

# Best practices for use of Population Viability Analysis to forecast seabird populations

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*Please note results are preliminary*



# Population Viability Analysis (PVA)

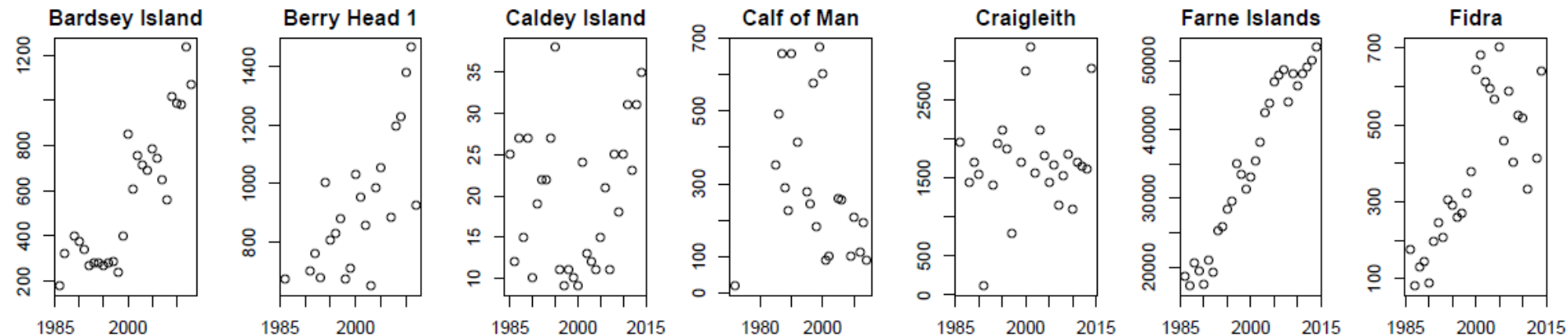
- Population Viability Analysis (PVA) is the use of a mathematical model to forecast future population sizes, based on assumed or estimated demographic rates
- Despite the wide application of PVAs, there have been a number of criticisms of their use



# PVAs and seabirds

The key issue motivating the work is the fact that data coverage for seabirds is far from complete:

- the quantity and types of data available for seabird breeding colonies are highly variable, with data being **sparse** for many colonies
- Often need to borrow data on demographic rates from other, better studied colonies or **pooling regions** – how should we choose which colonies to borrow from?



# Objectives

- Evaluate different methods for conducting PVAs within the context of specific seabird species
- to establish the most appropriate generic method to use in which circumstances

**Northern gannet**  
**Black-legged kittiwake**  
**Herring gull**  
**Common guillemot**  
**Razorbill**  
**European shag**  
**Northern fulmar**  
**Great cormorant**



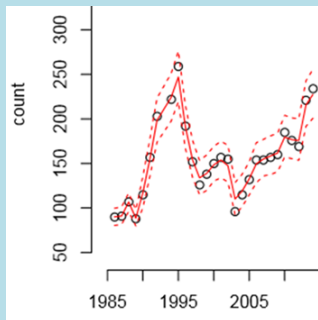
**Arctic skua**  
**Sandwich tern**  
**Little tern**  
**Common tern**  
**Lesser black-backed gull**  
**Great black-backed gull**  
**Atlantic puffin**

# Selected PVA methods

<b>Models based on breeding success &amp; survival</b>	Deterministic Leslie matrix model
	Stochastic Leslie matrix model
<b>Models based on all available data</b>	Bayesian state space versions of the Leslie matrix model (Integrated Population Models)

$$N_t = L_t N_{t-1} \quad L = \begin{bmatrix} r_1 & r_2 & r_3 & \dots & r_{A-1} & r_A \\ s_1 & 0 & 0 & \dots & 0 & 0 \\ 0 & s_2 & 0 & \dots & 0 & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots & \vdots \\ 0 & 0 & 0 & s_{A-2} & 0 & 0 \\ 0 & 0 & 0 & 0 & s_{A-1} & 0 \end{bmatrix}$$

## Models based on time series of abundance



Simple growth model (Dennis, 1991)

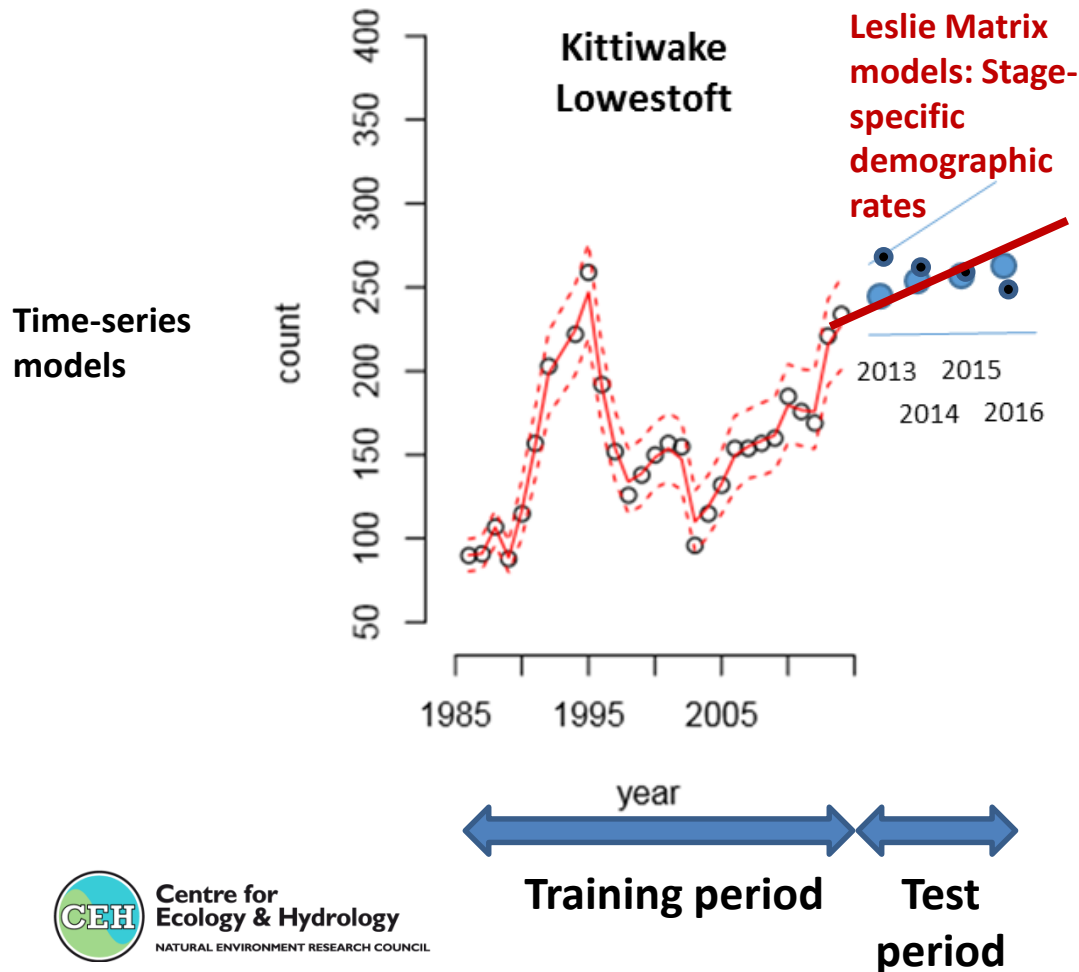
Ricker logistic model

Gompertz model

State-space versions of these models (allowing for observation error)

# Model testing methods

We applied these PVA methods to data for a 'training' period (e.g., all available years up to 2012) and assessed how accurately each method predicts observed count data that have been collected during a 'test' period (e.g., 2013-2016):



**COUNTS:** Seabird Monitoring Programme data – colony level, all available from 1986-2017

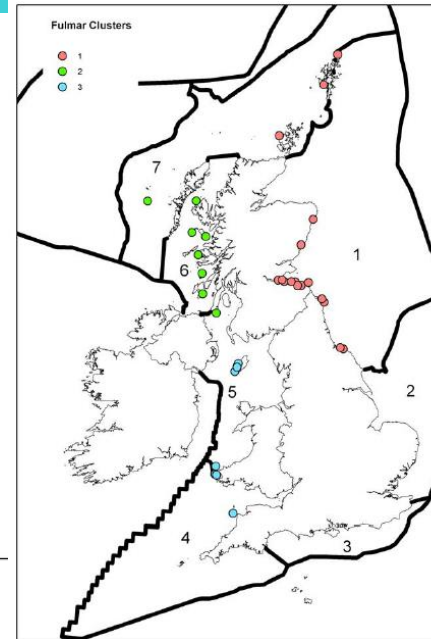
**BREEDING SUCCESS:** Seabird Monitoring Programme data – colony level, all available from 1986-2017

**SURVIVAL:** species level, BTO report (Horswill & Robinson, 2015)

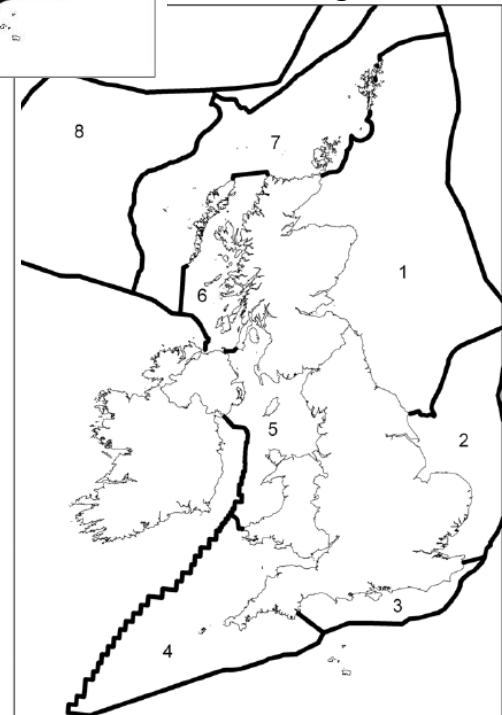
# Data pooling

- A fairly small proportion of colonies have local data on breeding success, and very few have local data on survival
- There is therefore interest in whether **regional pooling** can improve performance
- Which **regional classification** is best...
  - Ecological regions (BTO)
  - Management
    - OSPAR
    - ICES
    - MSFD
  - Geographic
    - SMP regions
    - JNCC Regional Seas

'Ecologically coherent' regions  
for abundance - Fulmar  
(Cook & Robinson 2010)



JNCC Regional Seas



SMP regions



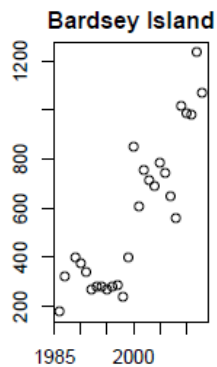
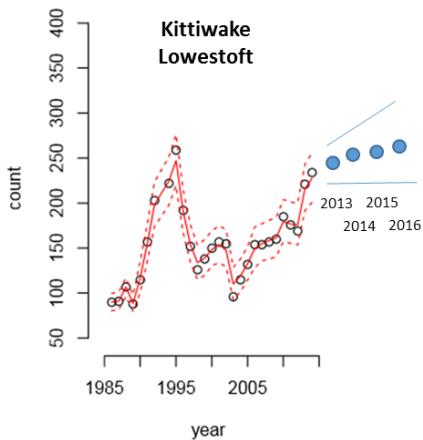
# Testing process

**Fit population models to empirical data for training period**

Or

**Project forward using Leslie Matrix and most recent count**

**Generate predictions of abundance for test period, along with associated estimate of uncertainty**



**Observed count data for test period**

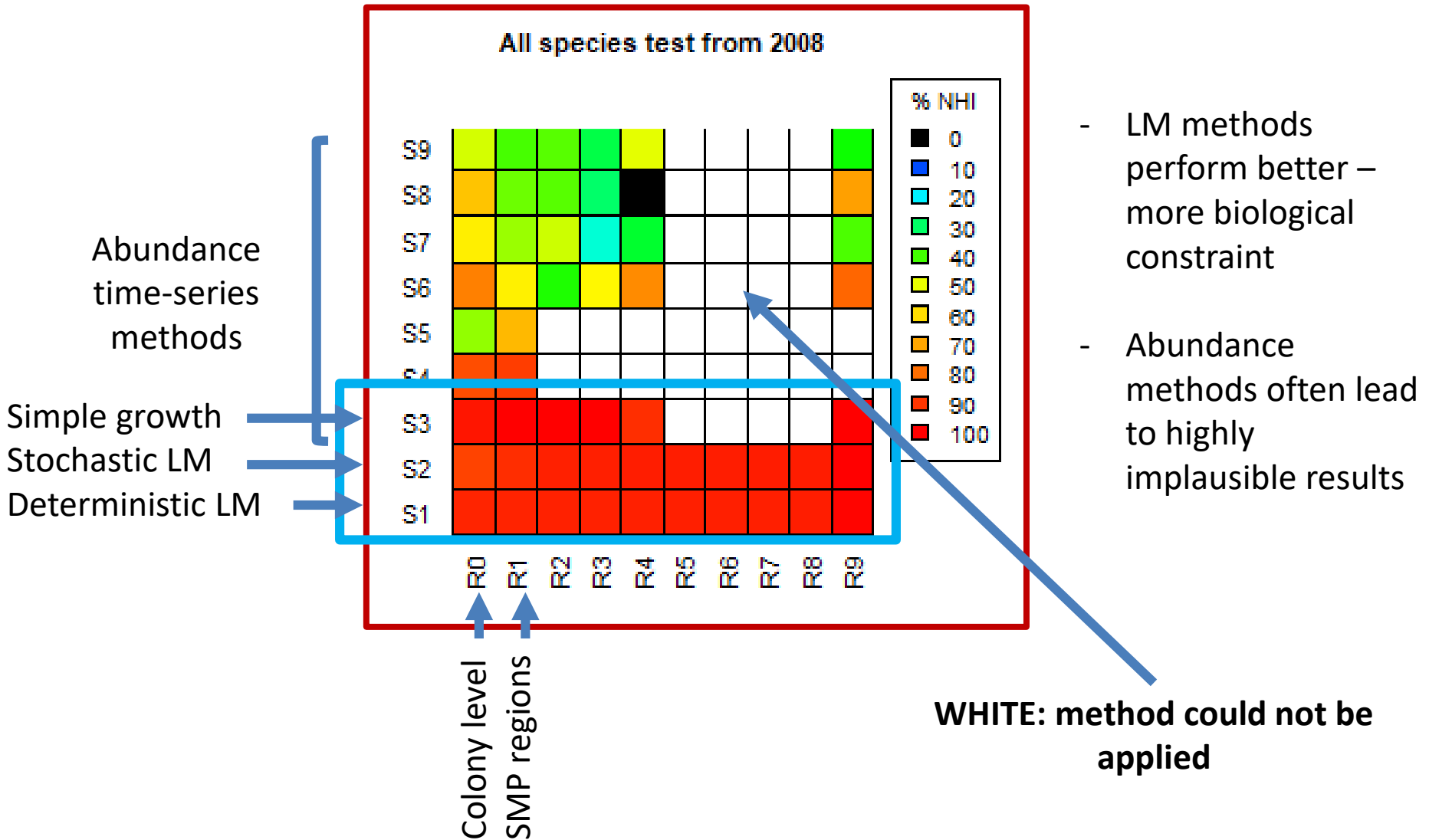
**Assessment of performance**

**Bayesian state space versions of the Leslie matrix model (Integrated Population Models): ONLY IN FORTH-TAY REGION**



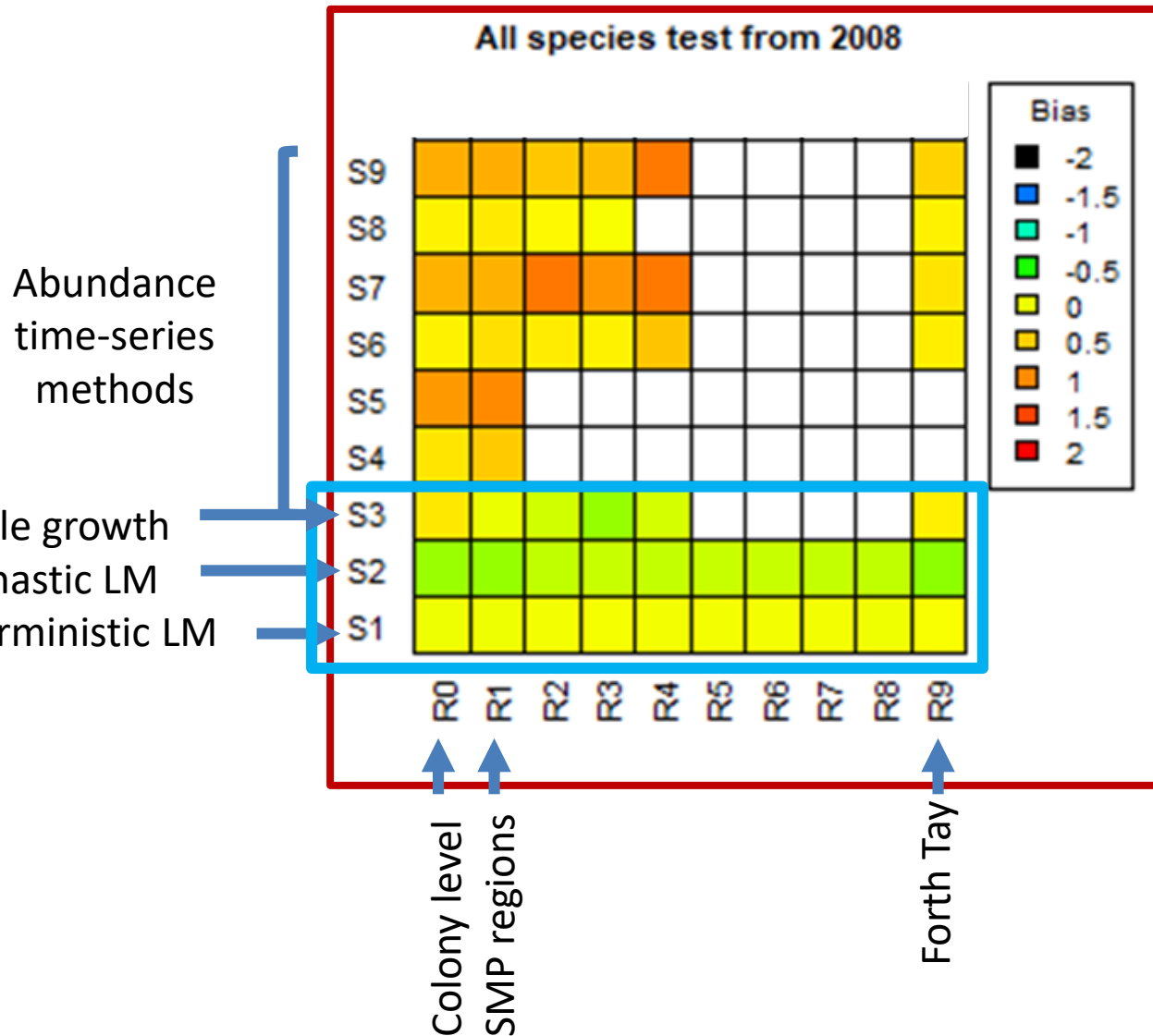
# Results

% results that are not “highly implausible”



# Results: systematic bias

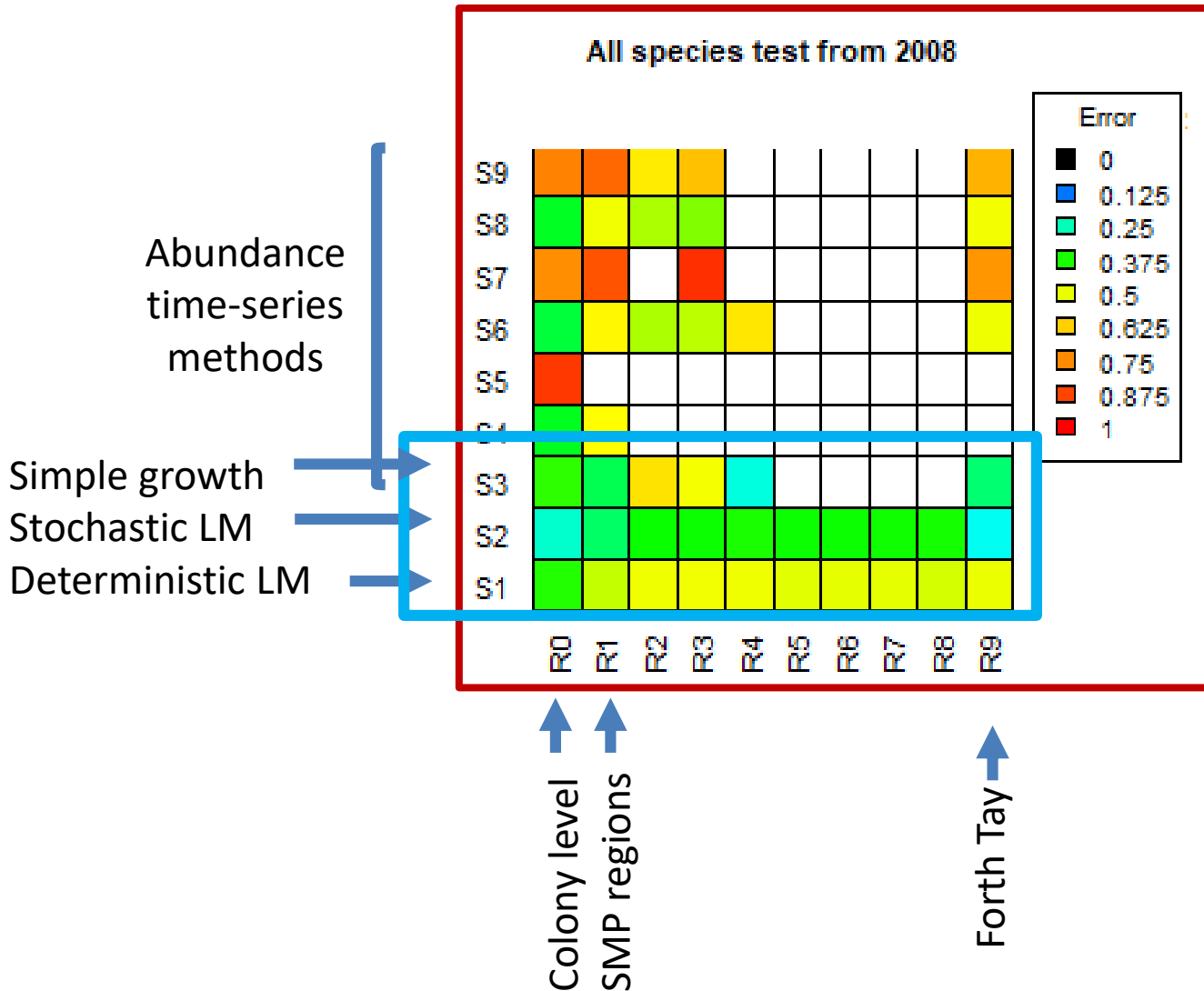
mean of  $\log(\text{predicted}/\text{observed})$



- LM methods show less bias, tendency for stochastic LM to underestimate
- Abundance methods tend to systematically overestimate

# Results: absolute error

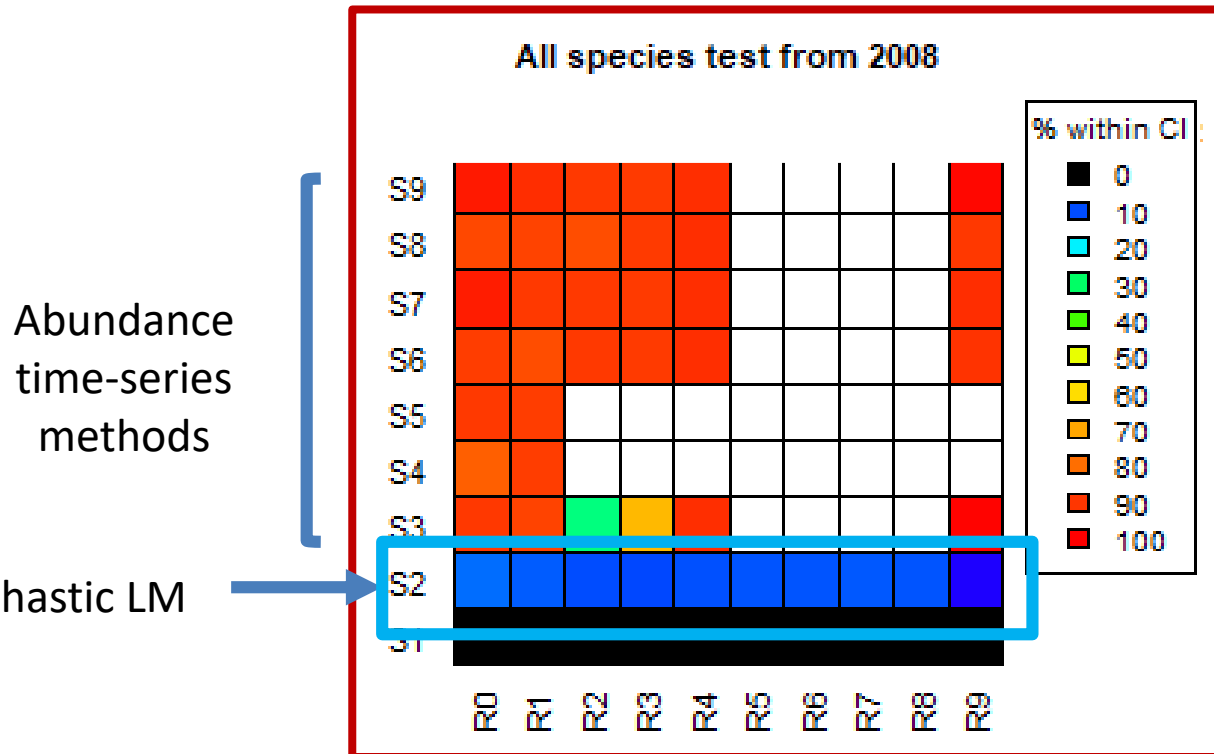
mean of  $|\log(\text{predicted}/\text{observed})|$



- LM methods show lower absolute error
- Stochastic LM lower error than deterministic
- Well-studied regions have lower absolute error

# Results: uncertainty

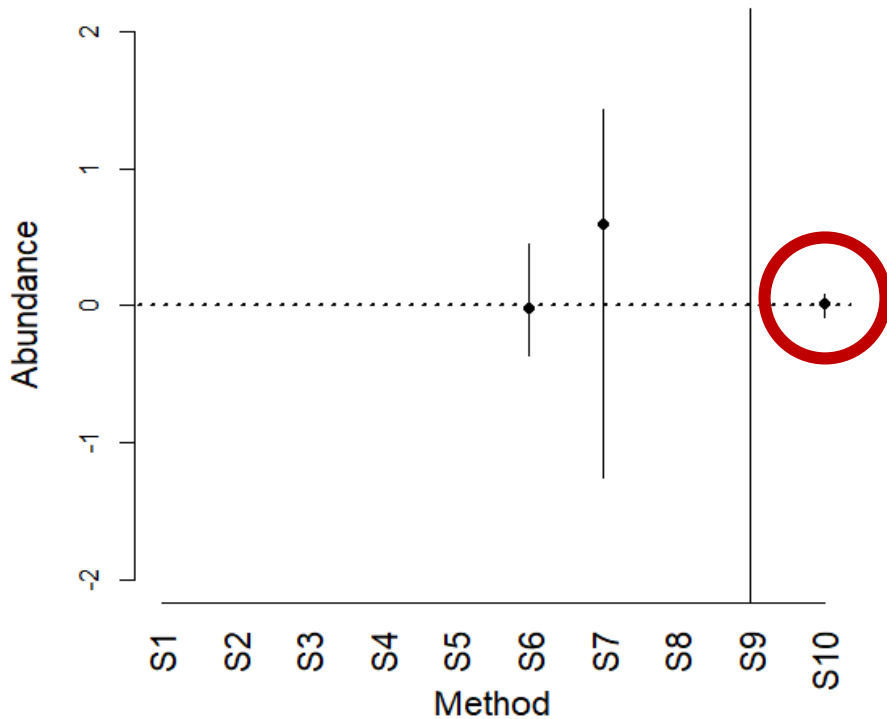
% of observed counts within 95% prediction interval



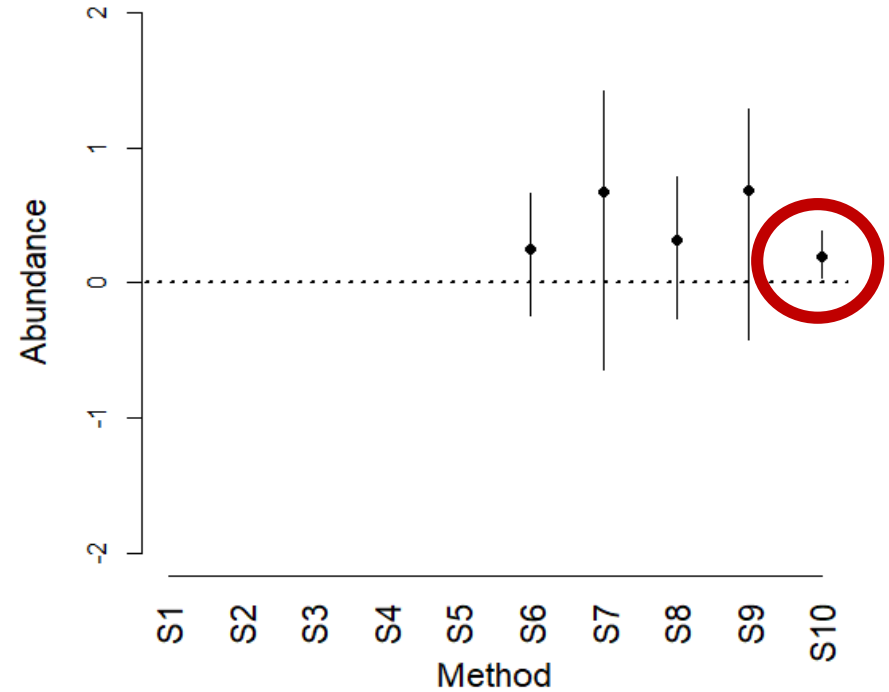
- Stochastic LM method shows poor capturing of uncertainty – **importance of parameters**
- Abundance time-series methods often include observation in CI

# Results: IPM Models in Forth-Tay Region

Common Guillemot Fowlsheugh SPA 2015



Kittiwake Forth Islands SPA 2013



The IPM approach had **lower bias** and **lower levels of error** than any other method, and **did not yield highly implausible results**.

The **best coverage (92%)** is for the IPM – this is close to the nominal level of 95%.

# Conclusions

Results so far suggest the Bayesian state space model (IPM) that uses *both* data sources has the best overall performance

Leslie matrix approaches can also perform relatively well

But time series approaches tended to perform poorly – lacking biological constraint, and abundance data are often insufficient to rule out such parameter values

## Regional Pooling

How does performance varies in relation to the definition of the regions used for spatial pooling of information used in the PVA?

Critical for Leslie matrix methods, where regional pooling is widely used in practice in data-sparse situations where no other PVA method is feasible.....

# Conclusions

Local, site-level approaches that avoid regional pooling generally had the lowest levels of bias and error, but can be used in far fewer situations

The ICES (R2) and Regional Seas (R3) classifications, can be applied in few situations and had higher rates of bias and error

The regions with more divisions (CRA, CRB, MSFD, OSPAR) should be used in preference to these

Some evidence that the breeding success classification performs marginally better than the abundance classification

Benefit in using local data within the Leslie matrix, rather than regional pooling, where data allow this

# Further work

- Survival rates and standard deviations (stochastic LM)
- Density dependence in demographic rates
- Metapopulations
- Environmental change





# Thank you



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The Scottish Government's Contract Research Fund

