

# The Evolution of Antiviral Resistance

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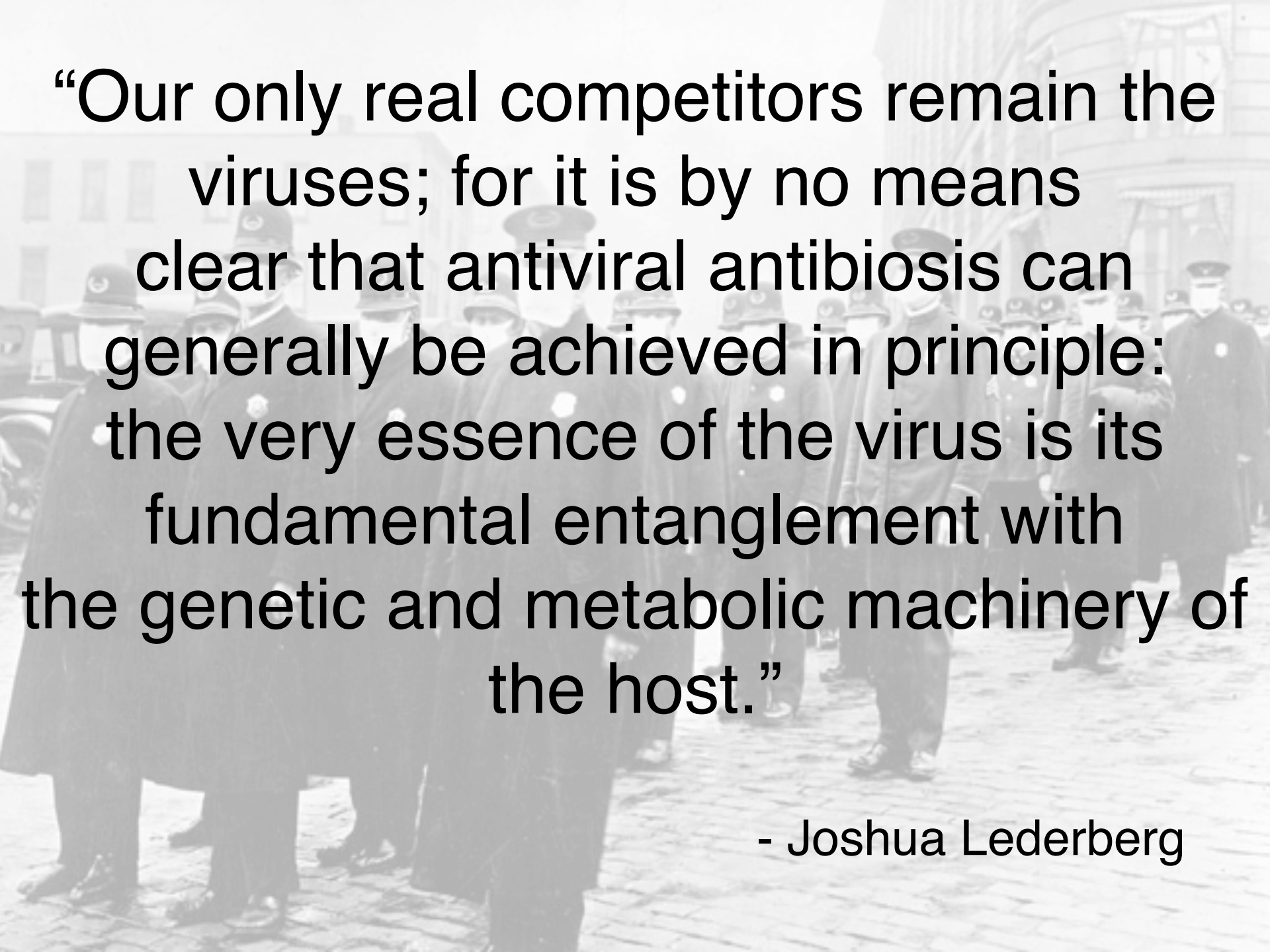
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THE UNIVERSITY OF  
**TEXAS**  
— AT AUSTIN —



**MIDAS**  
Models of Infectious  
Disease Agent Study



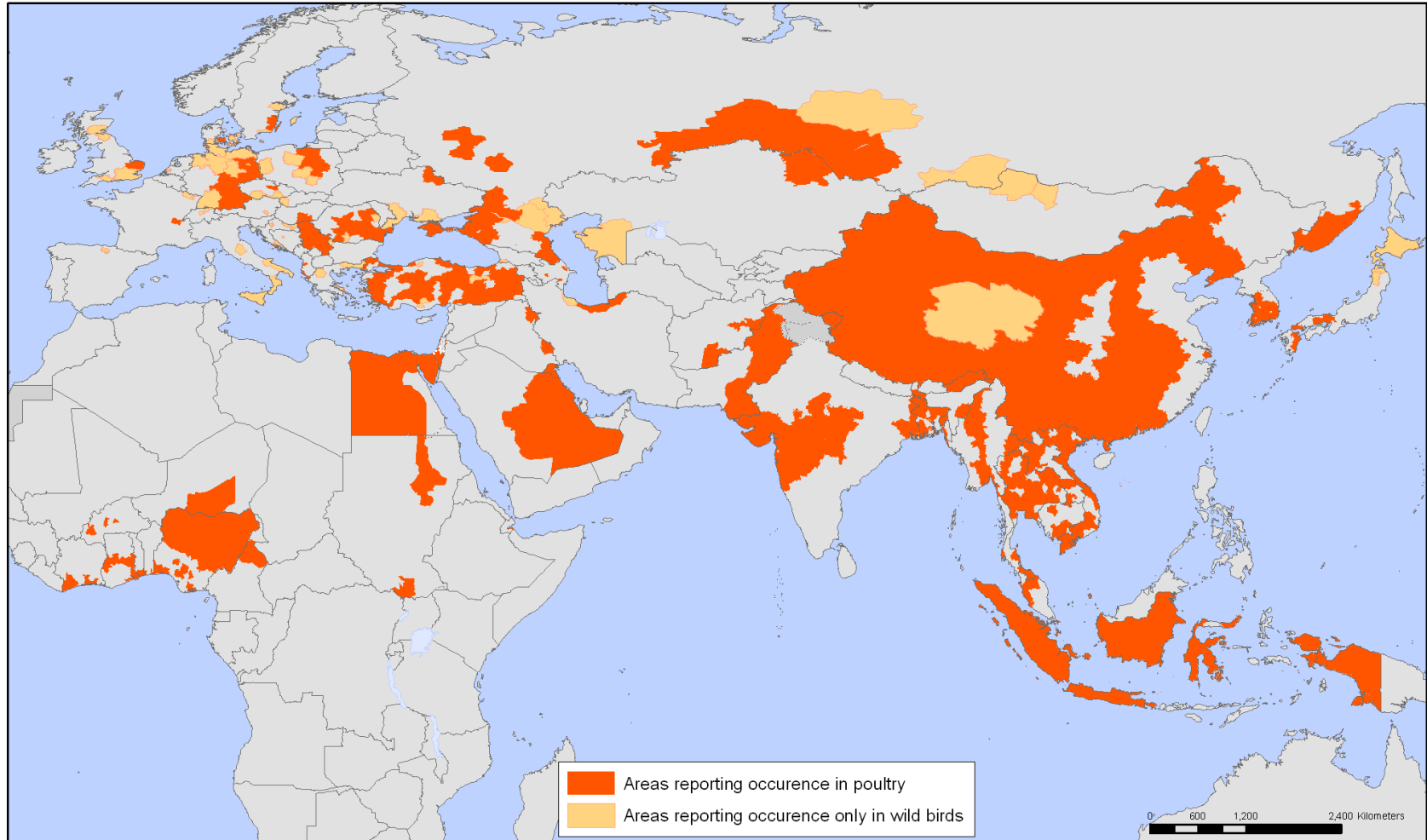
“Our only real competitors remain the viruses; for it is by no means clear that antiviral antibiotics can generally be achieved in principle: the very essence of the virus is its fundamental entanglement with the genetic and metabolic machinery of the host.”

- Joshua Lederberg

# In 2009, we were caught off guard

Areas reporting confirmed occurrence of H5N1 avian influenza in poultry and wild birds since 2003

Status as of 14 November 2008  
Latest available update



**World Health  
Organization**

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The boundaries and names shown and the designations used on this map do not imply the expression of any opinion whatsoever on the part of the World Health Organization concerning the legal status of any country, territory, city or area or of its authorities, or concerning the delimitation of its frontiers or boundaries. Dotted lines on maps represent approximate border lines for which there may not yet be full agreement.

**Data Source: World Organisation for Animal Health (OIE)  
and national governments**

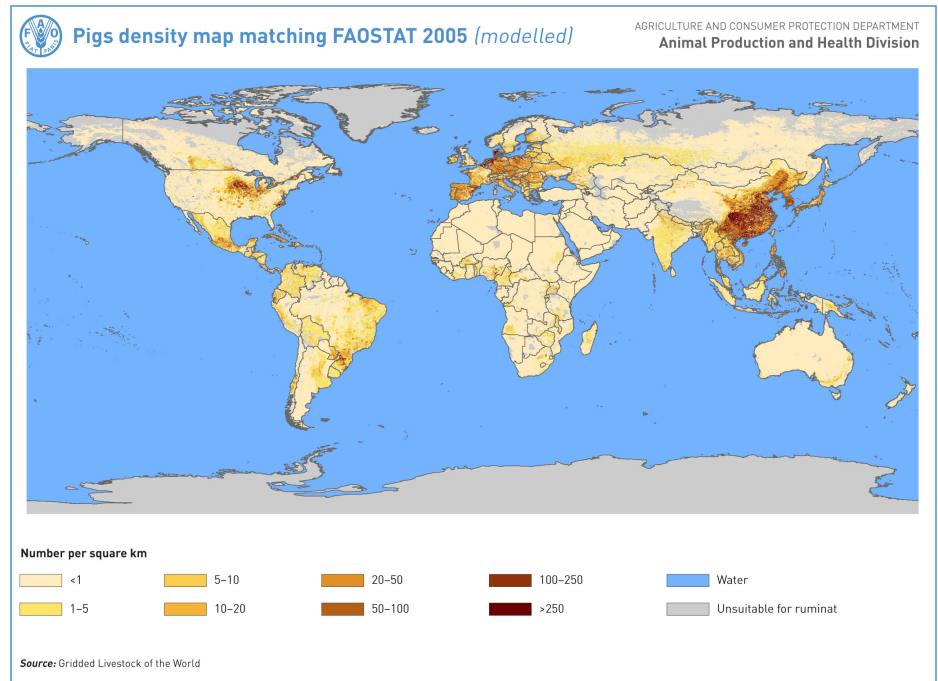
Map Production: Public Health Information and Geographic  
Information Systems (GIS), World Health Organization

# Why?

## Air travel



## Density of pig farms



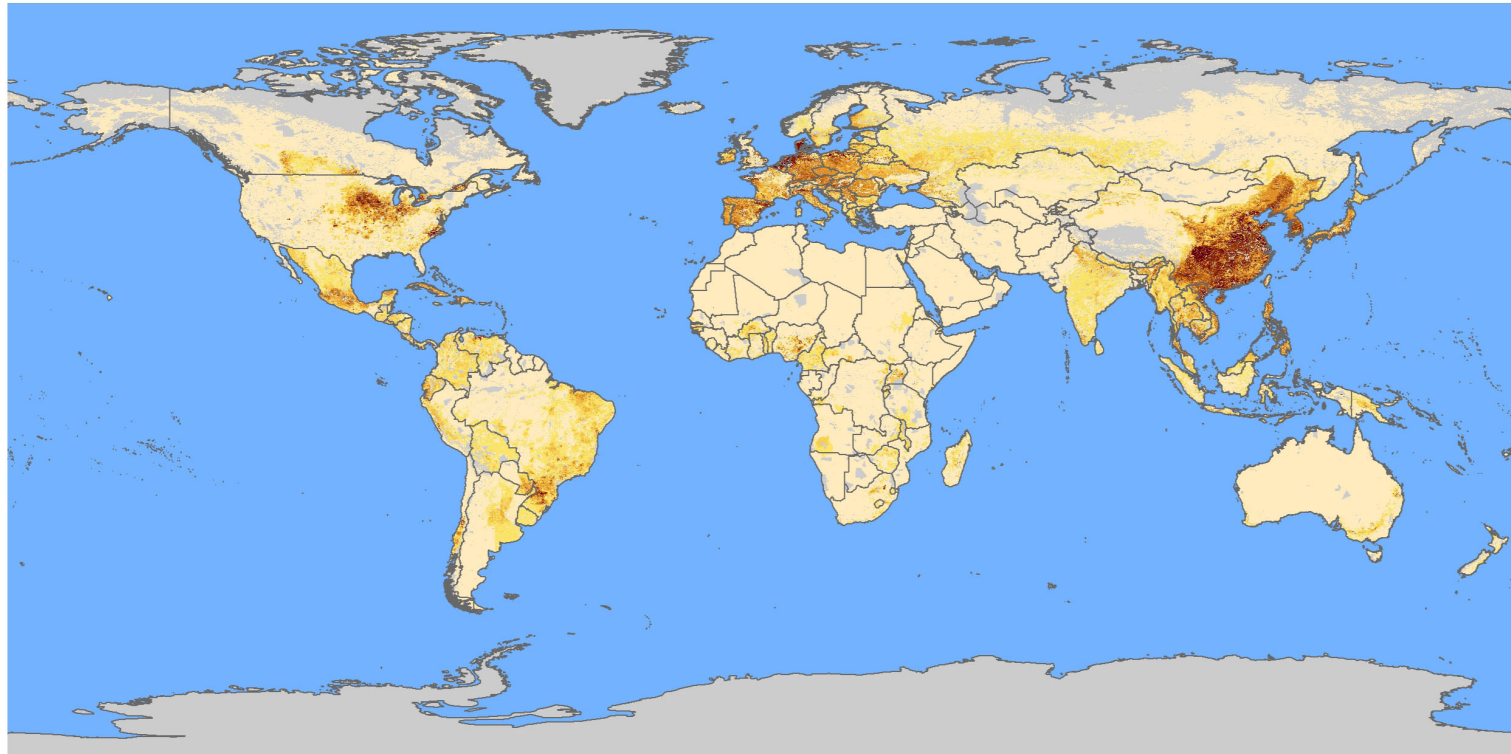
# Pigs are an evolutionary intermediary



Pigs density map matching FAOSTAT 2005 (*modelled*)

AGRICULTURE AND CONSUMER PROTECTION DEPARTMENT

Animal Production and Health Division



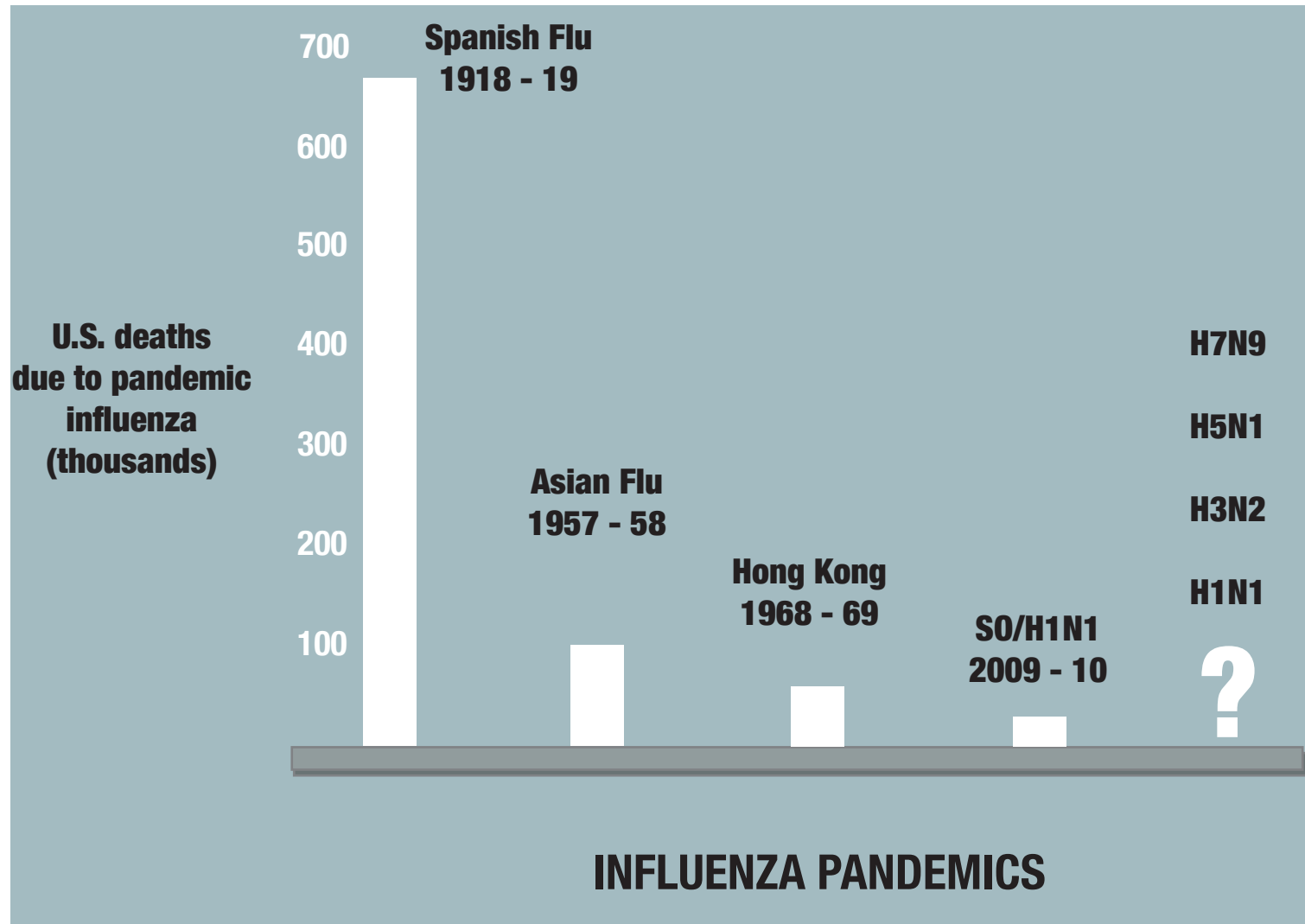
Number per square km



Source: Gridded Livestock of the World

# The next pandemic is right around the corner

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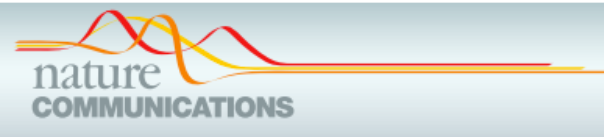


# The next pandemic and antiviral resistance

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# The next pandemic and antiviral resistance

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## ARTICLE

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OPEN

## Influenza A(H7N9) virus gains neuraminidase inhibitor resistance without loss of *in vivo* virulence or transmissibility

### Detection of Molecular Markers of Antiviral Resistance in Influenza A (H5N1) Viruses Using a Pyrosequencing Method<sup>▽</sup>

Varough M. Deyde,<sup>1#</sup> Tung Nguyen,<sup>2#</sup> Rick A. Bright,<sup>1†</sup> Amanda Balish,<sup>1</sup> Bo Shu,<sup>1</sup>  
Stephen Lindstrom,<sup>1</sup> Alexander I. Klimov,<sup>1</sup> and Larisa V. Gubareva<sup>1\*</sup>

*Influenza Division, National Center for Immunization and Respiratory Diseases, Centers for Disease Control and Prevention, Atlanta, Georgia,<sup>1</sup>  
and National Centre for Veterinary Diagnostics, DAH11-78th lane, Giai Phong str Phuong Mai, Dong Da, Hanoi, Vietnam<sup>2</sup>*

# Where are we going?

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1. Biology of antiviral resistance
2. Emerging patterns of antiviral resistance
3. Modeling the evolution of resistance
4. Modeling results
5. Conclusions

# Influenza: Basic Biology

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## RNA Virus

flu A: 8 segments, 11 genes

3 main genera

A,B,C



Subtypes determined by envelope glycoproteins

H's (16, 3 human) and N's (9, 2 human)

Causes recurrent, seasonal epidemics in temperate regions.

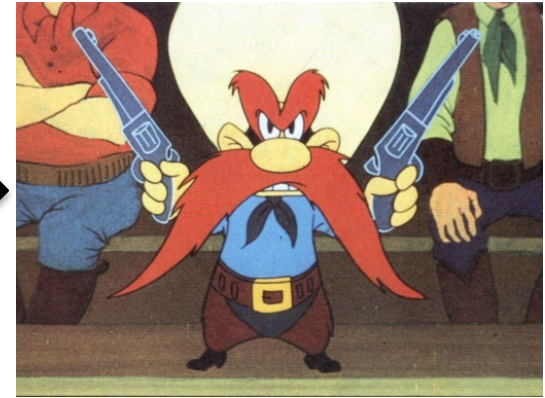
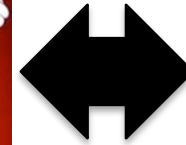
# Pigs: an evolutionary intermediary?

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NeuAc-2,3Gal

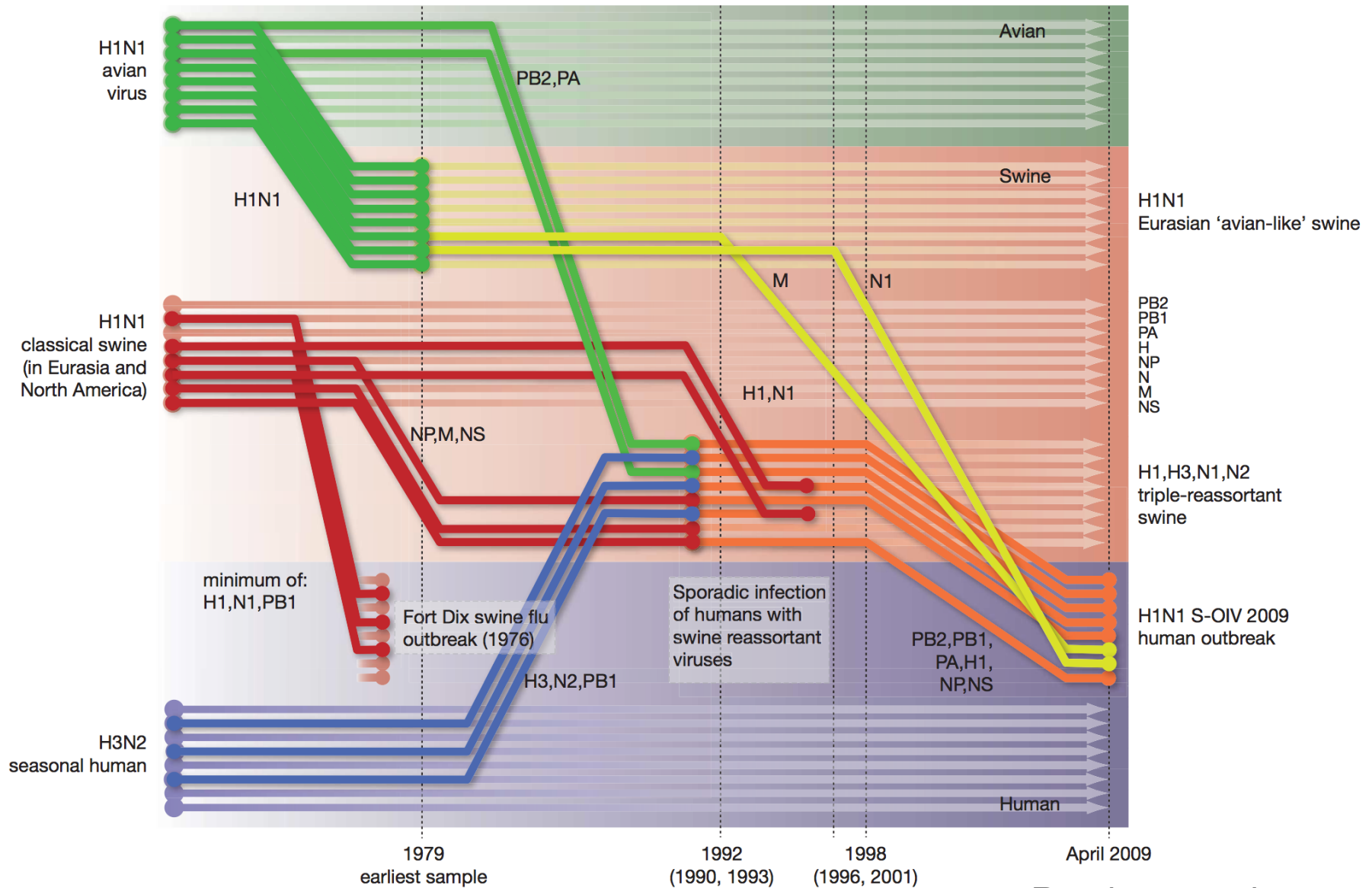
NeuAc-2,3 & 2,6 Gal

NeuAc-2,6Gal

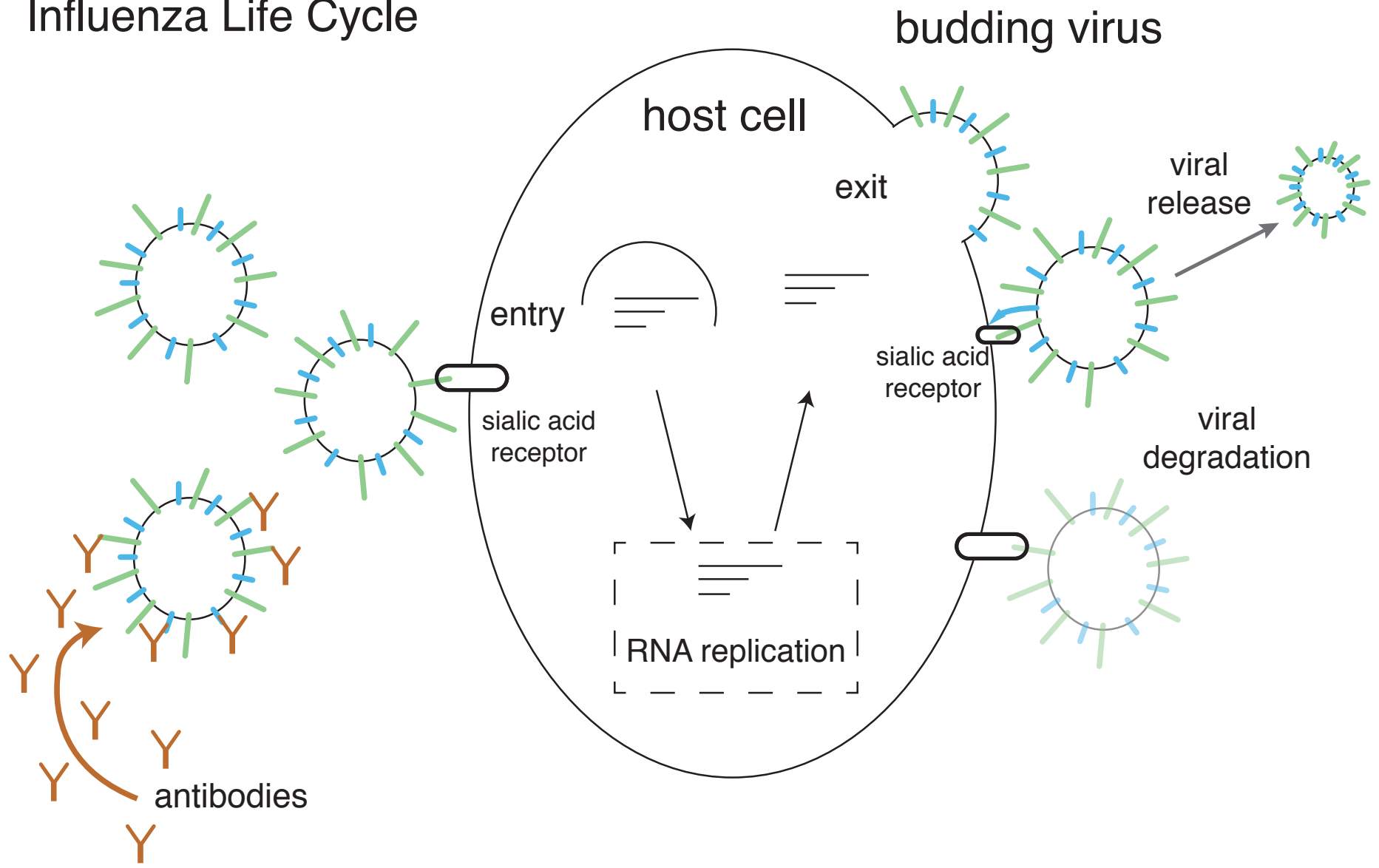


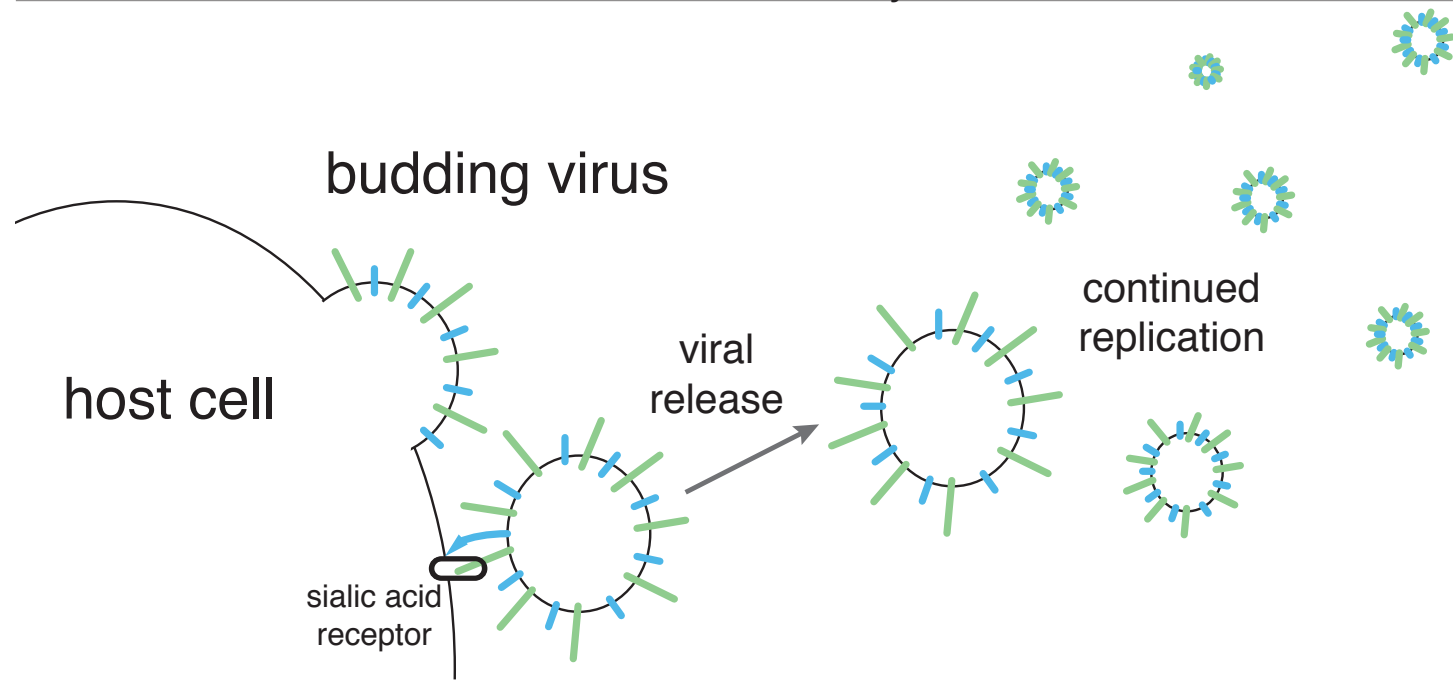
Zhou et al. 1999

# The emergence of H1N1

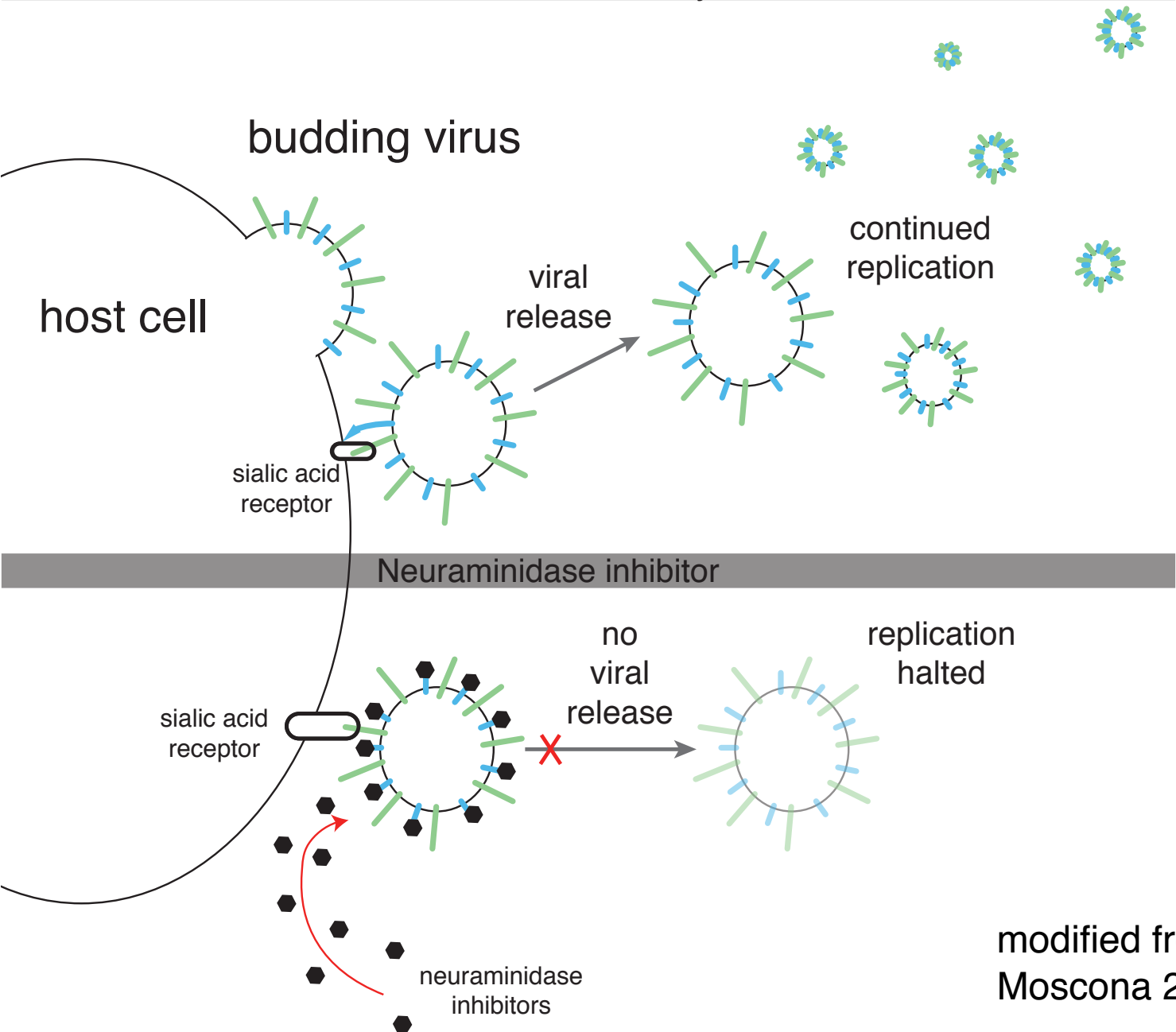


# Influenza Life Cycle



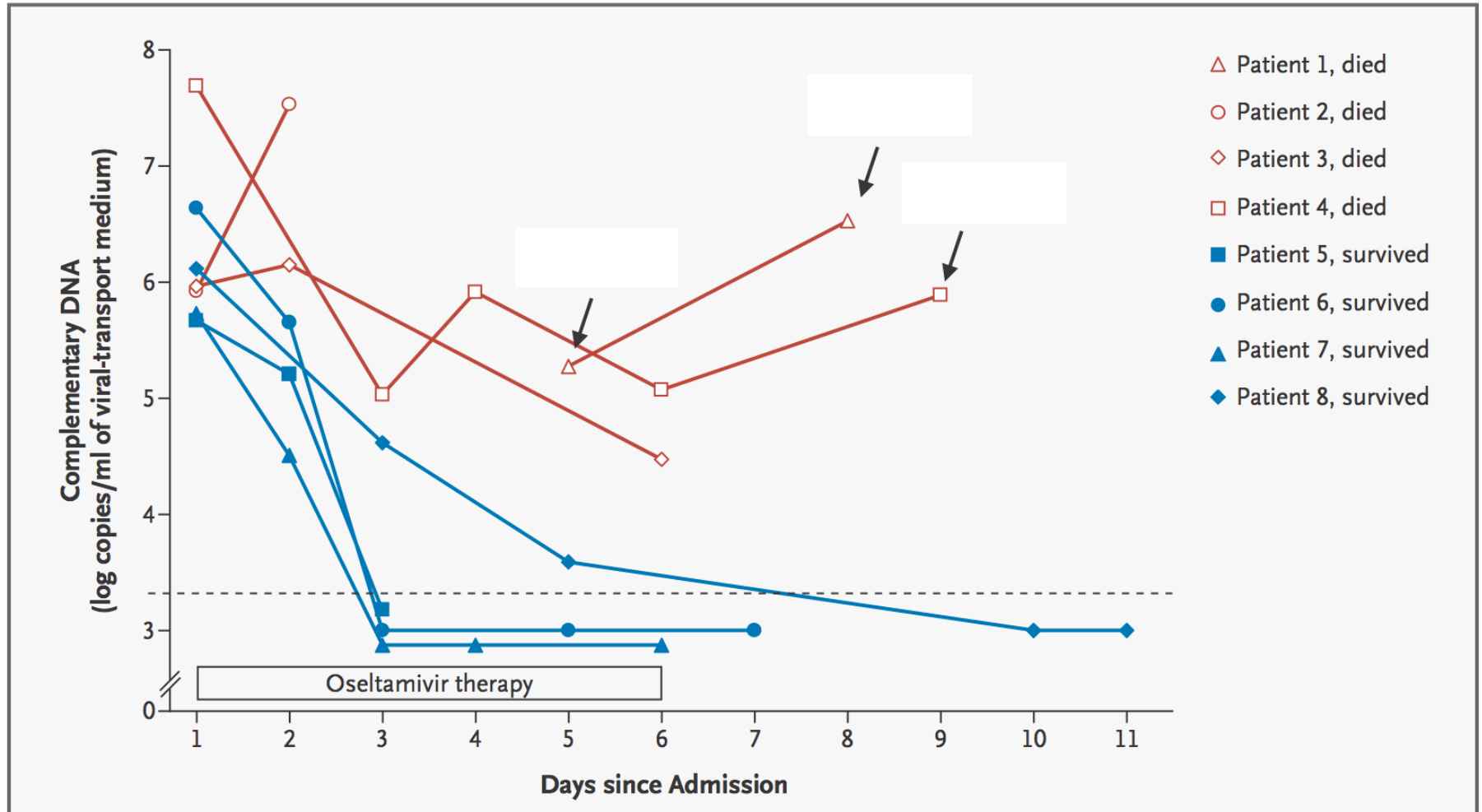


Neuraminidase activity

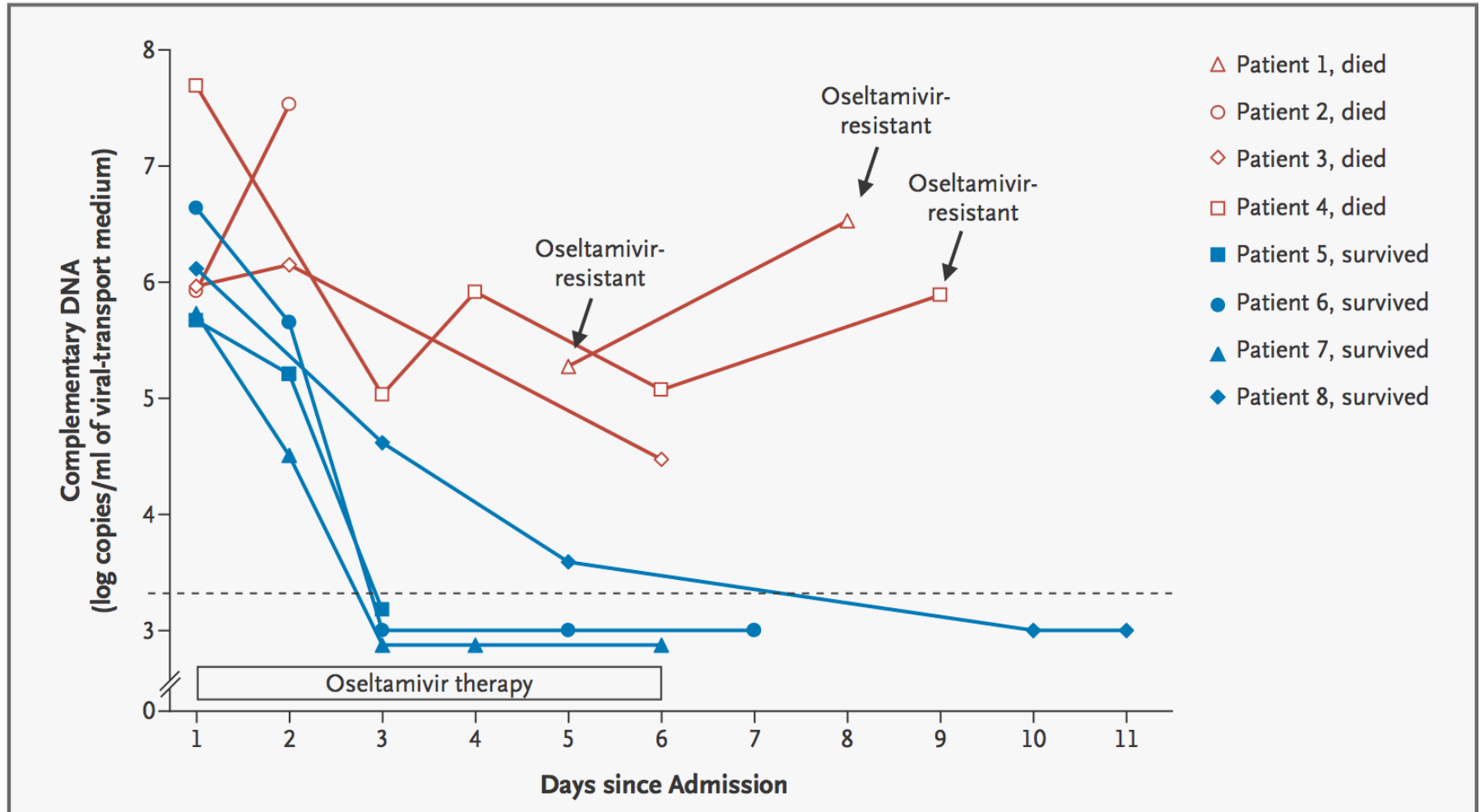


modified from  
Moscona 2005

# Neuraminidase inhibitors

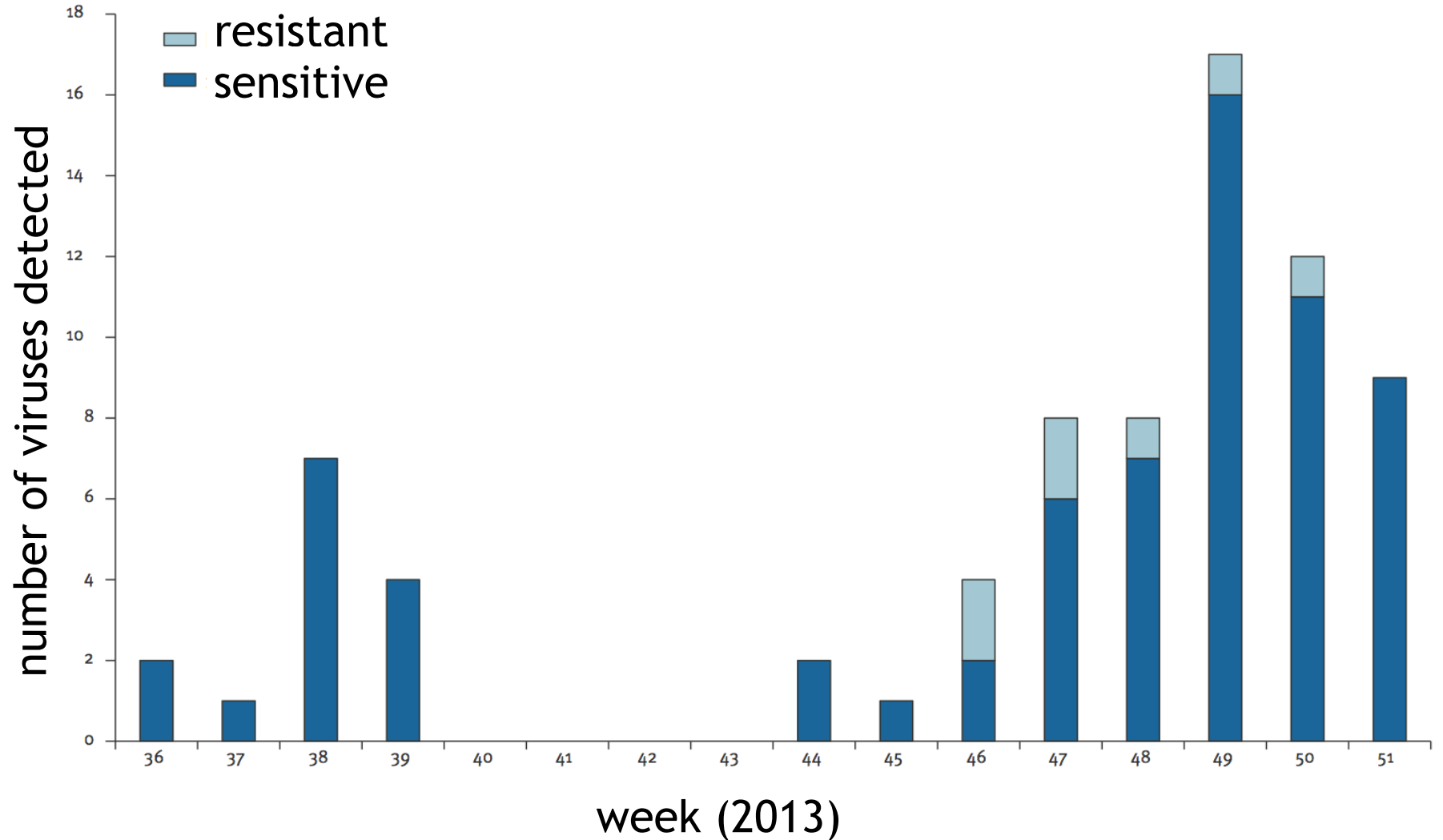


# Neuraminidase inhibitors



# Community spread of antiviral resistance

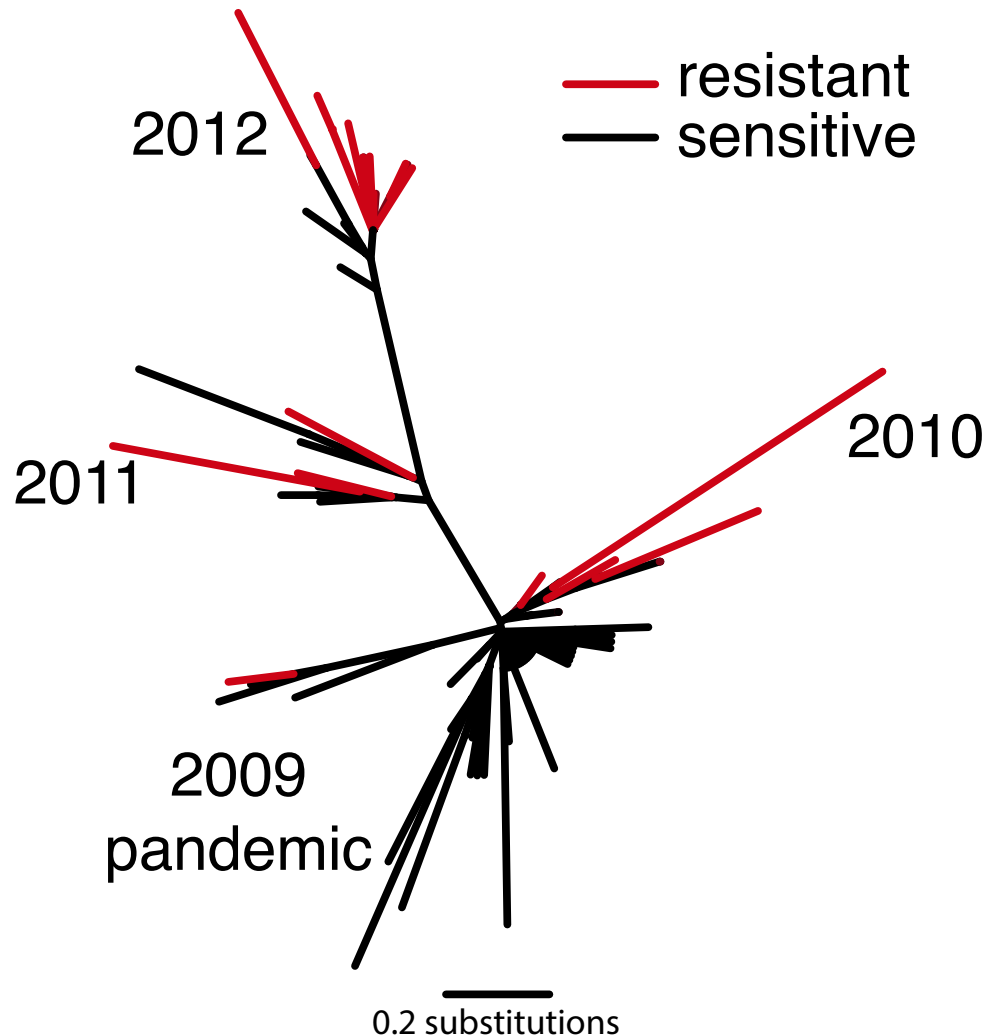
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# Antiviral resistance phylogenetic pattern

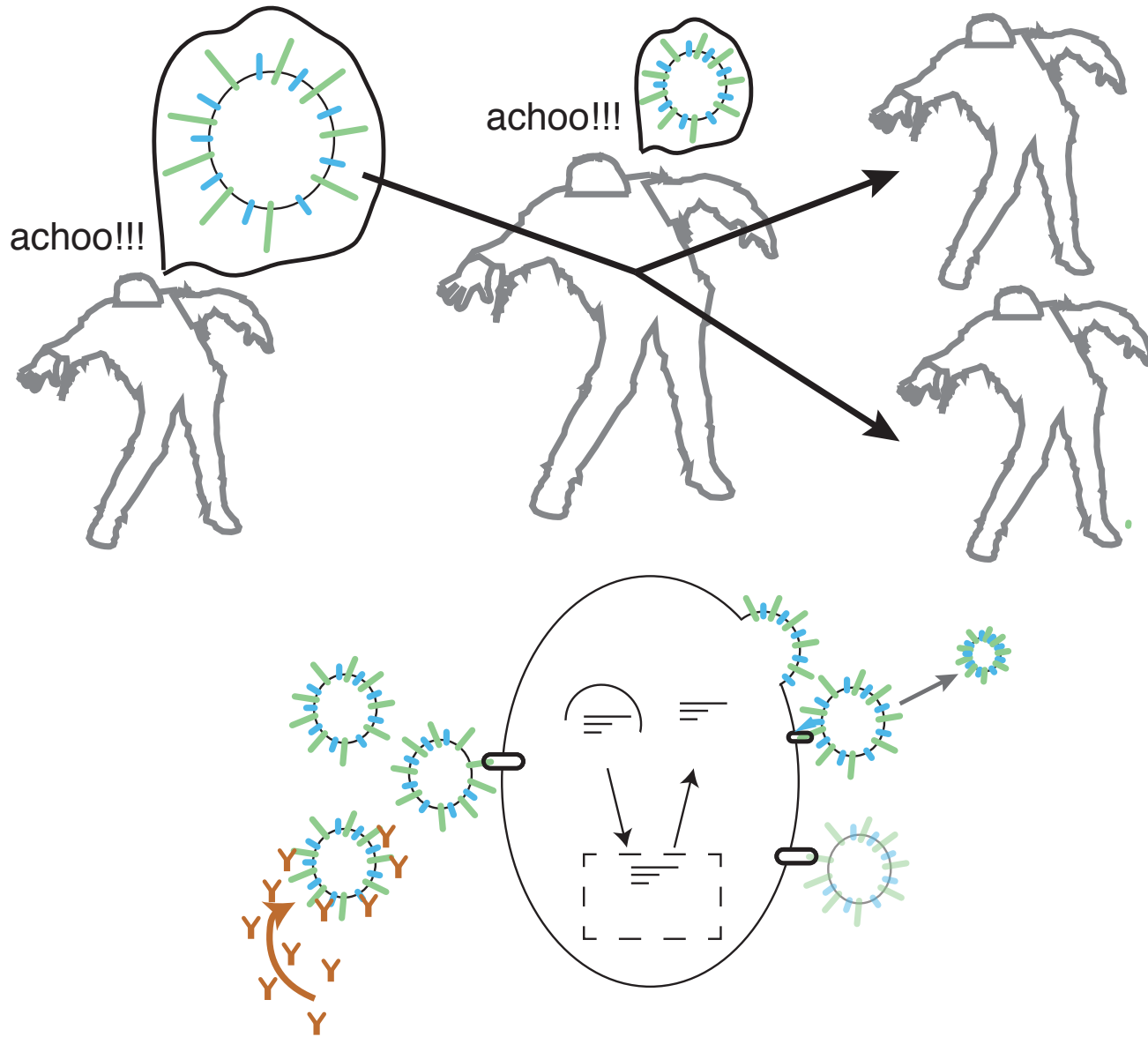
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## H1N1pdm09, NA Gene



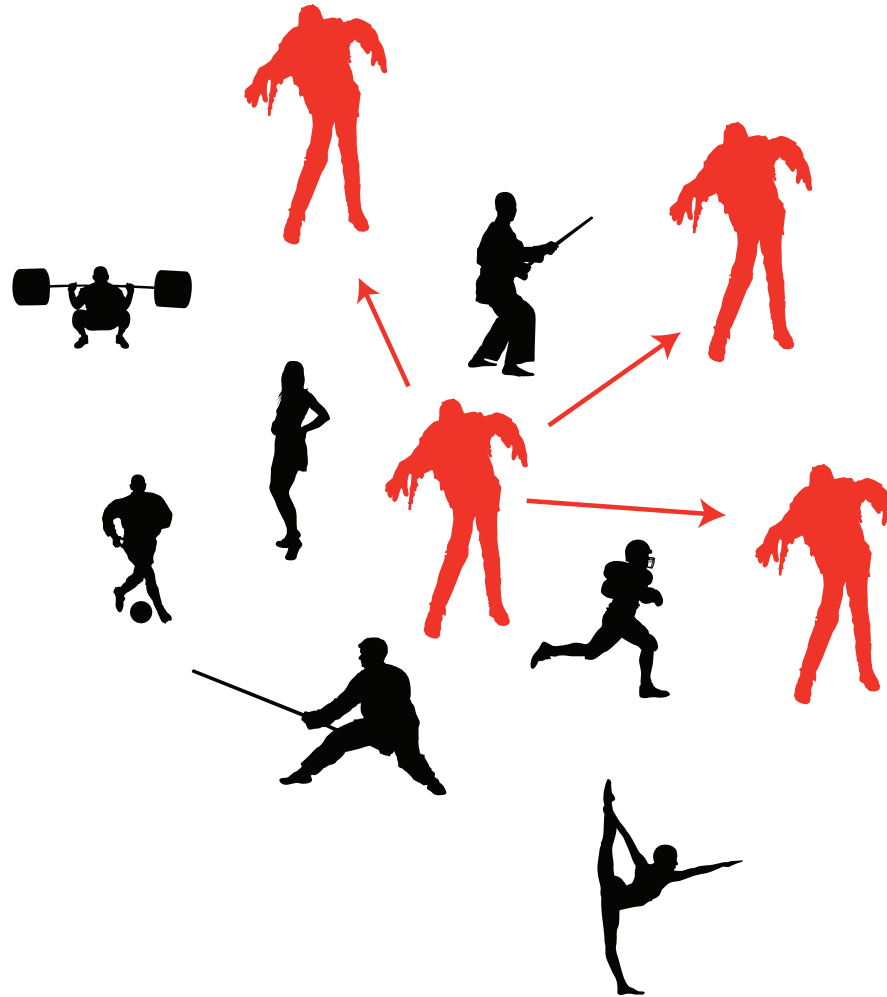
# Modeling the evolution of resistance

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# R0: the basic reproductive number

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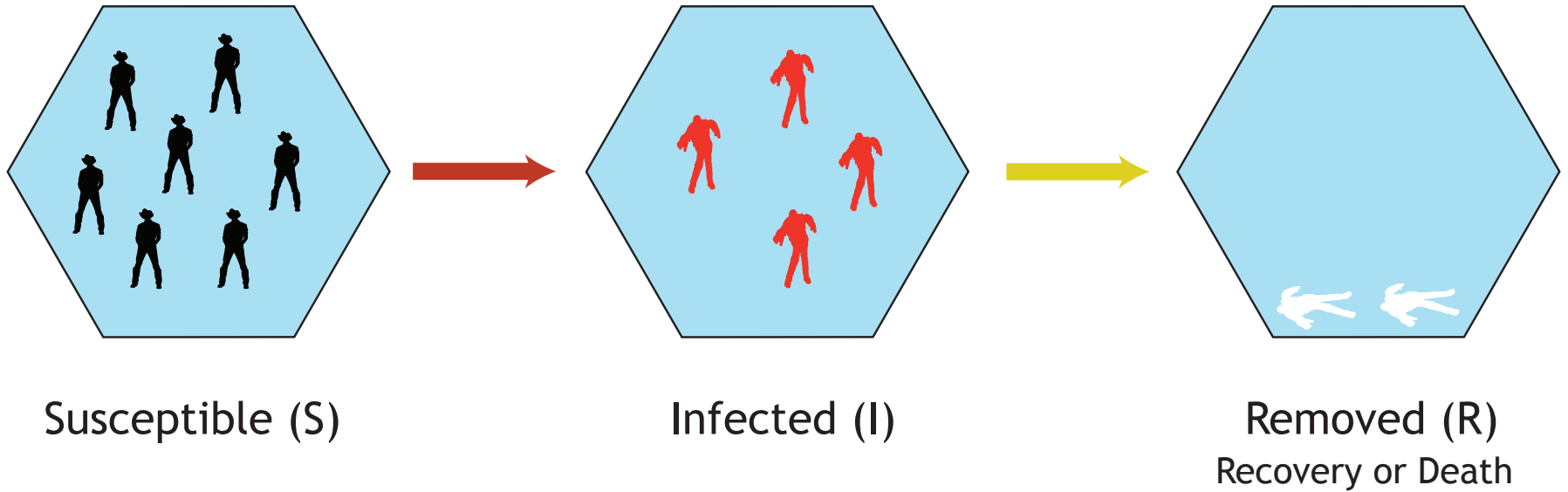


$R_0 =$

Expected number of secondary cases

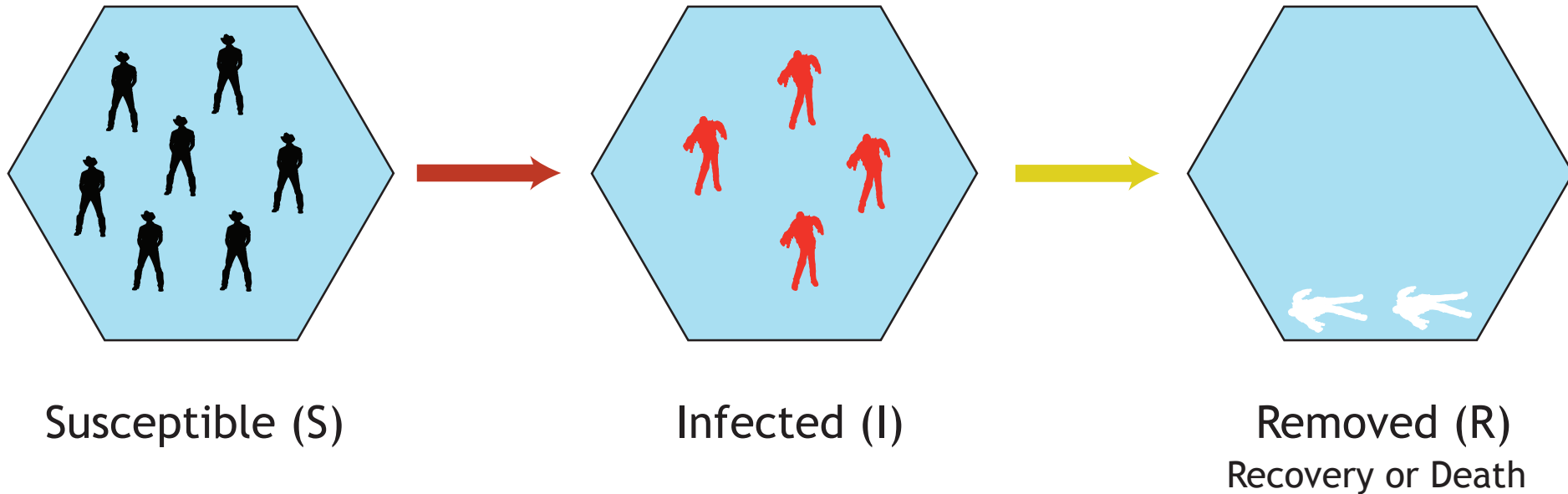
# R0 and the SIR model

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# R0 and the SIR model

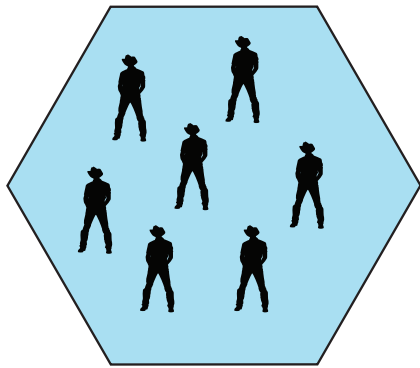
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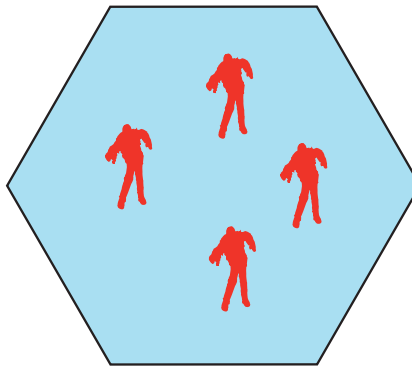
$$R_0 = \frac{\text{Infection Rate}}{\text{Recovery} + \text{Mortality}} = \frac{\text{Red Arrow}}{\text{Yellow Arrow}}$$

# R0 and the SIR model

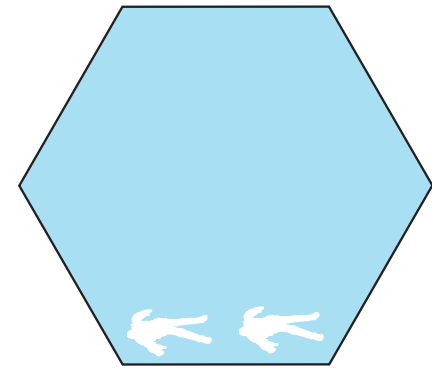
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Susceptible (S)



Infected (I)

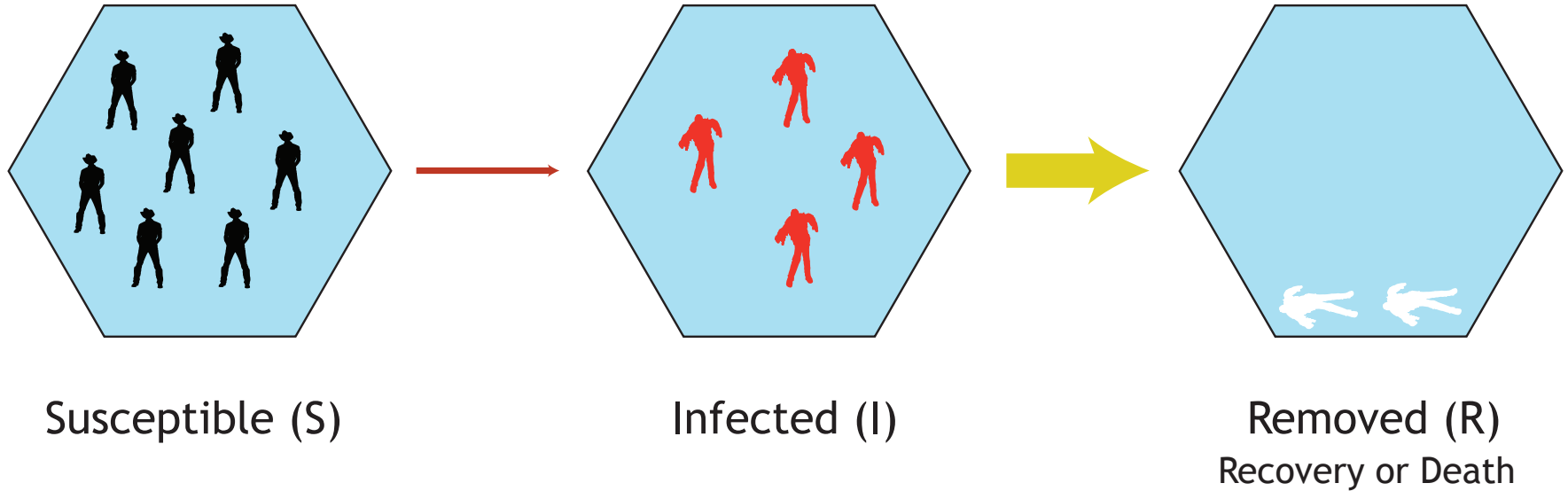


Removed (R)  
Recovery or Death

$$R_0 = \frac{\text{Infection Rate}}{\text{Recovery} + \text{Mortality}} = \frac{\text{Red Arrow}}{\text{Yellow Arrow}} = \text{We're Zombies}$$

# R0 and the SIR model

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$$R_0 = \frac{\text{Infection Rate}}{\text{Recovery} + \text{Mortality}} = \frac{\text{Infection Rate}}{\text{Recovery} + \text{Mortality}} = \text{We're Fine}$$

# The players

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## Four types of host



strong immune response



strong immune response  
treated with antivirals

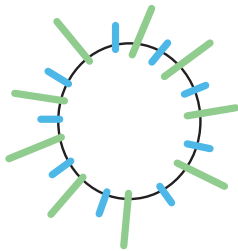


weak immune response

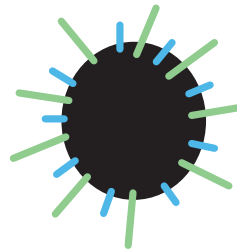


weak immune response  
treated with antivirals

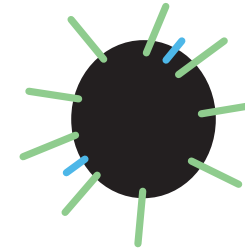
## Three types of virus



sensitive to antivirals



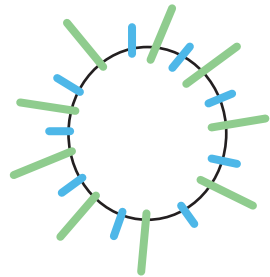
resistant to antivirals  
no cost to resistance



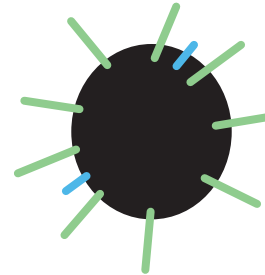
resistant to antivirals  
cost to resistance

# The cost of antiviral resistance

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sensitive to antivirals

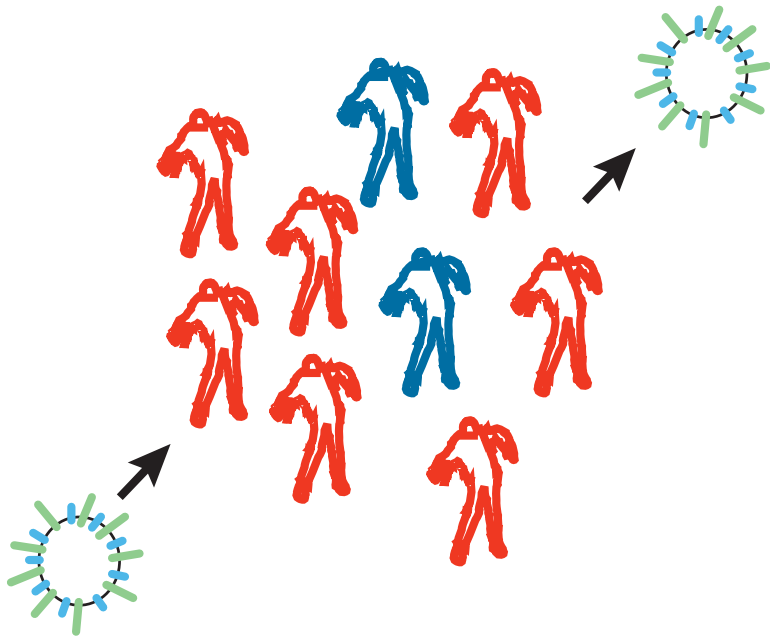


resistant to antivirals  
cost to resistance

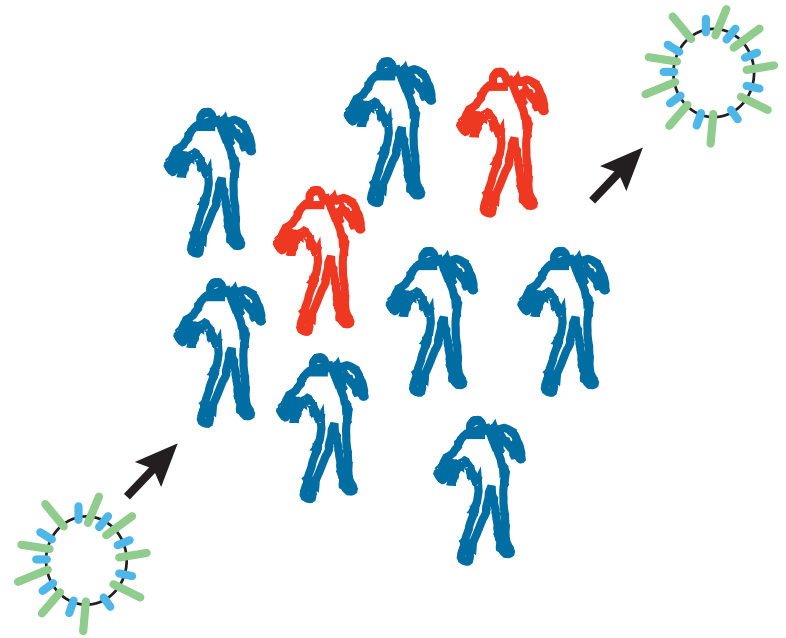
Bloom et al. 2010  
Butler et al. 2014

# Evolution of the viral surface proteins

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higher average immunity

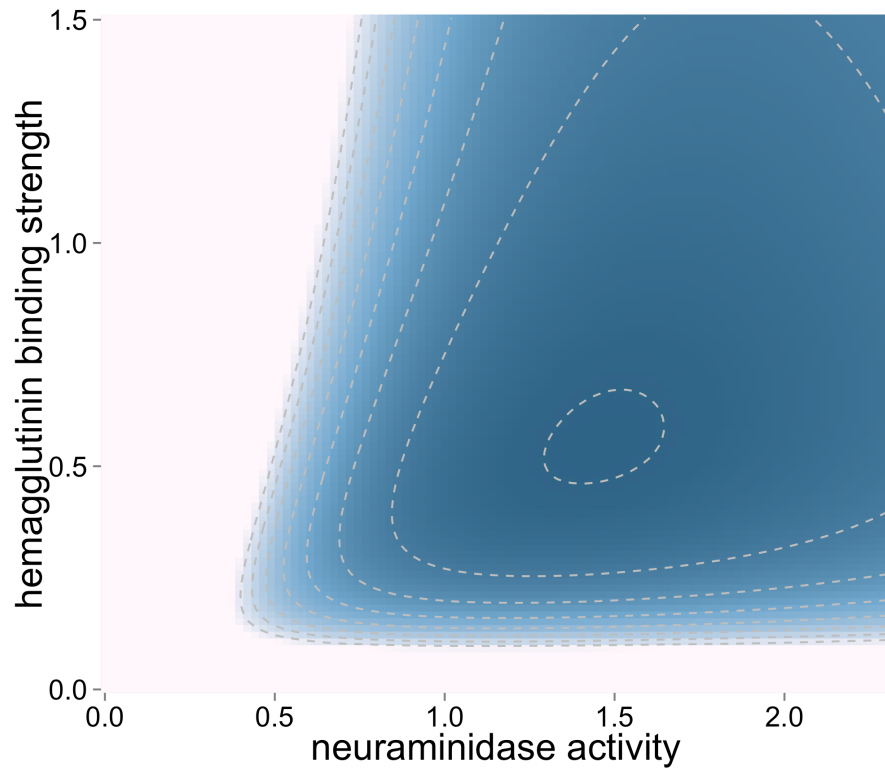


lower average immunity

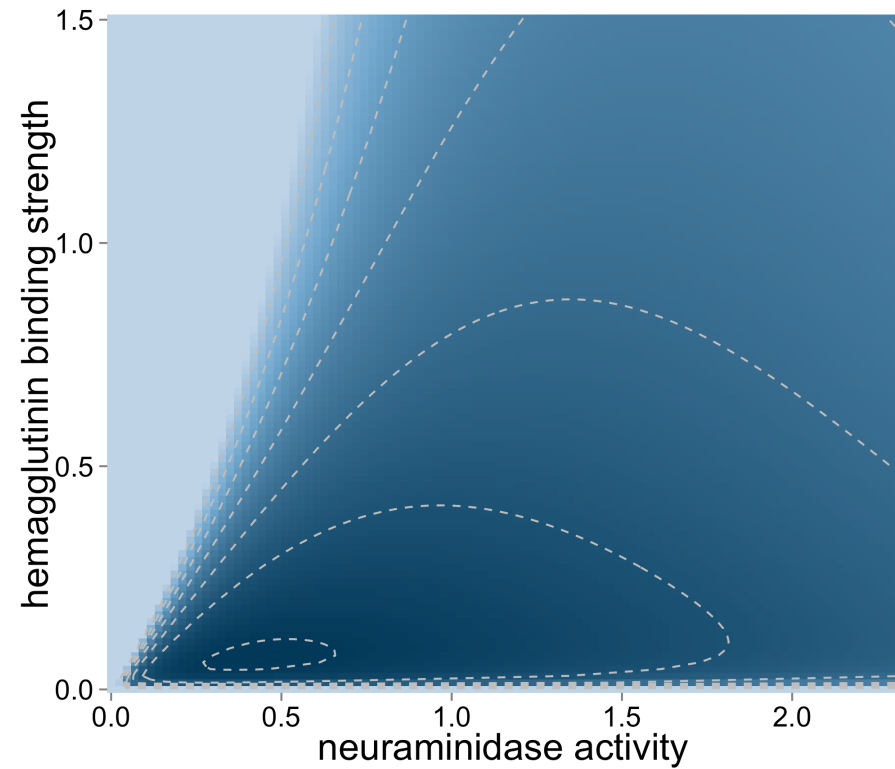
# Evolution of the viral surface proteins

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high immune host

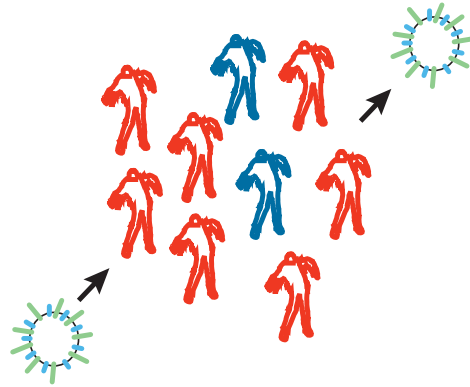


low immune host

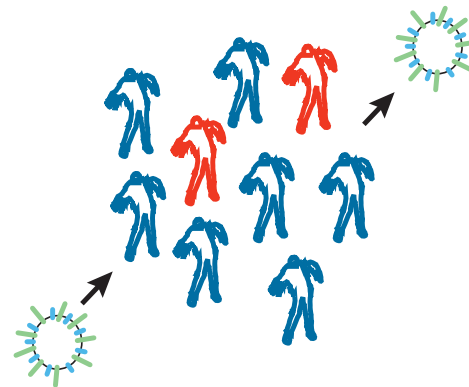


# Calculating viral fitness

evolution

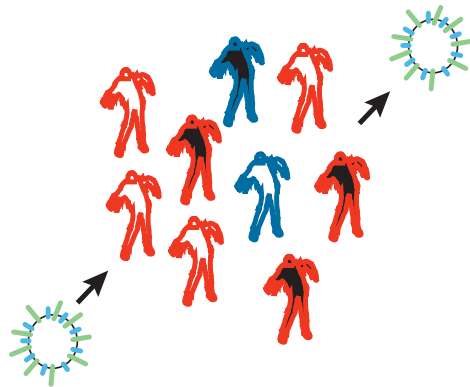


higher average immunity

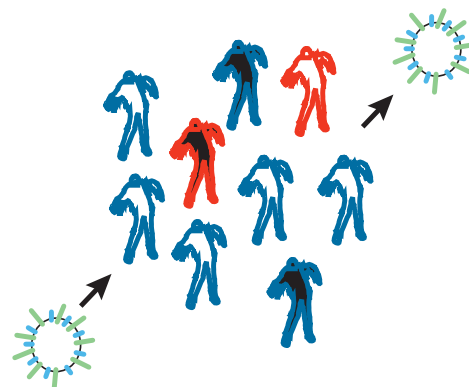


lower average immunity

evaluation



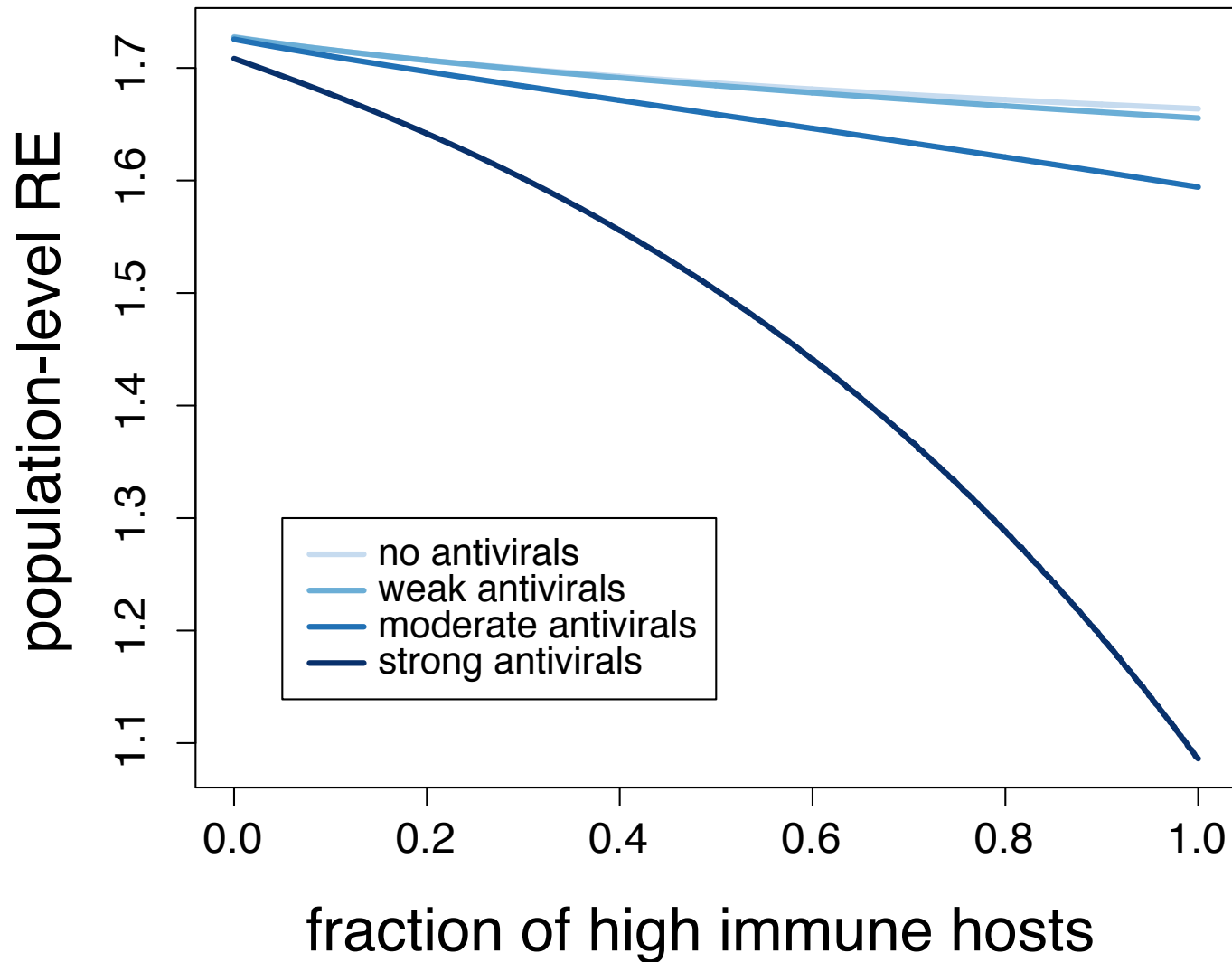
higher average immunity



lower average immunity

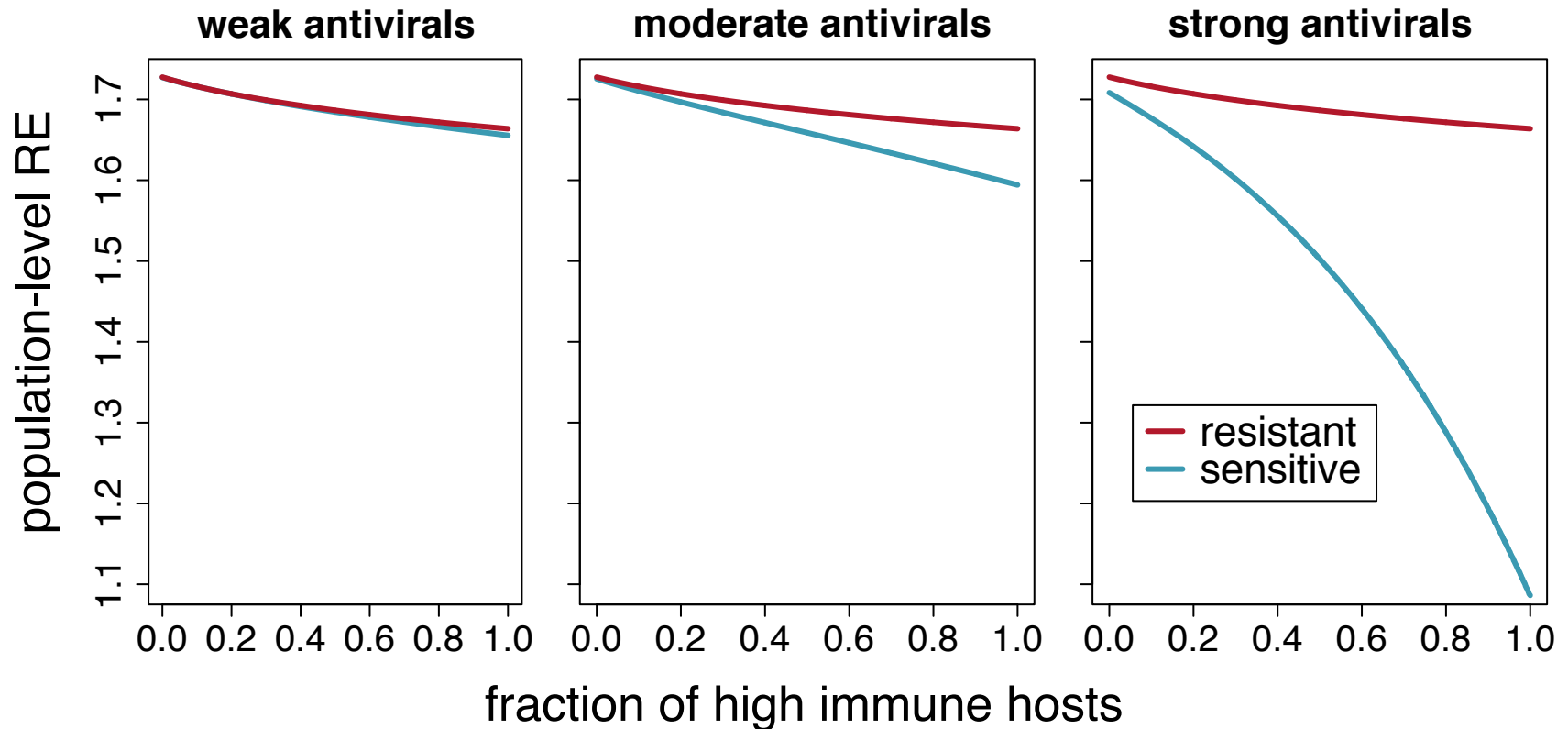
# The effect of antivirals

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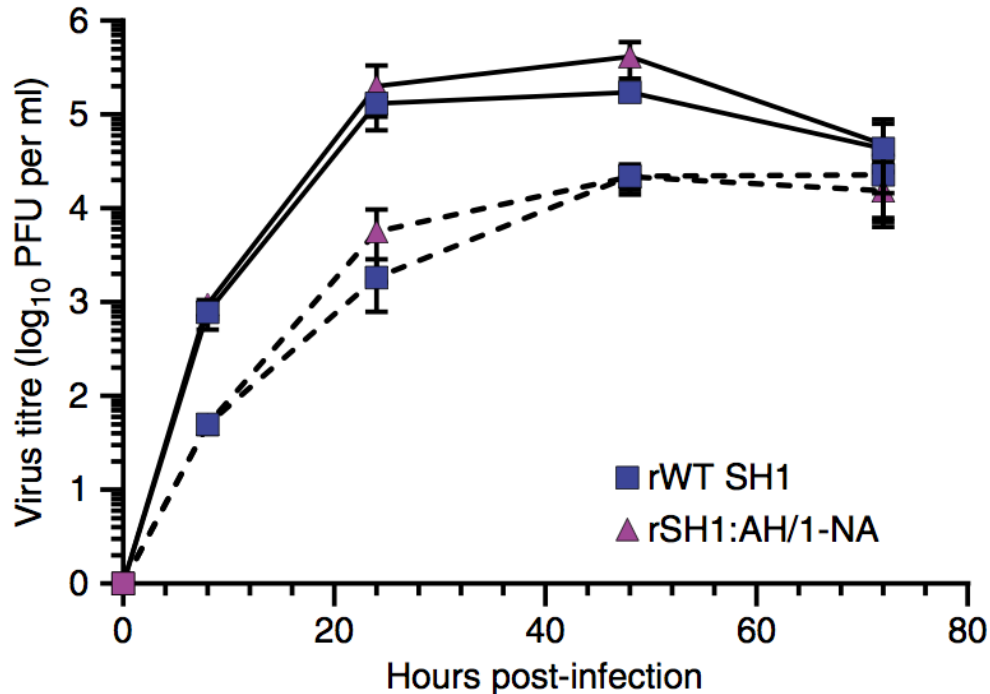
# The evolution of resistance (no cost)

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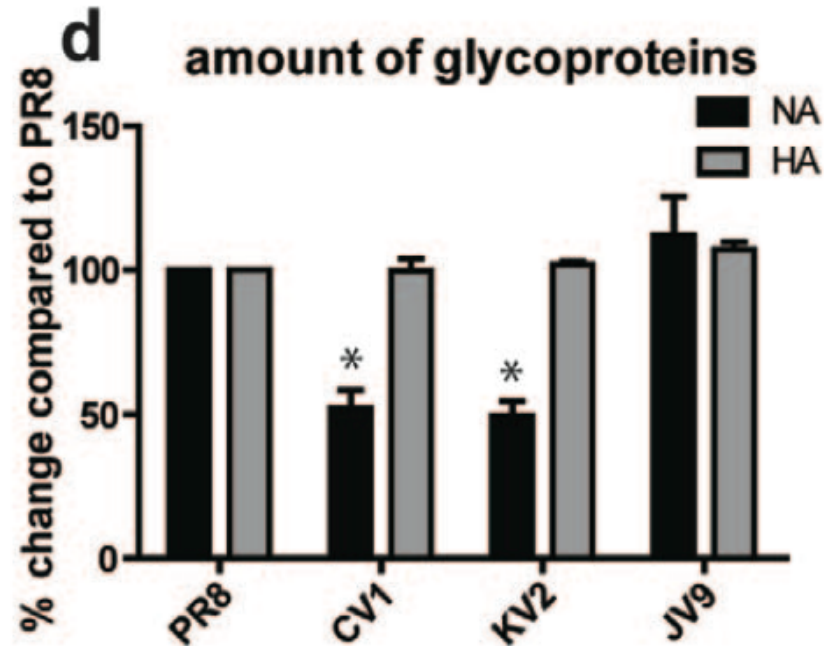
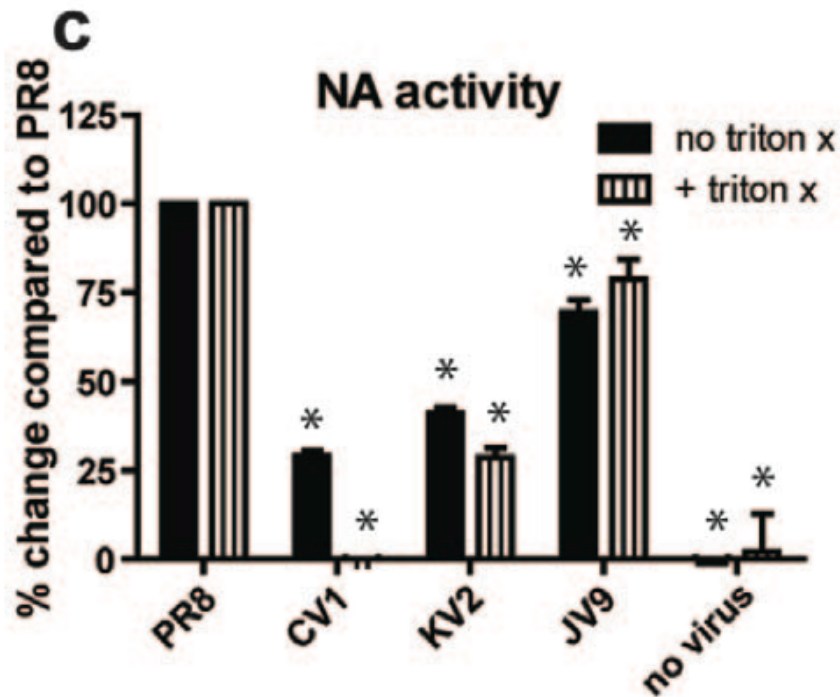
# Why consider no cost to resistance?

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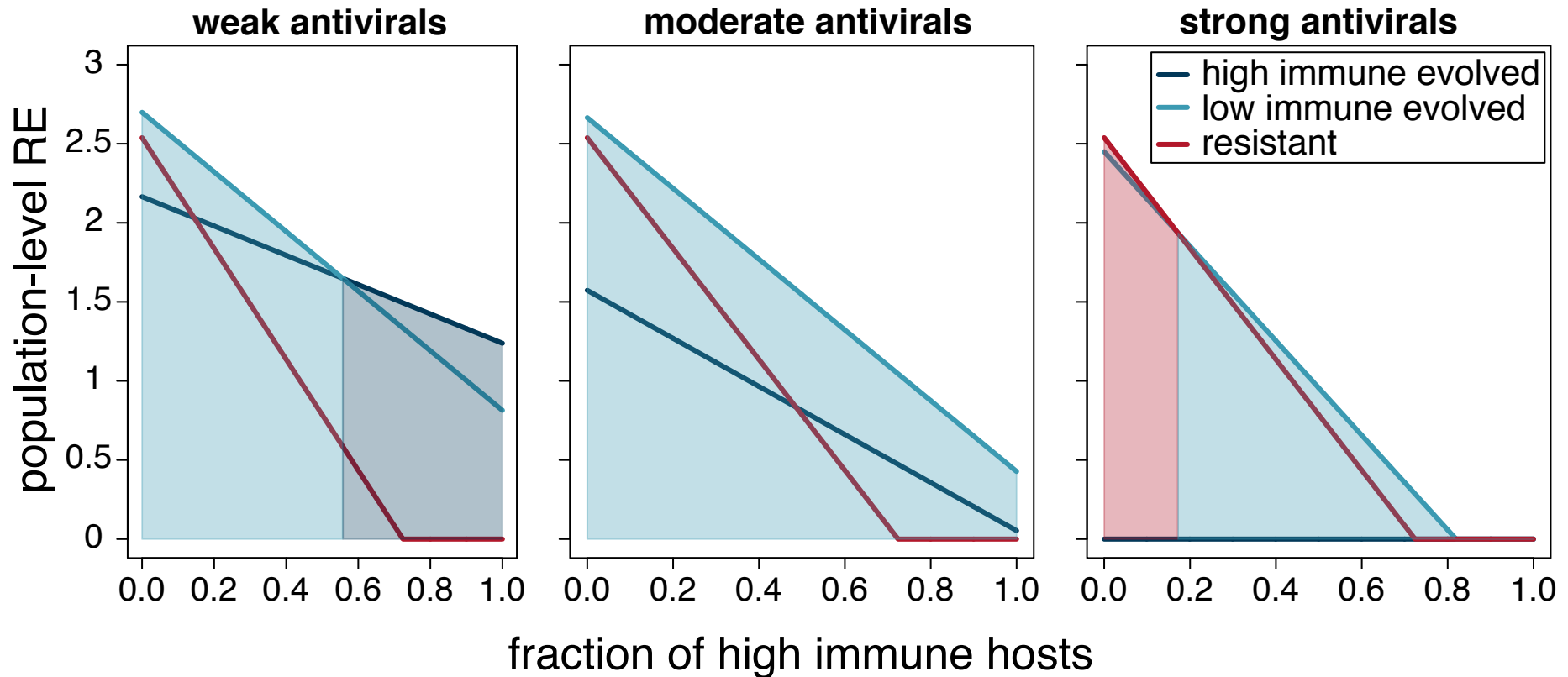


**Figure 1 | Oseltamivir resistance does not affect viral replication in human tracheobronchial epithelial cells.** Differentiated human tracheobronchial epithelial cells were infected with rSH/1 (squares) or rSH/1:AH/1-NA (triangles) viruses, at an MOI of 0.01, at either 33 °C (dashed line) or 37 °C (solid line). At 8, 24, 48 and 72 h post infection, cells were washed with PBS/BSA and the concentration of virus in each wash sample was determined by standard plaque assay on MDCK cells. The hTBE growth curves were performed in triplicate. Error bars represent s.d.

# Compensatory change 1: Hemagglutinin

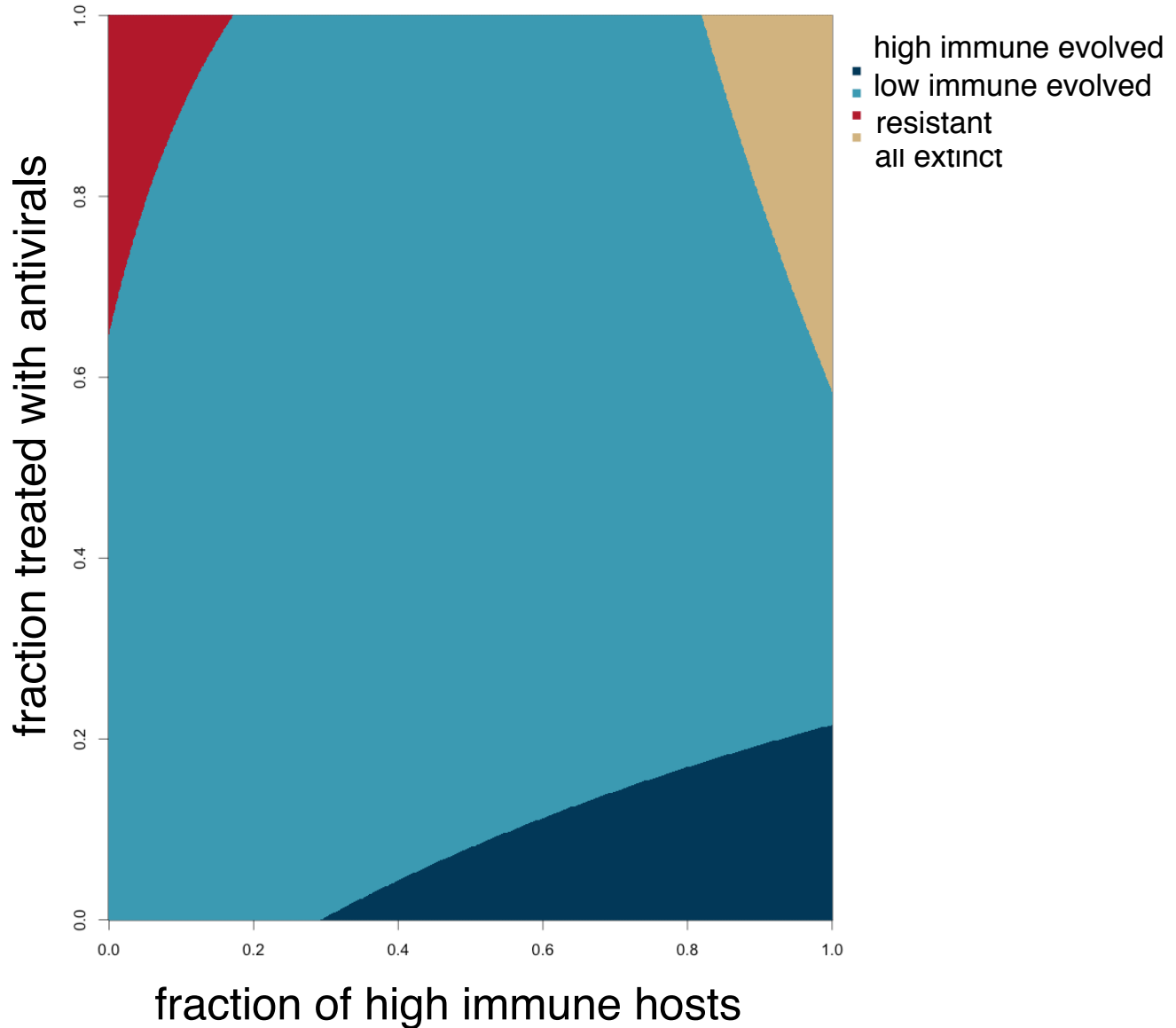


# Compensatory change 1: Hemagglutinin



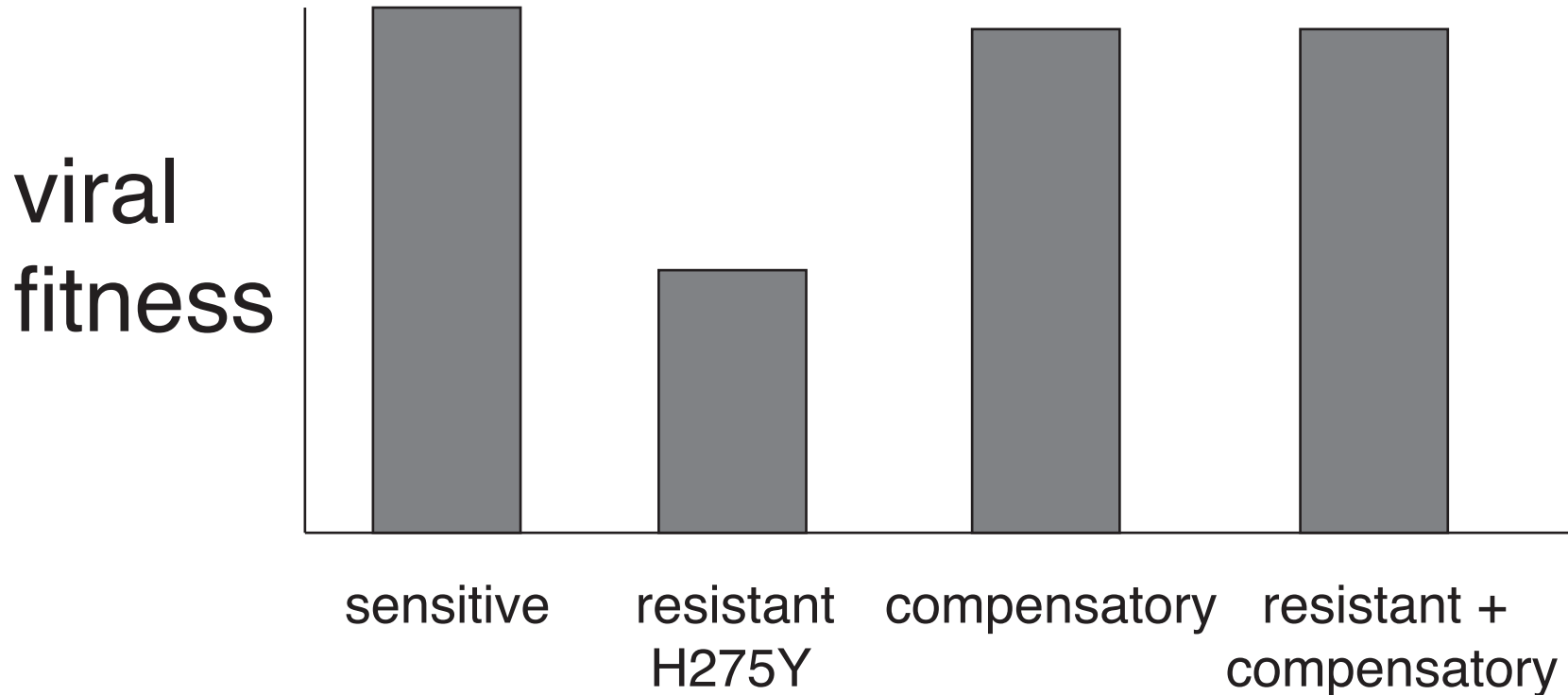
# Compensatory change 1: Hemagglutinin

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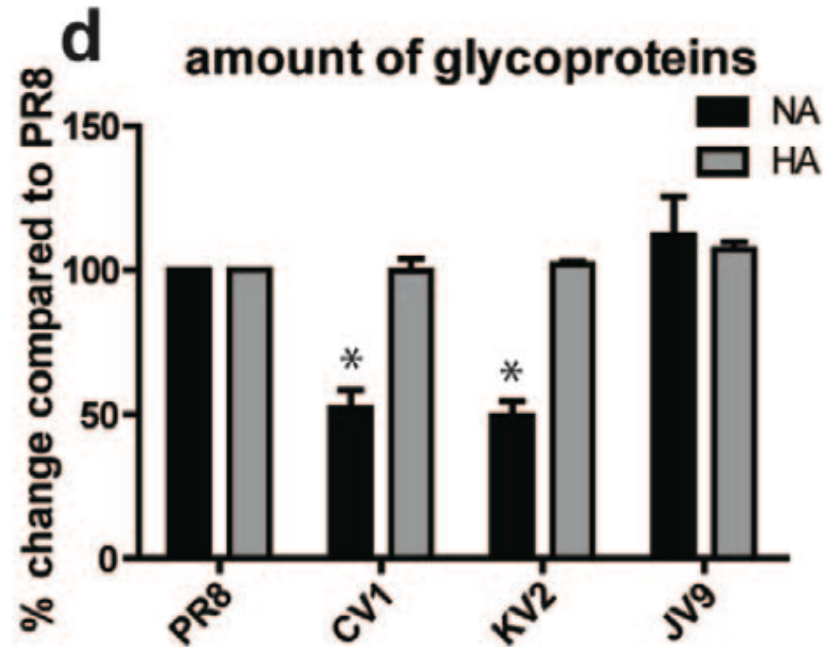
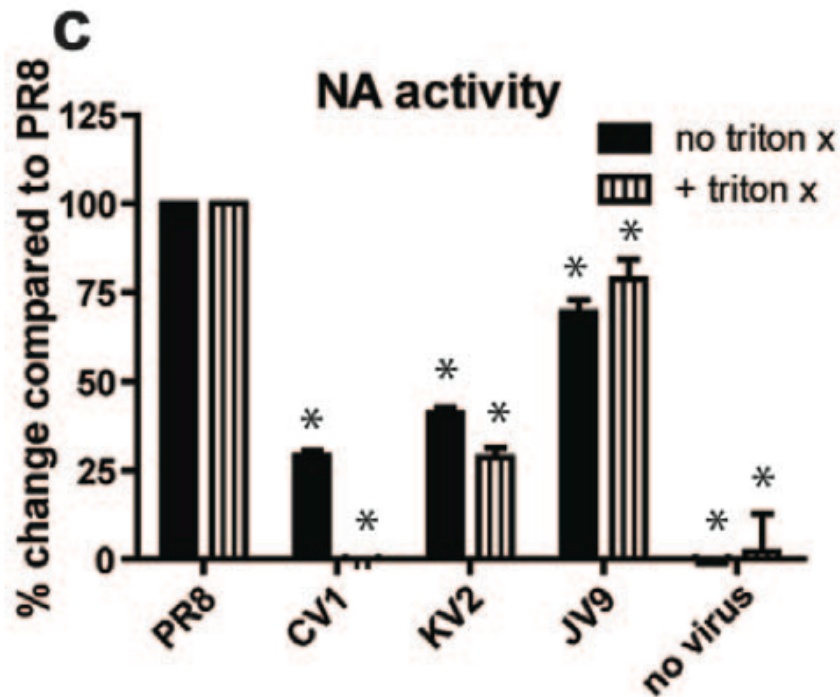
# Compensatory change 2: Neuraminidase

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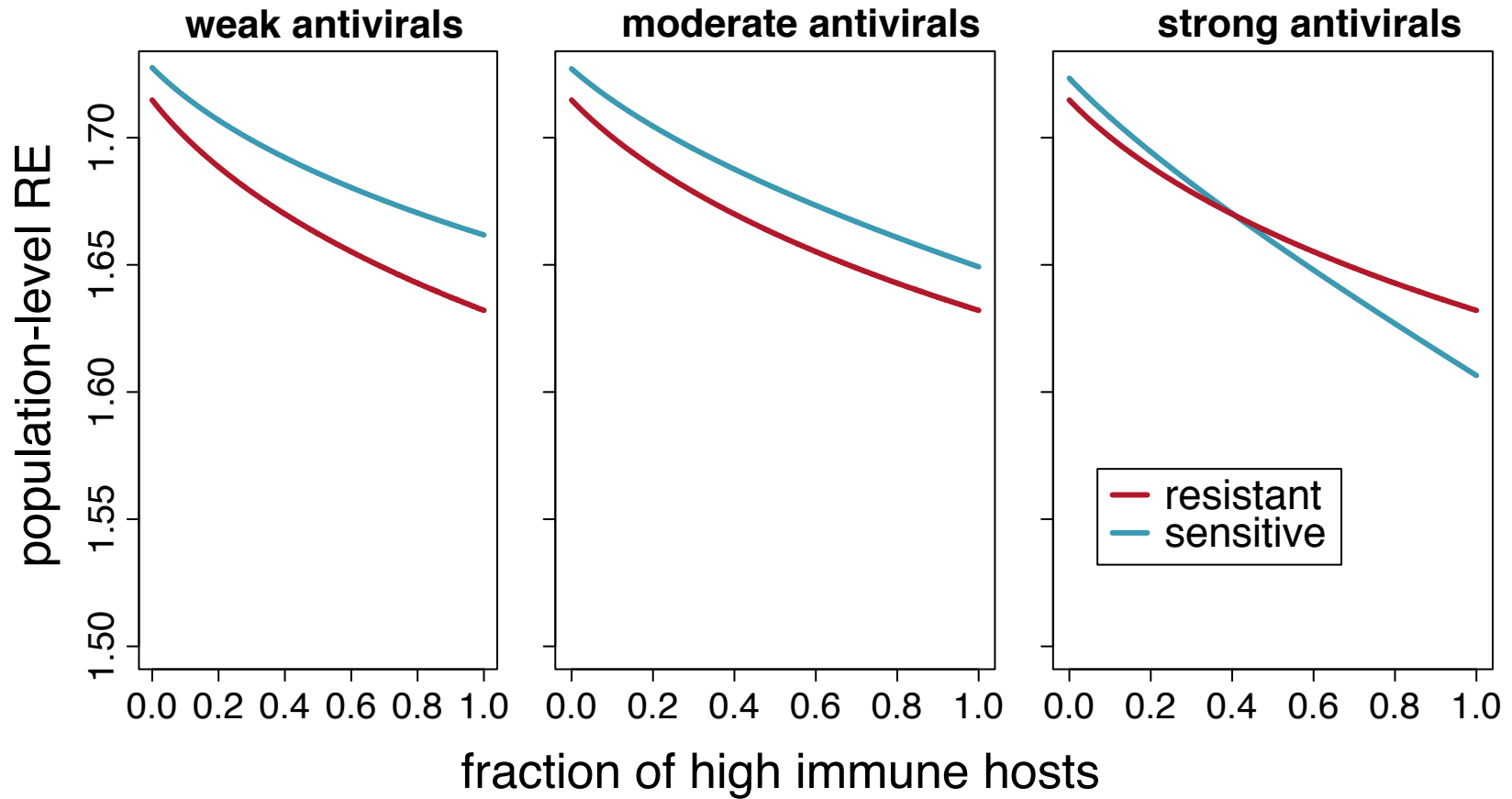
modified from  
Butler et al. 2014

# Compensatory change 2: Neuraminidase



# Compensatory change 2: Neuraminidase

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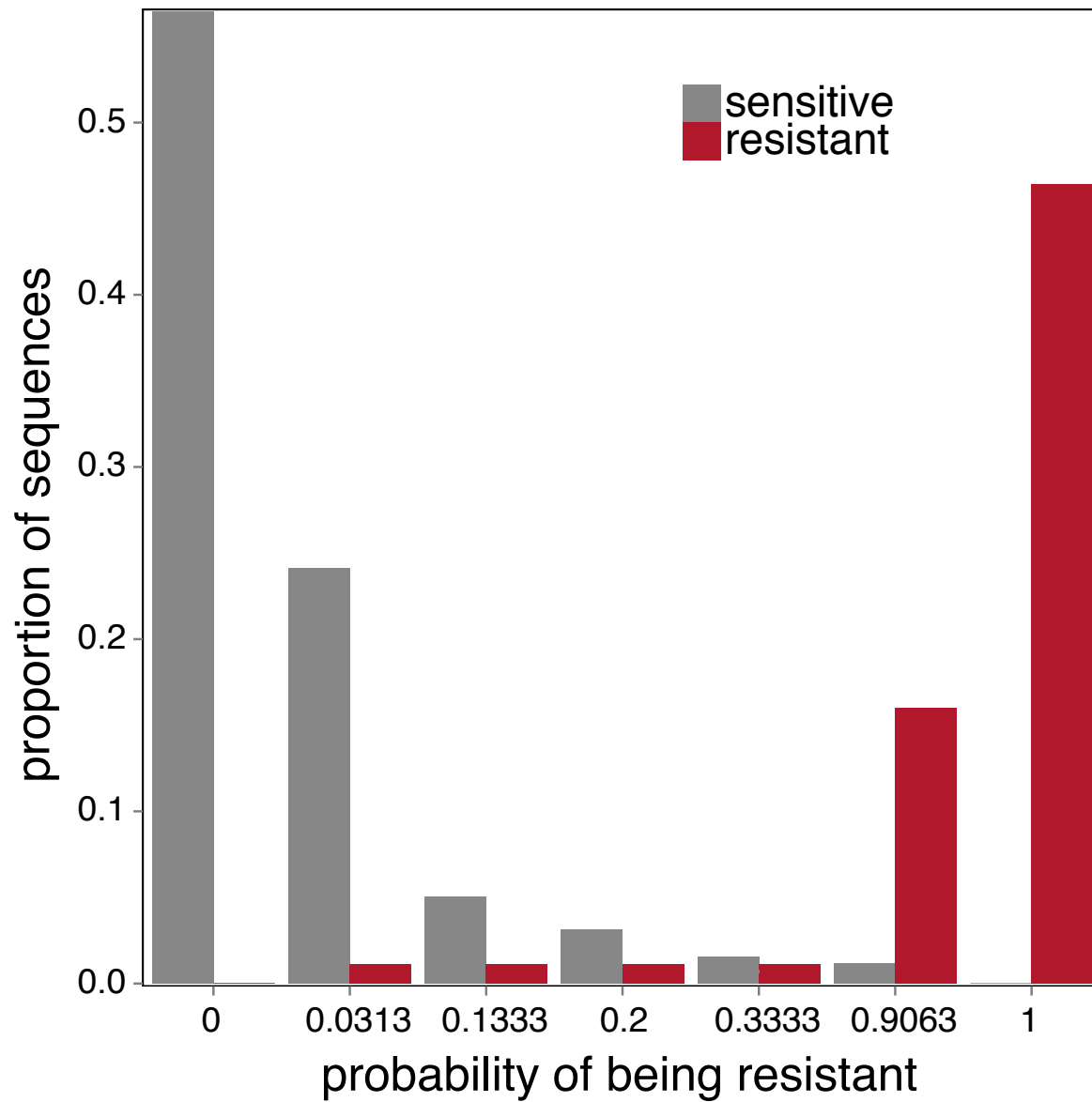


# Variation in resistance mutations

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# Variation in resistance mutations

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# Conclusions

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# Questions?

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