

# Tutorial

## Introduction to models and data: HIV in Harare

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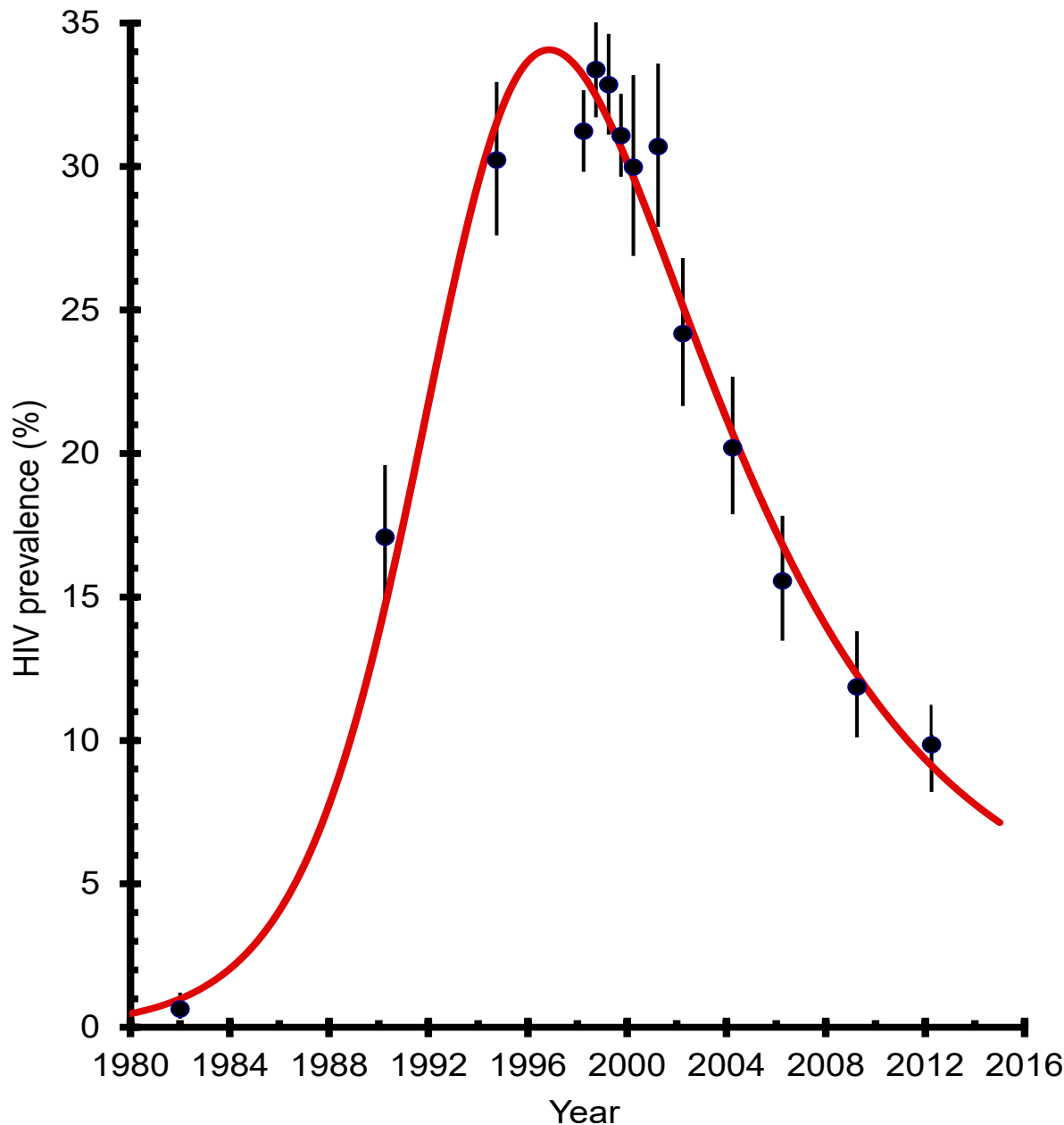
MMED 2023

Based on content by John Hargrove and Brian Williams

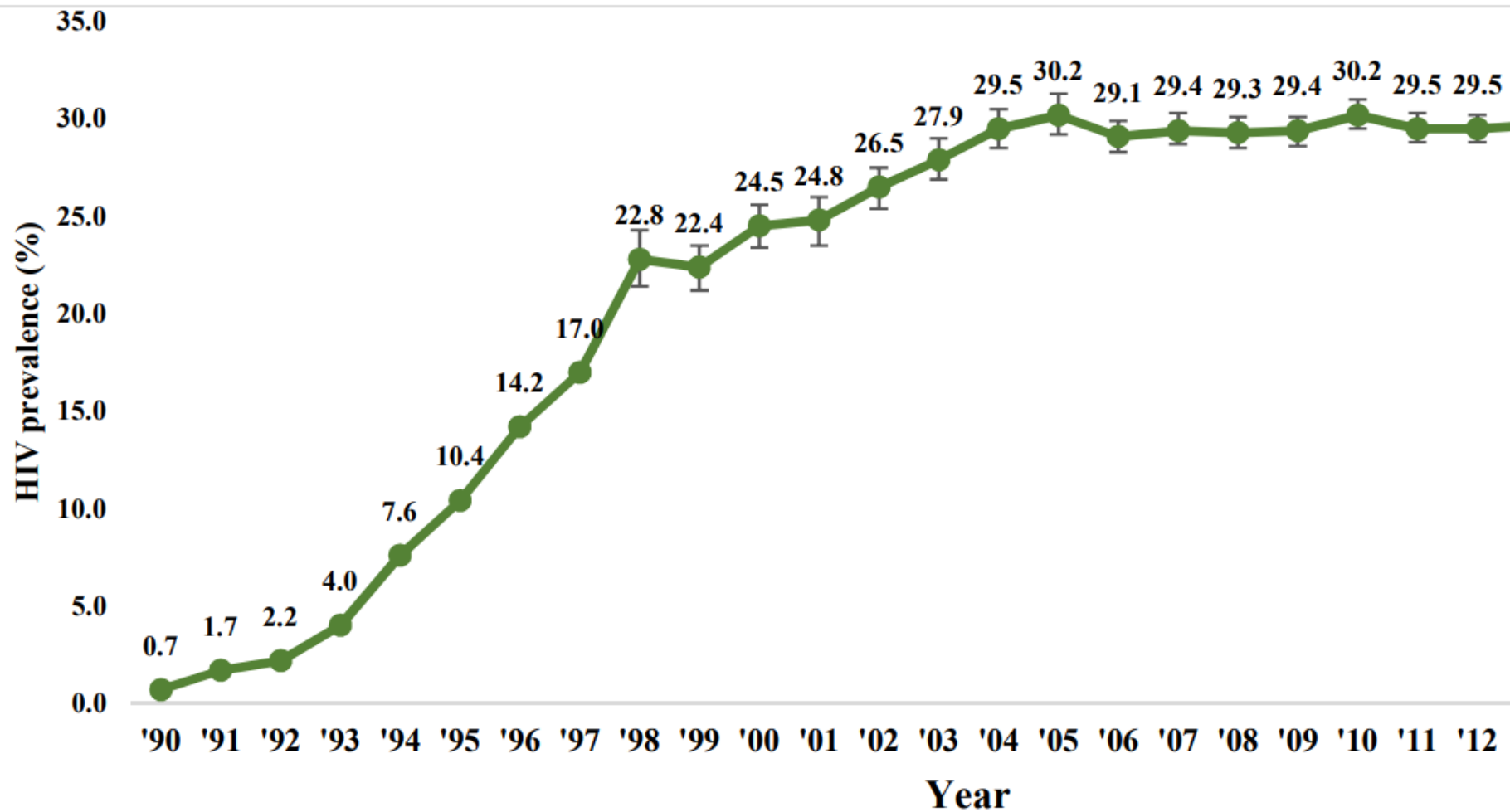
**Harare, Zimbabwe**

**HIV prevalence**  
during 1980-2012

Pregnant women  
attending antenatal  
clinics

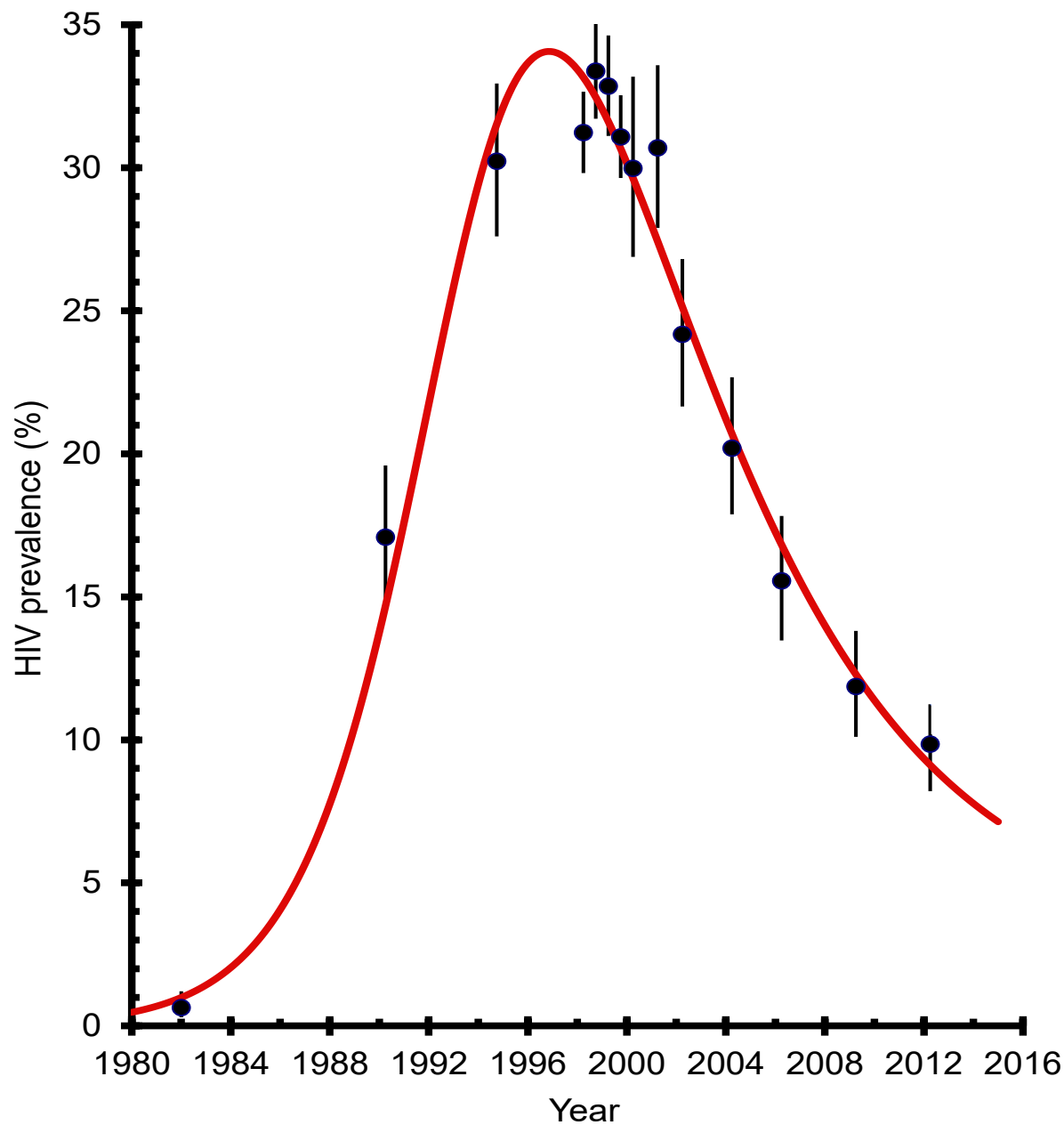


Hargrove et al. *Epidemics* 2011



## South Africa

[https://www.nicd.ac.za/wp-content/uploads/2021/11/Antenatal-survey-2019-report\\_FINAL\\_27April21.pdf](https://www.nicd.ac.za/wp-content/uploads/2021/11/Antenatal-survey-2019-report_FINAL_27April21.pdf)

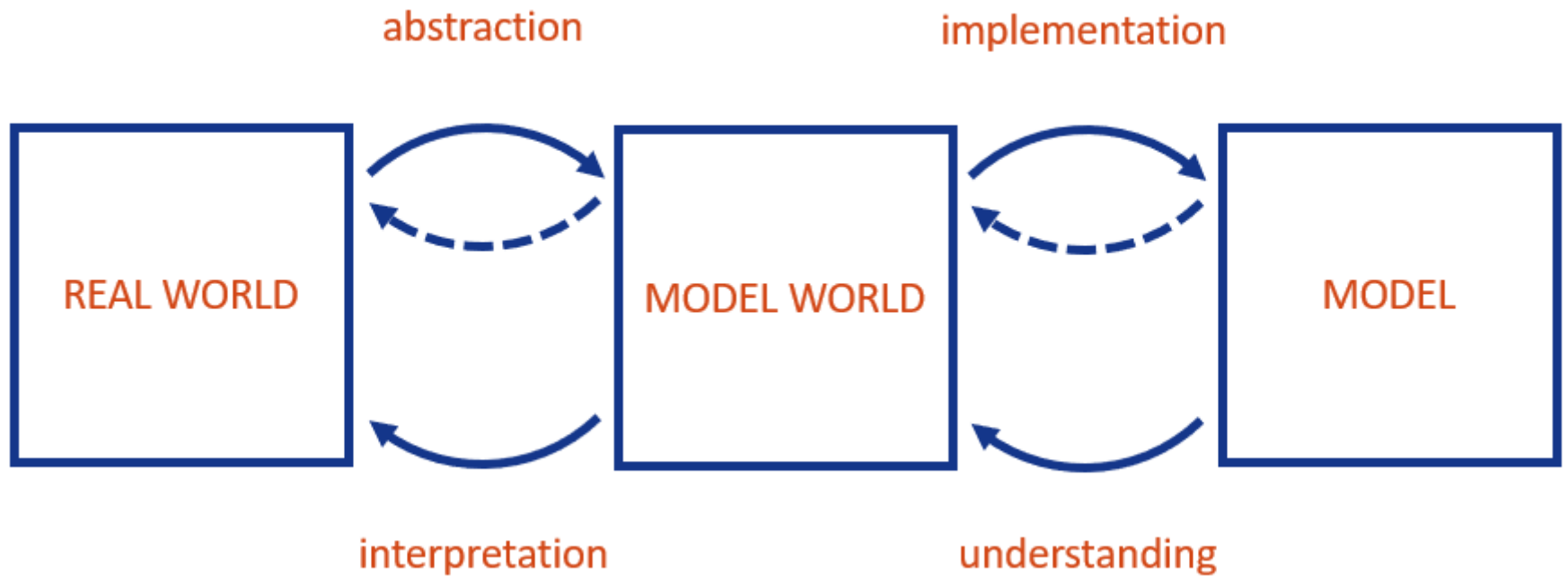


**You are going to  
model this data!**

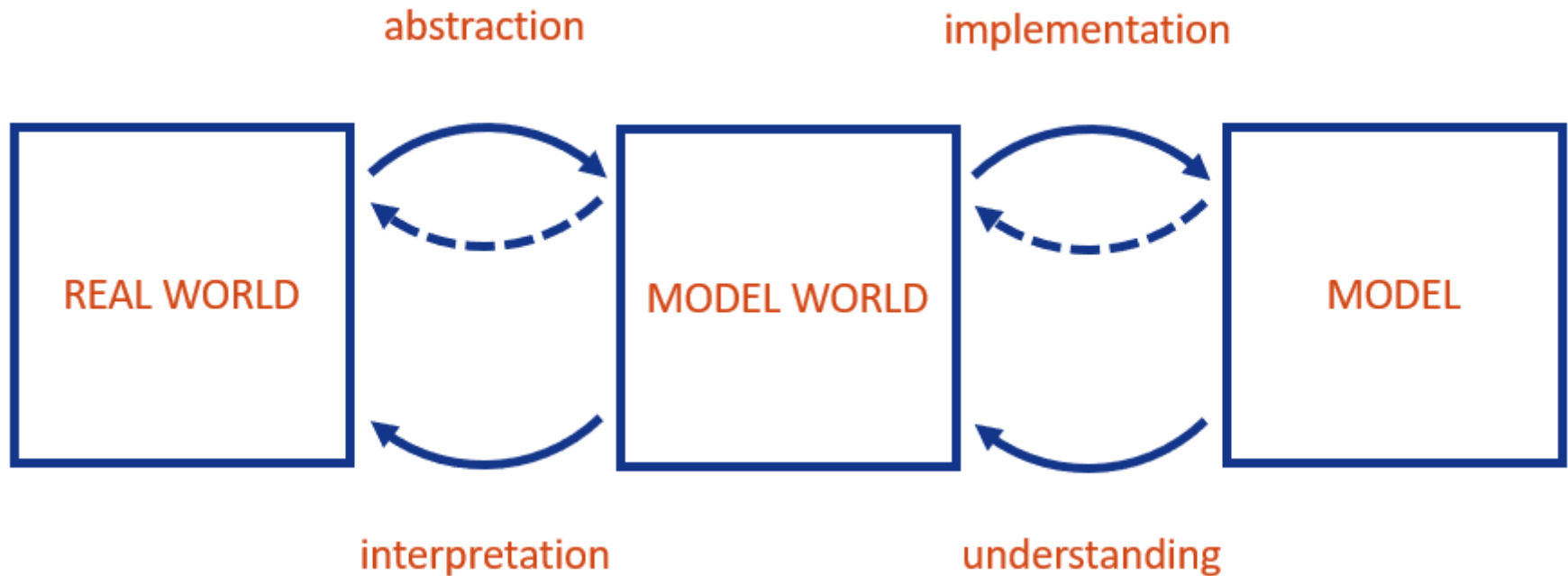
# Outline

- Recap of two relevant methodological principles
- More background on the data and setting
- The goals of the exercise
- Discuss the first model that you will be fitting

... leave you to play



# Model world: a (often simpler) representation of the real world



# Model world: a (often simpler) representation of the real world

- Does not need to exactly capture every mechanism of the real world

complex ←————→ simple

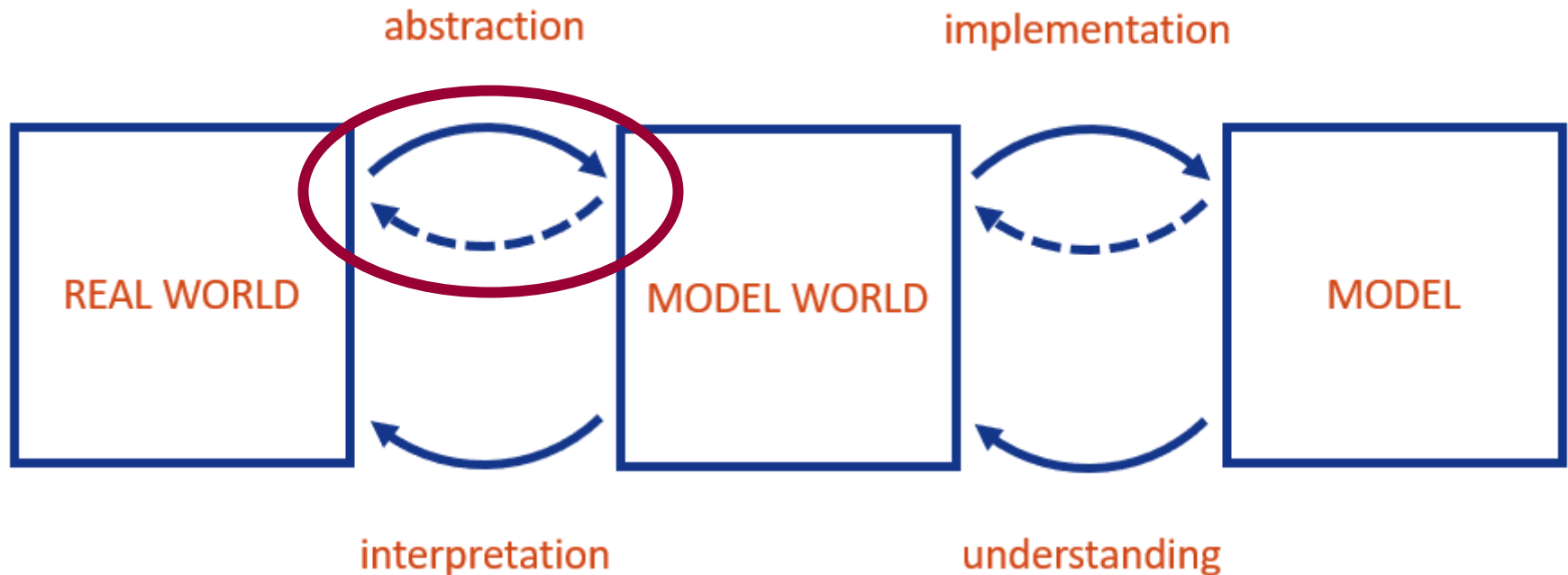
- Difficult to:  
implement model,  
interpret results,  
obtain inputs, ...
- May not be able  
to accurately  
answer
- Aim: find the simplest model that can adequately  
answer your question



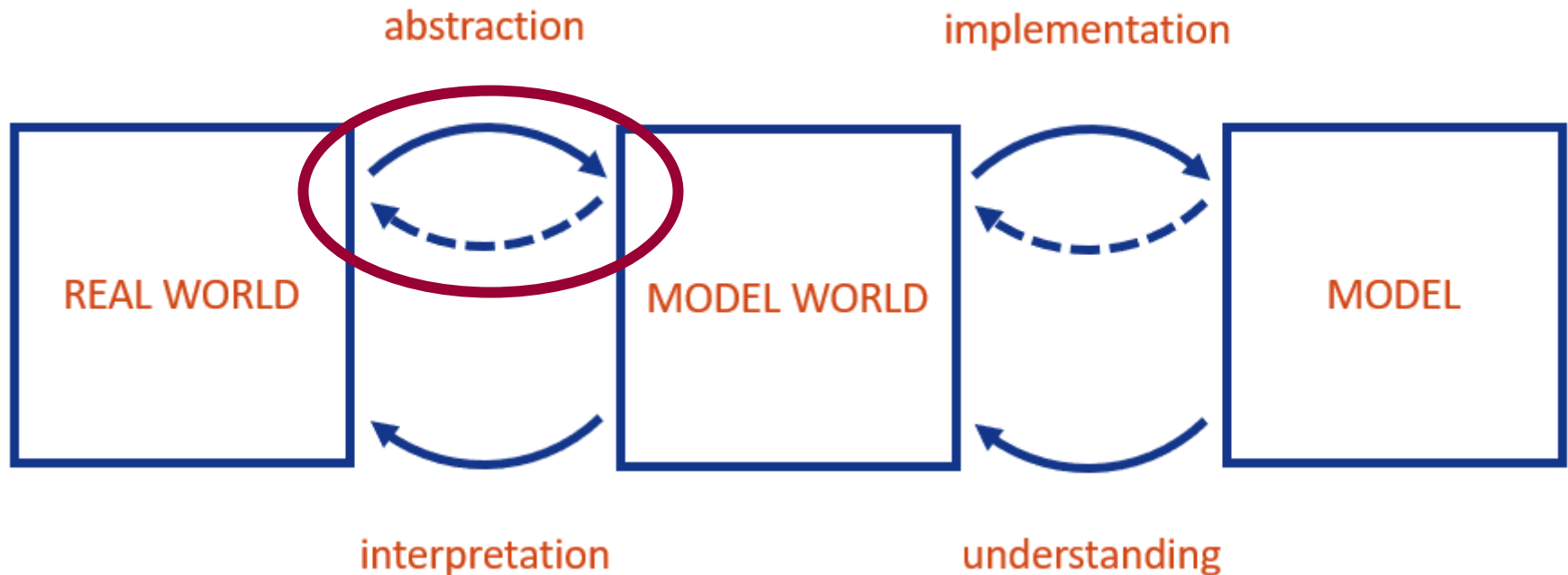
# Want your model to 'fit' the data

- Outputs from your model should be consistent with available data
- E.g. HIV prevalence survey estimates should be 'close' to the modelled prevalence in the population at those times
- Not aligned → model world is not adequately describing your real world

# Want your model to 'fit' the data



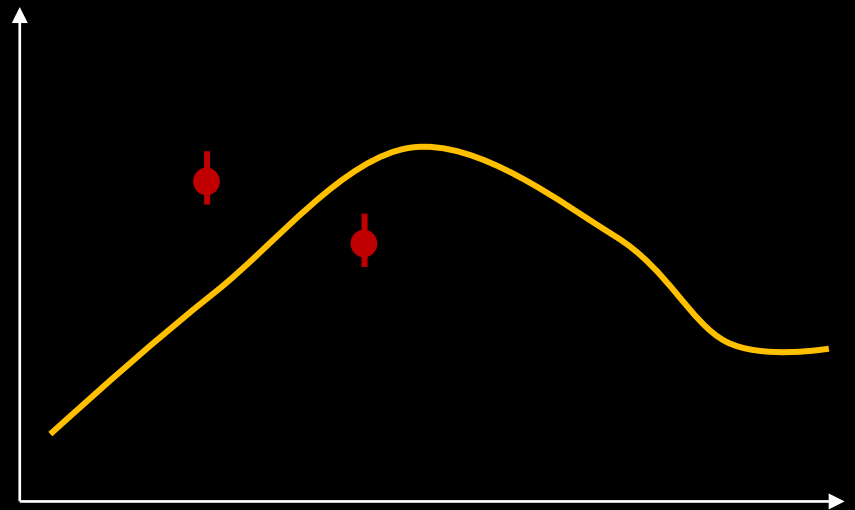
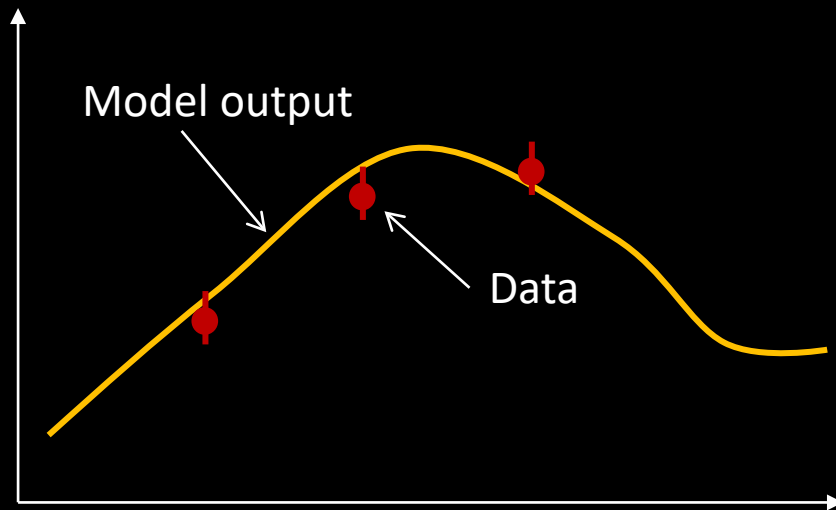
# Want your model to 'fit' the data



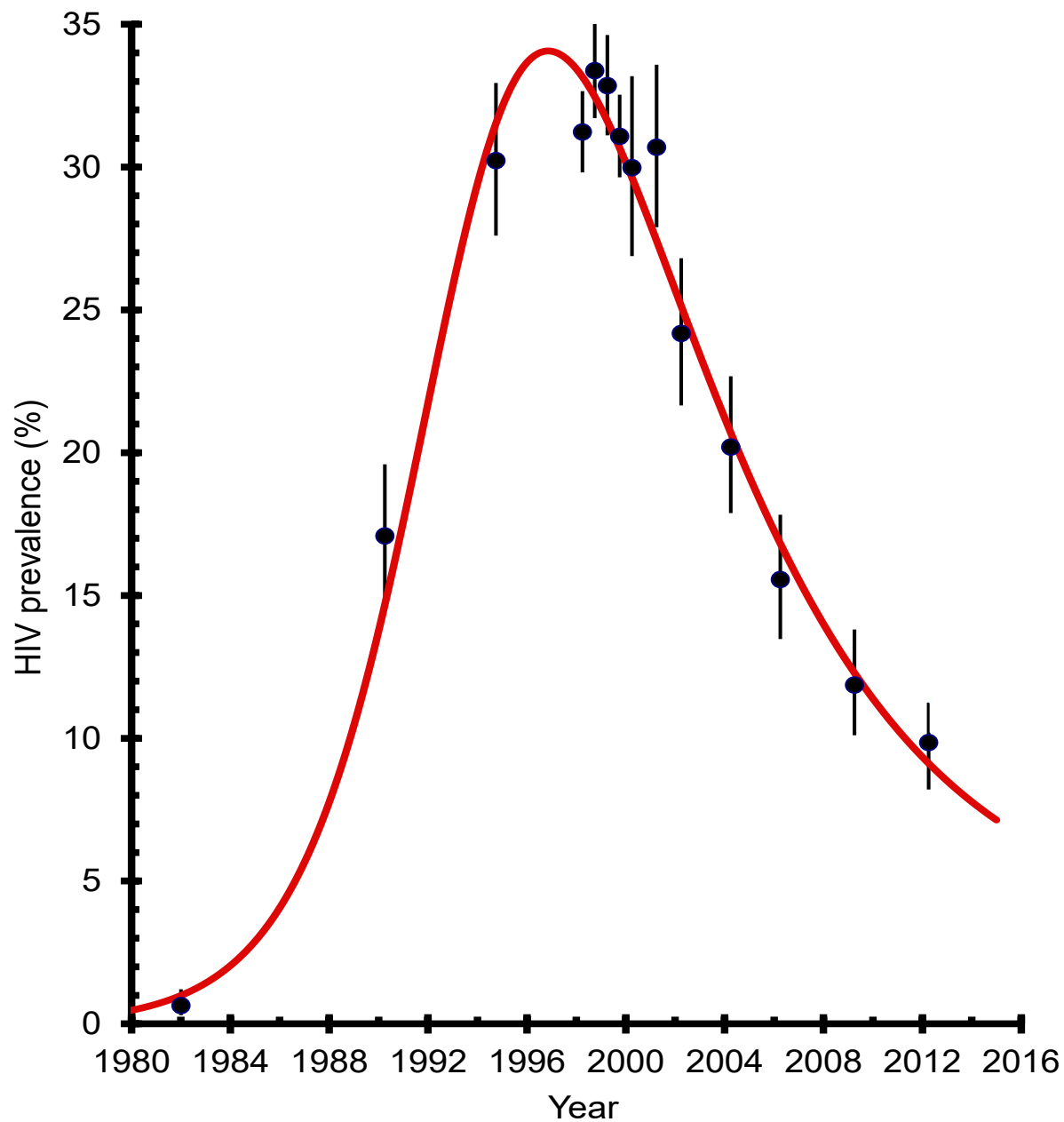
- If there is **misfit**, this could be caused by an incorrect **structure** of model or incorrect **inputs**

# Want your model to 'fit' the data

- Various methods for trying to ensure or check whether your model fits the data
- Today, we will be checking 'by eye'



Prevalence ( $y$ ) over time ( $x$ )



**You are going to  
model this data!**



Contents lists available at [ScienceDirect](http://www.sciencedirect.com)

## Epidemics

journal homepage: [www.elsevier.com/locate/epidemics](http://www.elsevier.com/locate/epidemics)



### Declining HIV prevalence and incidence in perinatal women in Harare, Zimbabwe <sup>☆</sup>

John W. Hargrove <sup>a,c,1</sup>, Jean H. Humphrey <sup>a,e,\*</sup>, Agnes Mahomva <sup>b,2</sup>, Brian G. Williams <sup>c</sup>,  
Henry Chidawanyika <sup>a</sup>, Kuda Mutasa <sup>a</sup>, Edmore Marinda <sup>a,3</sup>, Michael T. Mbizvo <sup>f</sup>, Kusum J. Nathoo <sup>d</sup>,  
Peter J. Iliff <sup>a,d</sup>, Owen Mugurungi <sup>b</sup>  
and the ZVITAMBO Study Group

<sup>a</sup> Zvitambo Project, Harare, Zimbabwe

<sup>b</sup> Ministry of Health and Child Welfare, AIDS & TB Unit, Harare Zimbabwe

<sup>c</sup> SACEMA, Stellenbosch University, South Africa

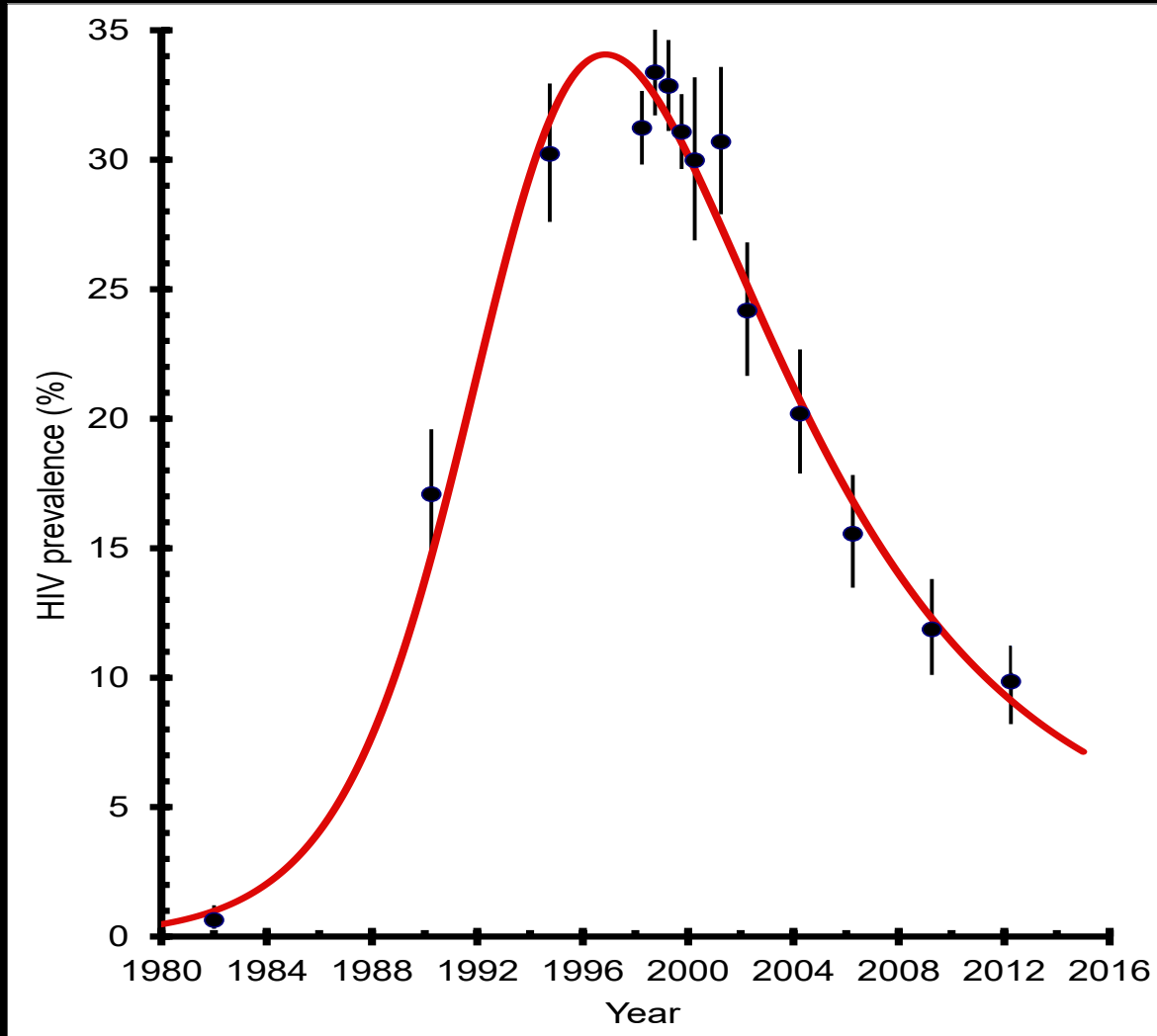
<sup>d</sup> Department of Paediatrics, University of Zimbabwe

<sup>e</sup> Johns Hopkins Bloomberg School of Public Health, Baltimore, MD, USA

<sup>f</sup> WHO, Geneva, Switzerland

# John Hargrove and Brian Williams

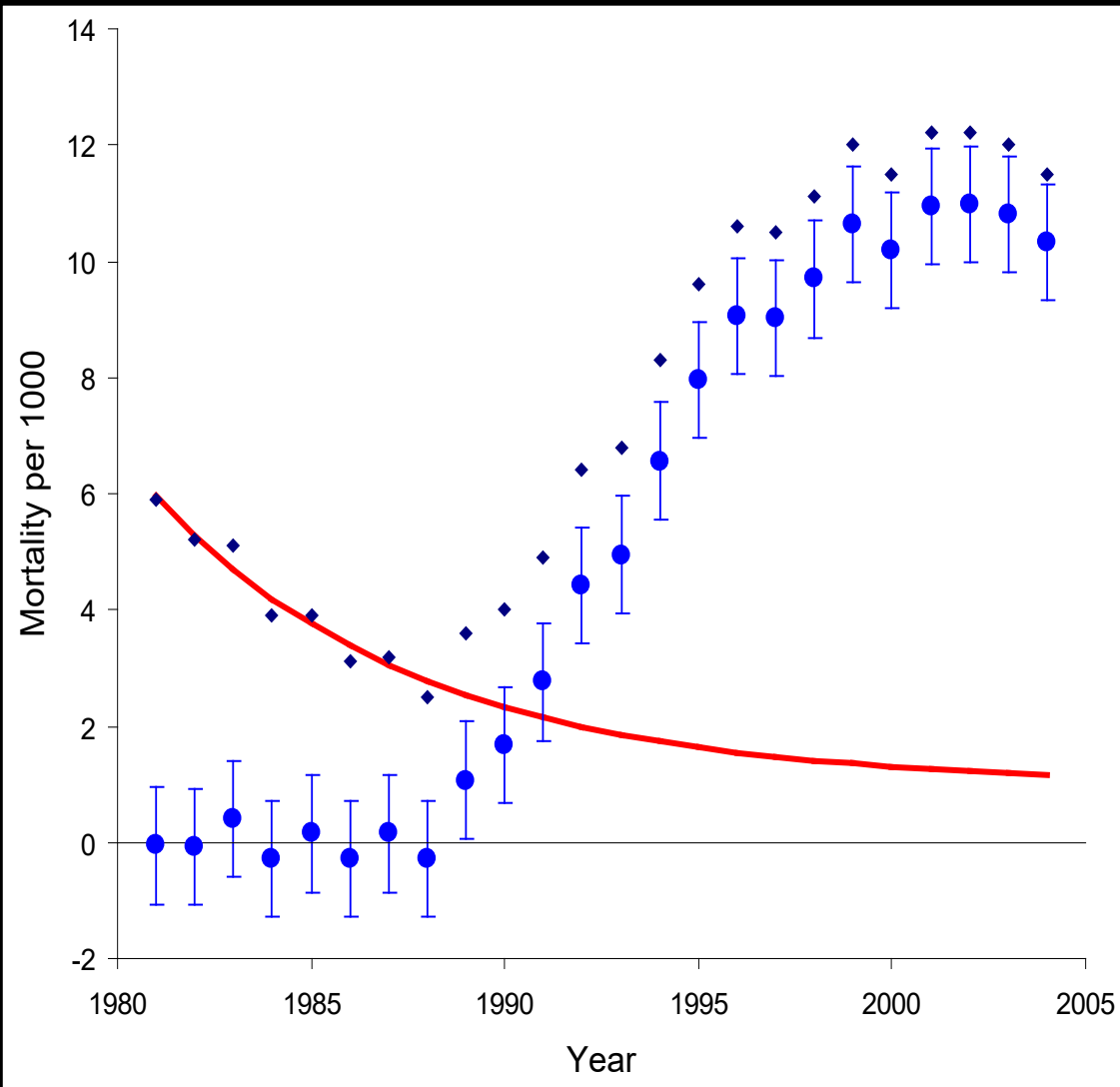
# The data: Prevalence



Surveys of pregnant women attending nine antenatal clinics in different years

$n = 22\,684$

# The data: disease-related mortality



Total mortality from records provided by the City of Harare

From 1980 to before the HIV epidemic: declining mortality

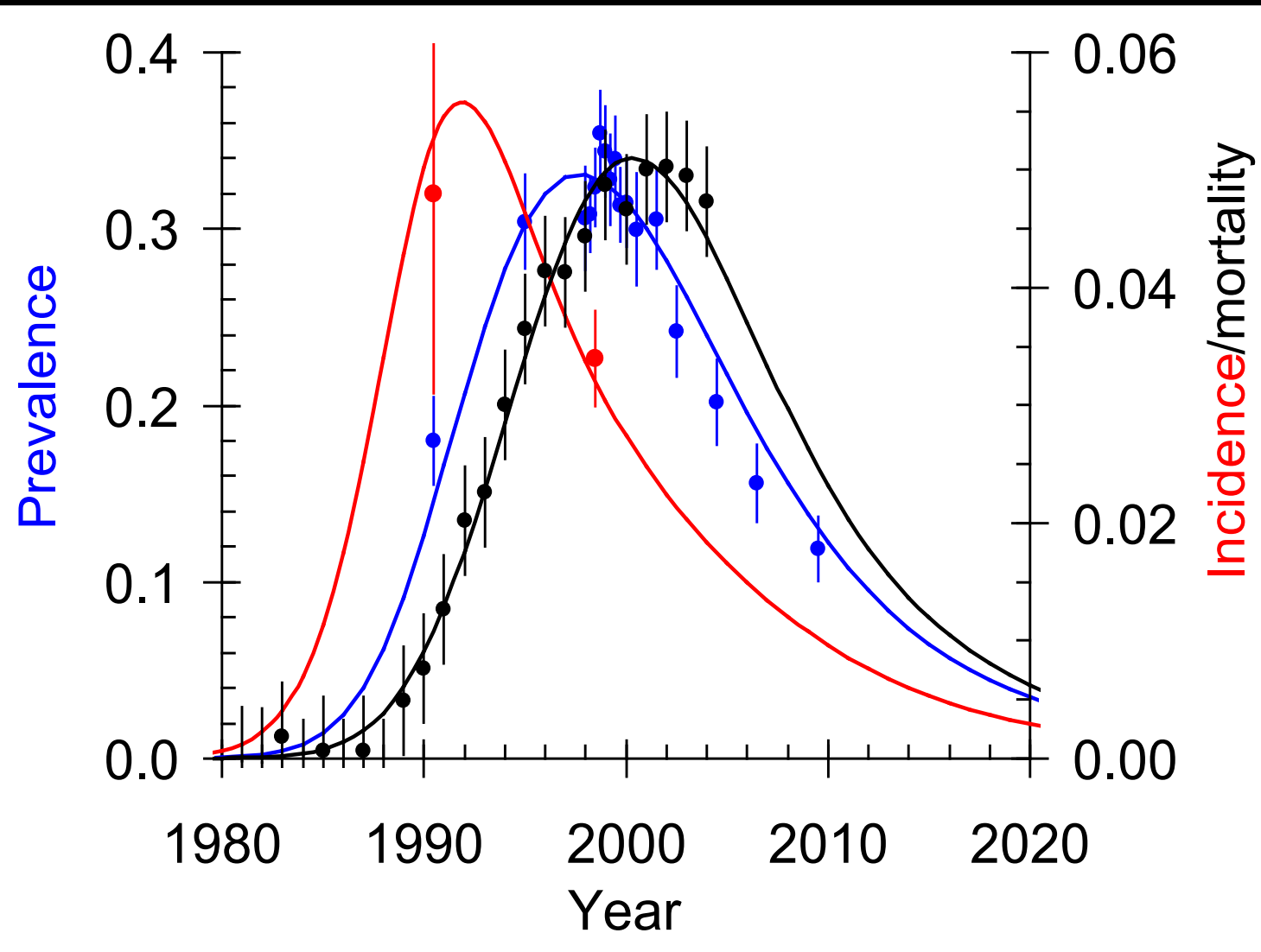
Extracted trends for disease-related mortality



# The data: incidence

- Two estimates from two cohort studies of pregnant women (conducted in 1991 and 1993)

# The data – can we find a model?



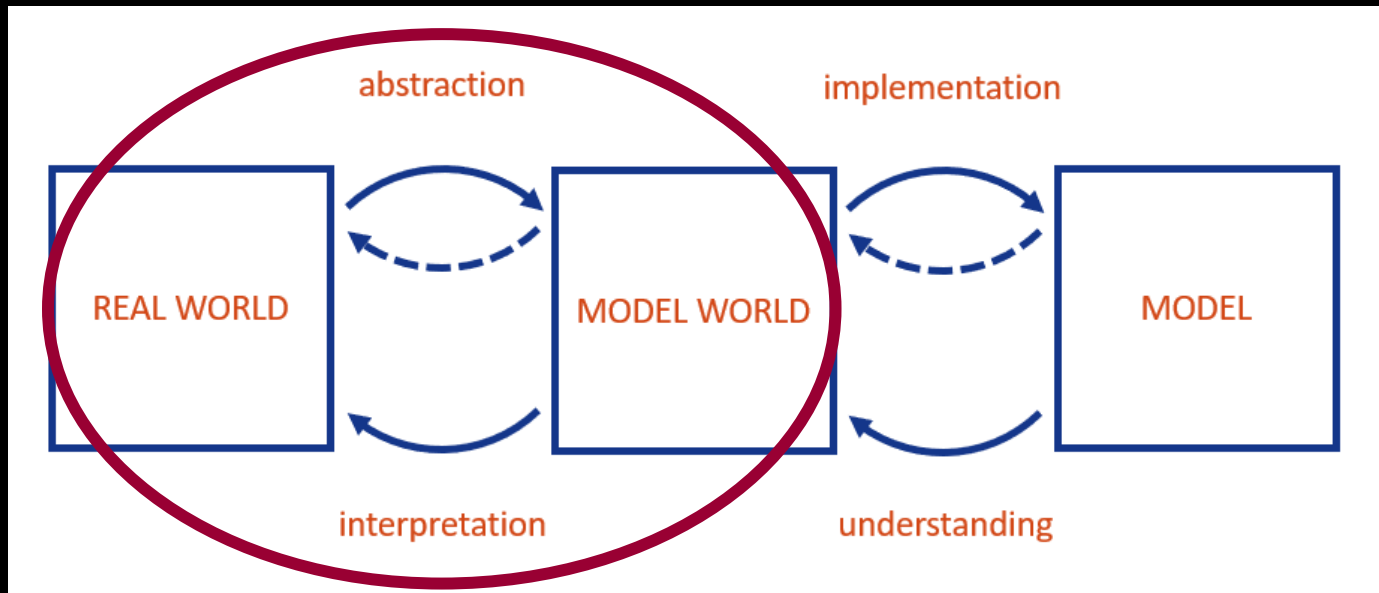
# What you will be doing...

- You will start with the simplest possible model, with the smallest number of parameters
- You will not be surprised to find that you do not get a good fit the data
- You should try to reflect on why
- Then try a slightly more complex model (adding one feature)
- Reassess

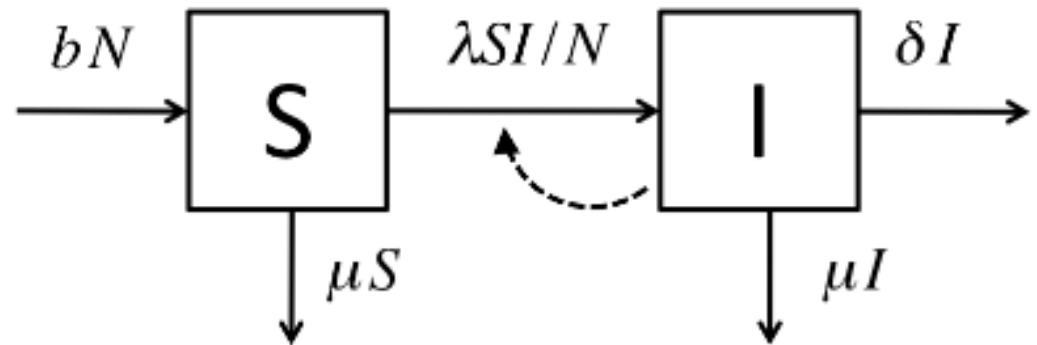


# What you will be doing...

- Use prevalence data, checking the fit ‘by eye’
- Shiny app (by Carl Pearson and Juliet Pulliam) – you do not need to do the model implementation!



# The first model



$$N = S + I$$

$b =$  per capita birth rate

$\lambda =$  effective contact rate

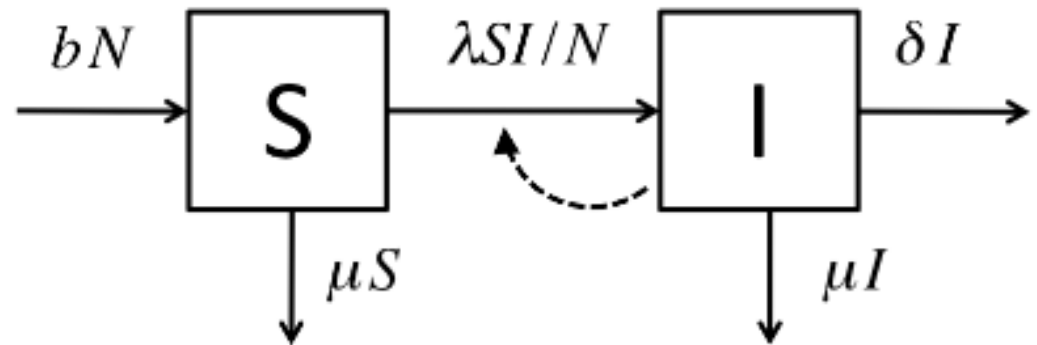
$\delta =$  disease induced mortality hazard

$\mu =$  per capita background mortality rate

The basic model

# The first model

- Understand the model
- Try out different values for the inputs
- Compare model outputs to data points



$$N = S + I$$

$b =$  per capita birth rate

$\lambda =$  effective contact rate

$\delta =$  disease induced mortality hazard

$\mu =$  per capita background mortality rate

The basic model

# Instructions

- Groups of <4 people
- Think about what it all means, answer the questions, and discuss
- When done with Harare, try the other two datasets (South Africa, Uganda)
- Can also look at the model code

**ICI3D::hivTutorial()**

You should have already done this:

**remotes::install\_github('ICI3D/ici3d-pkg')**



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Introduction to modelling changes in HIV prevalence and incidence in Harare, Zimbabwe

Attribution: J. Hargrove, B. Williams, R. Kassanjee  
Clinic on the Meaningful Modeling of Epidemiological Data

For further information please contact [figshare@ici3d.org](mailto:figshare@ici3d.org).



**AIMS**

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