

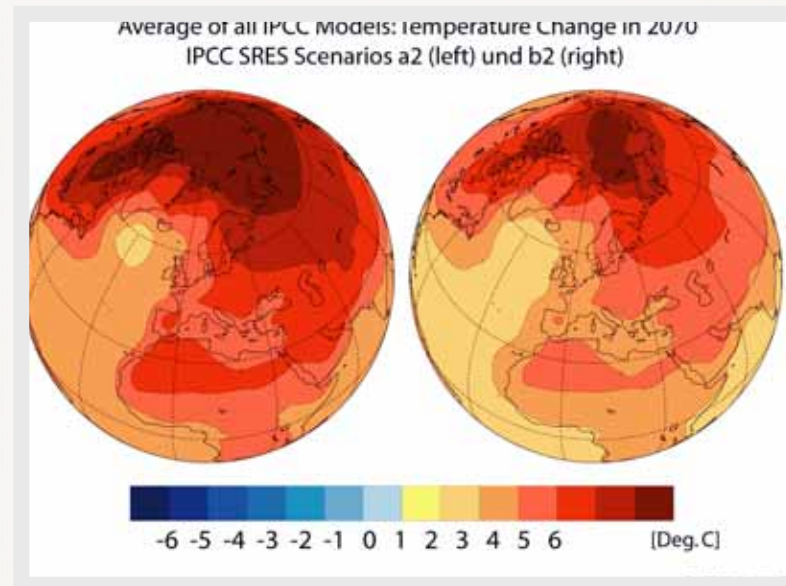
MODELLING POPULATION DYNAMICS: DENSITY STRUCTURED MODELS

Rob Freckleton
University of Sheffield

Royal Statistical Society 26th September 2007

CHALLENGES FOR APPLIED ECOLOGY

- Climate change
- Sustainable harvest
- Invasives
- Pest management



POPULATION MODELLING

- Biodiversity & GM crops
- Infectious diseases
- Single population management

TALK OUTLINE

- **Modelling Population Dynamics for Applications**
 - Problems with data
 - Problems with models
 - Density-structured models
 - Formulation
 - Application

DEMOGRAPHIC MODELS

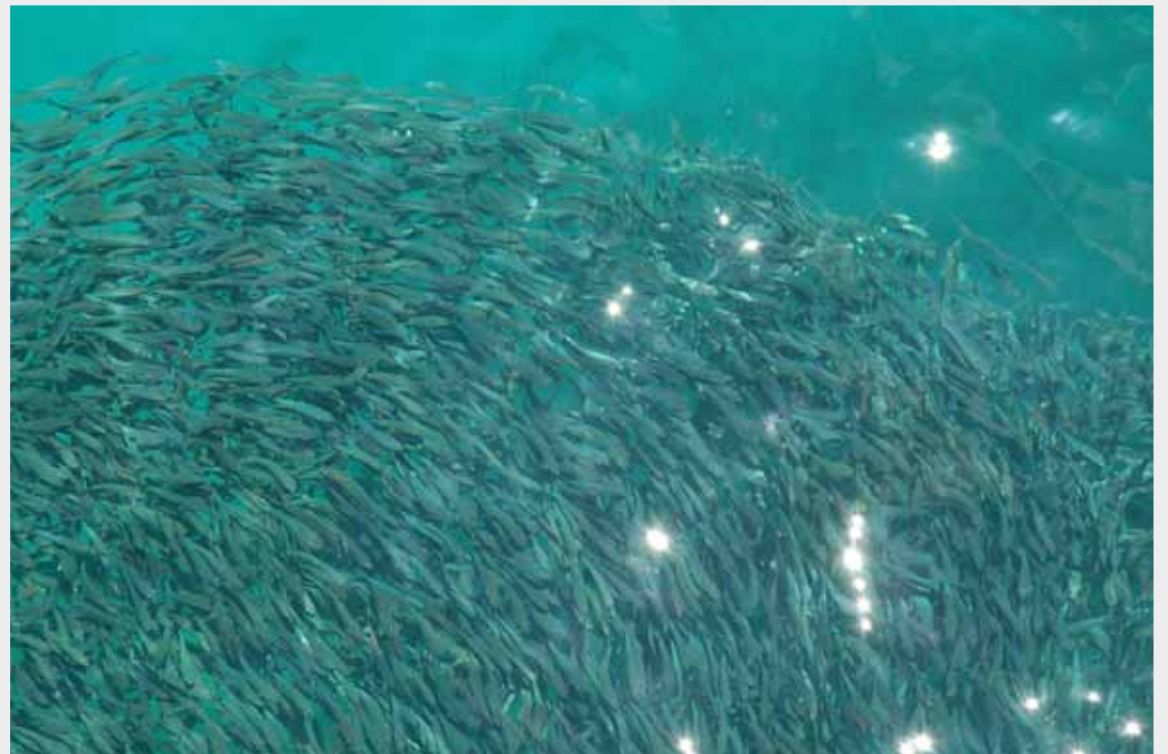
- State variable is $N(t)$
- $f(N)$ measures competition, density-dependence etc.
- λ is low density population growth rate

$$N(t+1) = \lambda N(t) f[N(t)]$$

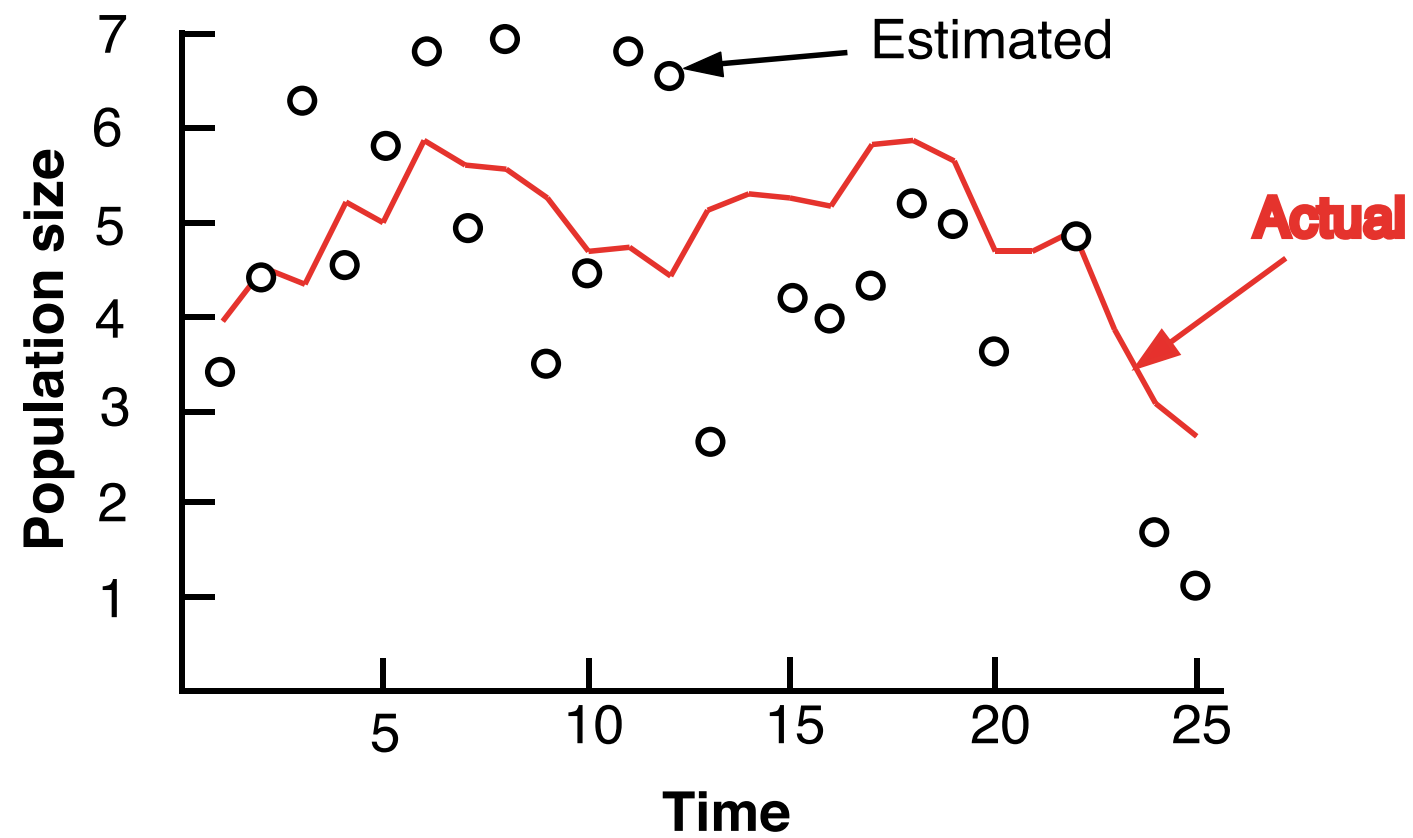
PROBLEMS WITH DATA

MEASUREMENT ERROR

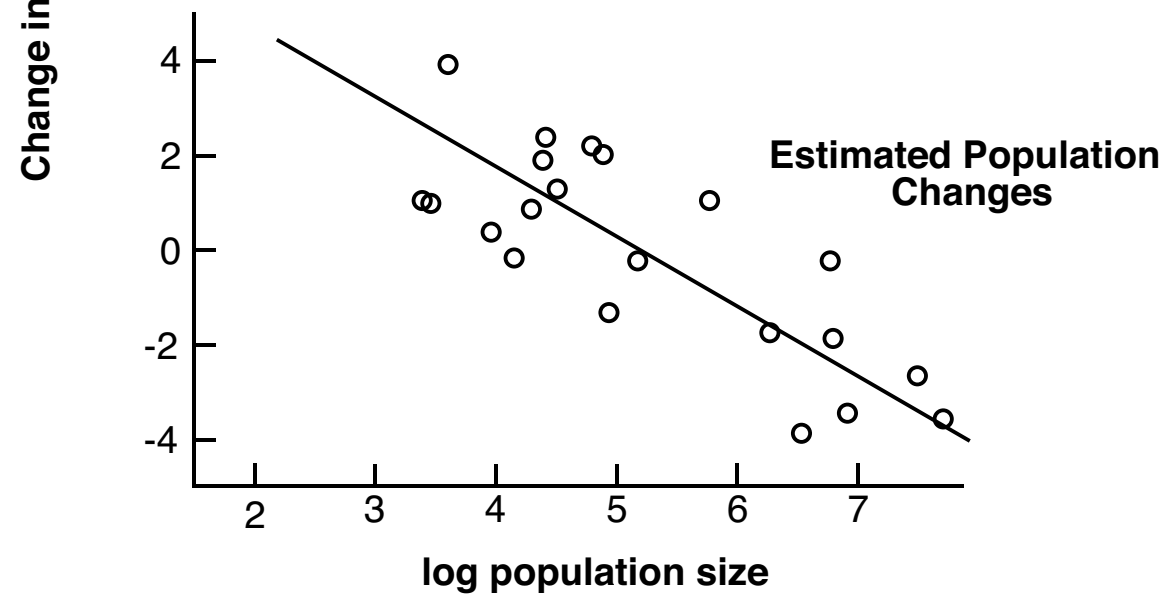
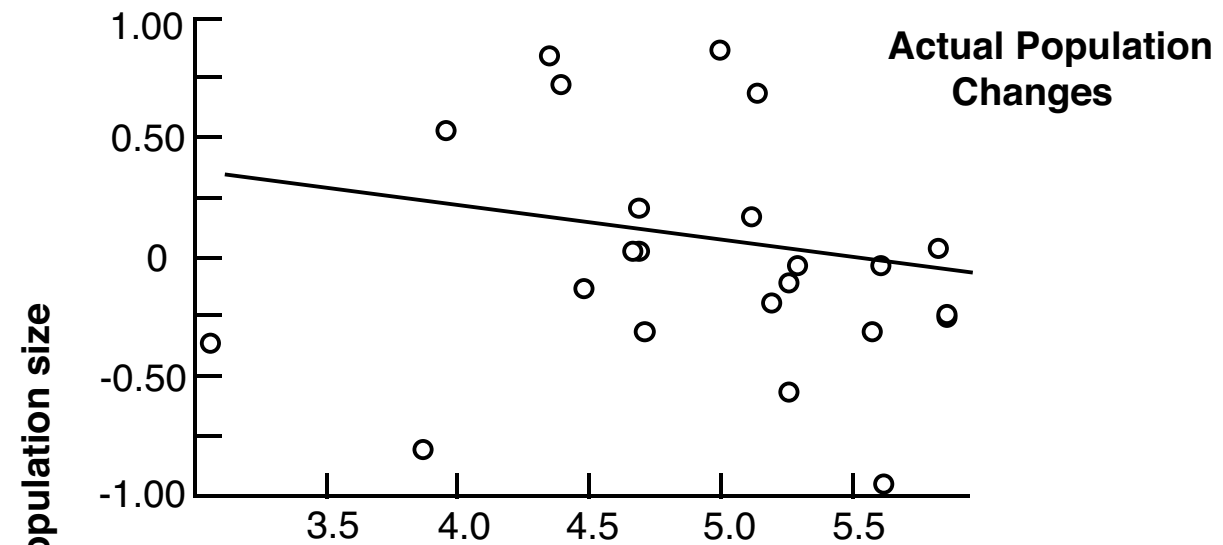
- Ecological data contain error
- Errors of measurement
- Estimation error



SPURIOUS DENSITY-DEPENDENCE



SPURIOUS DENSITY-DEPENDENCE



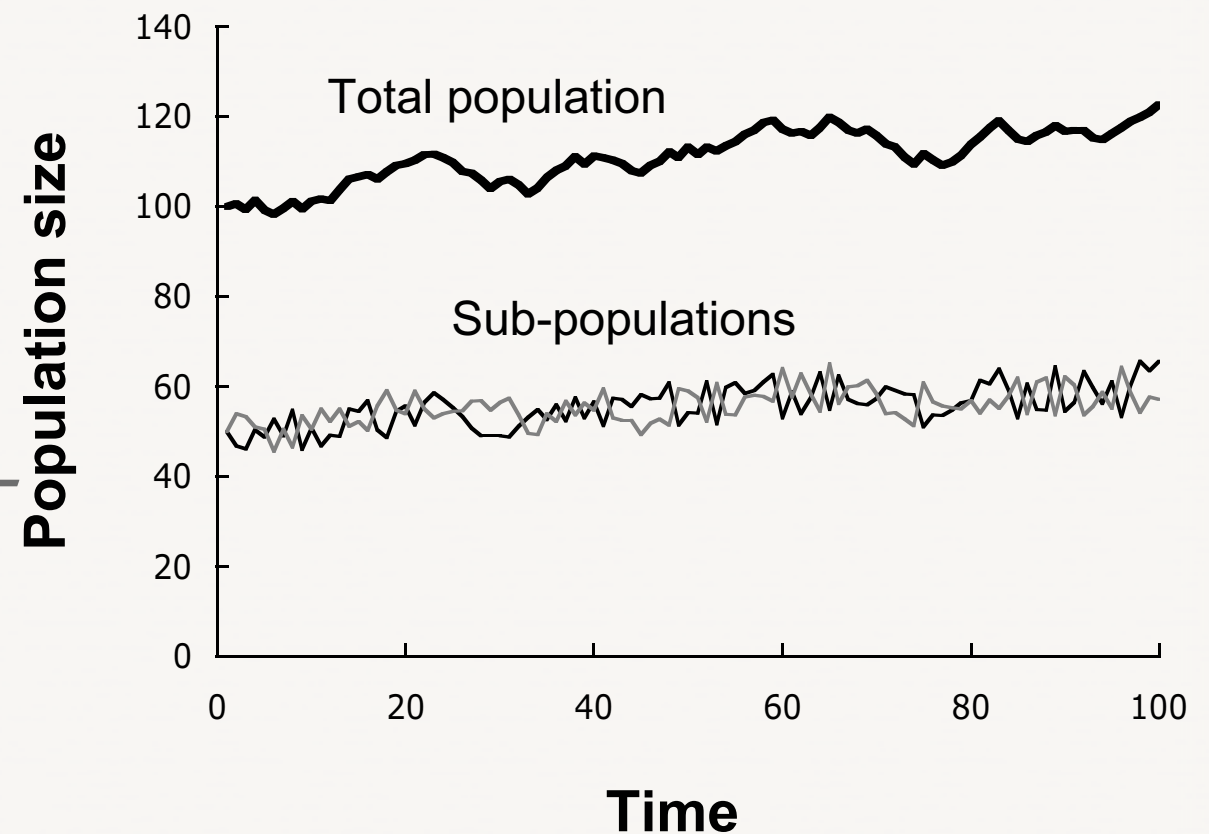
CLOSED POPULATIONS

- Populations are not discrete
- Movement into and out of populations is common

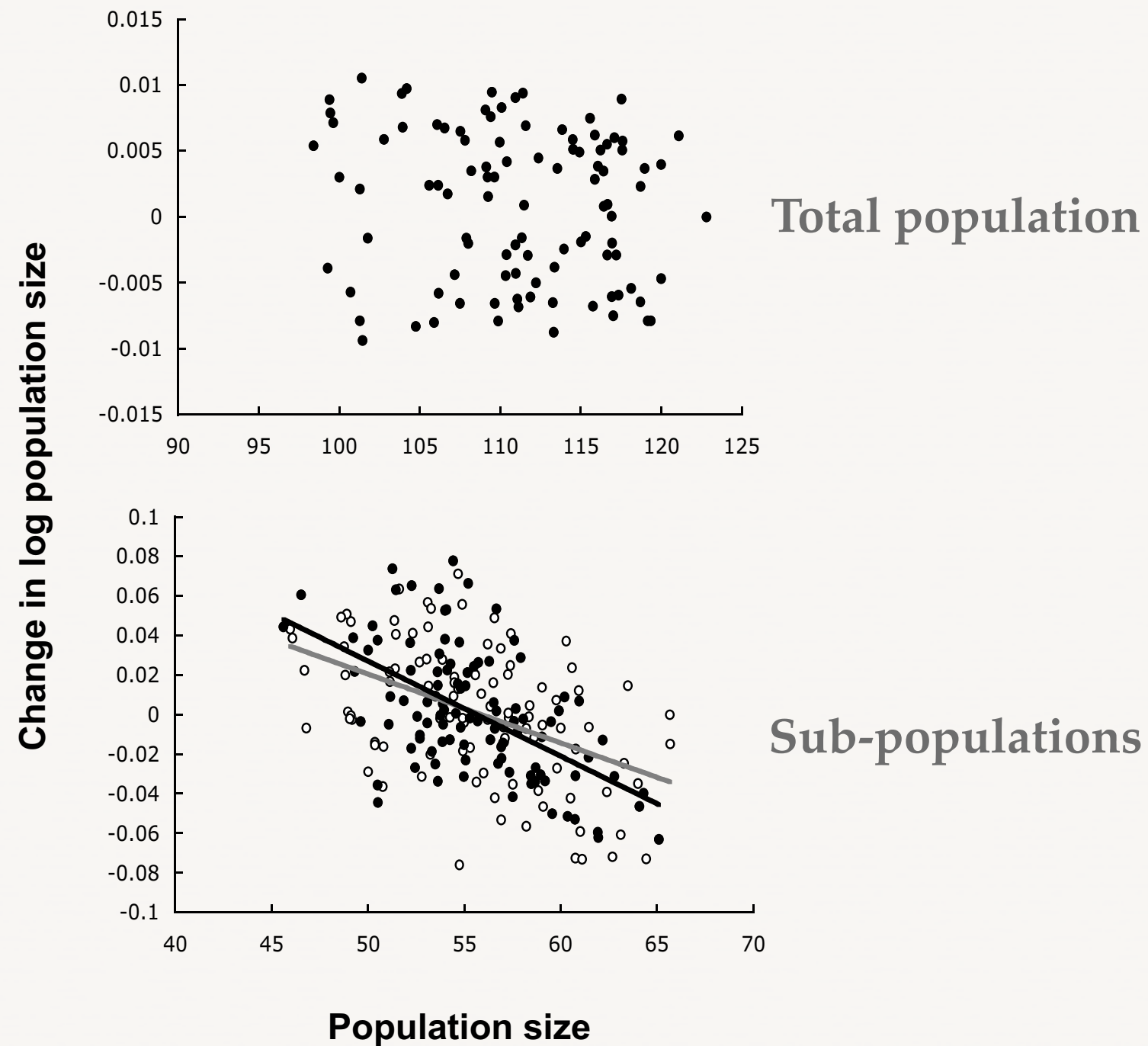


DYNAMICS OF UNCLOSED POPULATIONS

- Total population composed of two sub-populations
- Small amount of movement between sub-populations
- No density-dependence in total population



SPURIOUS DENSITY DEPENDENCE



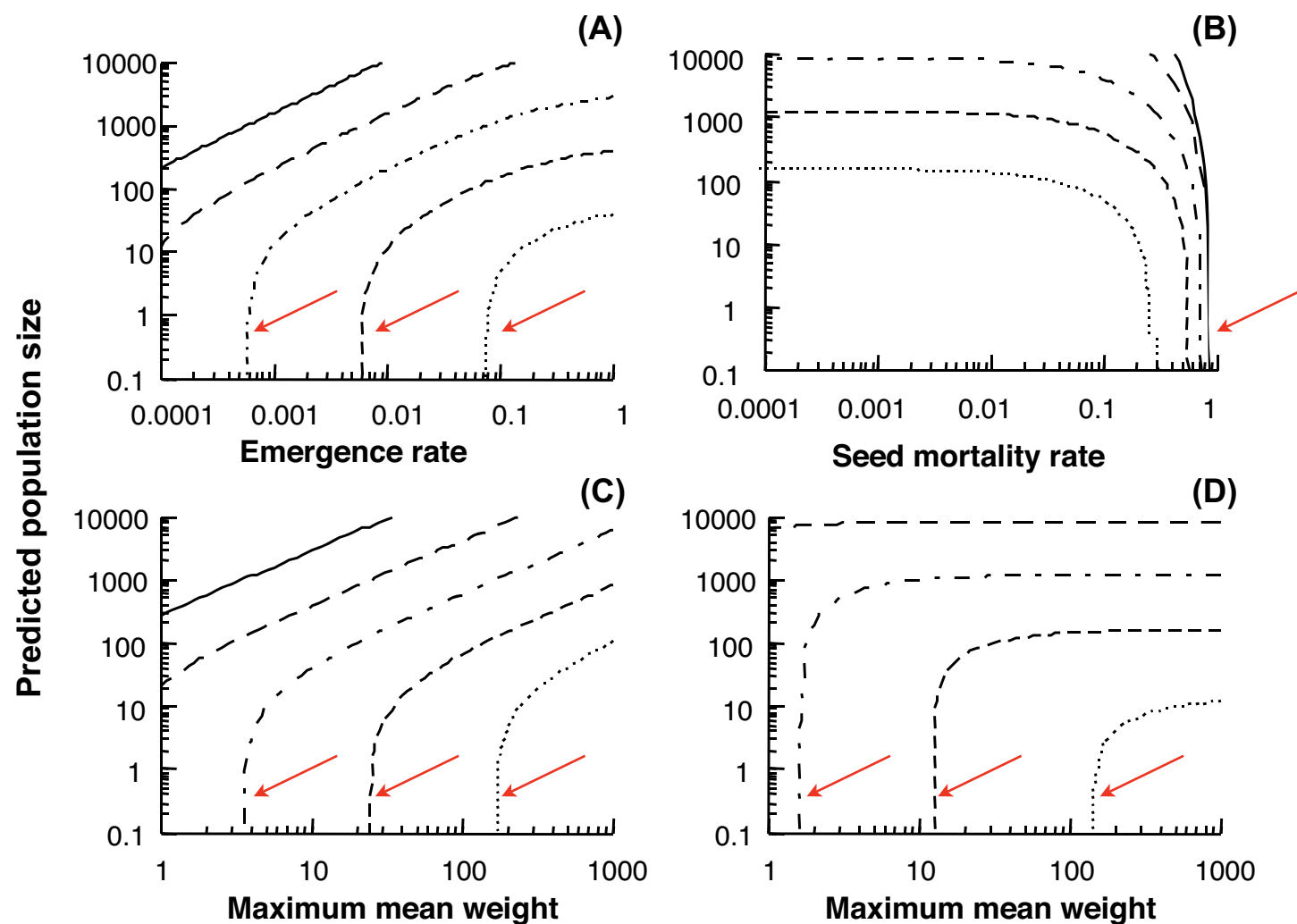
SOLUTIONS

- Randomisations
- Likelihood
- Simex
- State-space models

All require census error to be estimated

PROBLEMS WITH DEMOGRAPHIC MODELS

NUMERICAL INSTABILITY



**Models are frequently
numerically unstable
near to extinction
boundaries**

CONSEQUENCES

- Model may be wrong?
- Quantify parameter error
- Alternative model formulation?

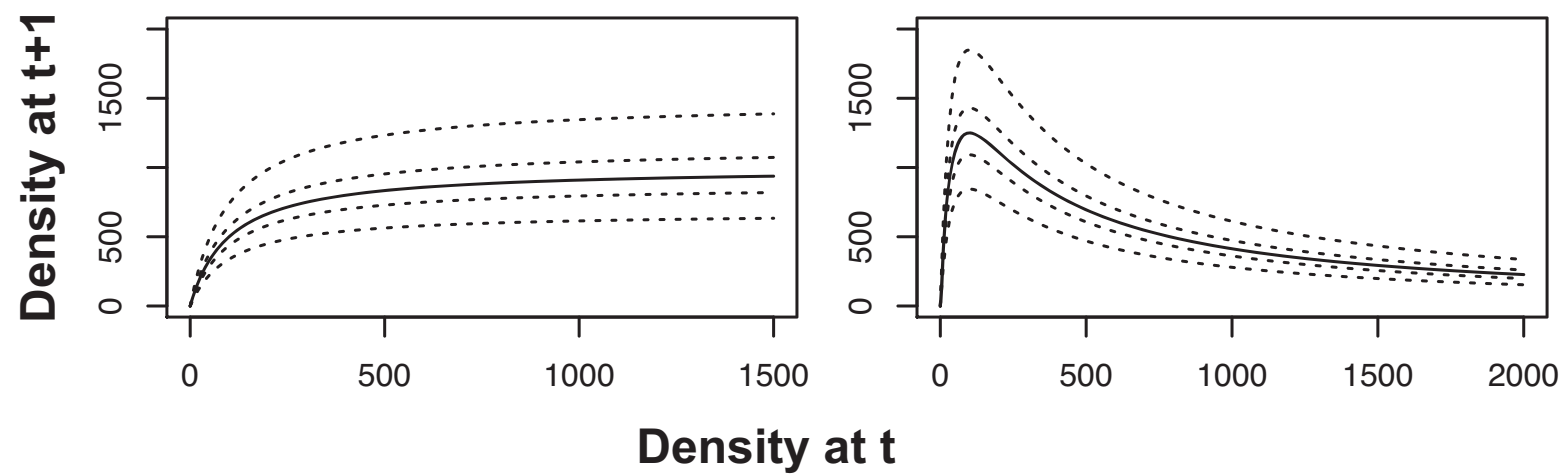
DENSITY-STRUCTURED MODELS

DENSITY-STRUCTURED MODELS

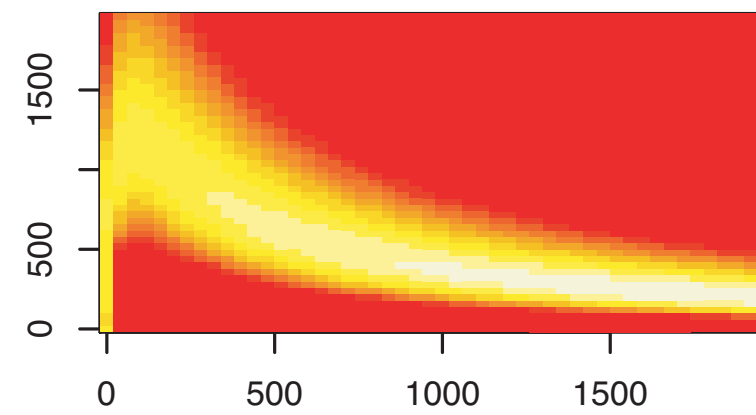
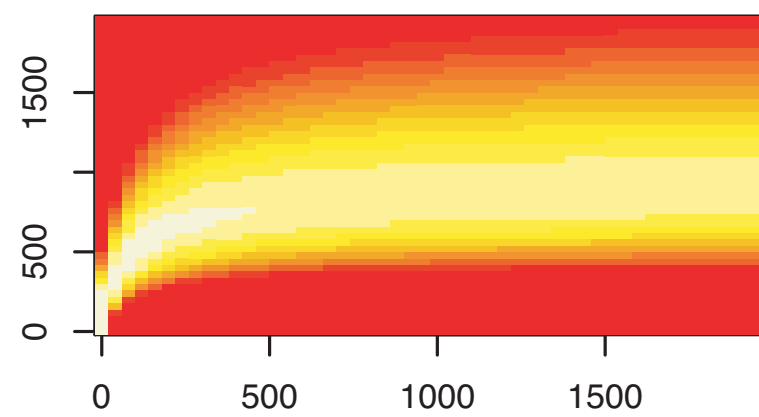
- State variable is $\mathbf{N}(t)$
- \mathbf{N} is a set of ordered density states
- \mathbf{T} models transitions between states
- Model is empirical

$$\mathbf{N}(t + 1) = \mathbf{T} \cdot \mathbf{N}(t)$$

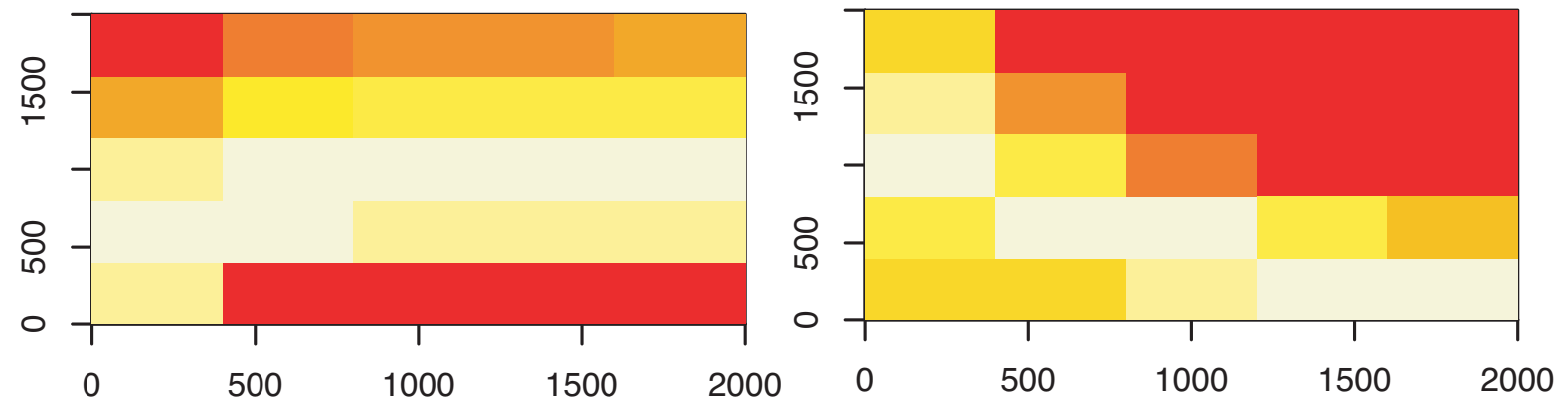
Continuous Density Stochastic Model:



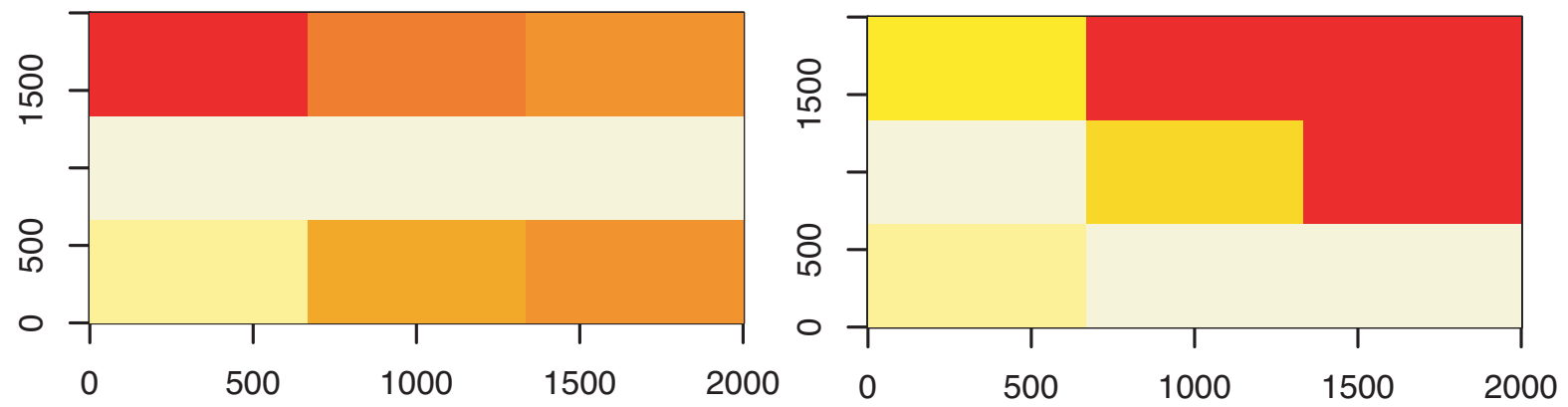
50 State Model:



5 State Model:

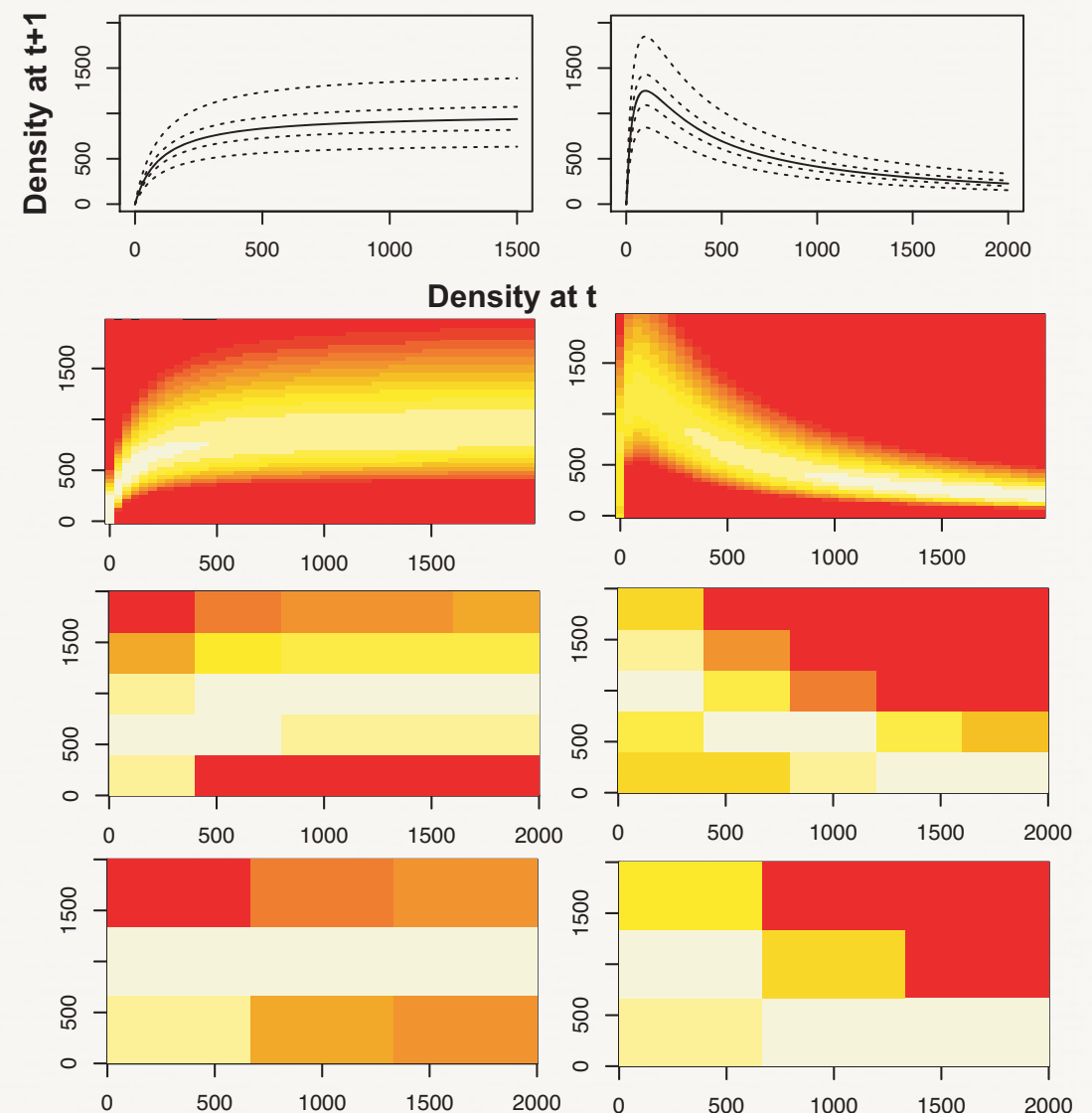


3 State Model:

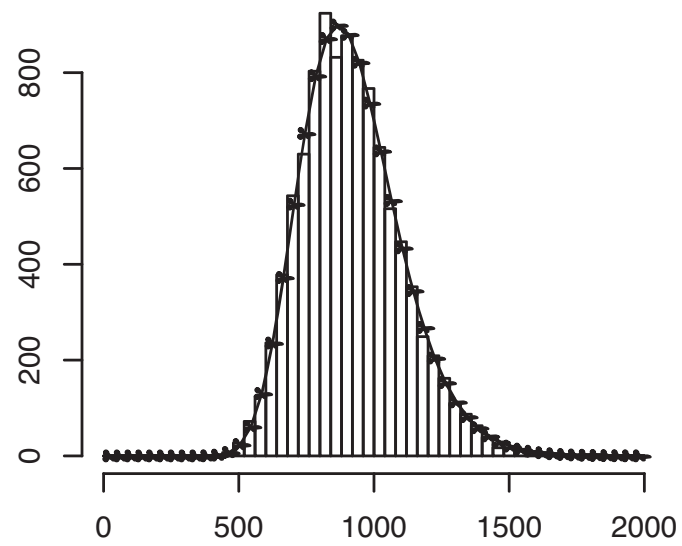
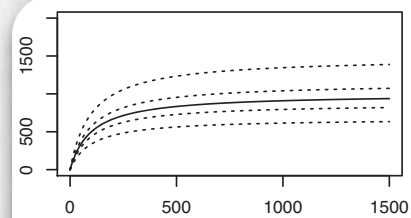


DENSITY-STRUCTURED MODELS

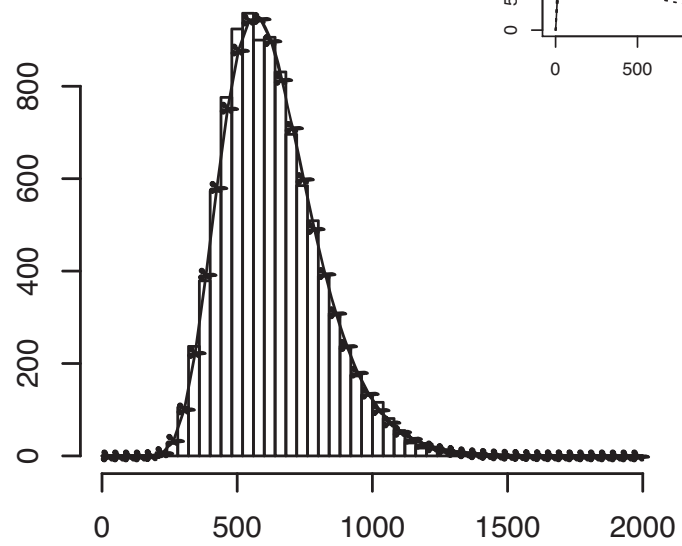
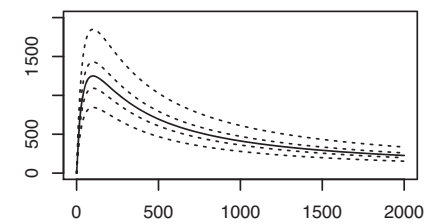
- DS models capture stochastic population dynamics
- Explicitly empirical focus
- Readily parameterised



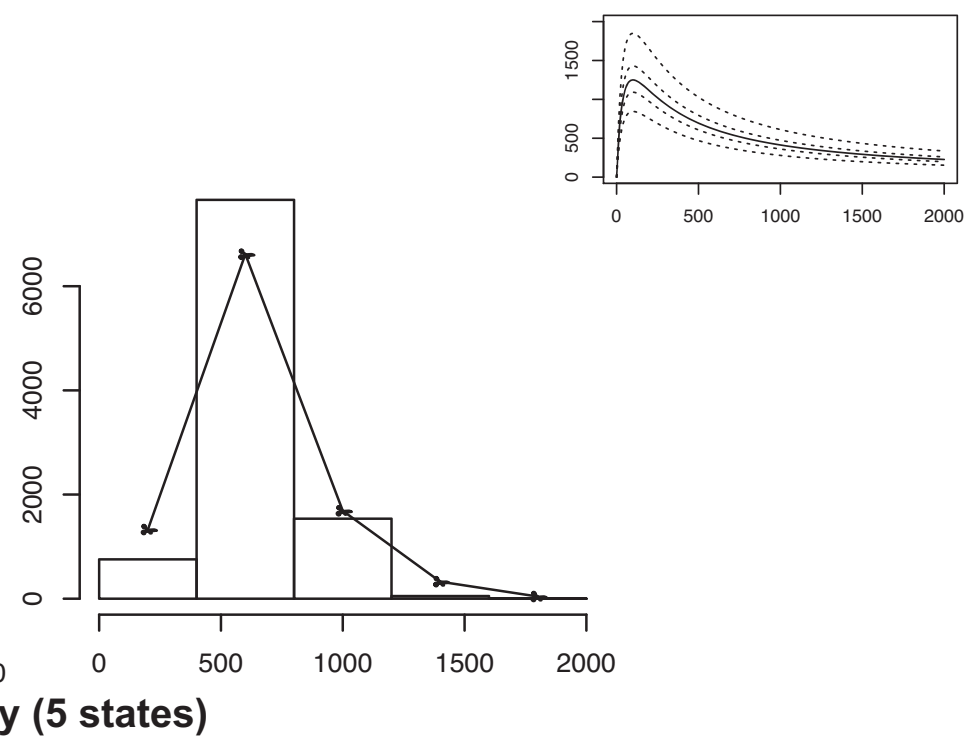
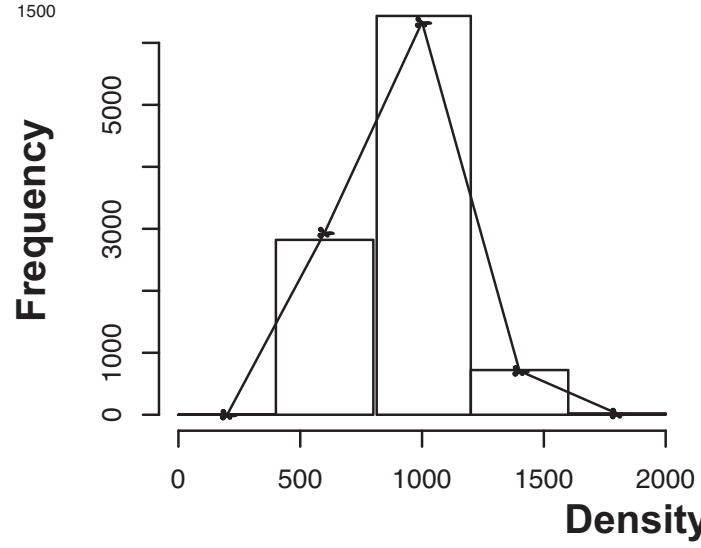
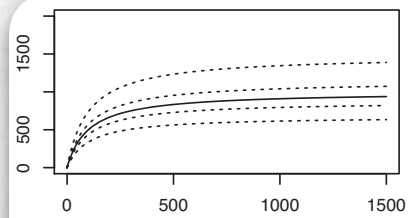
50 State Model:



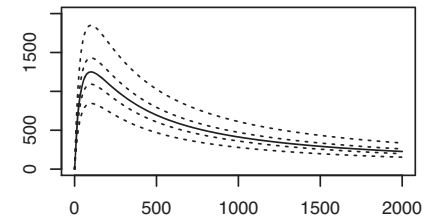
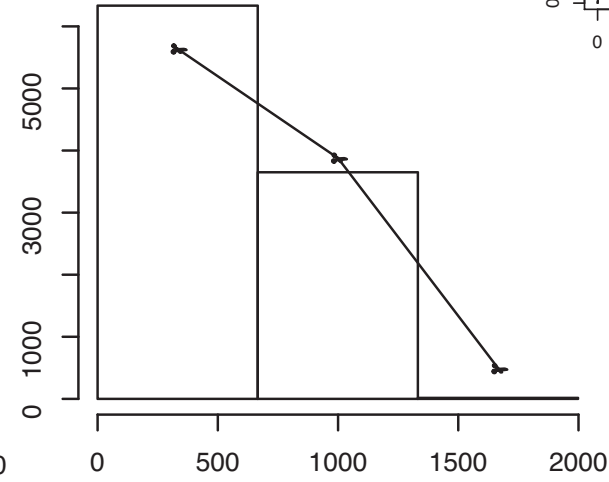
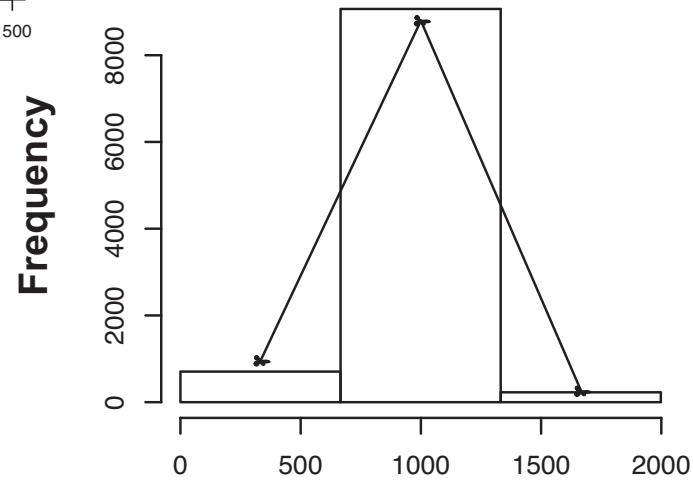
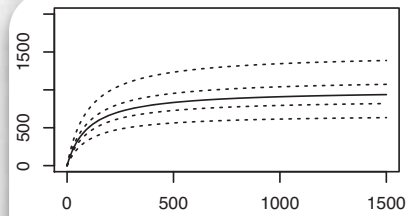
Density (50 states)



5 State Model:



3 State Model:



Density (3 states)

ANALYTICAL ADVANTAGES

- Do not need to specify functions
- Relatively simple to analyse
- Census error easy to analyse
- Model output is numerically stable

PRACTICAL ADVANTAGES

- Data are rapid to collect
- Allows multiple field sites to be studied
- Even with few personnel
- Lots of data available



APPLICATION

1. ARABLE WEEDS

ARABLE WEEDS

- Annual plants in arable crops
- Reduce yields
- Often have positive effects on biodiversity



RESEARCH QUESTIONS

- How do weeds respond to management?
- How does management influence biodiversity?
- What are the economic and social drivers of management and biodiversity?



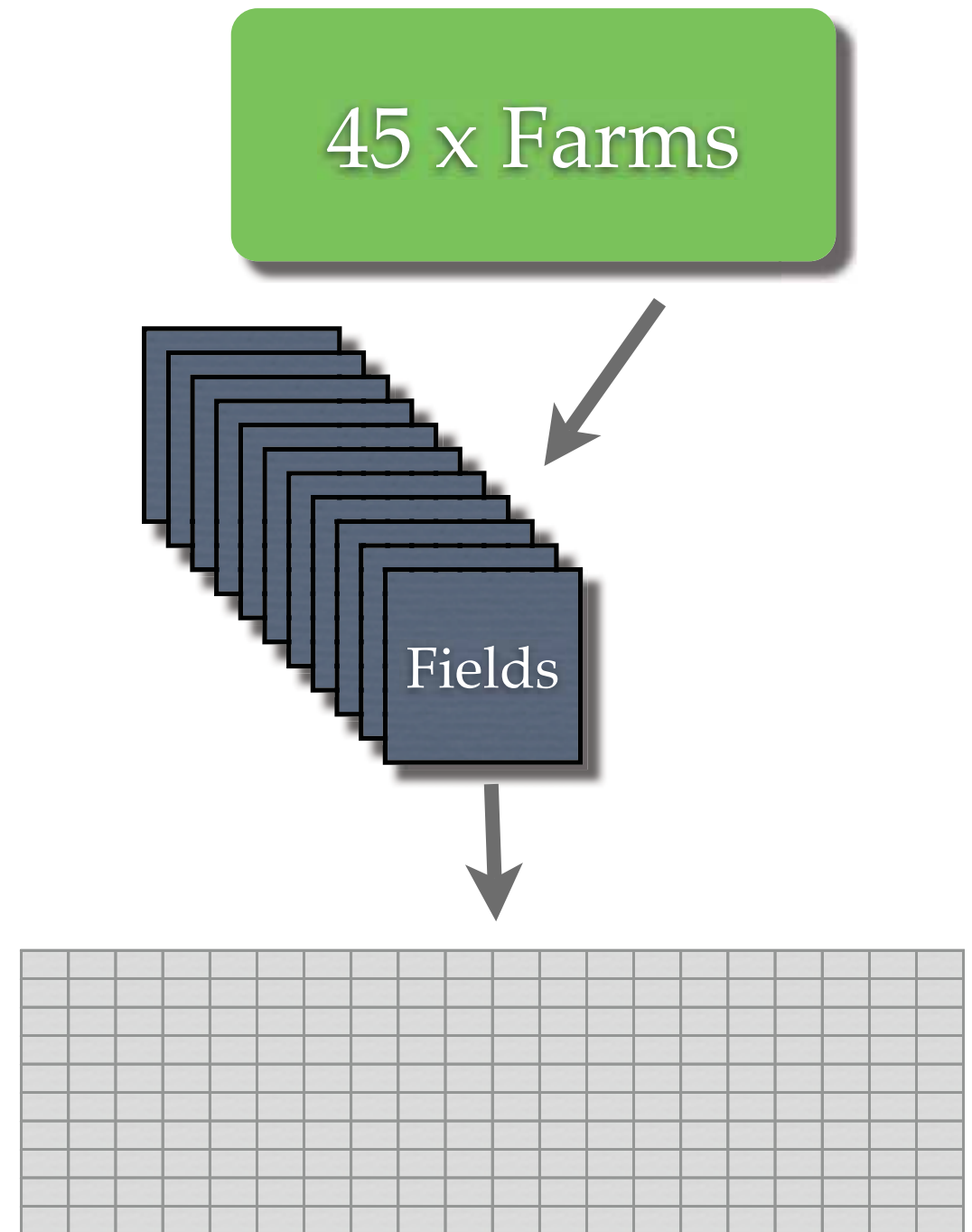
ISSUES

- Huge variation in density
- Between farms
- Between fields on a farm
- Between years

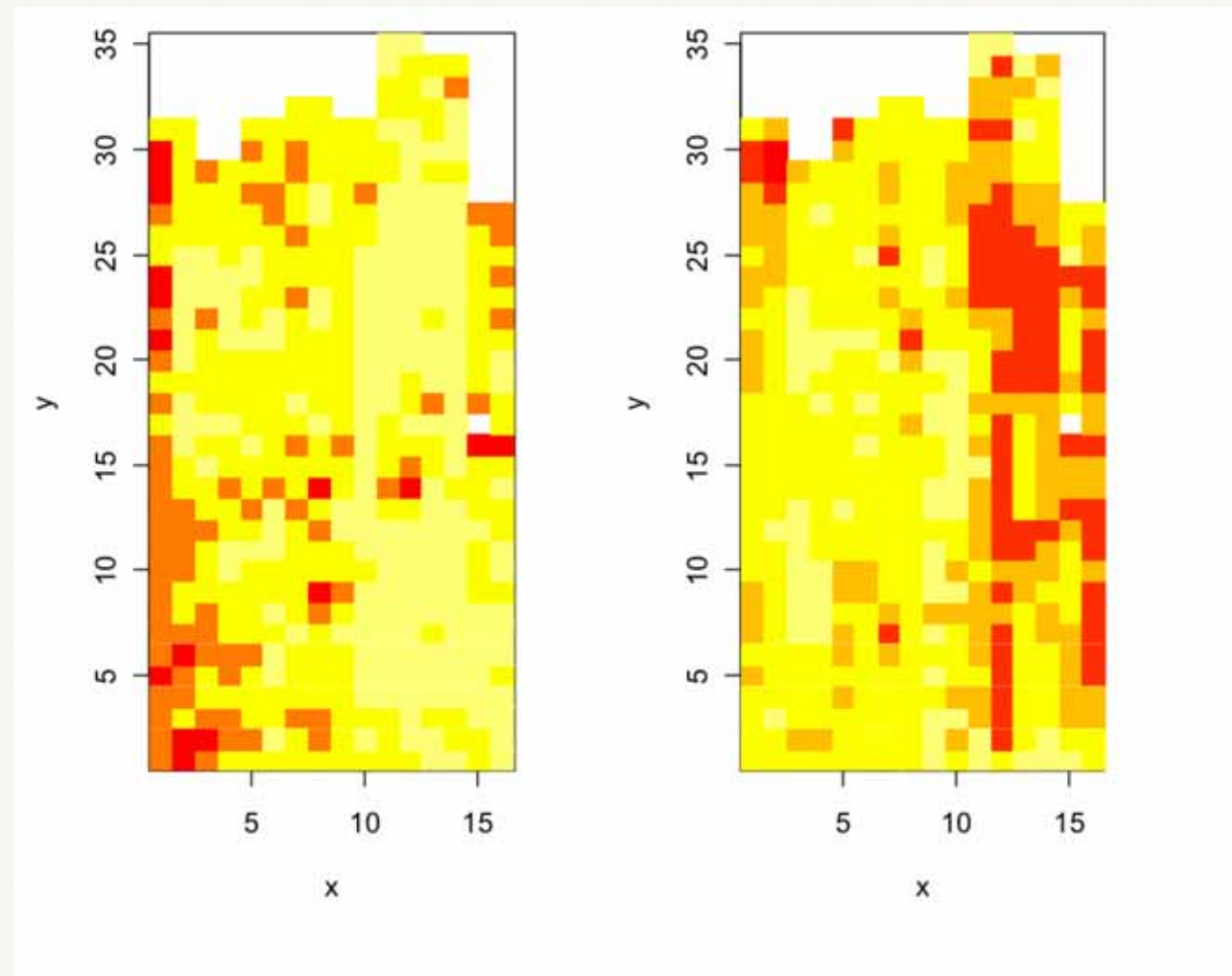


MODELLING ARABLE WEEDS

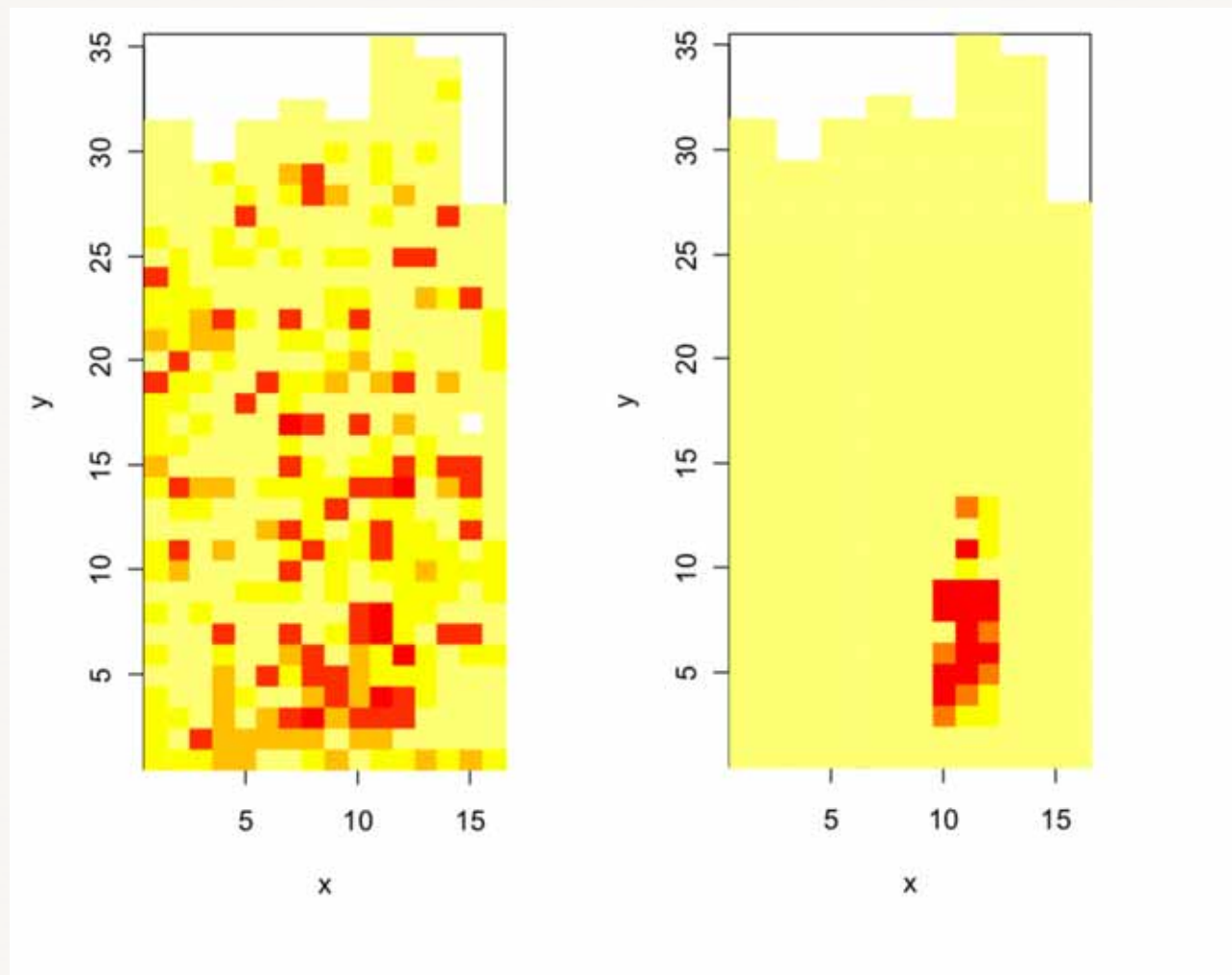
- Hierarchical survey
- 45 arable farms (Beds, Lincs & Norfolk)
- 10 fields per farm
- Fields monitored down to 20m x 20m scale
- 900 ha surveyed in total



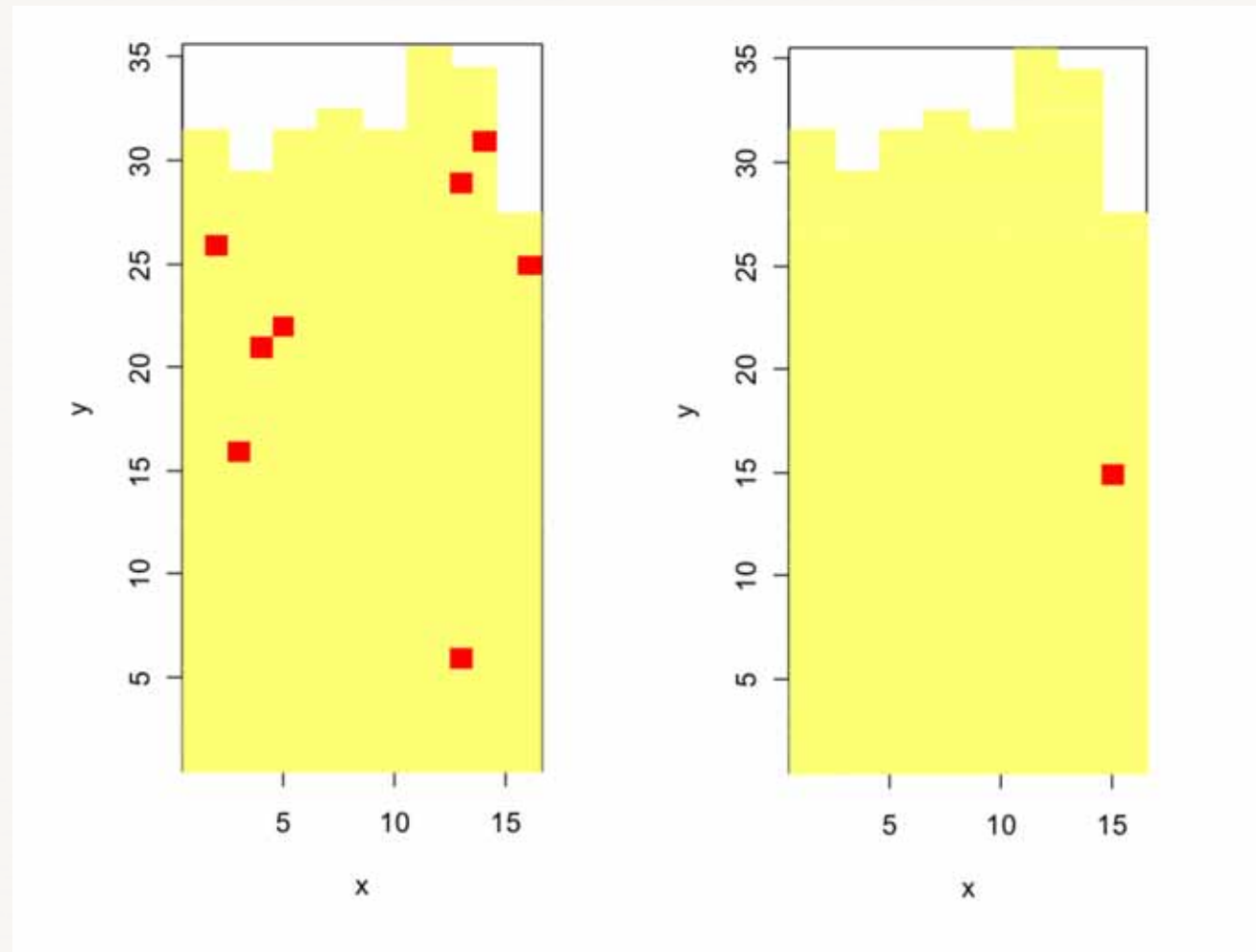
EXAMPLE DATA - GRASS WEEDS



BROAD-LEAVED



SCARCE / PATCHY WEEDS



EXAMPLE DATA - BLACKGRASS

FARM

A

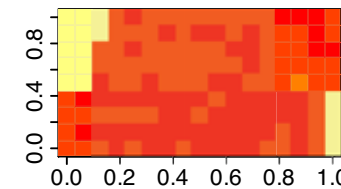
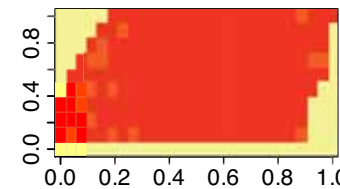
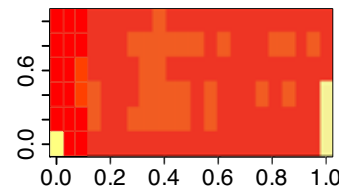
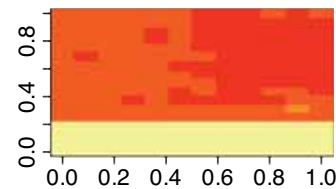
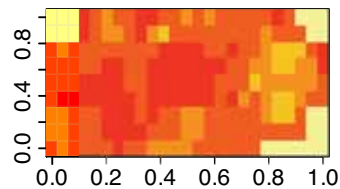
B

C

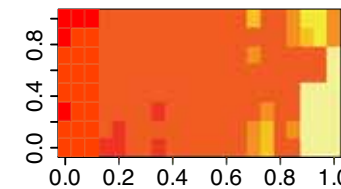
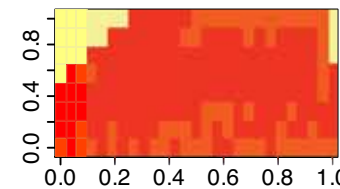
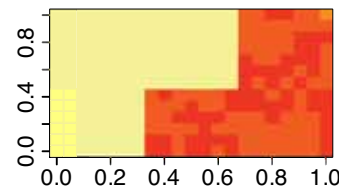
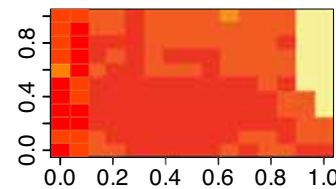
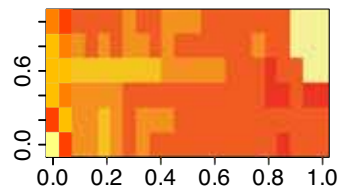
D

E

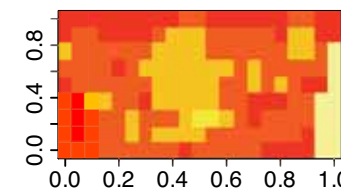
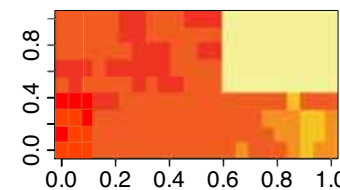
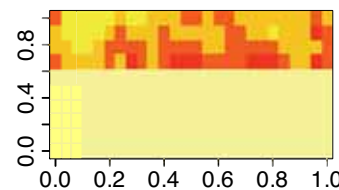
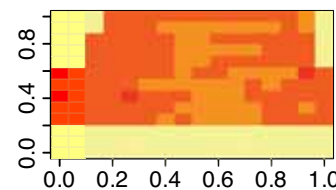
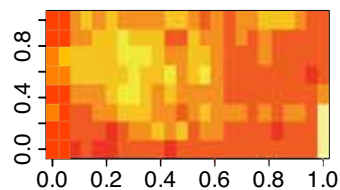
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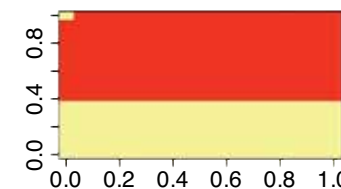
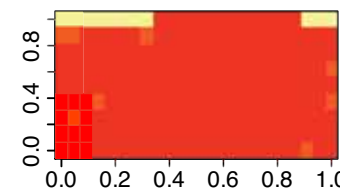
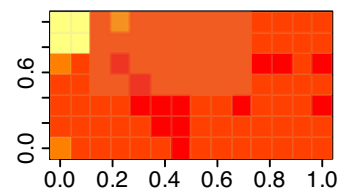
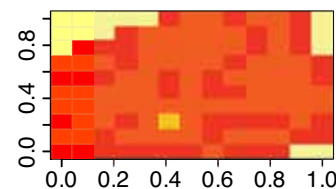
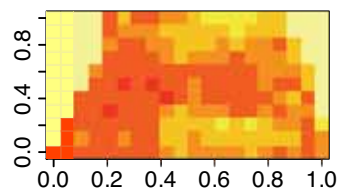
2



3



4



FIELD

ON-GOING

- Continue monitoring for 2 more years
- Interview farmers
- Classification errors
- 'Ground-truthing'

APPLICATION

2. WREN POPULATIONS

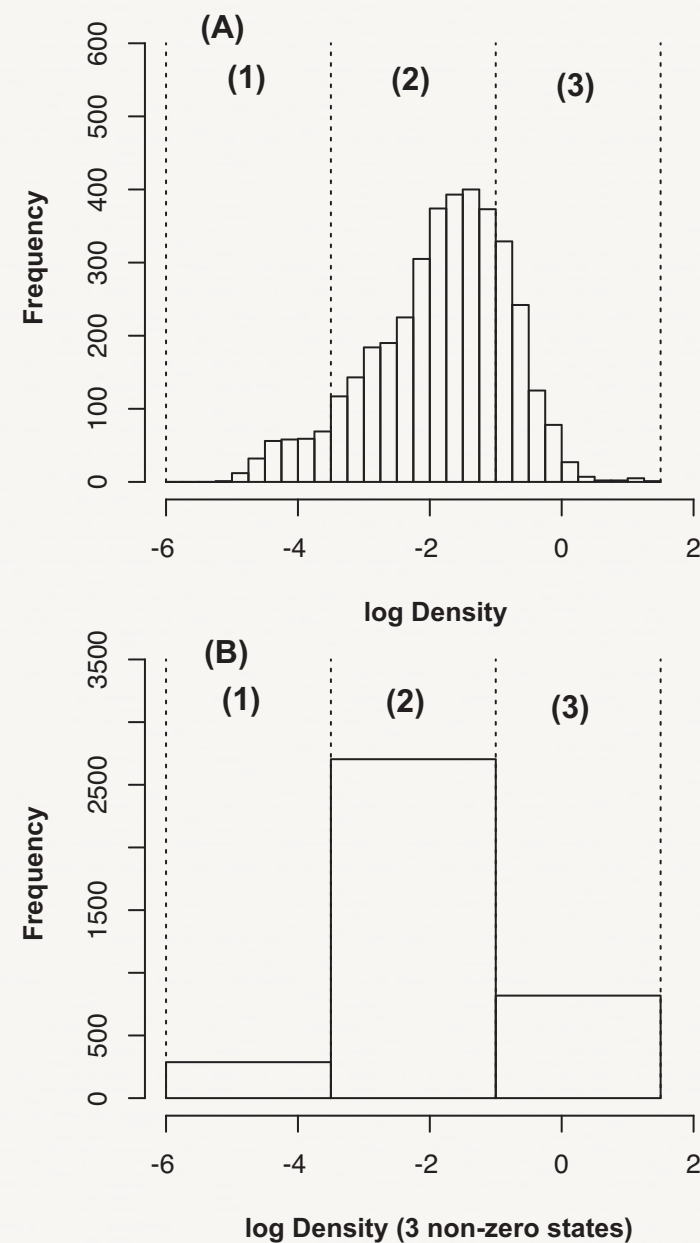
COMMON BIRD CENSUS

- Standardised estimate of breeding birds
- 1964 - 2000
- c. 200 sites per year throughout UK
- Number of breeding pairs recorded
- No estimate of census error

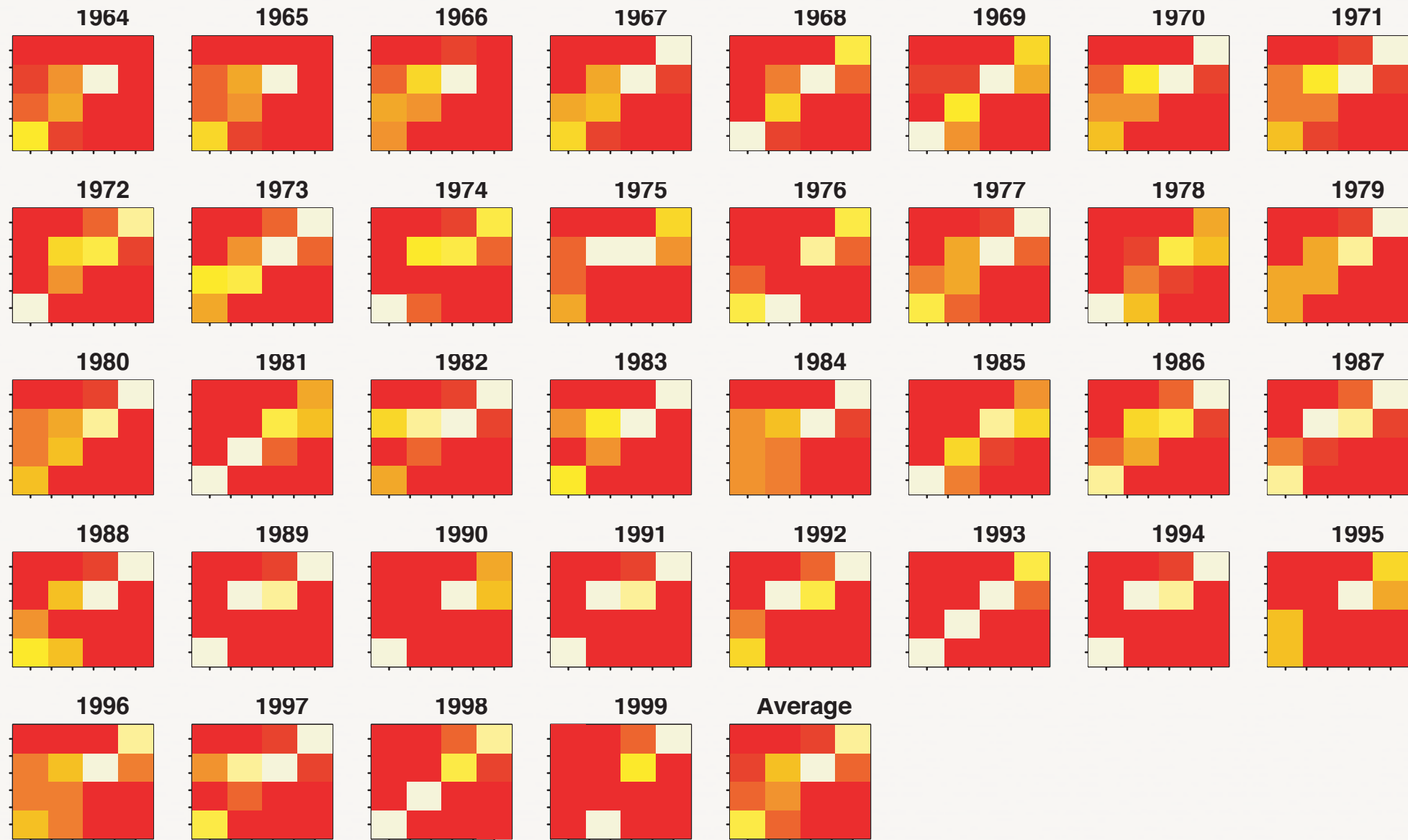


4-STATE MODEL

- Divide data into 3 non-zero states & zero state
- Analyse as DS model

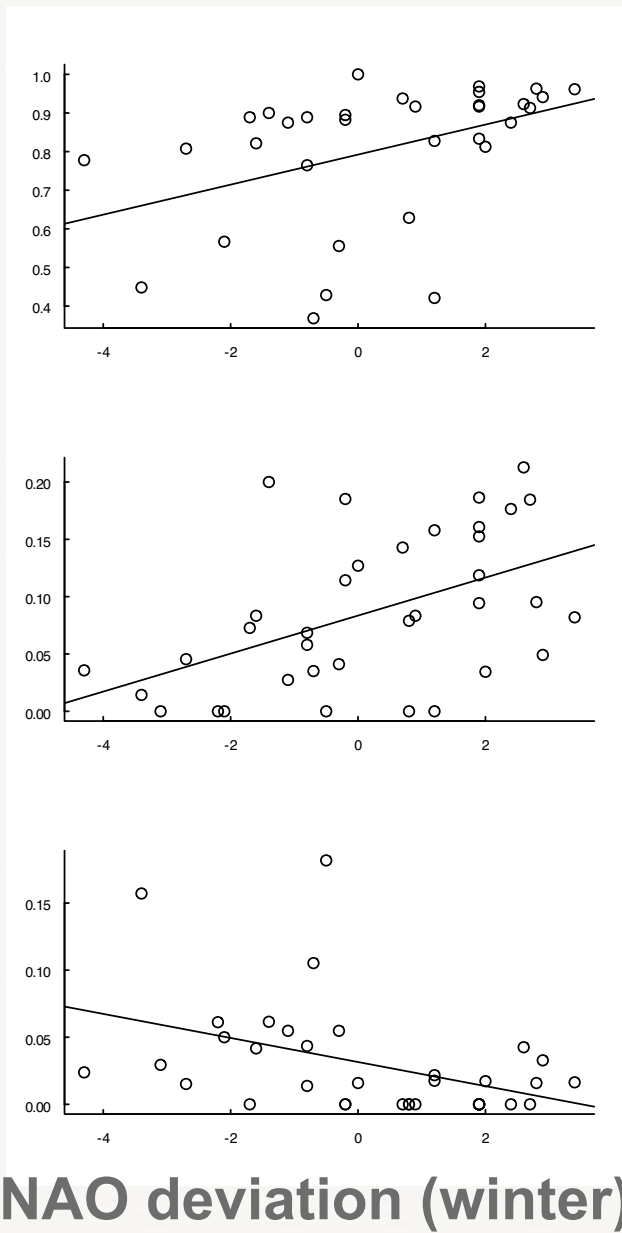


4-STATE MODEL FOR WRENS



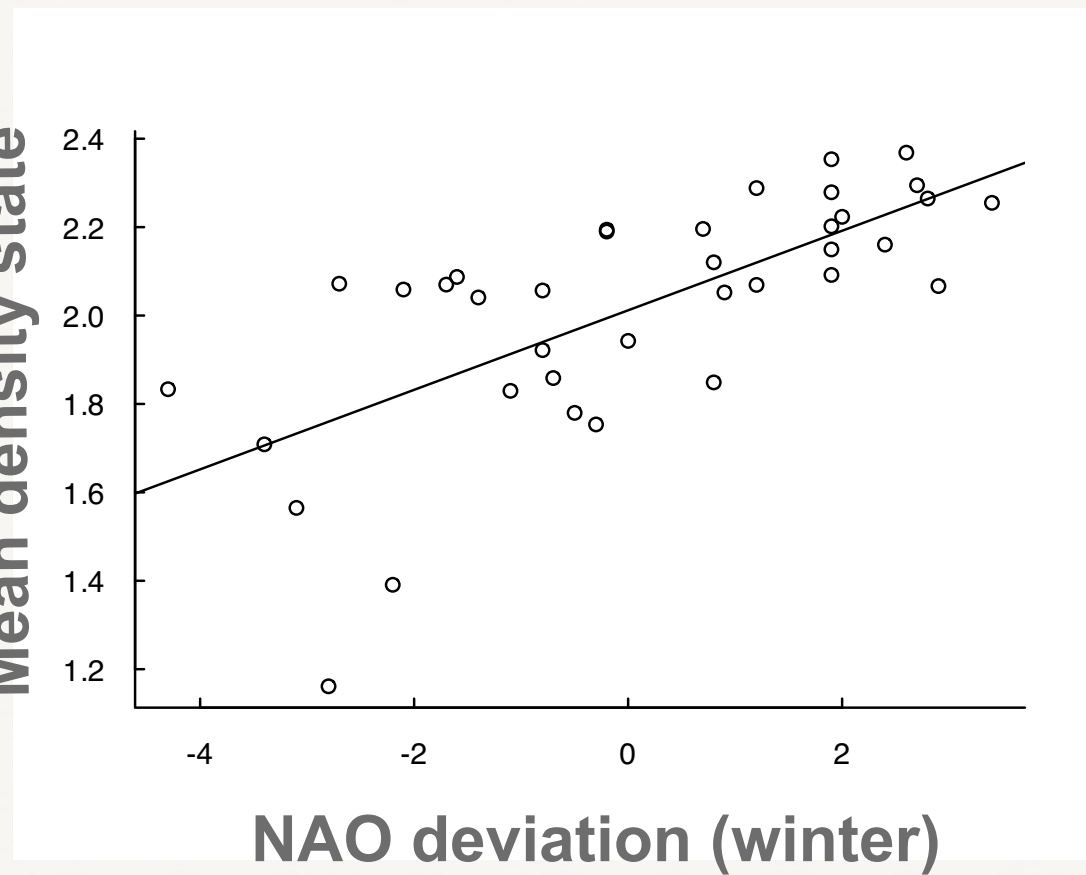
CORRELATION WITH NAO INDEX

Annual Transition Probability



NAO deviation (winter)

Mean density state



NAO deviation (winter)

CONCLUSION

SUMMING UP

- Empirical models useful for developing models
- Linked closely to data collection
- Analysis reveals determinants of change
- Development of statistical methodology

ACKNOWLEDGMENTS

- Bill Sutherland
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- Rhys Green
- Phil Stephens
- Simon Queenborough
- David Noble

