

Model-based optimization of vaccine inoculum dose

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Motivation

- ▶ The inoculum dose (live pathogen or antigen) is important.
- ▶ Common assumptions:
 - Higher dose leads to more symptoms and more severe outcomes (e.g. LD50).
 - Higher dose induces a stronger immune response and creates more immune memory.
- ▶ Overall goal: Investigate those assumptions and study the impact of dose, with a focus on vaccines.

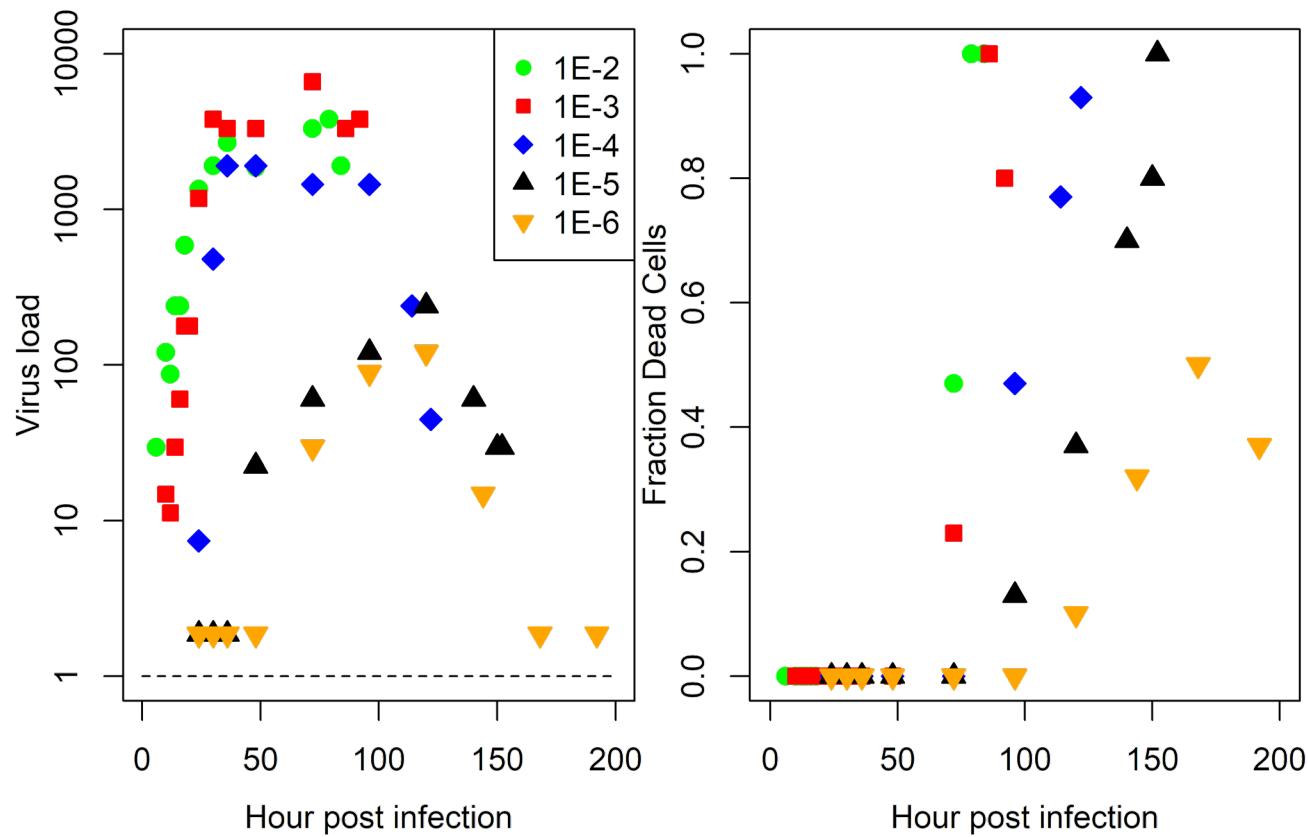
Previous Work

Handel et al 2018 PLoS Comp Bio
(also Li and Handel 2014 JTB, won't talk about it)

Project Aim

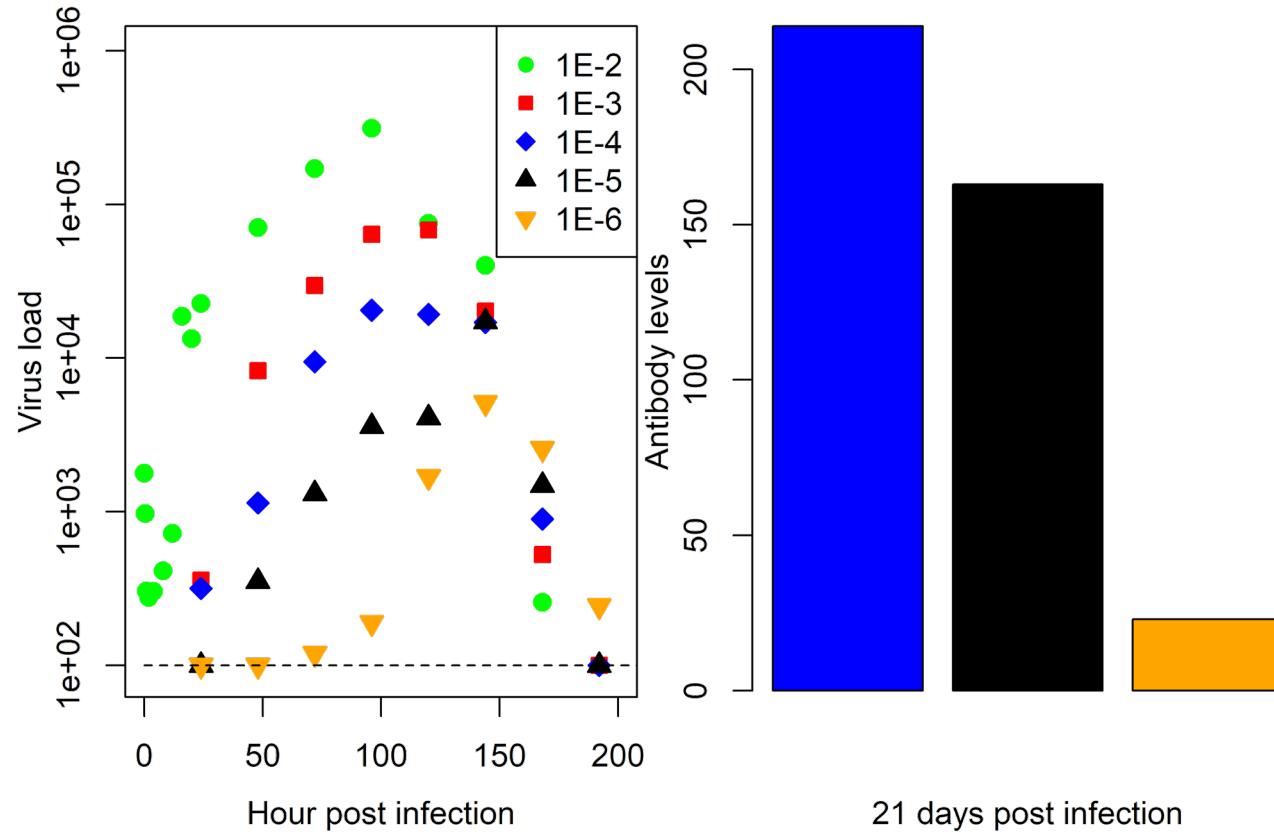
- ▶ Build a framework combining data with models to investigate the impact of inoculum dose on immune response and morbidity/symptoms.
- ▶ Illustrate how to use new framework to predict outcomes (immune response and morbidity) for a large range of inoculum doses.
- ▶ Show how one can use the framework to optimize vaccine dose.

Data I



- Influenza A virus (IAV) infection in mice (Ginsberg et al 1952, JEM)
- Left: Virus load for 5 inoculum doses, average of several animals per dose. Right: fraction lung damage.

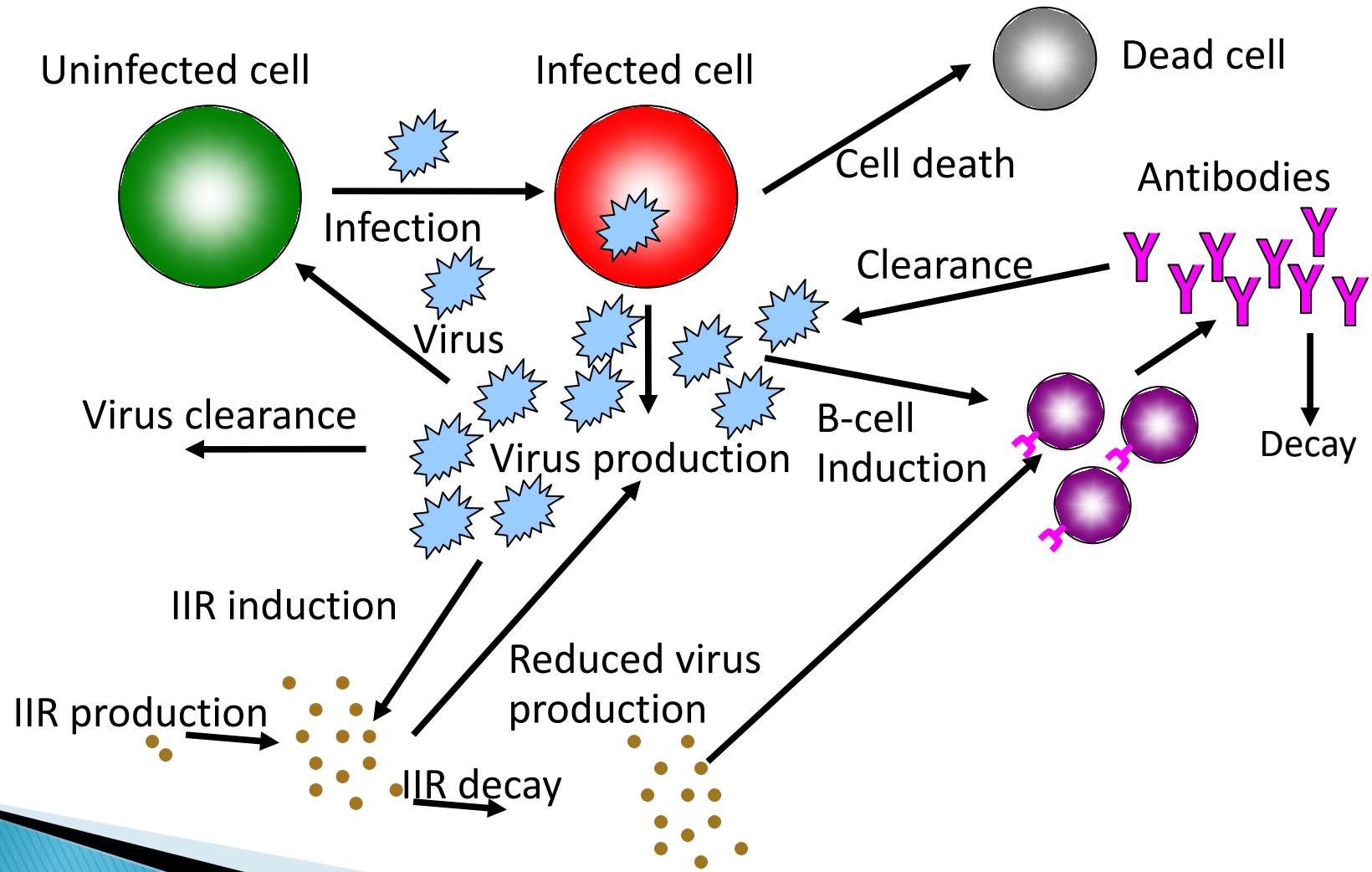
Data II



- ▶ HPIV infection in cotton rats (Ottolini et al JGV 1996)
- ▶ Left: Virus load for 5 inoculum doses, average of several animals per dose.
Right: Antibody increase at end of infection for the 3 lowest doses.
- ▶ For more/similar data, see: Li & Handel 2014 JTB (or ask me).

Model diagram

- ▶ A model with innate (IIR) and adaptive (B cell/antibody) immune response.



Model equations

Uninfected cells

$$\dot{U} = -bUV$$

Infected cells

$$\dot{I} = bUV - d_I I$$

Dead cells

$$\dot{D} = d_I I$$

Virus

$$\dot{V} = \frac{p}{1+s_F F} I - d_V V - k_A A V - b_p U V$$

Innate Response

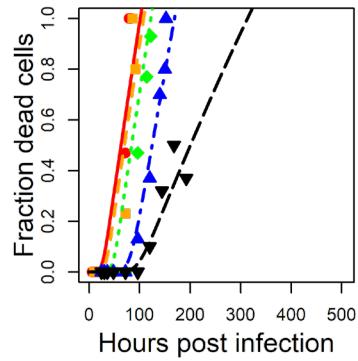
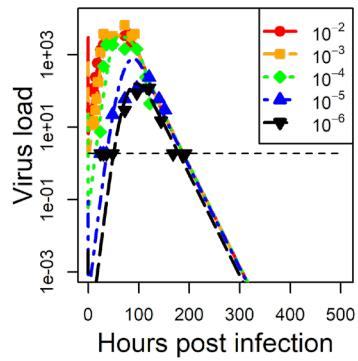
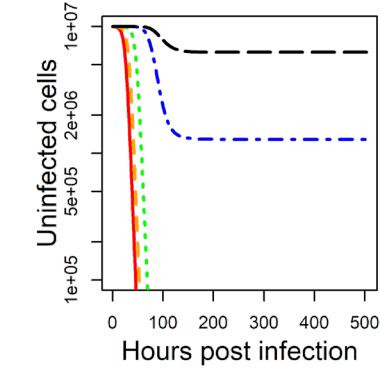
$$\dot{F} = p_F + g_F \frac{V}{V+h_V} (F_{max} - F) - d_F F$$

B-cells

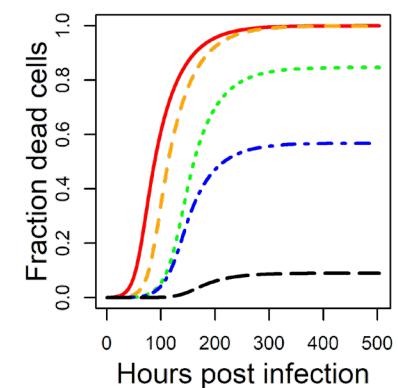
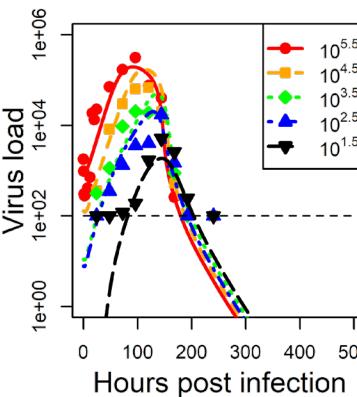
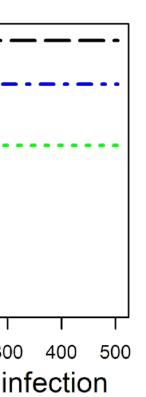
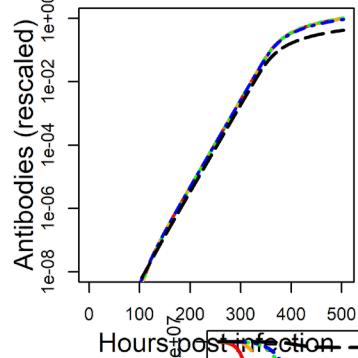
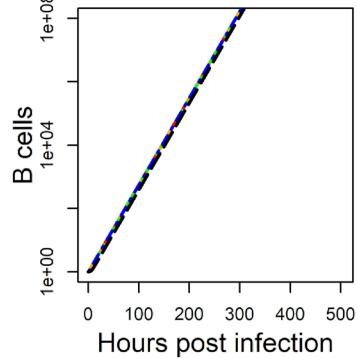
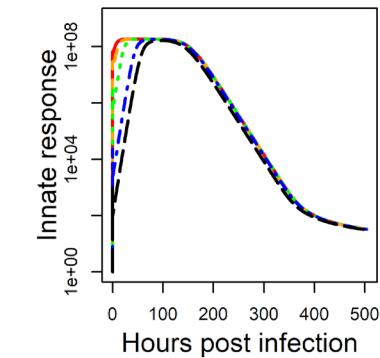
$$\dot{B} = \frac{FV}{FV+h_F} g_B B$$

Antibodies

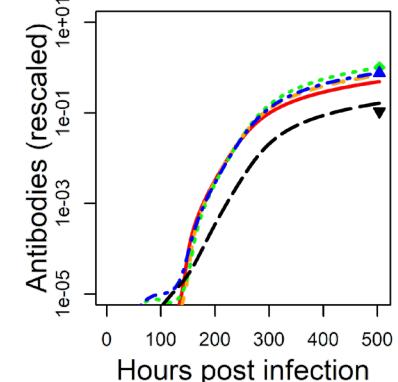
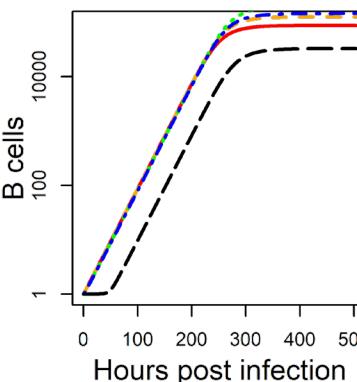
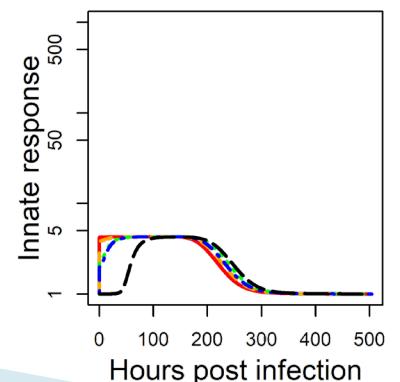
$$\dot{A} = r_A B - d_A A - k_A A V$$



Influenza



HPIV



Immunity and Morbidity as function of Inoculum

- ▶ We want to know immune protection and morbidity as function of dose.
- ▶ We can map antibodies (A) to protection (P) and innate response (F) to morbidity (M).

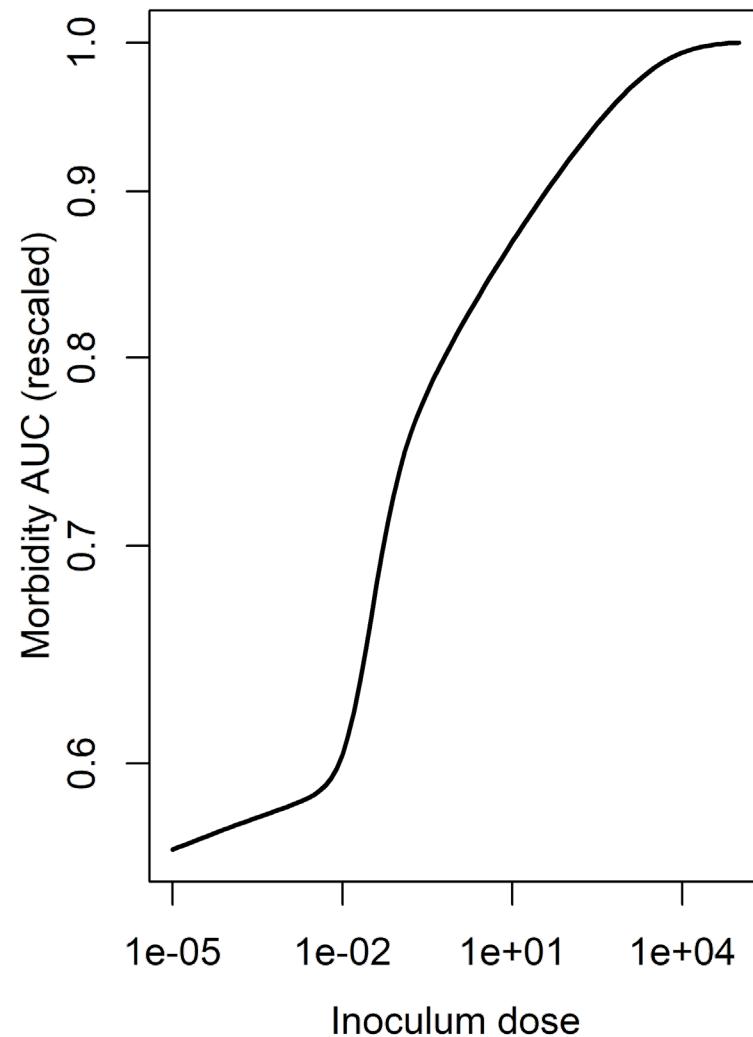
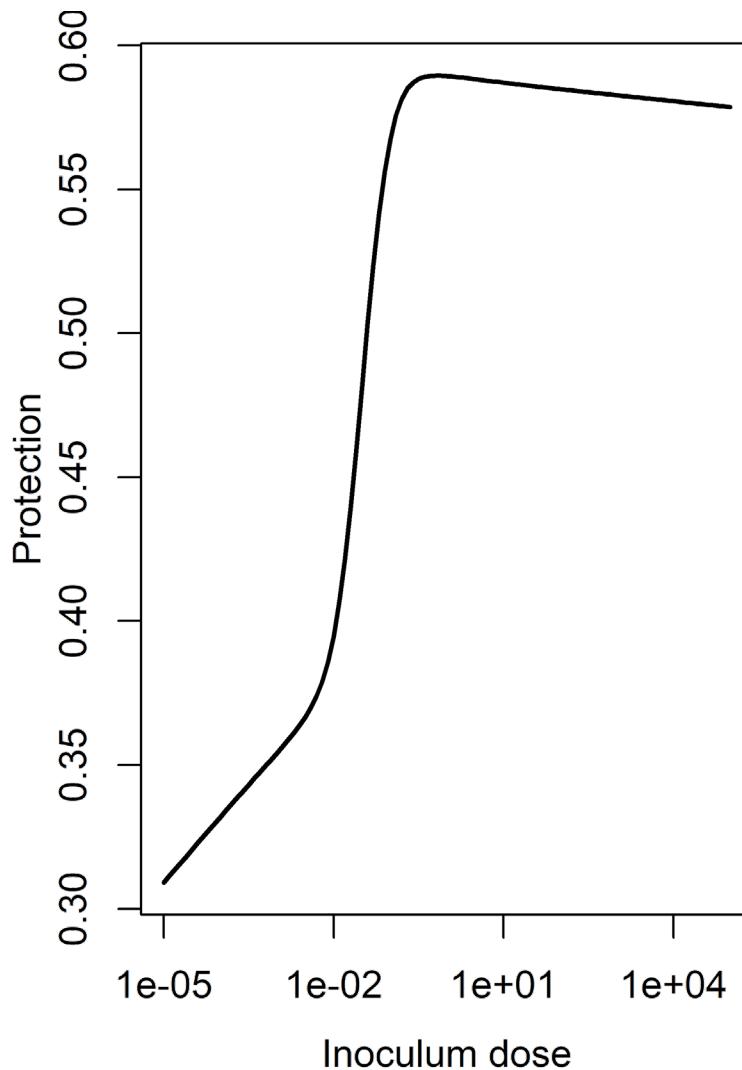
$$P = 1 - \frac{1}{1 + e^{k_1(\log(A) - k_2)}}$$

Coudeville et al 2010 BMC Med Res Meth

$$M = \int \frac{a F^c}{b + F^c}$$

Hayden et al 1998 JCI

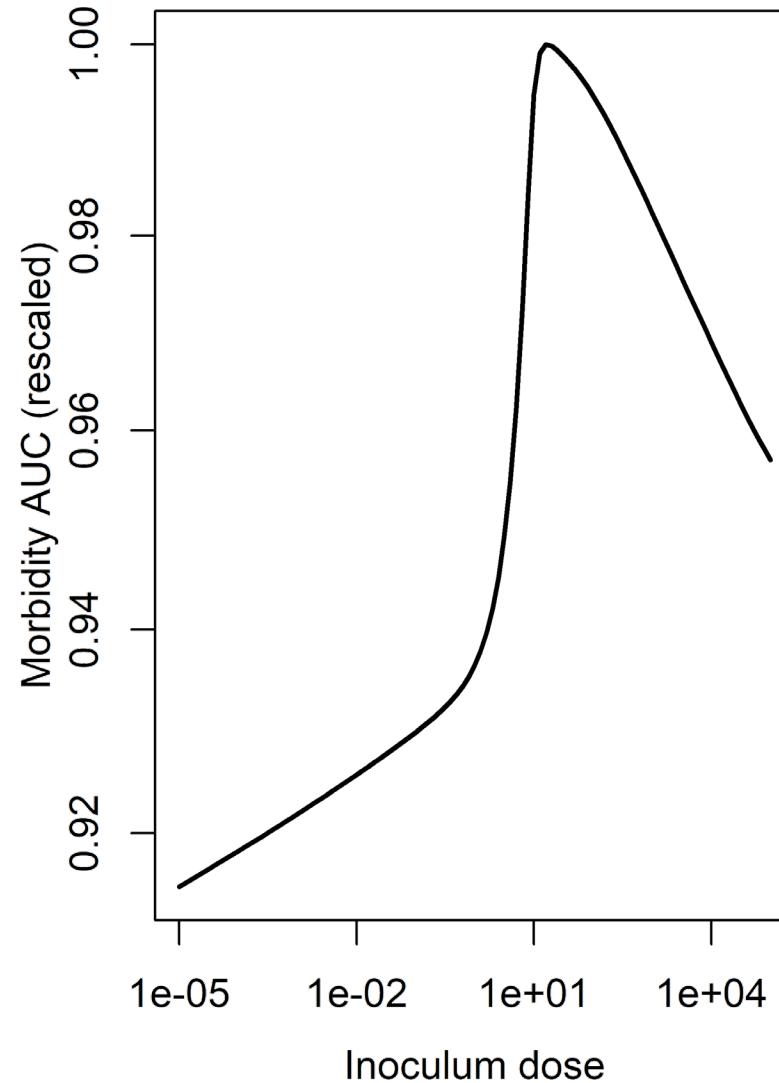
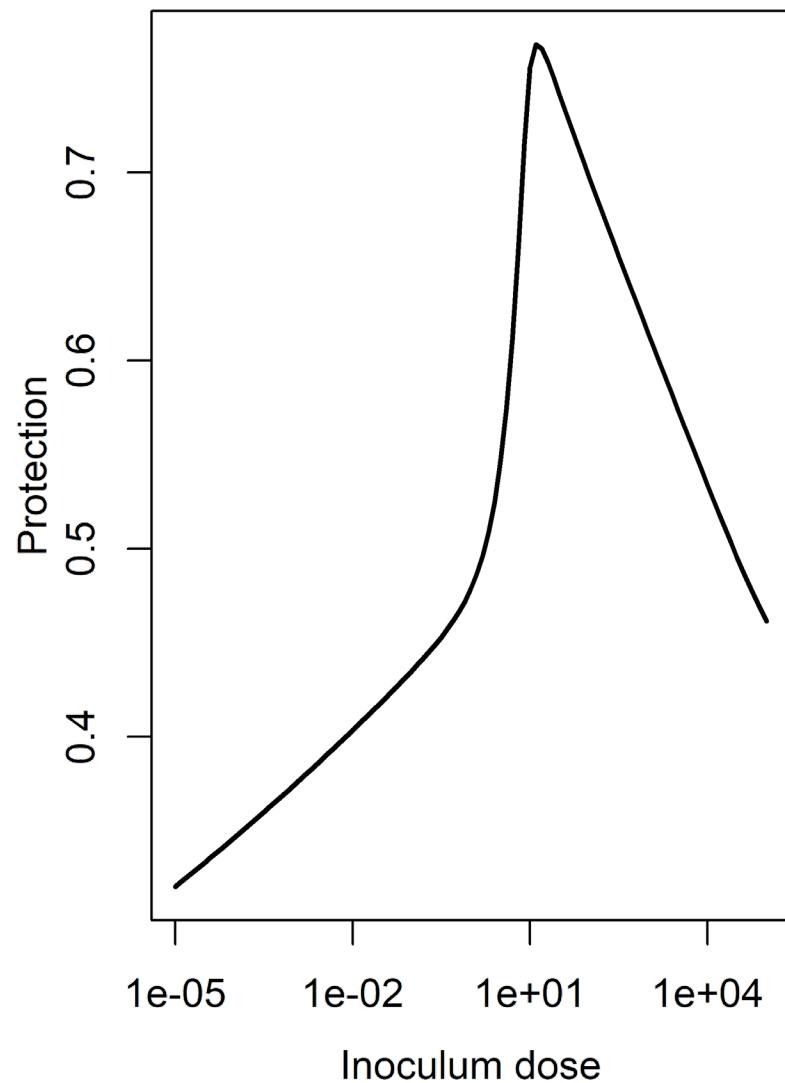
Impact of inoculum on immunity/morbidity - flu



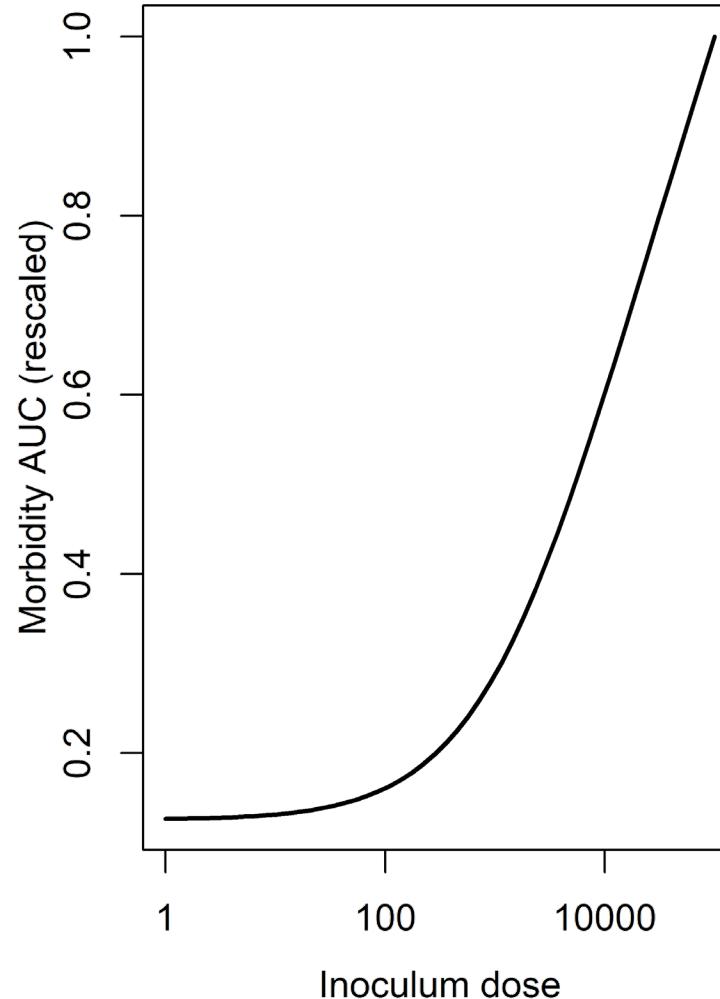
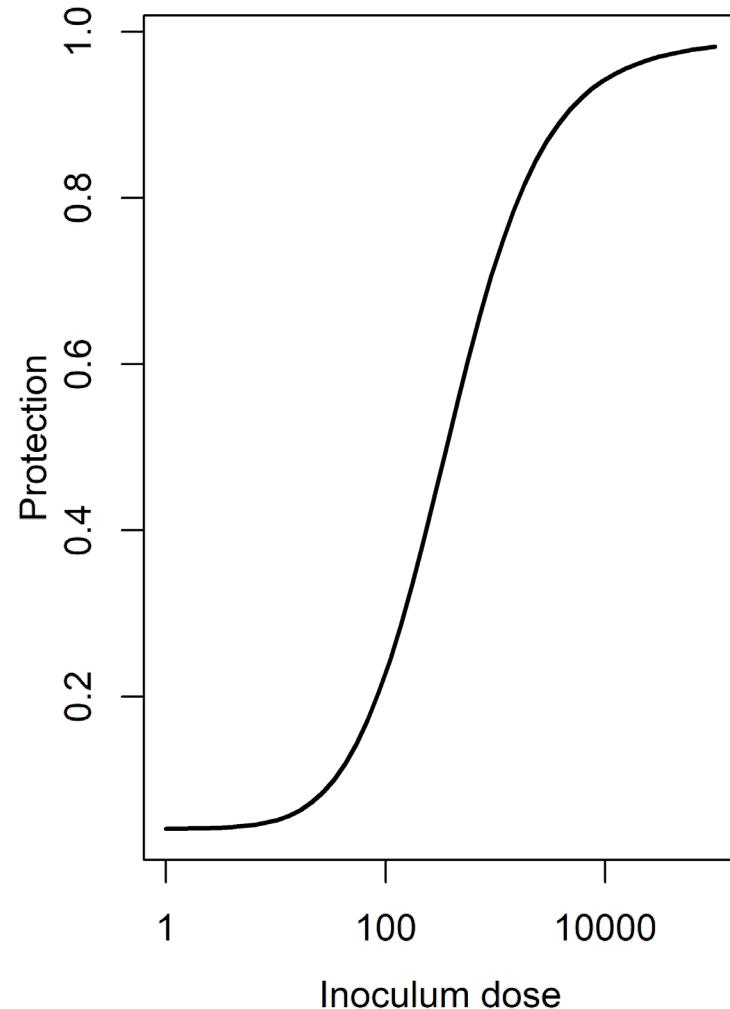
$$P = 1 - \frac{1}{1 + e^{k_1(\log(A) - k_2)}}$$

$$M = \int \frac{aF^c}{b + F^c}$$

Impact of inoculum on immunity/morbidity - HPIV



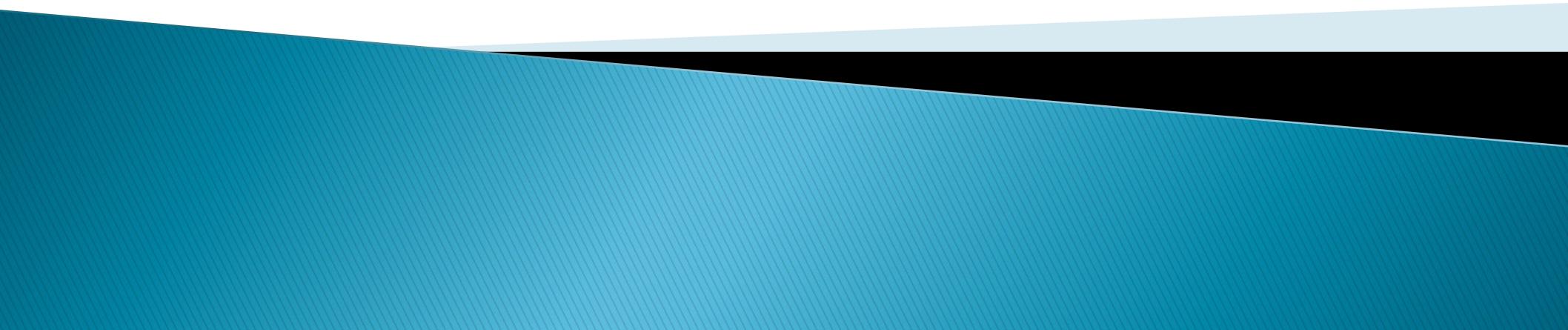
Impact of inoculum on immunity/morbidity - vaccine



Summary so far

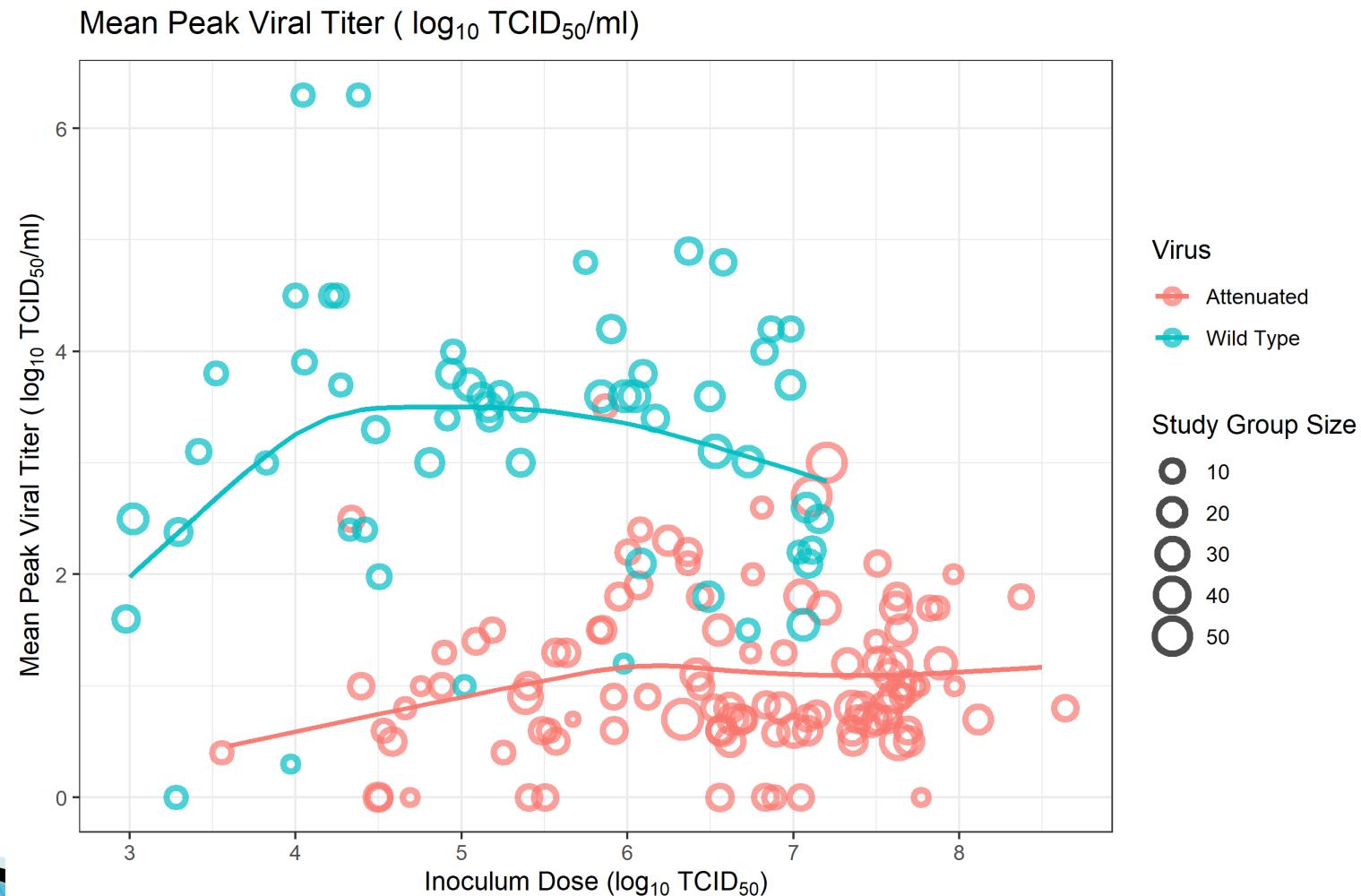
- ▶ We proposed a framework that combines data and models to study the impact of dose.
- ▶ We used animal data to show how this framework could be applied.
- ▶ With this framework, one could potentially determine important outcomes for any dose and pick the optimal dose based on those considerations.
- ▶ The data was not too meaningful and thus results can only be considered conceptual.

Current work



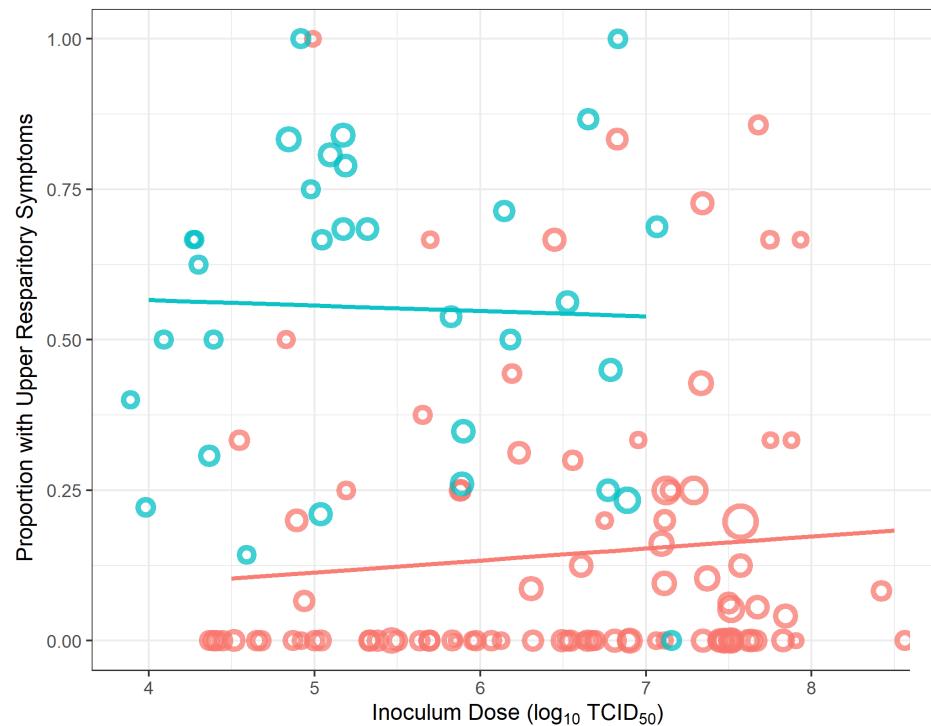
Human influenza challenge studies

- ▶ Systematic review of human challenge studies (similar to Carrat et al 2008).

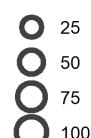


Human influenza challenge studies

Proportion Upper Respiratory Symptoms



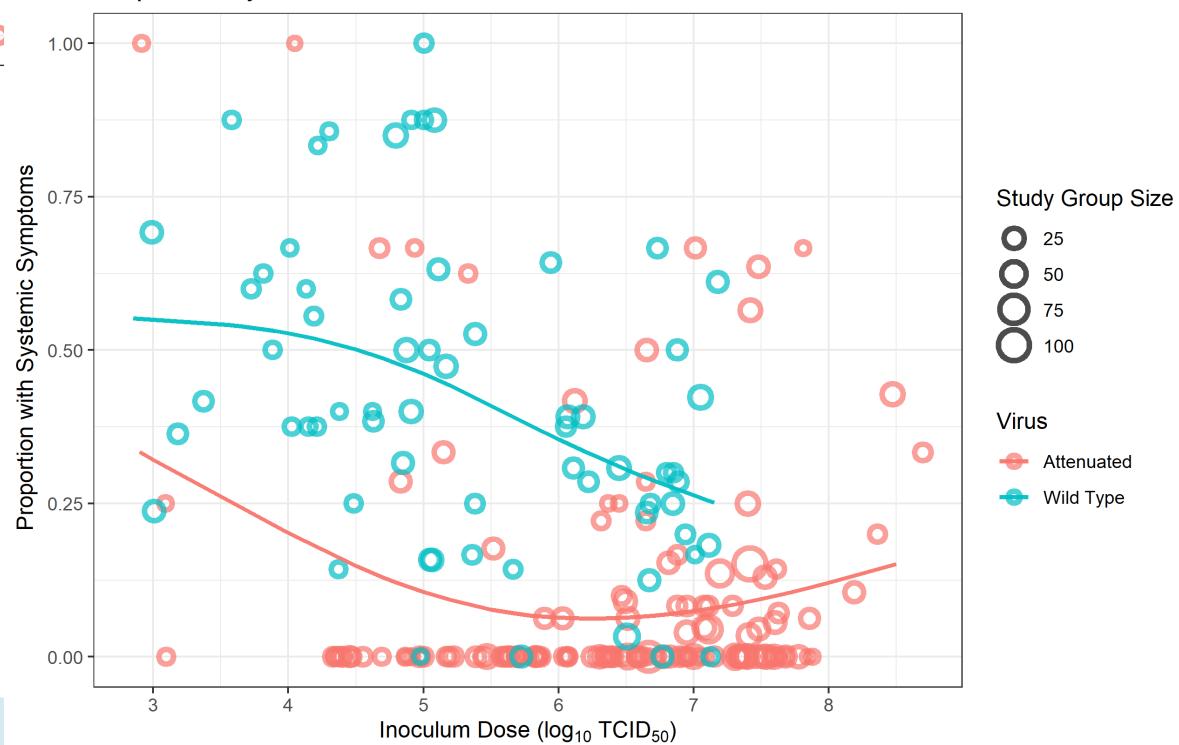
Study Group Size



Virus



Proportion Systemic



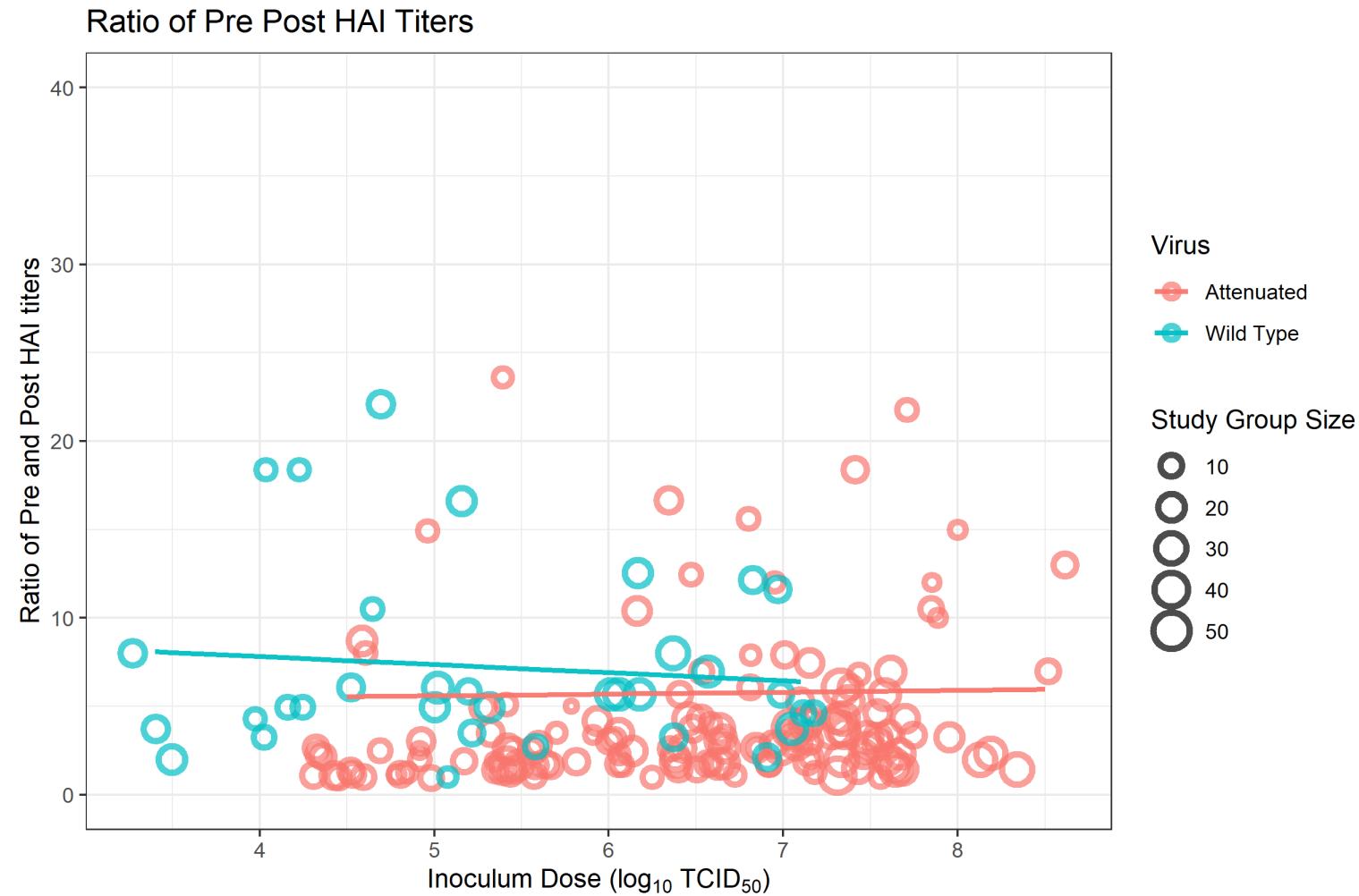
Study Group Size



Virus

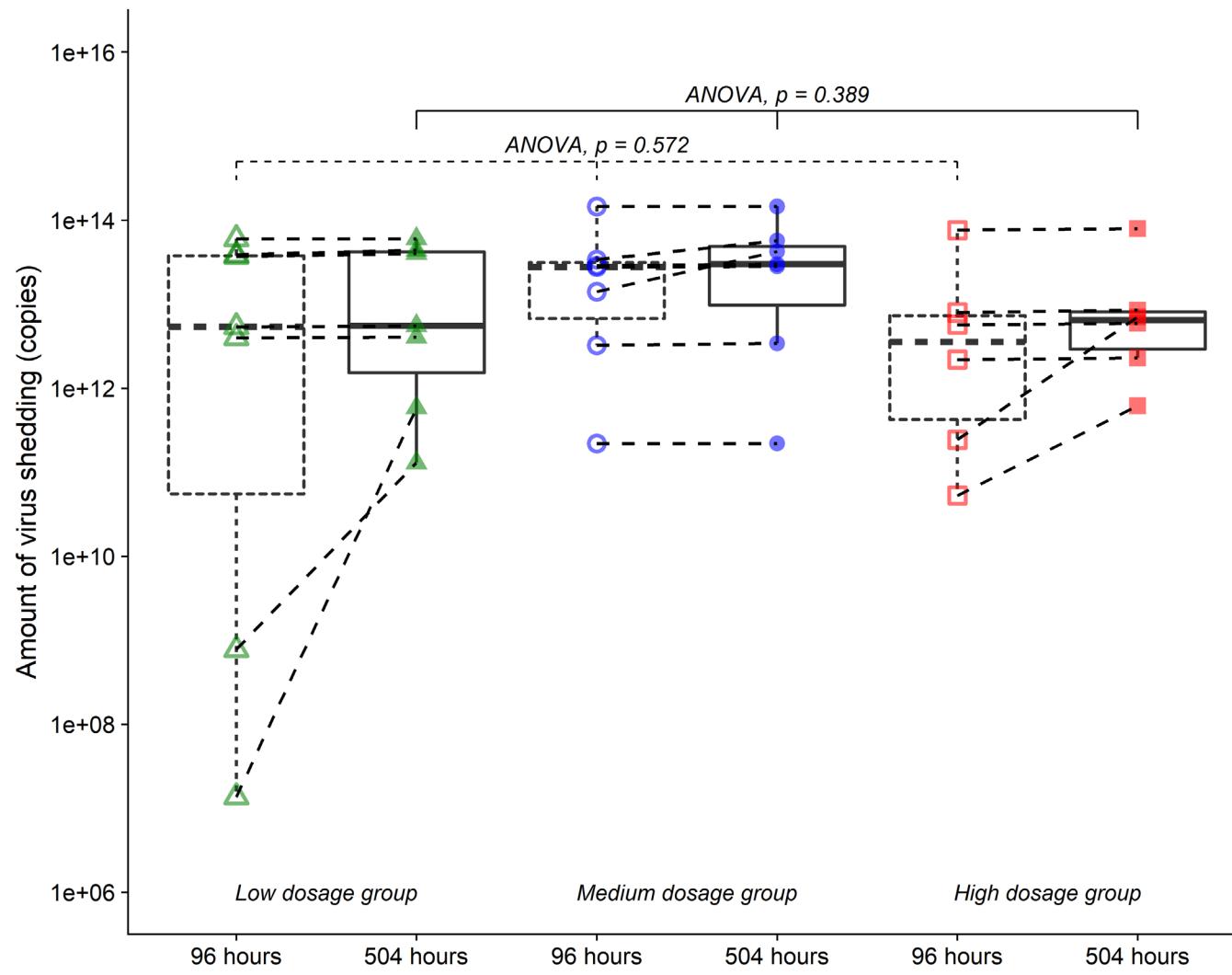


Human influenza challenge studies



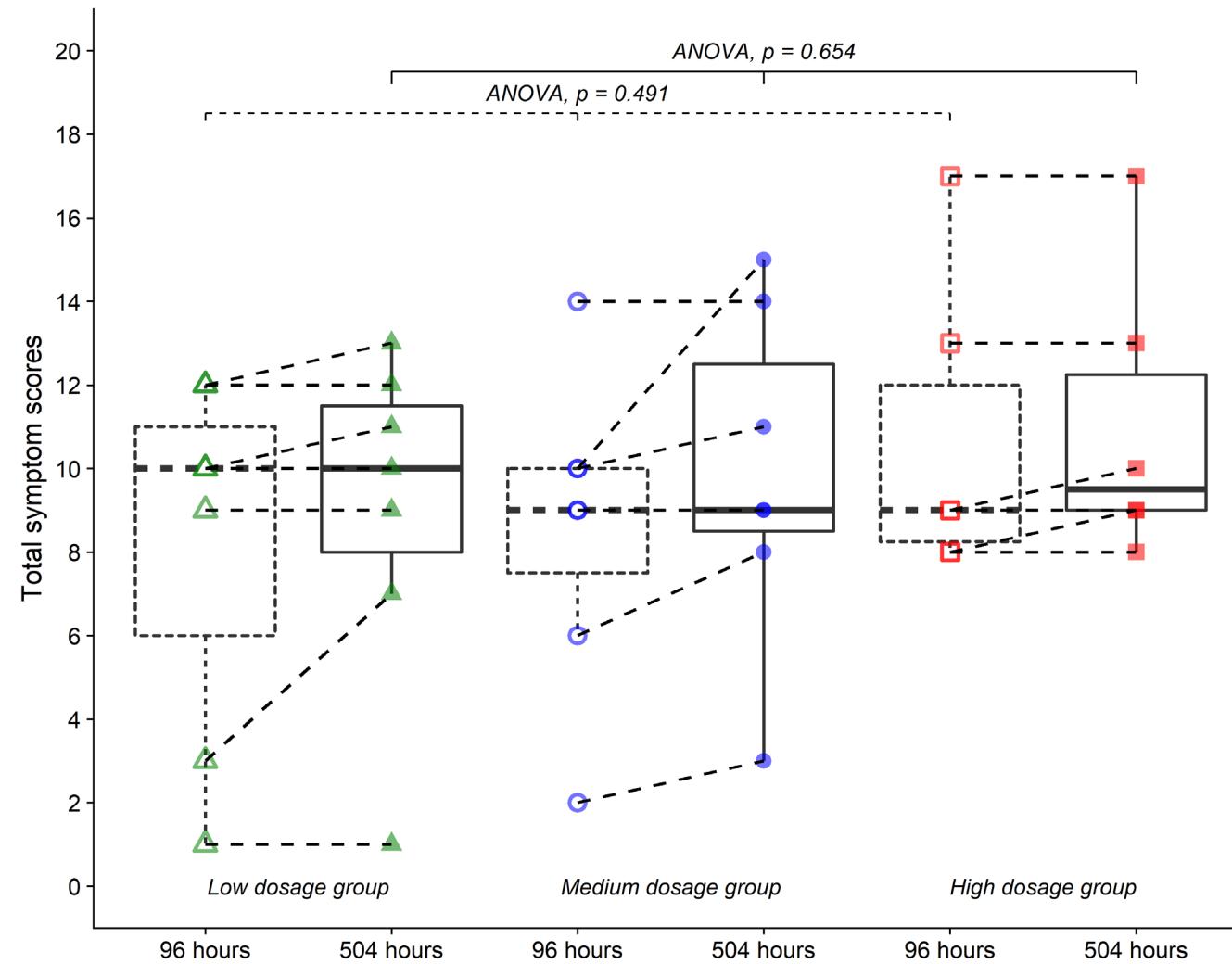
Human norovirus challenge studies

- ▶ Individual patient data from a human norovirus challenge study.



Human norovirus challenge studies

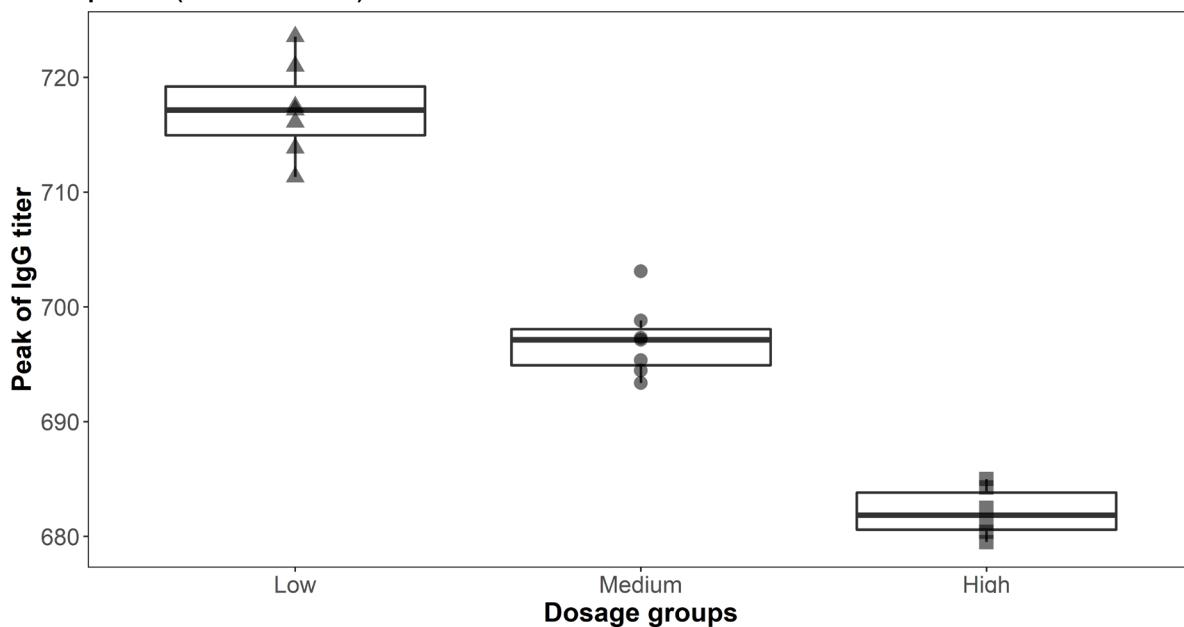
- ▶ Individual patient data from a human norovirus challenge study.



Human norovirus challenge studies

Peak of IgG titer predicted by model

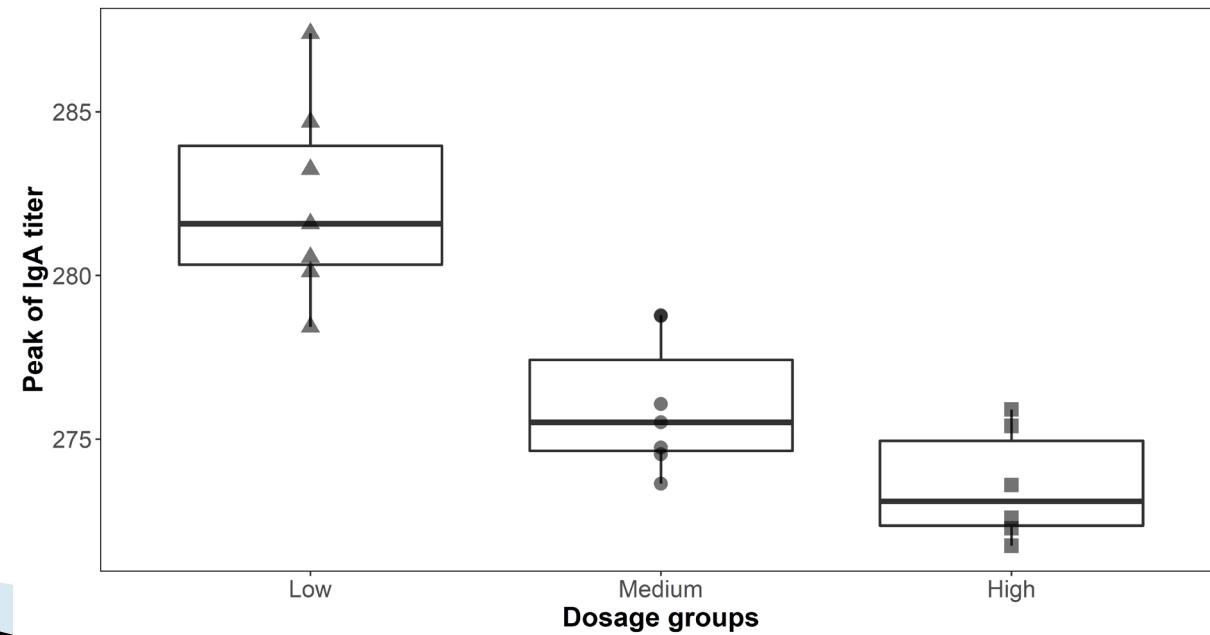
p-value (High vs Low) < 0.01 *
p-value (Medium vs Low) < 0.01 *



IgG peak titer

Peak of IgA titer predicted by model

p-value (High vs Low) < 0.01 *
p-value (Medium vs Low) < 0.01 *



IgA peak titer

Future work

- ▶ Human norovirus vaccine candidate studies
 - Individual patient data from phase 1+2 trials of a norovirus vaccine candidate (thanks to Takeda). Infections at 3 different doses, killed vaccine, larger sample size.
- ▶ Influenza animal studies
 - Impact of dose on infection of a live attenuated vaccine in ferrets (Mark Tompkins).
- ▶ Human influenza studies
 - Existing data from individuals receiving either regular or high-dose influenza vaccine (Ted Ross).
 - New data as part of a large “Universal” influenza vaccine project. (Ted Ross, Stacey Schultz-Cherry, and 40 (or so?) co-Investigators).

Acknowledgements

- ▶ This work was done with the following collaborators



Yan Li



Brian McKay



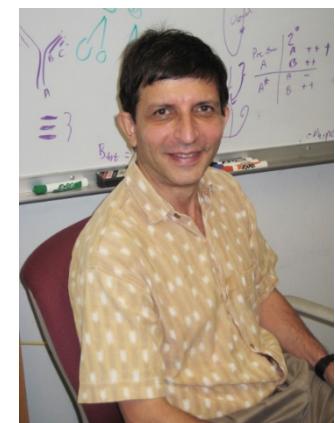
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Kasia Pawelek



Veronika Zarnitsyna



Rustom Antia

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