

# Capturing variation in infectivity from binary disease data

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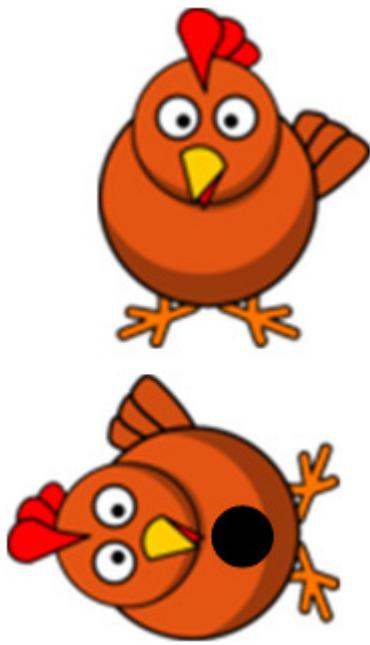
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# Introduction



- Genetic analyses of disease data often show low heritabilities.
  - Caused by missing variation in infectivity?
- Infectivity = propensity of transmitting infection upon contact with a susceptible individual
- Evidence on impact of super-spreaders from e.g. SARS (Shen et al., 2004).
- Difficult to measure directly
  - Observed in group-mates
- Infectivity is an associative effect.



# Associative effects



- Classically,  $P_i = A_i + E_i$  (Falconer and Mackay, 1996).
- **Associative effect:** phenotypes of other individuals which affect the analysed trait
  - Part of associative effect may be additive genetic and therefore subject to selection.

$$\begin{aligned} P_i &= A_{D,i} + E_{D,i} + \sum_{j=1}^{n-1} P_{S,j} & j \neq i \\ &= A_{D,i} + E_{D,i} + \sum_{j=1}^{n-1} (A_{S,j} + E_{S,j}) & \text{(Griffing, 1967)} \end{aligned}$$



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# Associative effects



Variance	Expected	Conventional	Associative
Susceptibility	20.39	18.28	19.55
Infectivity	9.20	/	3.87

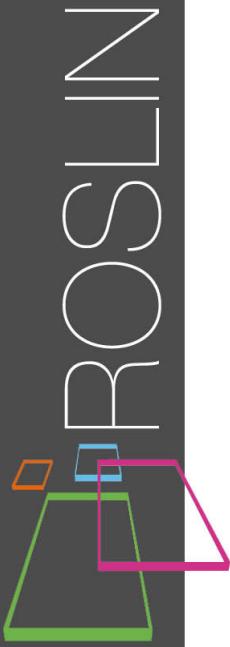
Values scaled by  $10^3$

(Lipschutz-Powell et al., Proc. WCGALP 2010 & under review)

- Developed for static traits



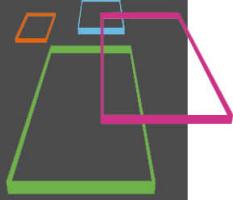
# Hypothesis



The accuracy and impact of an associative effects model, when used to analyse binary disease data, may be improved by extending it to allow for dynamics of disease.



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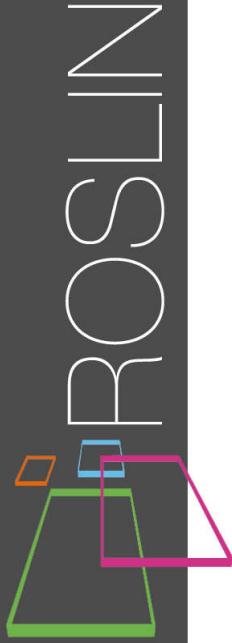
# Materials & Method



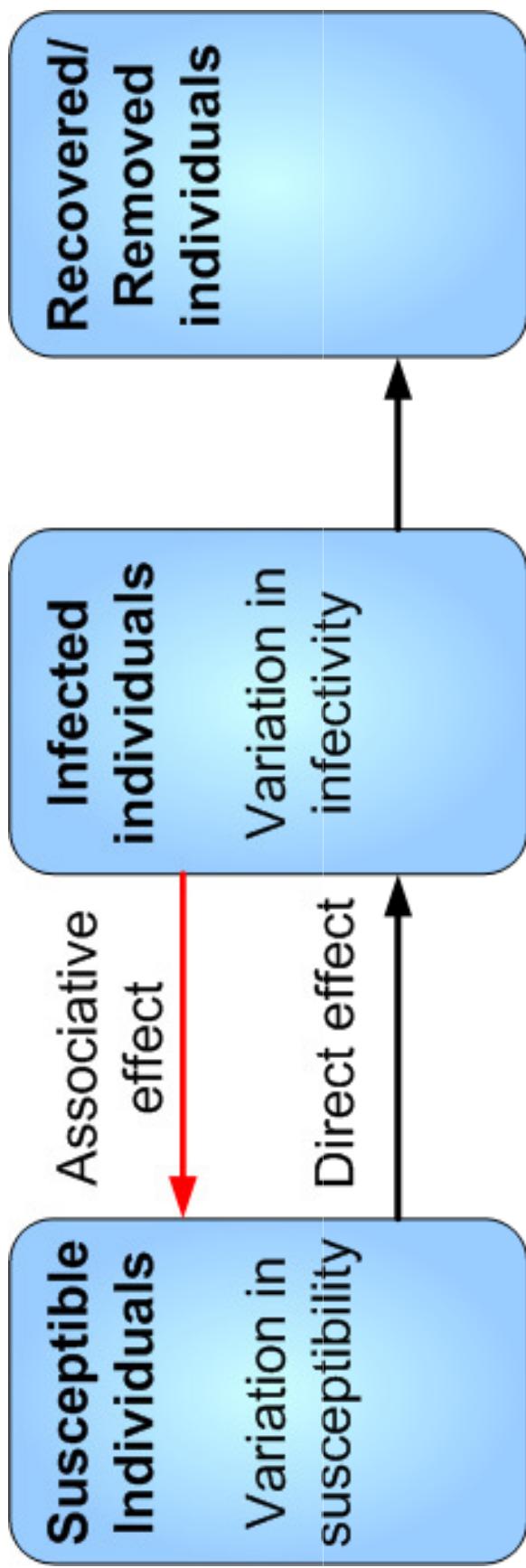
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# Disease Data



Simulation of epidemic using a stochastic model

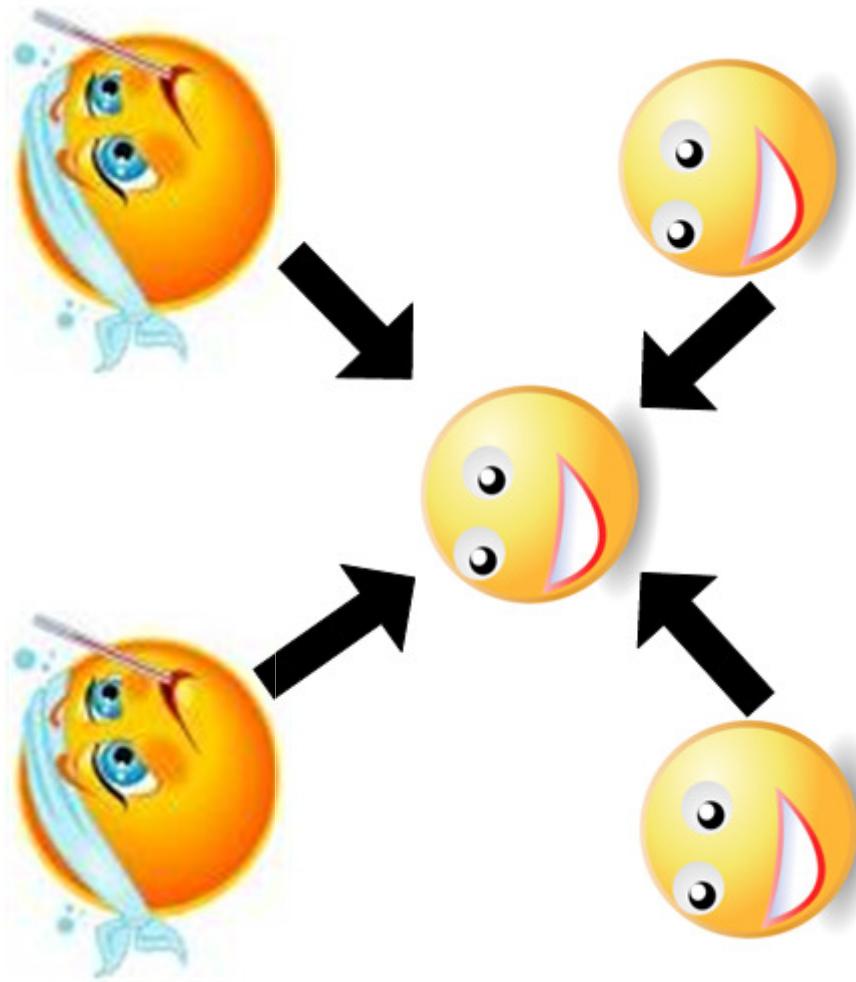


Assumed infectivity and susceptibility independent

## Method - Analyses

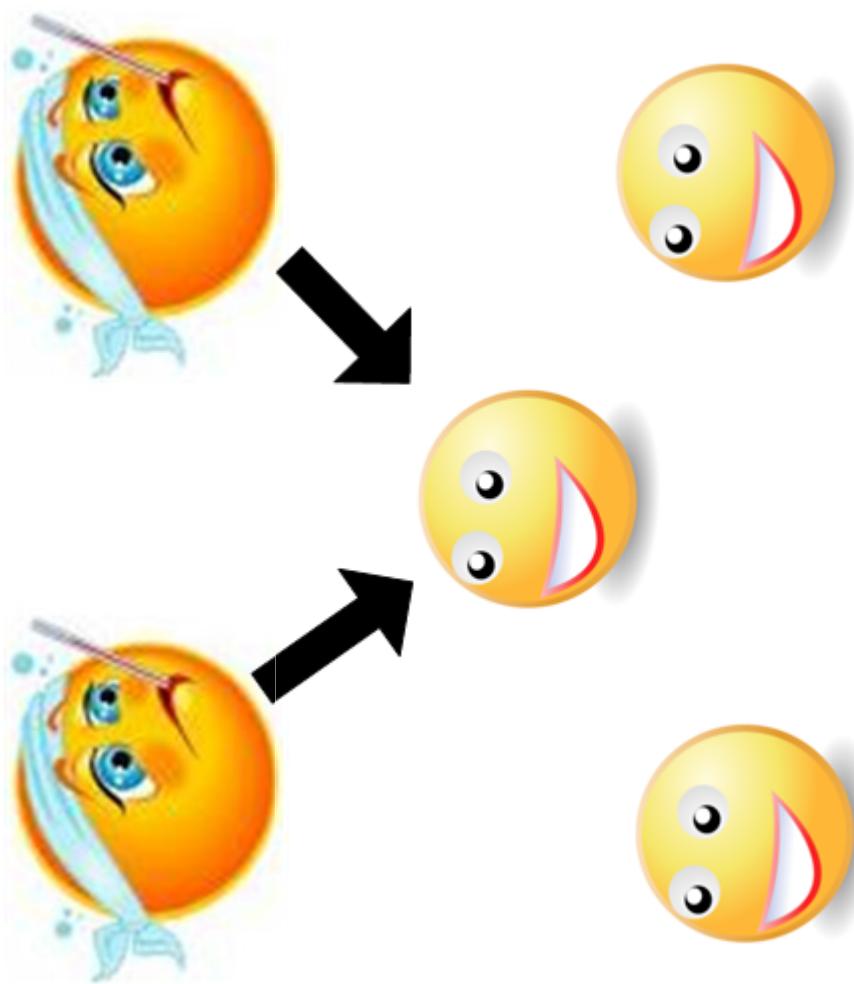
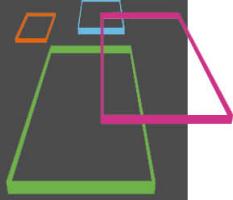
- All genetic analyses were carried out using ASReml (Gilmour 2006)

Standard model



# Method - Analyses

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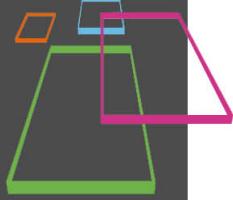
Case model



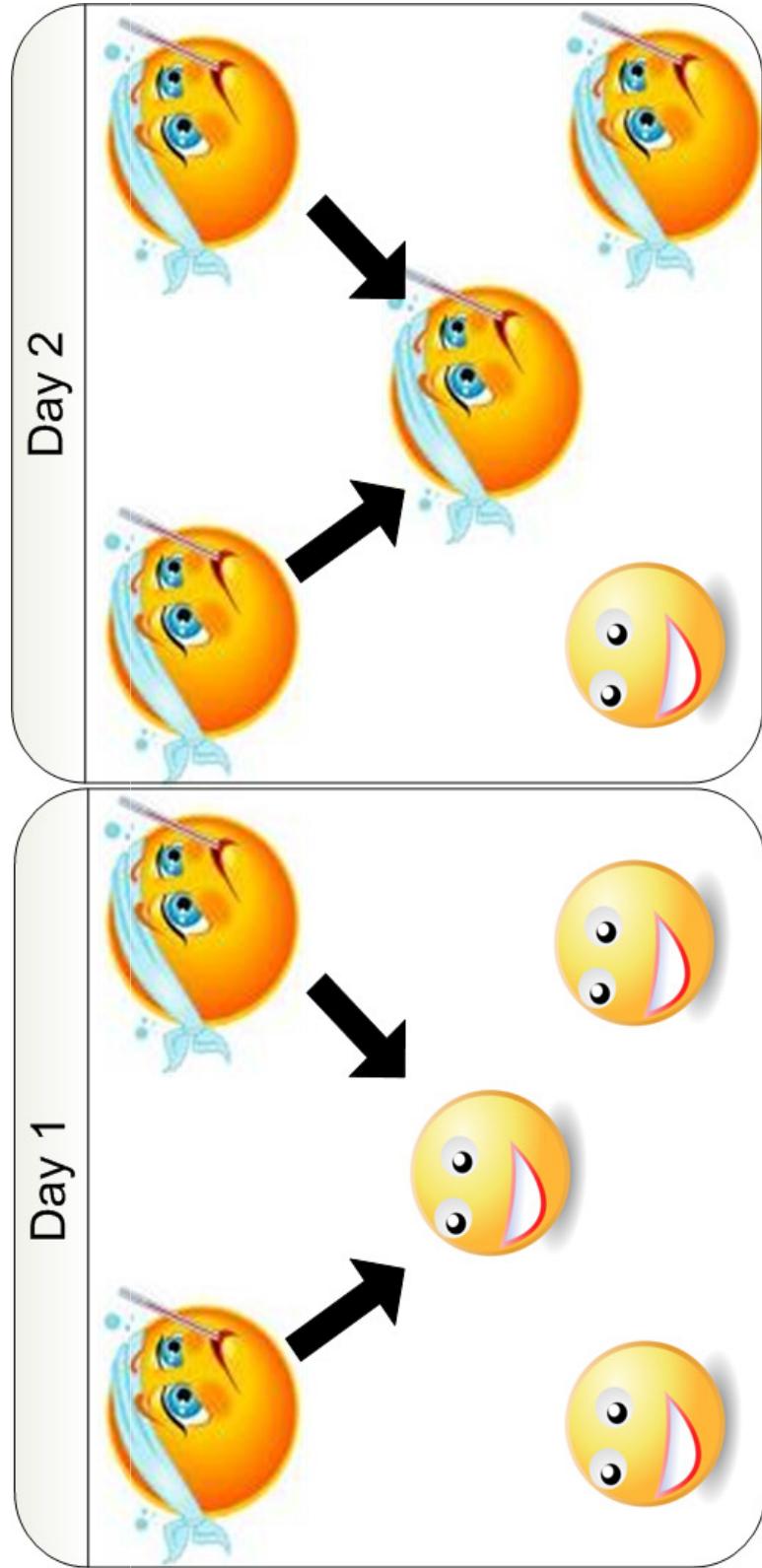
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# Method - Analyses

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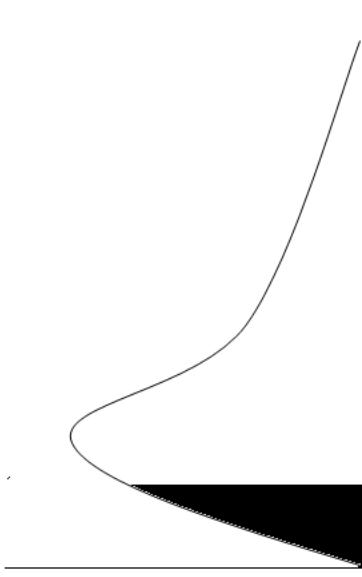
Case-ordered model



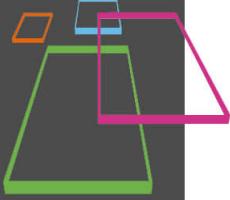
# Model Evaluation



- Accuracy:
  - correlation between estimated breeding values (EBV) and susceptibility & infectivity
  
- Impact:
  - Mean susceptibility & infectivity
  - Risk and severity of outbreaks
  - Basic reproduction number  $R_0$
  - Selected subpopulations



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# Results



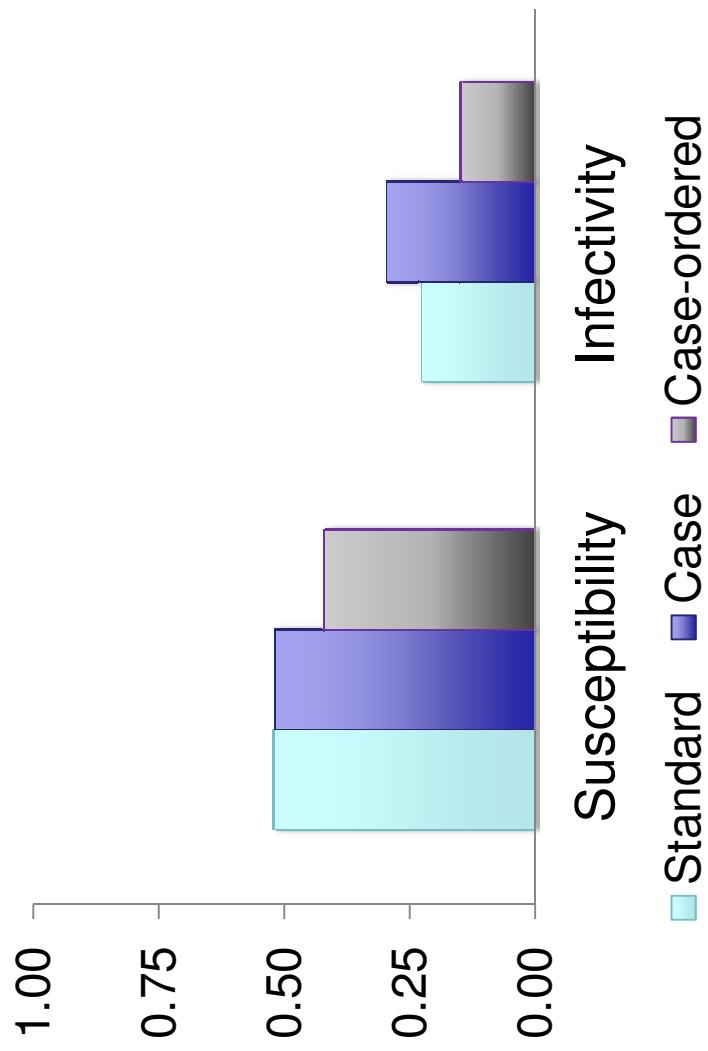
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# Results – Accuracy



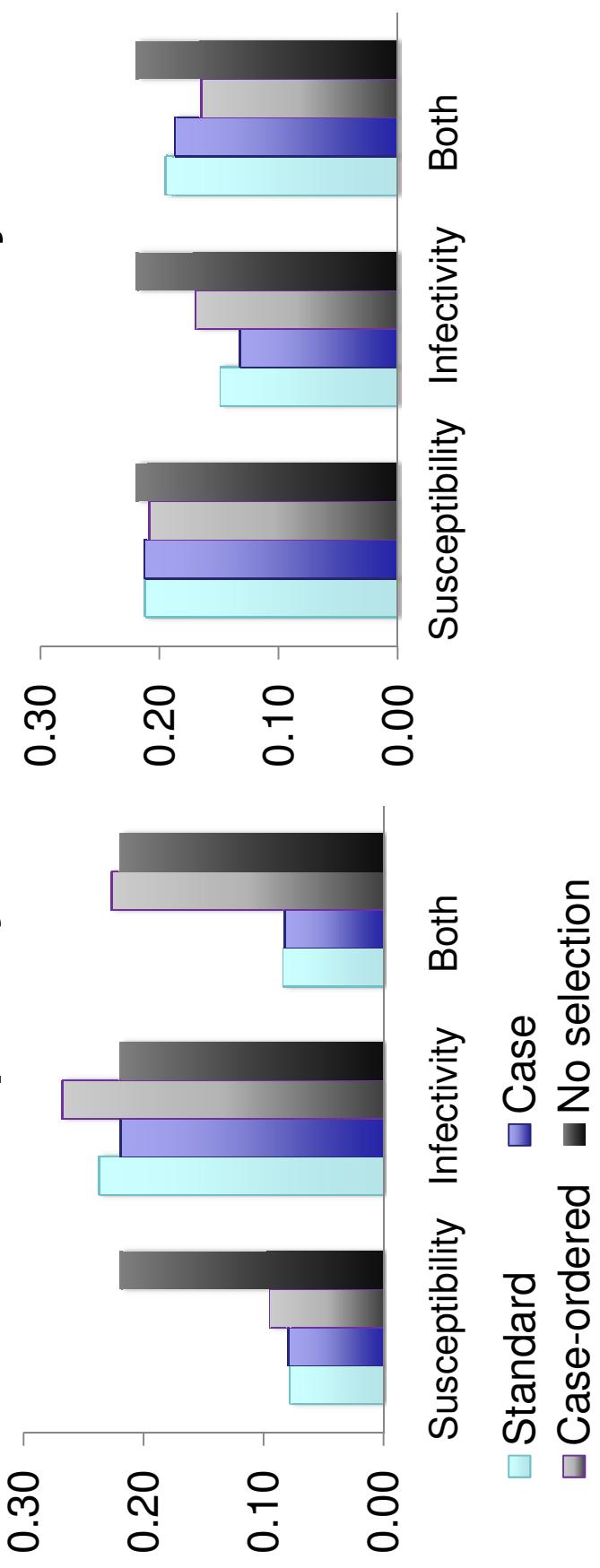
## Accuracy of EBV



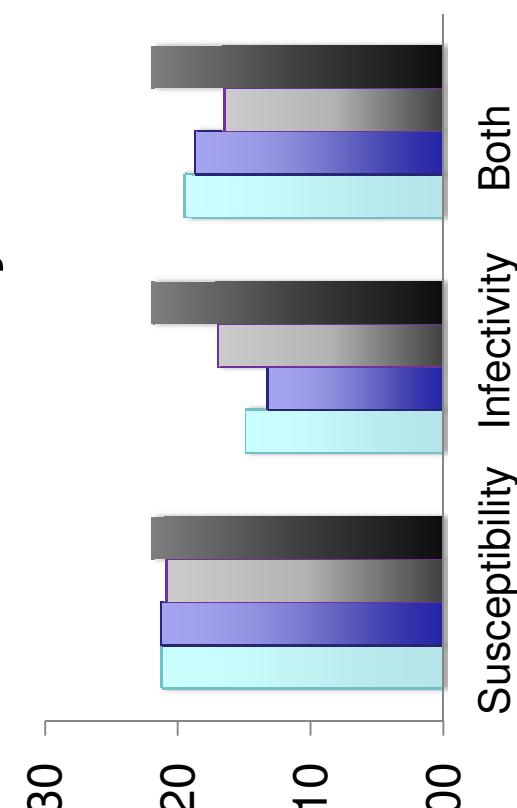
# Results – Impact on TBV



## Mean Susceptibility



## Mean Infectivity



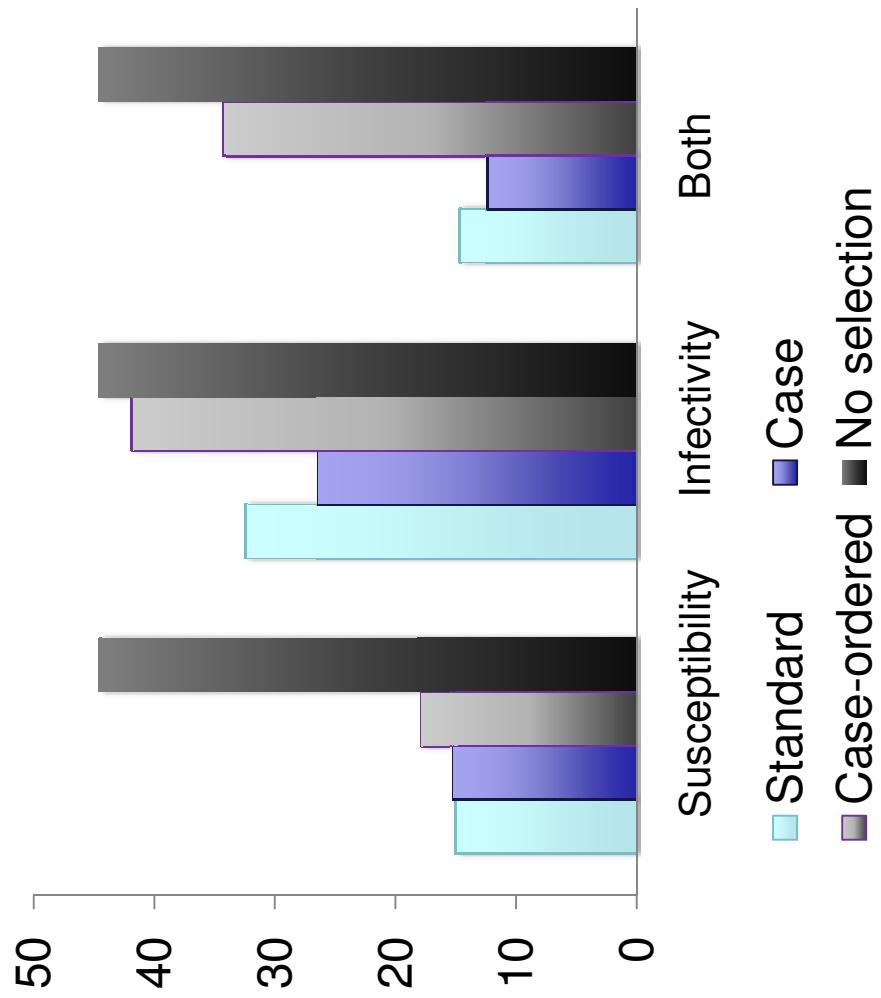
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# Results – Impact on $R_0$



## Basic Reproduction Number



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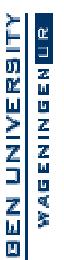
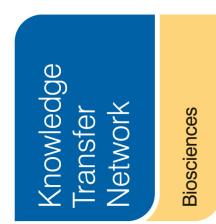
# Conclusion



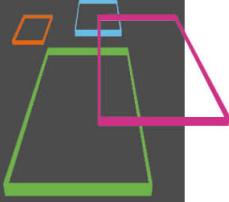
- Associative effects models capture variation in infectivity
- Infection dynamics are important
- Trade-off between verisimilitude and accuracy & impact
- Future studies should concentrate on interaction between susceptibility and infectivity
- Overall case model provides best estimates



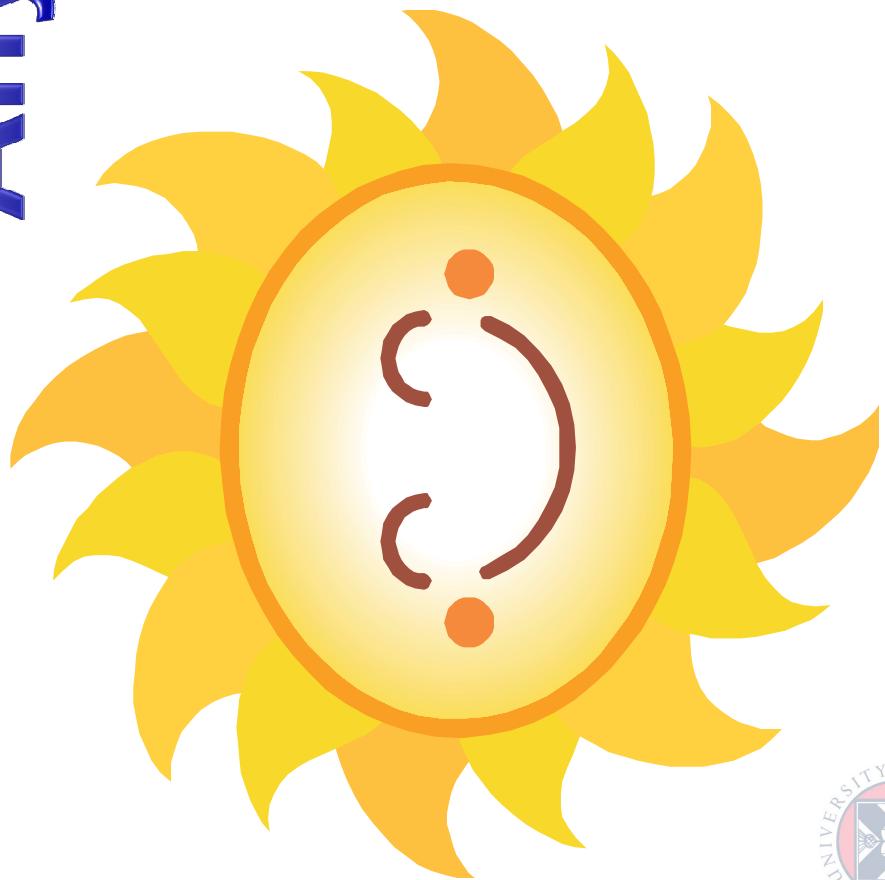
**Thank you!**



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Any questions?



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