

# False positives and false negatives in citizen science monitoring data: should we be worried?

Sam Cruickshank

Department of Environmental Studies and Evolutionary Biology

University of Zürich

Switzerland



# Introduction

Citizen Science -> large scale data collection

- Essential for species monitoring

Data quality still perceived as major problem

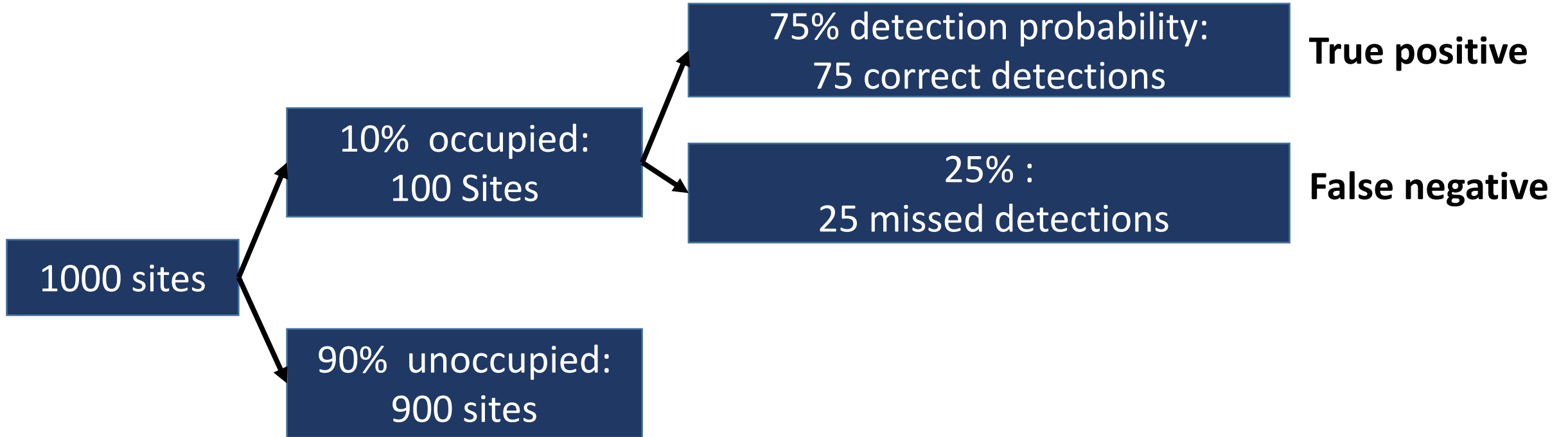
Repeat observations allow modelling of these observer effects

In species monitoring, quality can be characterised as:

- **False negatives**
- **False positives**



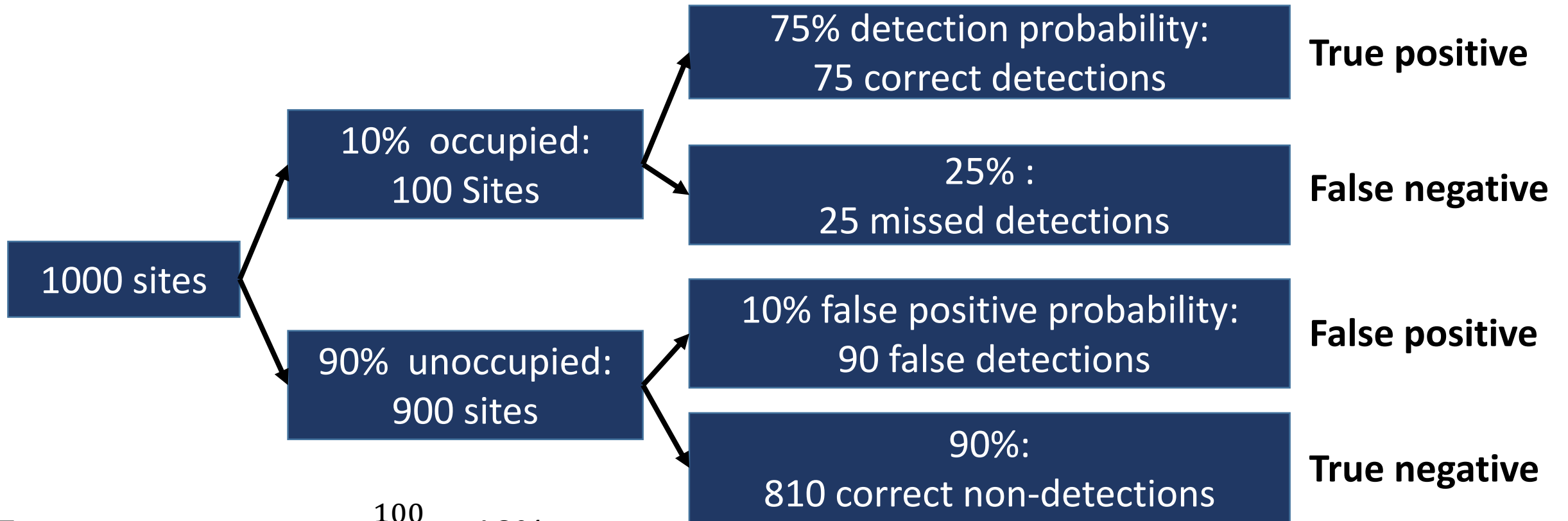
# Observation Biases



True occupancy rate  $\frac{100}{1000} = 10\%$

Estimated occupancy rate  $\frac{75}{1000} = 7.5\%$

# Observation Biases

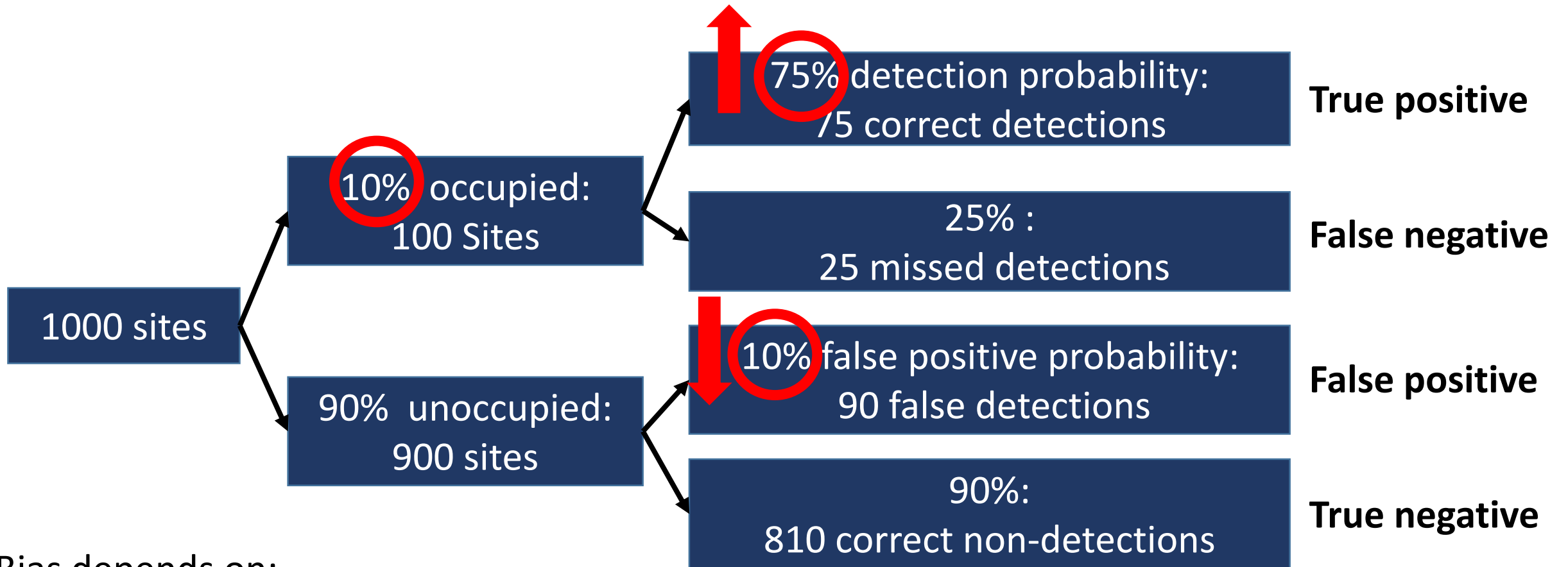


True occupancy rate  $\frac{100}{1000} = 10\%$

Estimated occupancy rate  $\frac{75+90}{1000} = 16.5\%$

False discovery rate  $= \frac{90}{90+75} = 55\%$

# Observation Biases



Bias depends on:

- True occupancy
- False positives/imperfect detection rates

More visits = higher cumulative detection probability  
= lower cumulative false 'discovery' rate

# Observation Biases

10 visits at a site

Possible site histories include:

a) **0000100000**

b) **1101111111**

**True positive**

**False negative**

**False positive**

**True negative**

Bias depends on:

- True occupancy
- False positives/imperfect detection rates

More visits = higher cumulative detection probability  
= lower cumulative false-positive rate



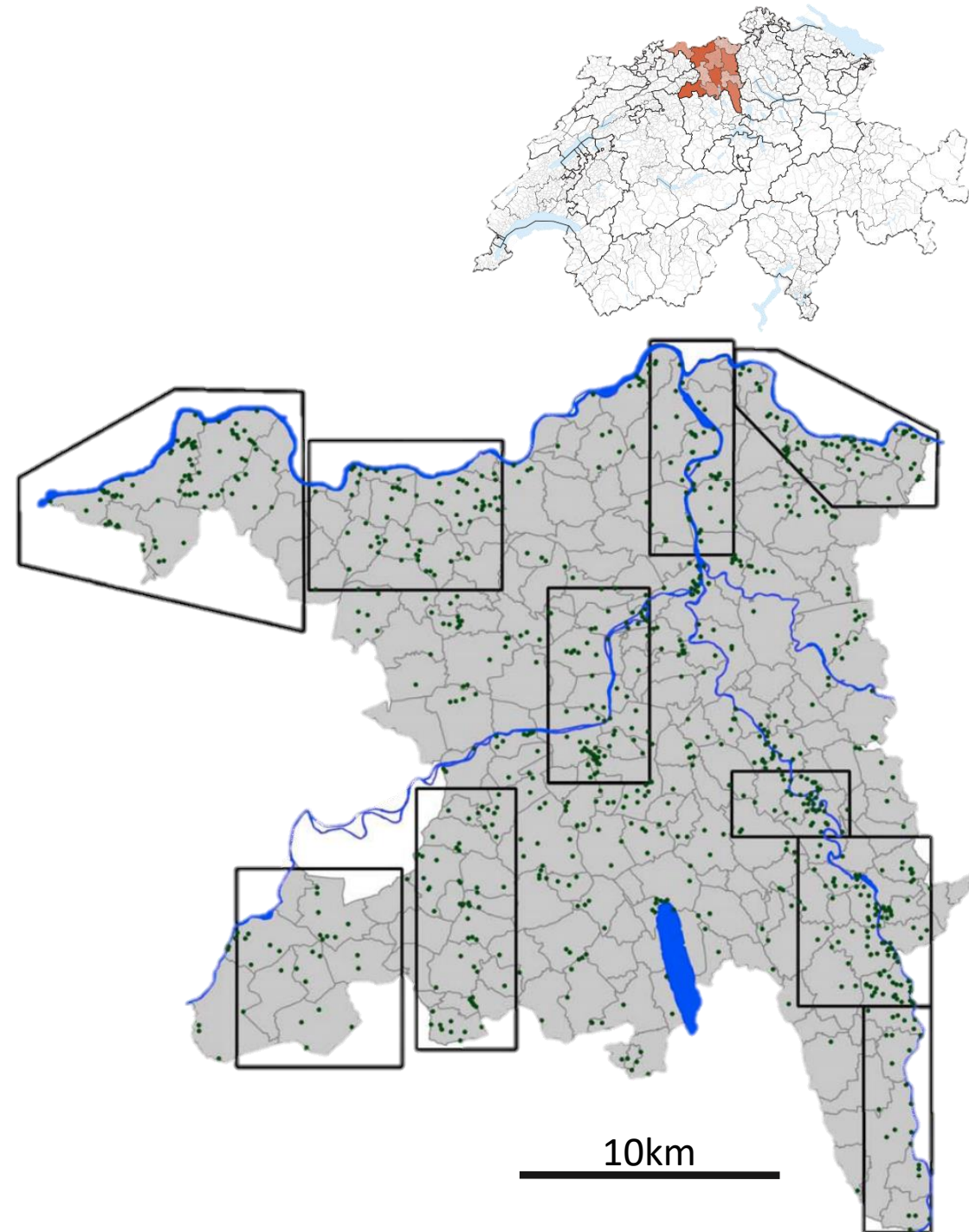
# Research Objectives

- Estimate prevalence of Imperfect detection  
False positives
- How do these rates bias population trend estimation



# Study System

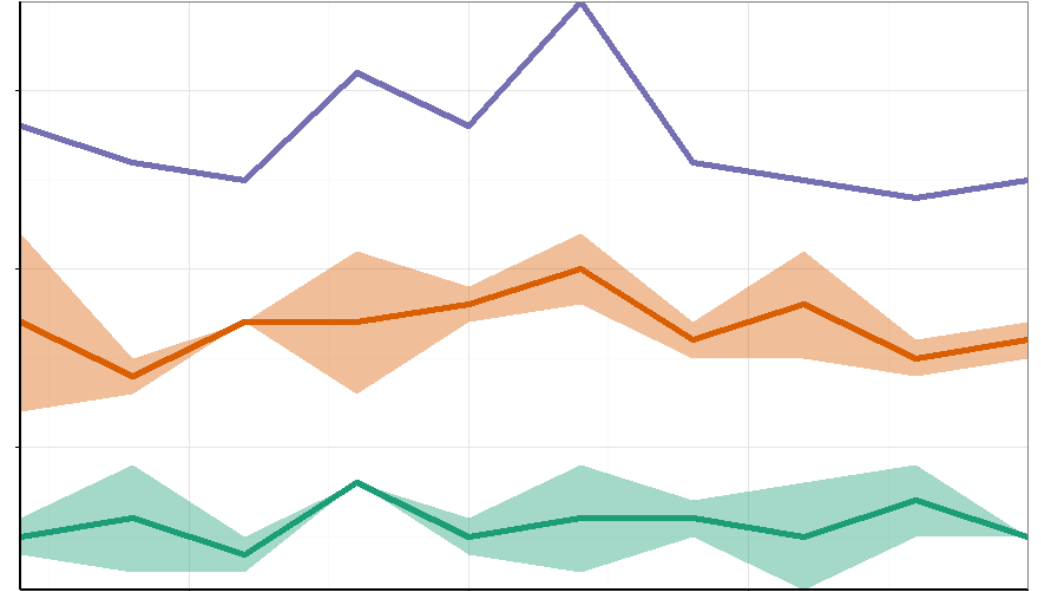
- 1999-2013
- 1054 sites
- 10 core areas surveyed every 3 years
- 3 surveys/ year
- Counts of all amphibians recorded





# Modelling Approach

- Focus on occupancy (not count) data
- Each species separately
- Dynamic occupancy models
  - Occupancy
    - Trend calculation
  - Survival
  - Colonisation



## 3 Models:

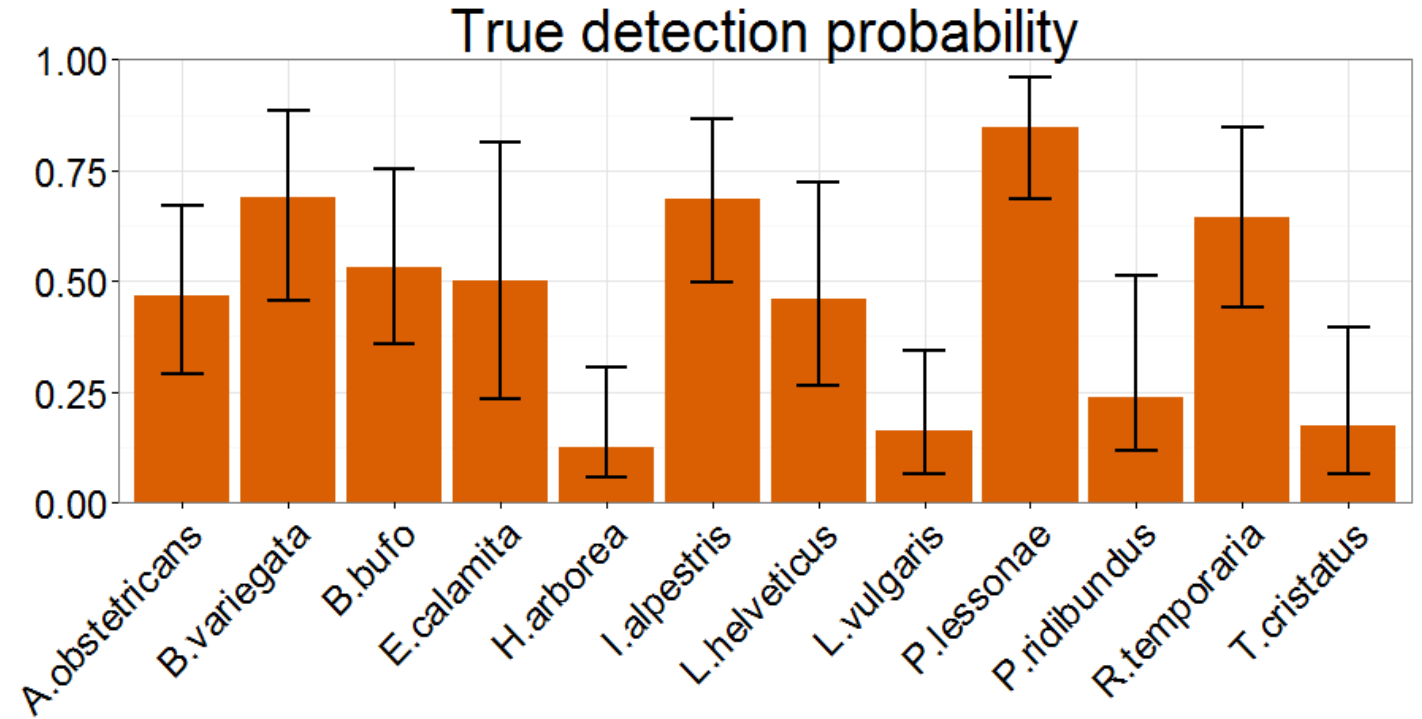
- Naïve - observed data
- False negatives - estimate imperfect detection
- False positives - both imperfect detection and false positives

# Preliminary Results: Imperfect detection

Per-visit detection  
(when species is present)

Bars= 95% credible intervals

- 12 species
- High variation

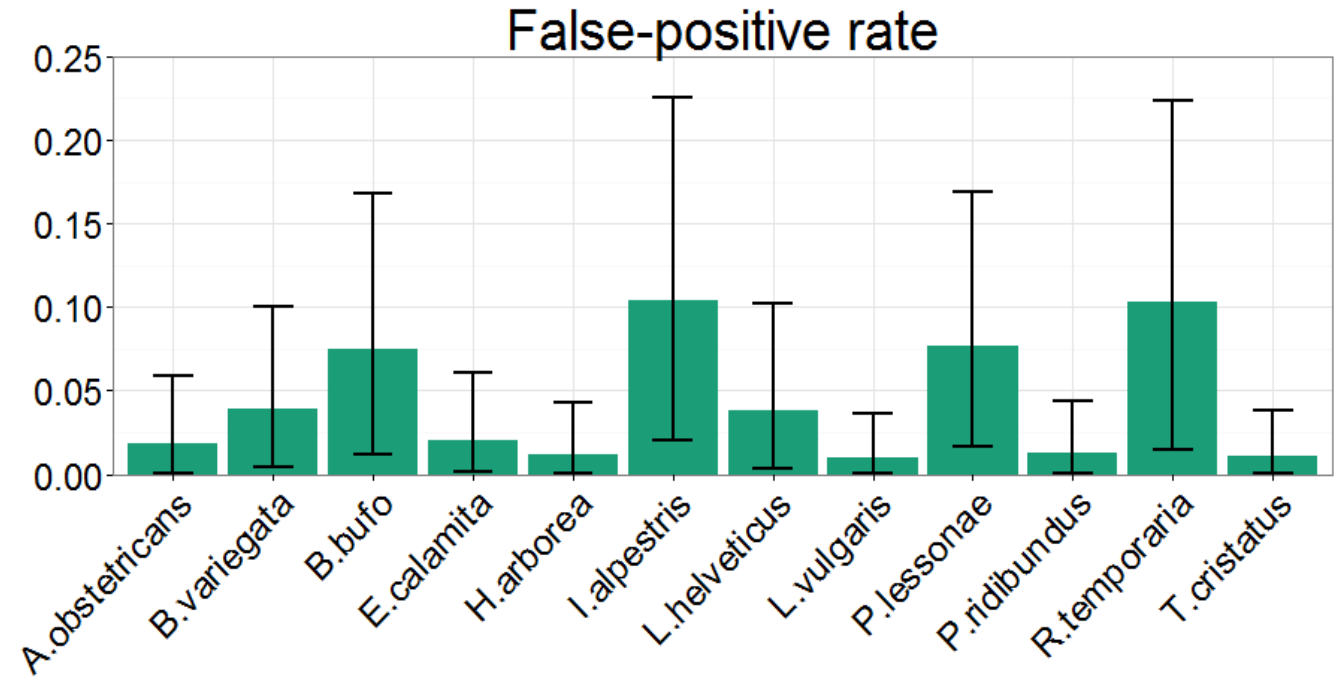


# Preliminary Results: False-positives

Per-visit false positives  
(when species is absent)

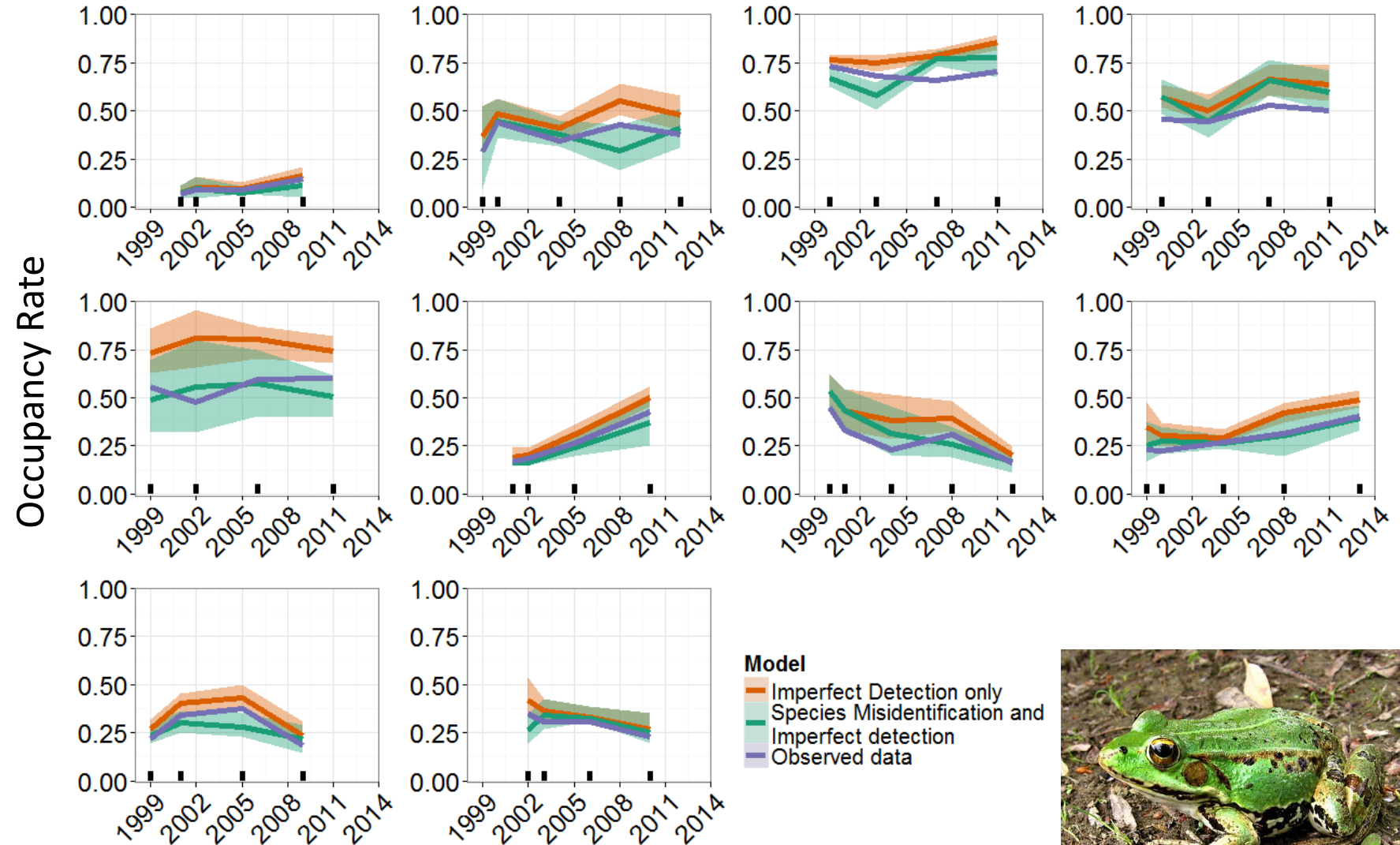
- Relatively low rates
- Common species more problematic

No evidence for “rare-species” bias



# Preliminary population trends- Pool frog

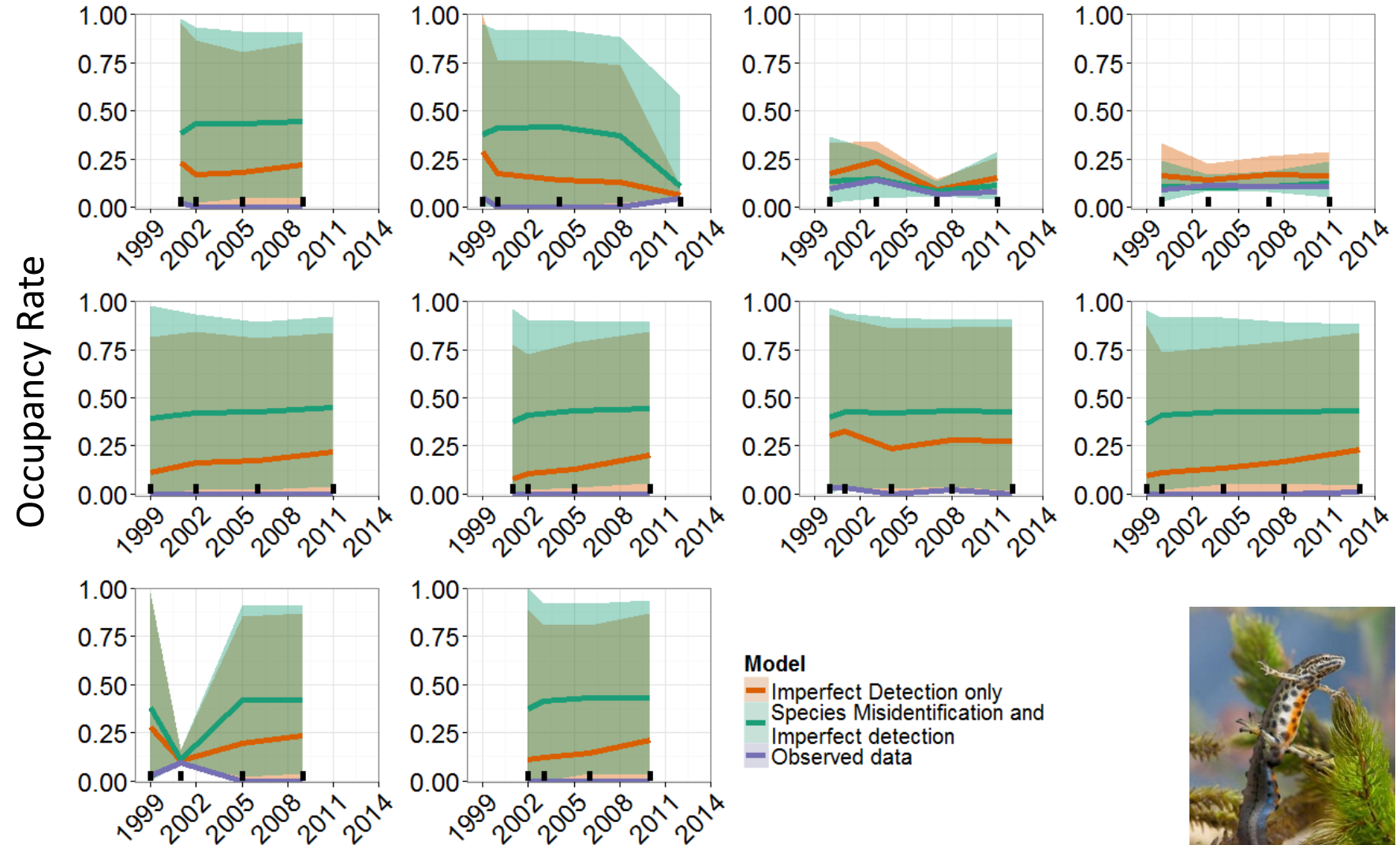
- High true detection (84.5%)
- High false positives (7.7%)
- Trends are qualitatively comparable





# Preliminary population trends- Smooth Newt

- Rare species
- Low detection (16.1%)
- Low false positives (1.0%)
- Trend estimates differ qualitatively
- Models overestimate
- Not enough information to draw conclusions





# Rare species issues

False positives create large bias

But not enough information to estimate observer effects

**1010**

Occupied but unseen twice?

Unoccupied with two false positives?

Solution:

**Incorporate more information**

- “Confirm” detections
- Incorporate abundance (higher abundance → higher chance of true detection)
- Increased estimation of observer effects
- Better trend estimates

# Conclusions: should we be worried?

**Yes:**

- We know imperfect detection is the norm
- False positives do happen

**No:**

- Problems are not unique to citizen science data
- For non-rare species, population trends remain broadly similar

Rare species: Problematic

➤ Need sufficient information to estimate observation values

Accounting for detection is not complex, but it is important!

- **Need to demonstrate data quality**

# Acknowledgements

- Benedikt Schmidt
- Arpat Ozgul
  
- Christoph Bühler
- Thierry Chambert
- Volunteer field surveyors
  
- Departement Bau, Verkehr und Umwelt, Abteilung Landschaft und Gewässer, Kanton Aargau



**University of  
Zurich** <sup>UZH</sup>



**karch**



Schweizerische Eidgenossenschaft  
Confédération suisse  
Confederazione Svizzera  
Confederaziun svizra

**Federal Office for the Environment FOEN**  
**Bundesamt für Umwelt BAFU**

