly Risk assessment: Influenza at the human-animal interface  
– 16 May 2017

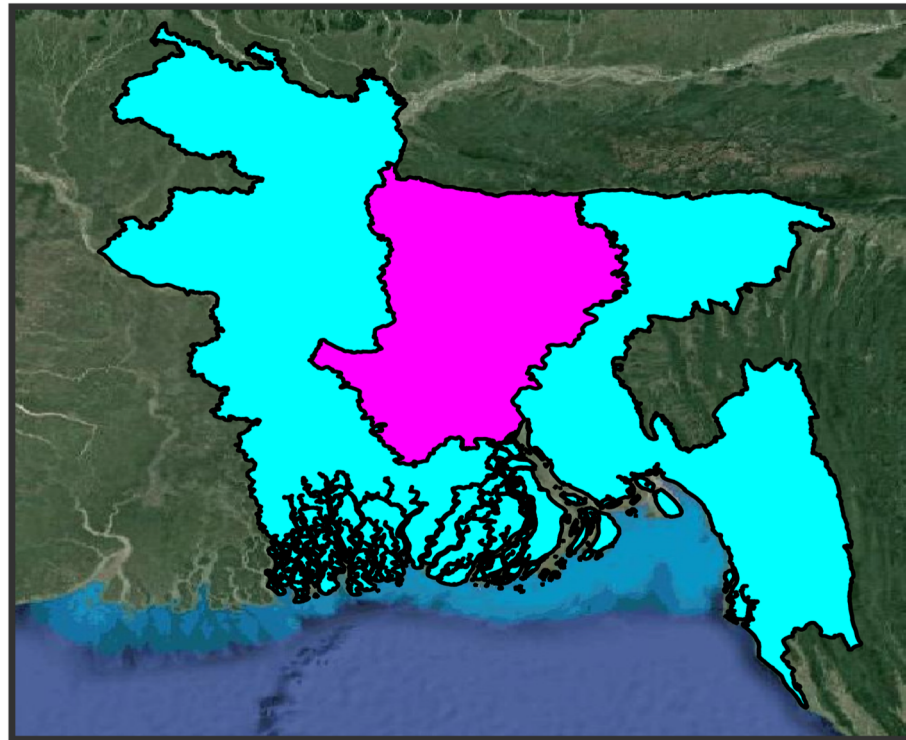
**Figure 3:** Reported H5N1 cases for poultry premises (black line) and humans (vertical red bars) in Bangladesh.



# Initial model fitting

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- Fit modelling framework to historical case data
  - Applied to Dhaka division (magenta shaded region)





# Outline

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## **(1) Poultry H5N1 transmission model**

- Overview of the mathematical framework previously fitted to historical case data

## **(2) Evaluate interventions targeting poultry premises**

- Ring culling
- Ring vaccination
- Active surveillance

## **(3) Zoonotic spillover**

- Assess interventions targeting reduced transmission across the poultry-human interface

# Outline

## (1) Poultry H5N1 transmission model

- Overview of the framework previously fit to historical case data

### Reference:

E. M. Hill *et al.* “Modelling H5N1 in Bangladesh across spatial scales: model complexity and zoonotic transmission risk.” *Epidemics* (2017).

## (2) Interventions targeting poultry

- Ring culling; Ring vaccination; Active surveillance

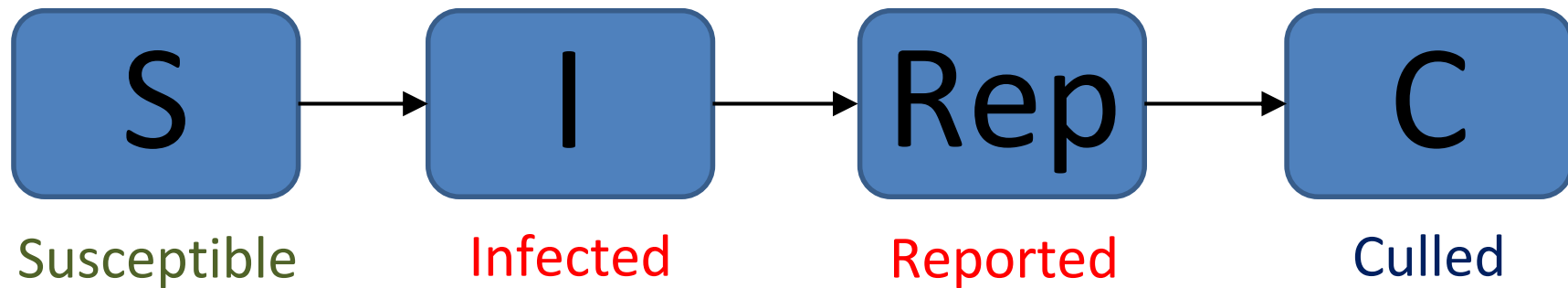
## (3) Zoonotic spillover

- Interventions targeting reduced transmission across the poultry-human interface

# Poultry Model Assumptions

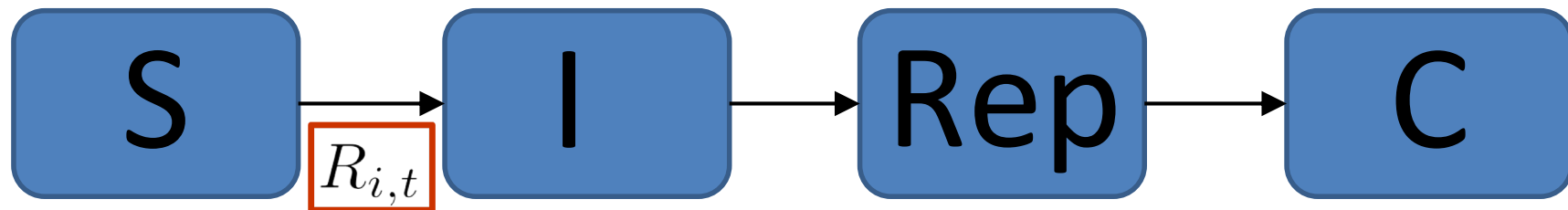
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- Epidemiological unit – premises



# Poultry Model Assumptions

- Epidemiological unit – premises

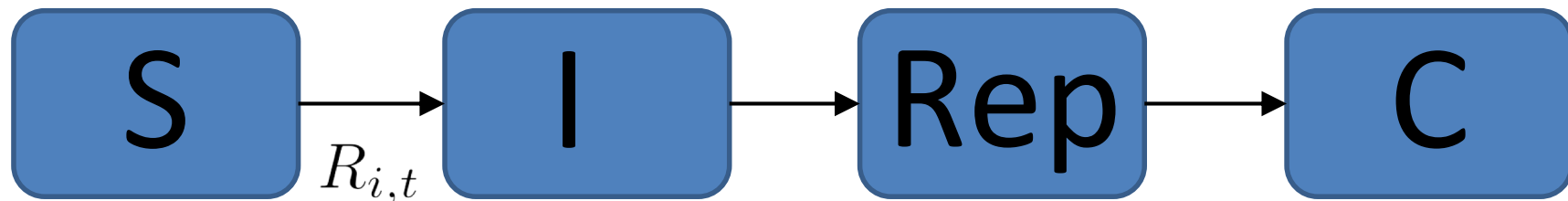


- Force of infection

$$R_{i,t} = \left( \sum_{j \in \text{infectious on day } t} N_{c,i}^p \times t_c N_{c,j}^q \times K(d_{ij}) \right) + \epsilon$$

# Poultry Model Assumptions

- Epidemiological unit – premises



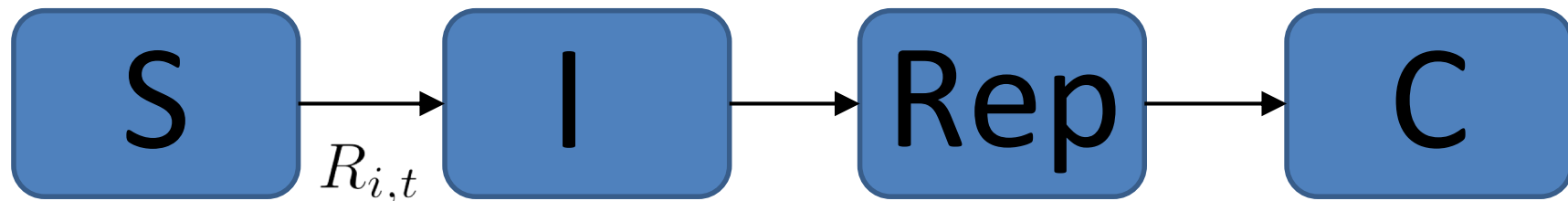
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Flock size on  
susceptible premises  $i$

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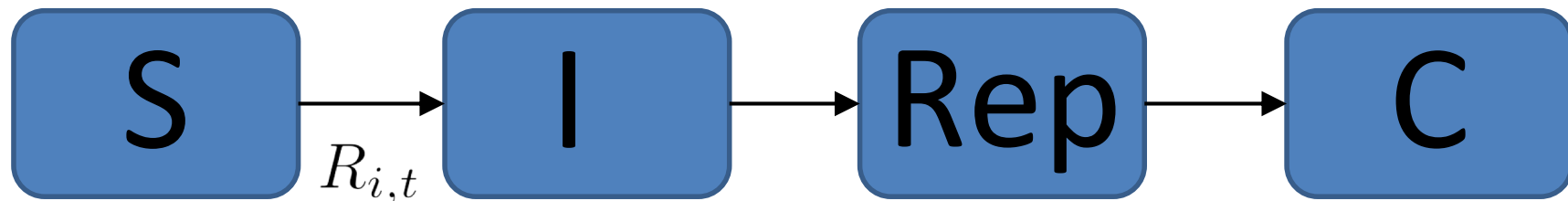
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Flock size on  
infectious premises j

# Poultry Model Assumptions

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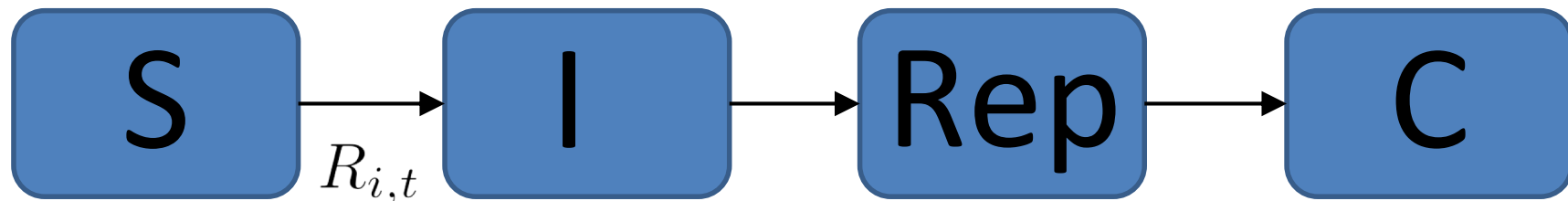
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Distance between  
premises i & j

# Poultry Model Assumptions

- Epidemiological unit – premises



- Force of infection

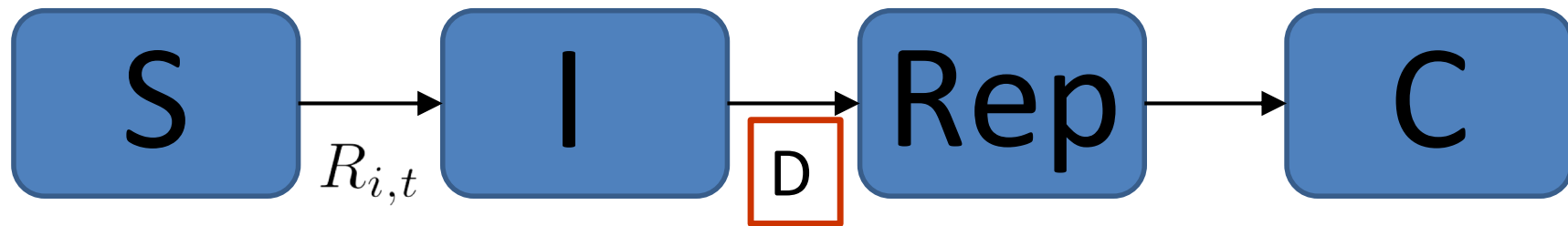
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External factors



# Poultry Model Assumptions

- Epidemiological unit – premises



- Force of infection

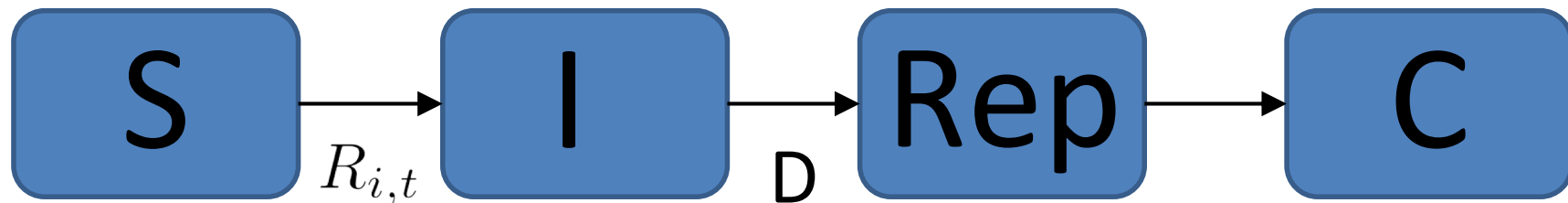
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- Notification delay

- D = 7 days

# Poultry Model Assumptions

- Epidemiological unit – premises



- Force of infection

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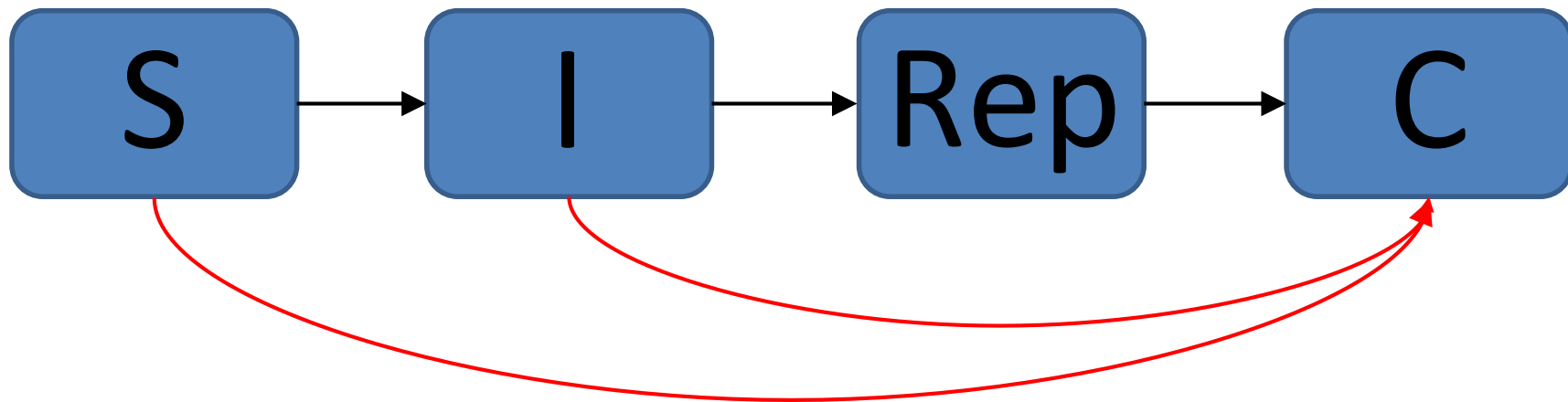
- Ring culling
- Ring vaccination
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## (3) Zoonotic spillover

- Assess interventions targeting reduced transmission across the poultry-human interface

# Ring culling strategies

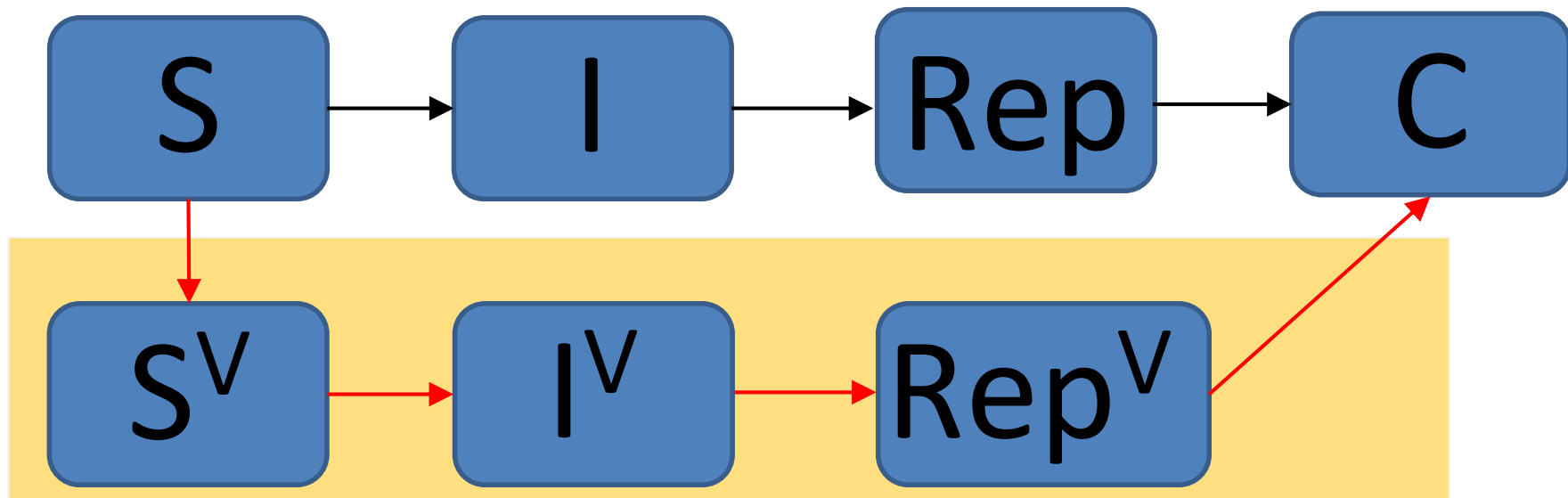
- **Baseline strategy:** Culling of reported premises only.



- **Additional:** All premises within a specified distance of each location with confirmed infection are listed for culling.
- **Ring radii:** 1-10km (1km increments)
- **Prioritisation:** Outside-to-centre

# Ring vaccination strategies

- All premises within a specified distance of each location with confirmed infection are listed for vaccination.

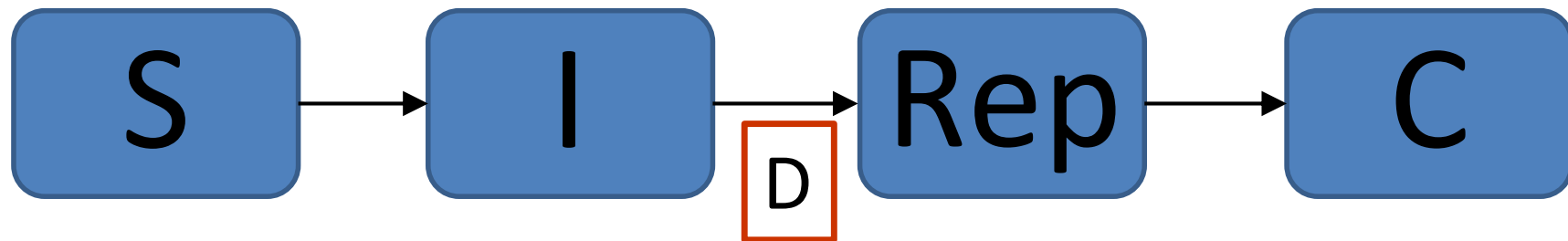


- **Effectiveness delay:** 7 days
- **Efficacy:** 70% of flock protected/unable to transmit infection

# Active surveillance strategies

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- Modifies notification delay



- **Premises undergoing active surveillance:  $D = 2$  days**
- **Four prioritisation schemes analysed**
  - ‘Reactive’: (I) by distance; (II) by population.
  - ‘Proactive’: (III) by population; (IV) by density.

# Control under uncertainty

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- Investigate sensitivity to following considerations via simulations of previously fitted model framework.

**TRANSMISSION DYNAMIC  
CHARACTERISTICS**

**WHAT IS THE SPECIFIC  
CONTROL OBJECTIVE?**

**CAPACITY CONSTRAINTS**

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# Outline of tested capacities

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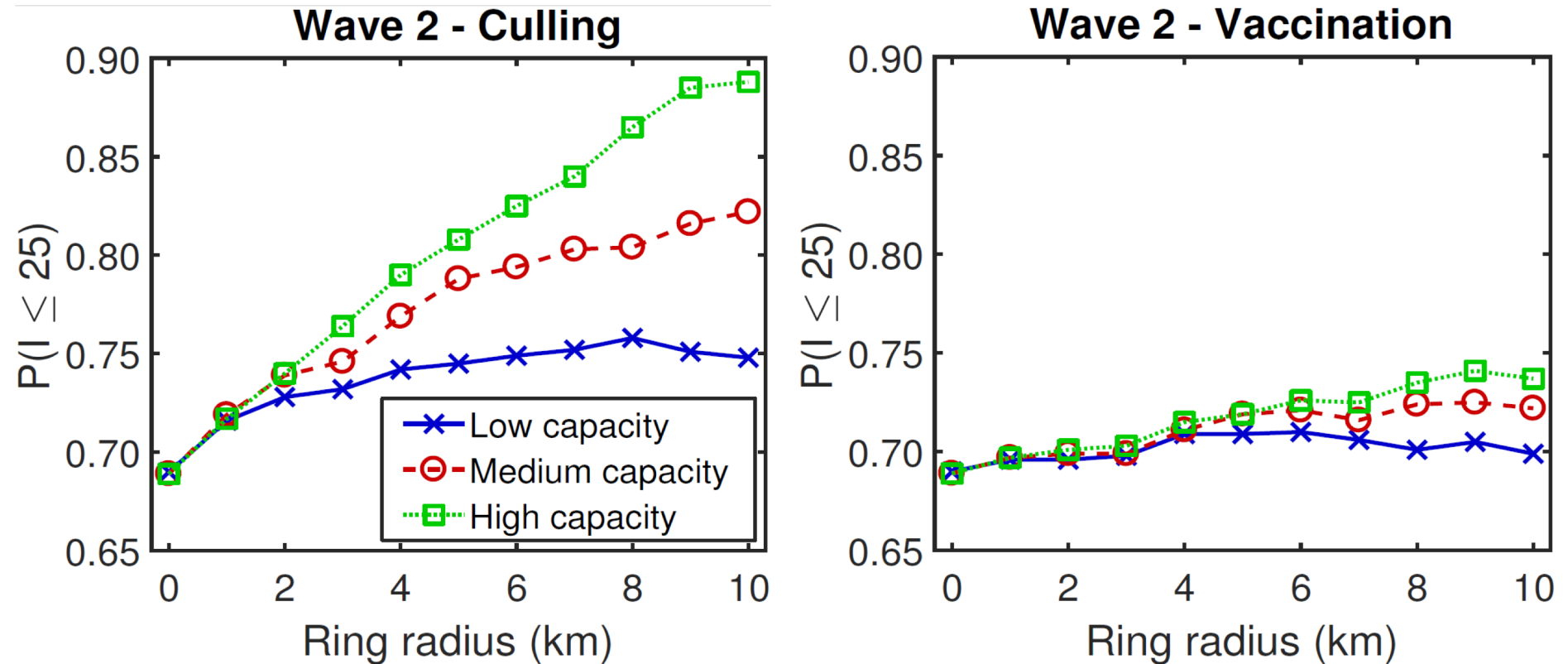
## Culling/vaccination (daily limits):

|        | Birds   | Premises |
|--------|---------|----------|
| Low    | 20,000  | 20       |
| Medium | 50,000  | 50       |
| High   | 100,000 | 100      |

## Active surveillance:

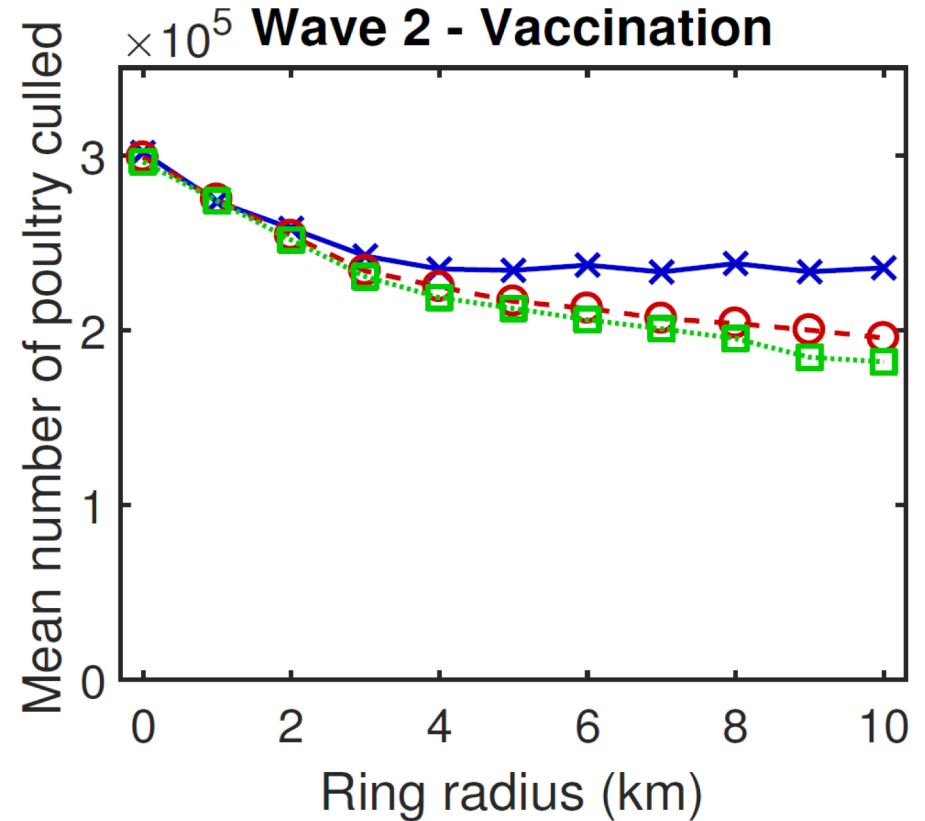
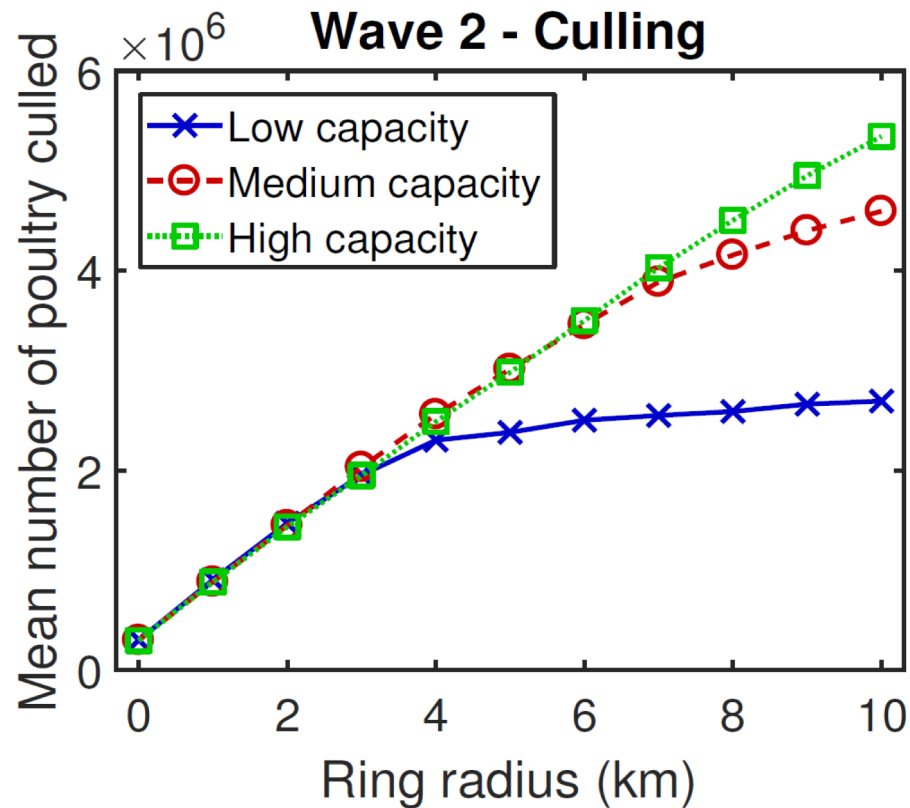
|        | Reactive scheme coverage<br>(per outbreak) | Proactive scheme coverage |
|--------|--|---------------------------|
| Low    | 25   | 5%                        |
| Medium | 50   | 10%                       |
| High   | 100  | 25%                       |

**Figure 4A:** Predicted probability of outbreak size being 25 premises or less, under different ring culling/vaccination radii.



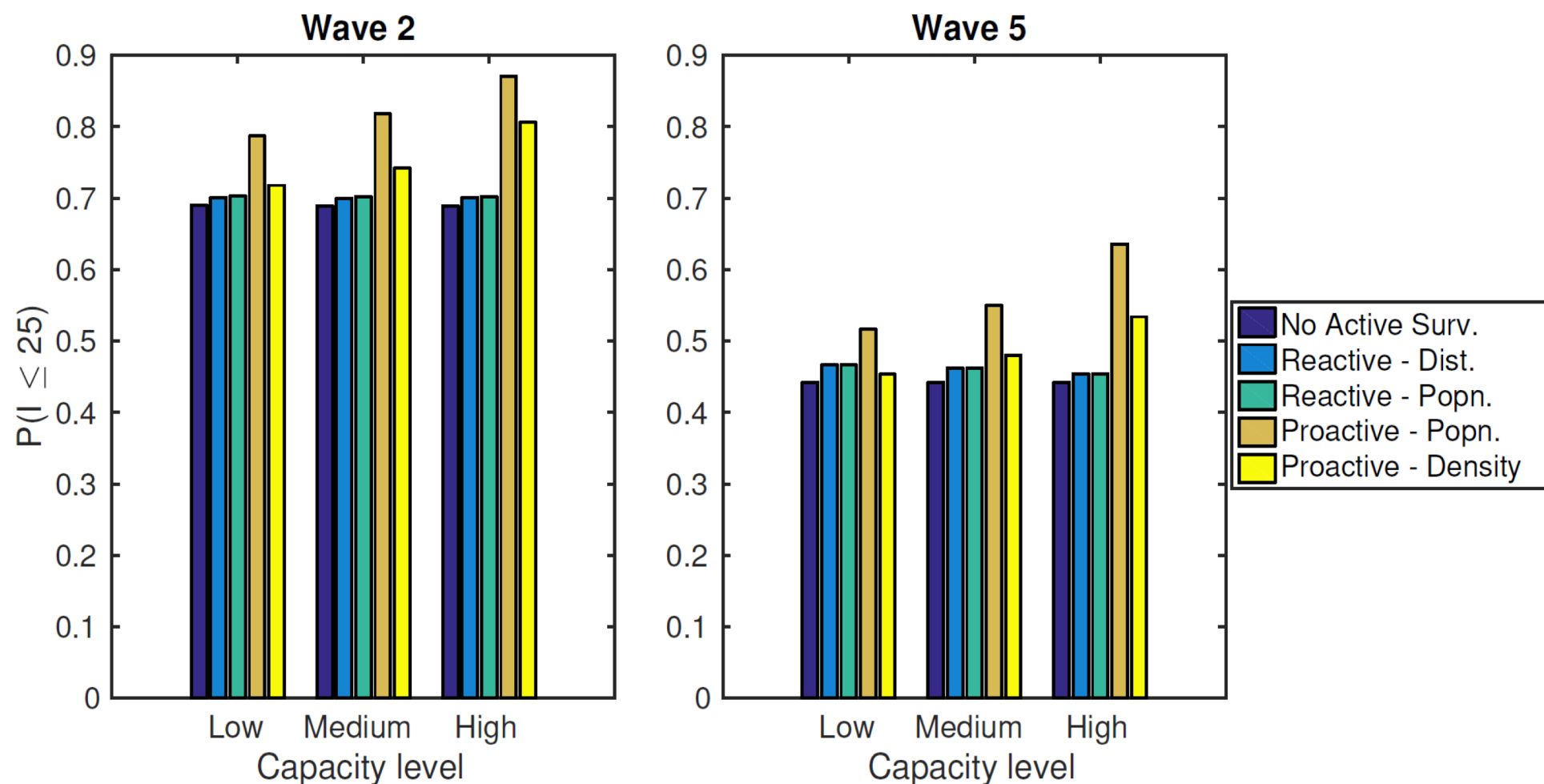
➤ For this control objective, culling outperforms vaccination.

**Figure 4B:** Mean number of poultry culled, under different ring culling/vaccination radii.



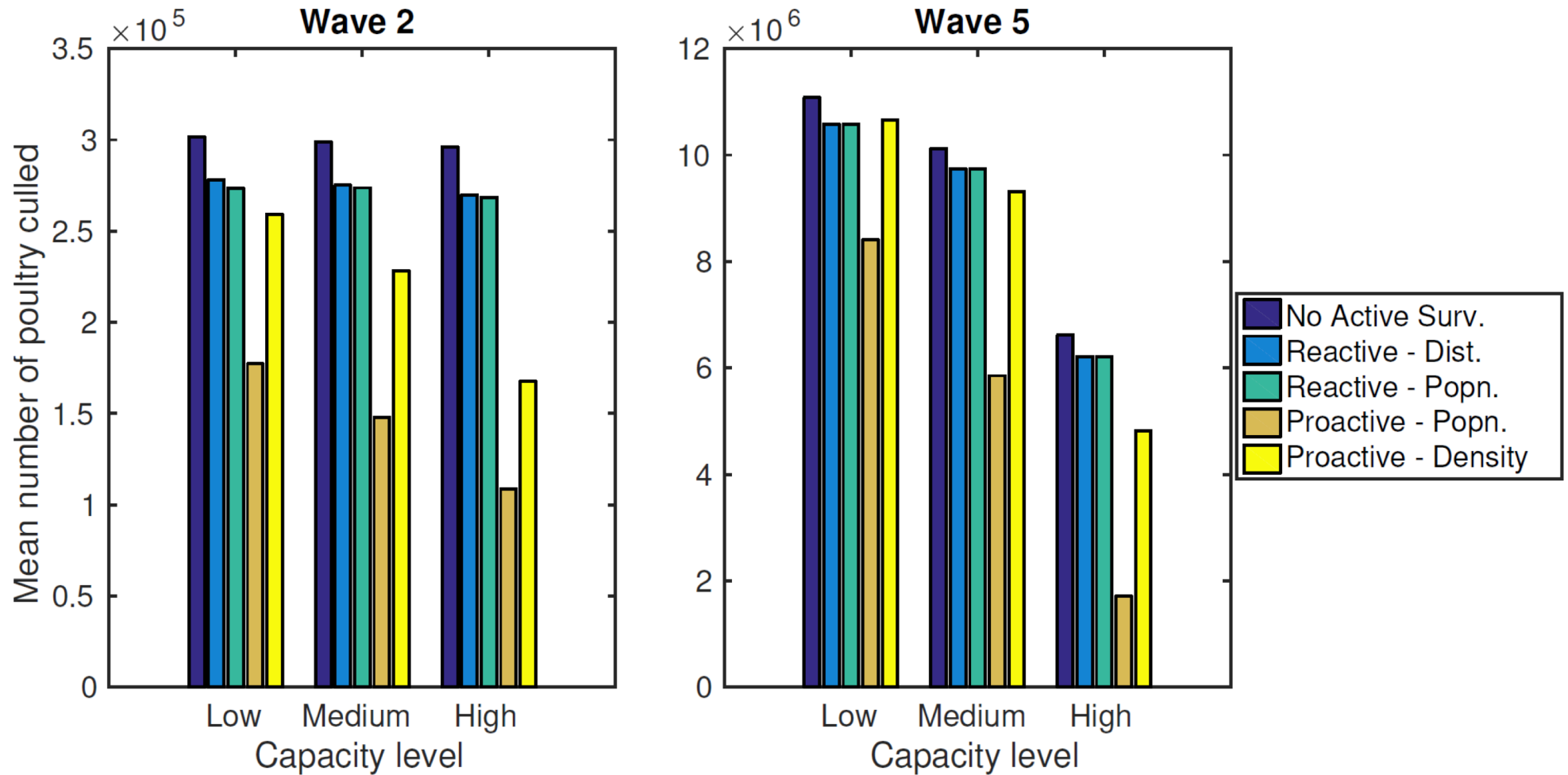
➤ Disparities across capacity constraints appear from 3km and above.

**Figure 5A: Surveillance strategy performance  
– outbreak duration objective**



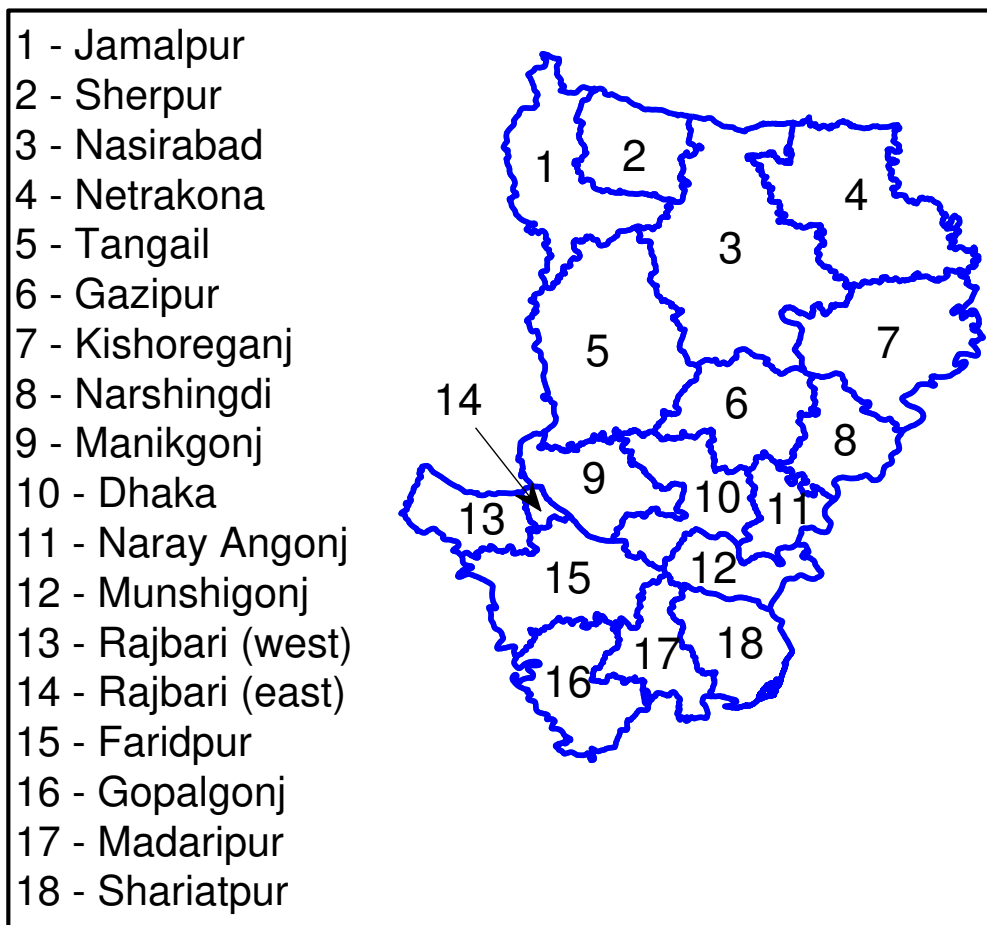
➤ ‘Proactive by population’ the best performing strategy.

**Figure 5B: Surveillance strategy performance  
– minimising poultry culled objective**



➤ ‘Proactive by population’ the best performing strategy.

# Transmission dynamics – Absence of external factors



➤ Does the division-level strategy alter based on the district the outbreak originated from?

➤ Revised force of infection:

$$R_{i,t} = \left( \sum_{j \in \text{infectious on day } t} N_{c,i}^p \times t_c N_{c,j}^q \times K(d_{ij}) \right)$$

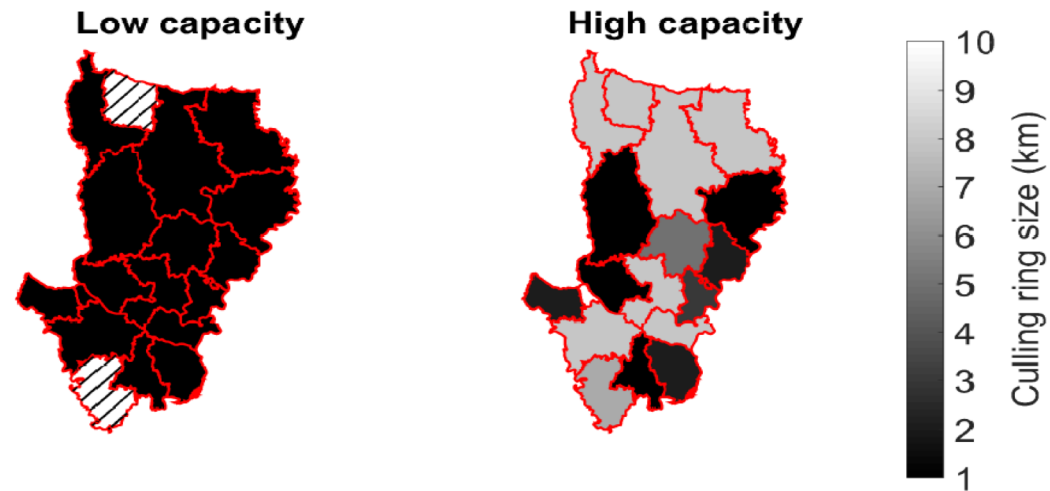
➤ Specific control objectives:

- Outbreak duration
- Probability of a widespread outbreak

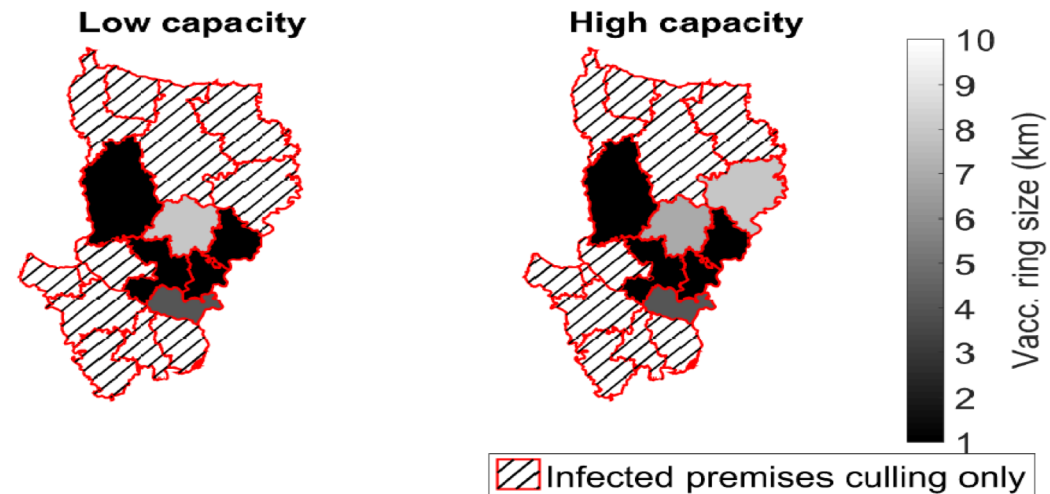



**Figure 6: Surveillance strategy performance  
– wave 5 model, widespread outbreak objective**

**Culling**



**Vaccination**



 Infected premises culling only

➤ Policy of infected premises culling alone can be the most suitable.

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# Zoonotic spillover interventions

## Non-spatial model

- Assume human case occurrence is a Poisson process.

**Infection Rate:**  $\lambda(t) = \beta I_b(t) + \epsilon_h$

- Separate set of human targeted measures.

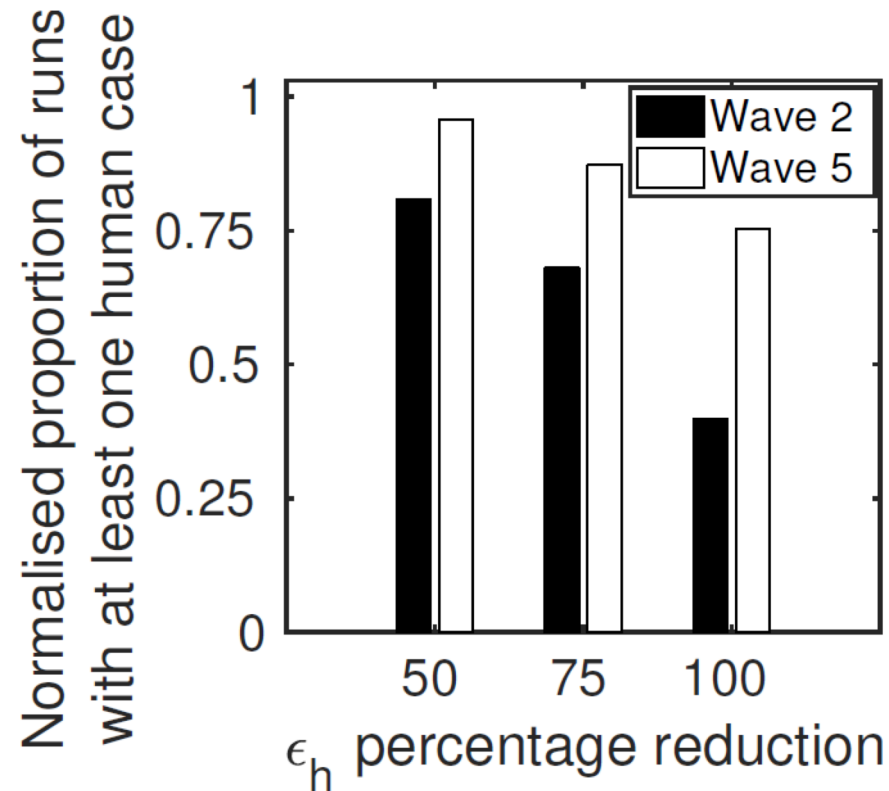
**Do you keep chickens, ducks, geese...?**  
Help protect your birds from the risk of #birdflu



- Captured by scaling  $\epsilon_h$   
(50%, 75%, 100% reduction)



**Figure 8:** Zoonotic spillover intervention performance



- Under wave 2 type outbreak dynamics, potential for vast cuts in spillover transmission risk.

# Summary of findings

## Evaluation of interventions targeting poultry premises

- Reactive culling and vaccination impact **highly dependent** upon epidemiological characteristics, control objectives and capacities.
- Proactive surveillance schemes **significantly outperform** reactive surveillance procedures.

## Zoonotic spillover

- Enforcement of control measures not directly applied to poultry flocks themselves can **severely diminish** the risk of spillover transmission.

# Acknowledgements

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- Bangladesh Department of Livestock services (DLS)
- FAO-ECTAD (Emergency Centre for Transboundary Animal Diseases)

**EPSRC**

Engineering and Physical Sciences  
Research Council



For further details:

EM Hill et al. (2018) The impact of surveillance and control on highly pathogenic influenza outbreaks in poultry in Dhaka division, Bangladesh.  
*bioRxiv*. doi: 10.1101/193177.

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