

# Monitoring under uncertainty for informed management decisions

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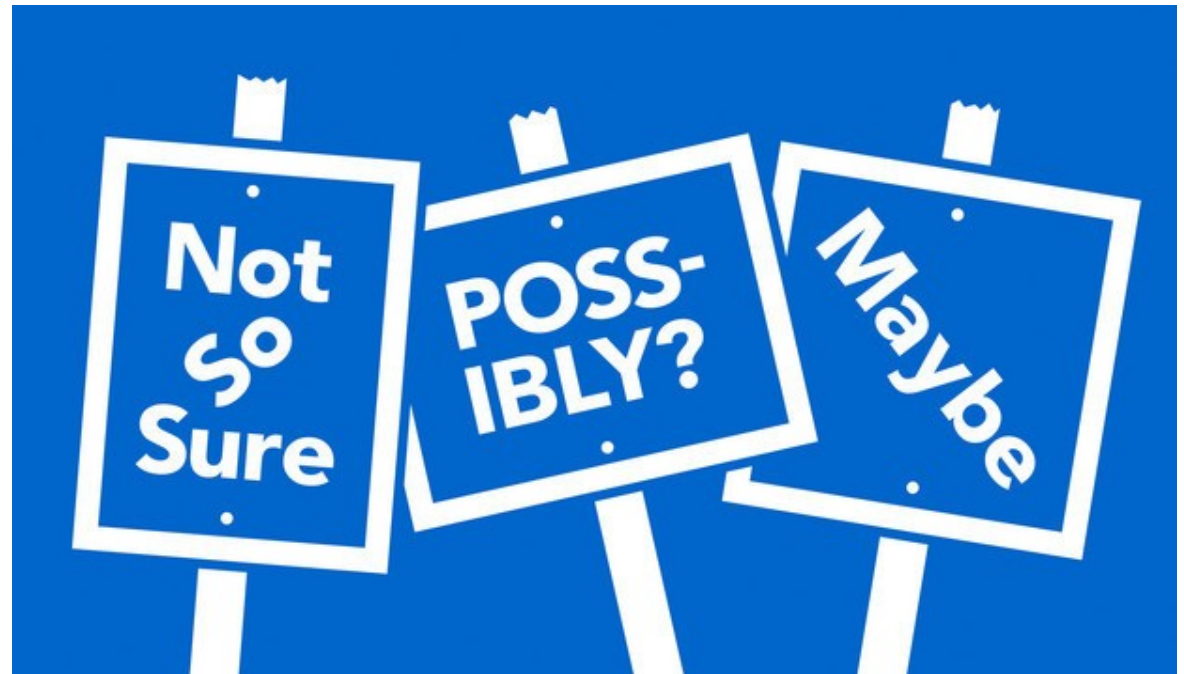
# Uncertainty

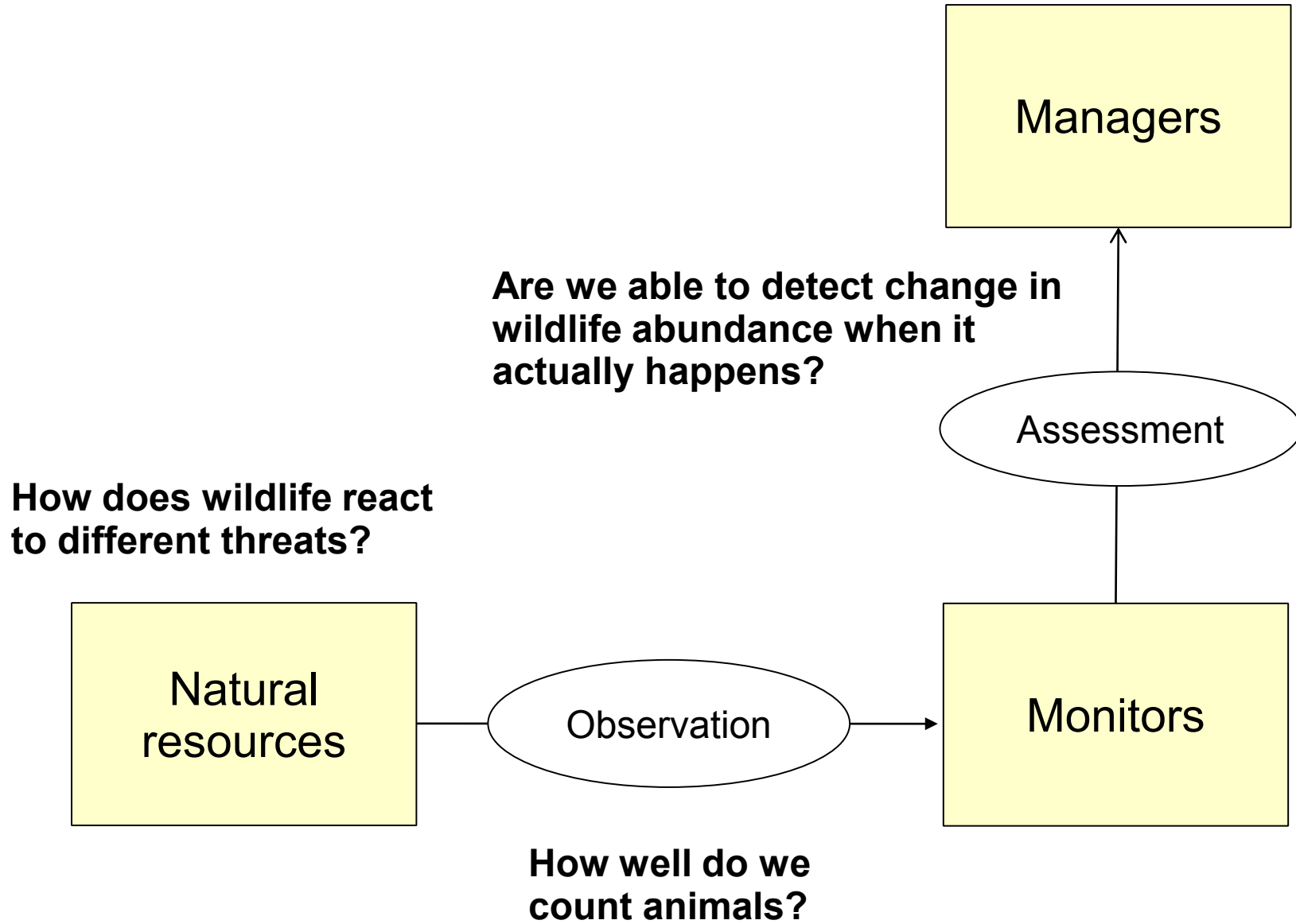
I THOUGHT I WAS  
INTERESTED IN UNCERTAINTY  
BUT NOW I'M NOT SO SURE



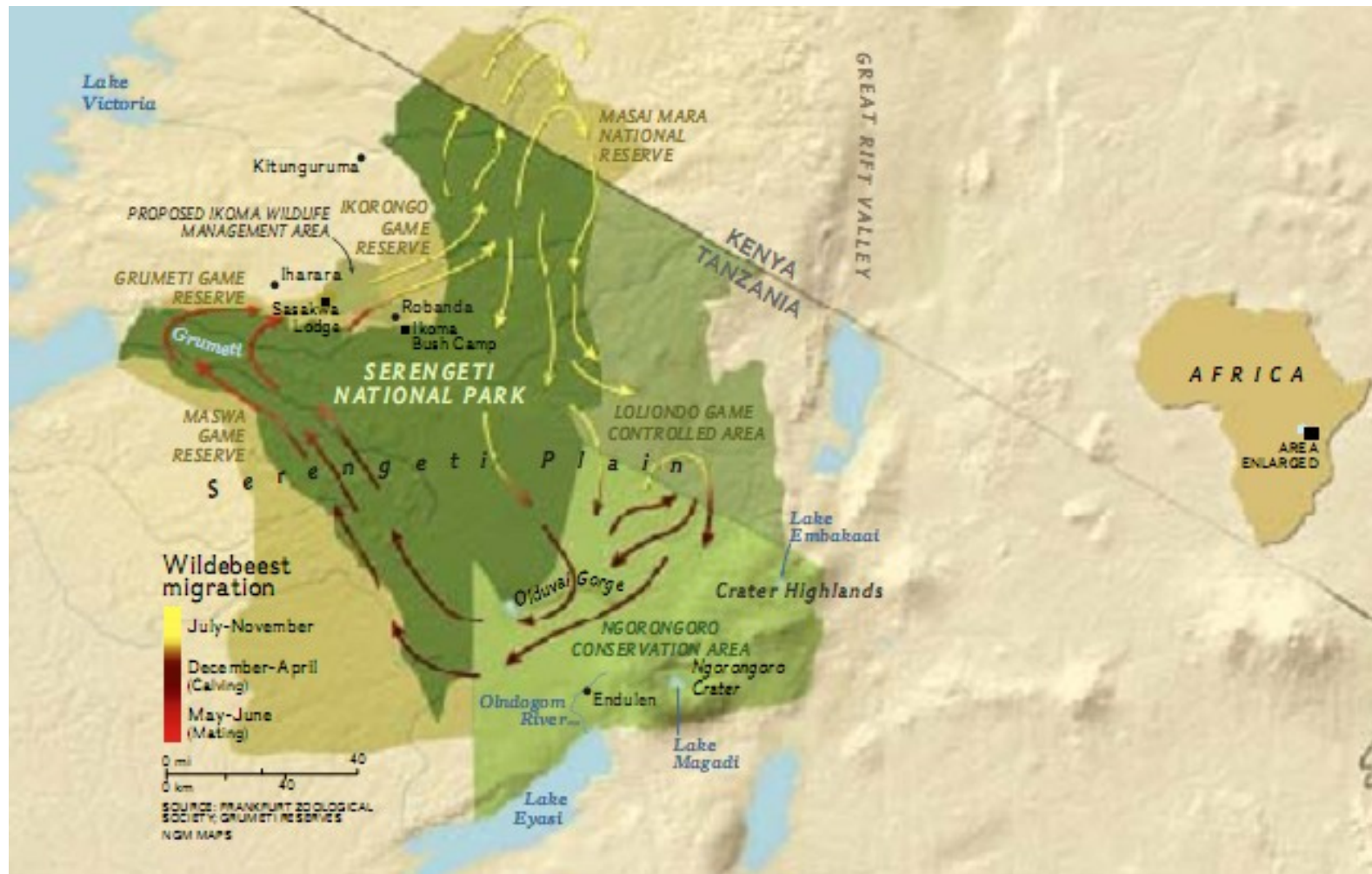
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# Study-area: Serengeti, Tanzania





# Illegal bushmeat hunting



# Questions

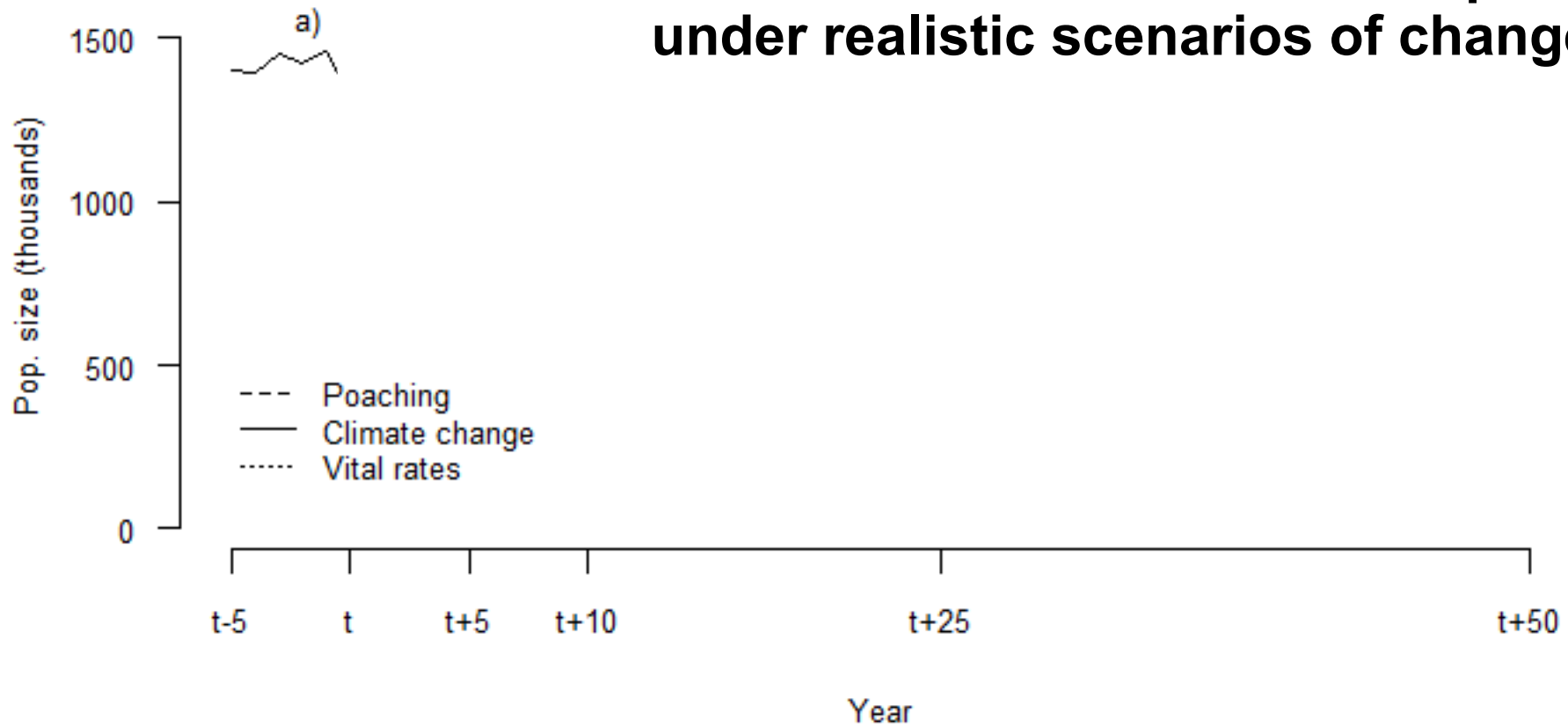
1. How do different monitoring budgets translate into data quality (accuracy and precision)?
2. How are different types of error affected by budgetary, observational and ecological conditions?

# Types of error

- **Type I errors ( $\alpha$ ):** rejecting the null hypothesis when it is true
- **Type II errors ( $\beta$ ):** failing to detect a difference that is present
- **Shape errors:** misclassifying a trend as linear when it is actually non-linear or vice-versa

# 1. Operating biological model

## Wildebeest





# 2. Observation model







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# Types of factors

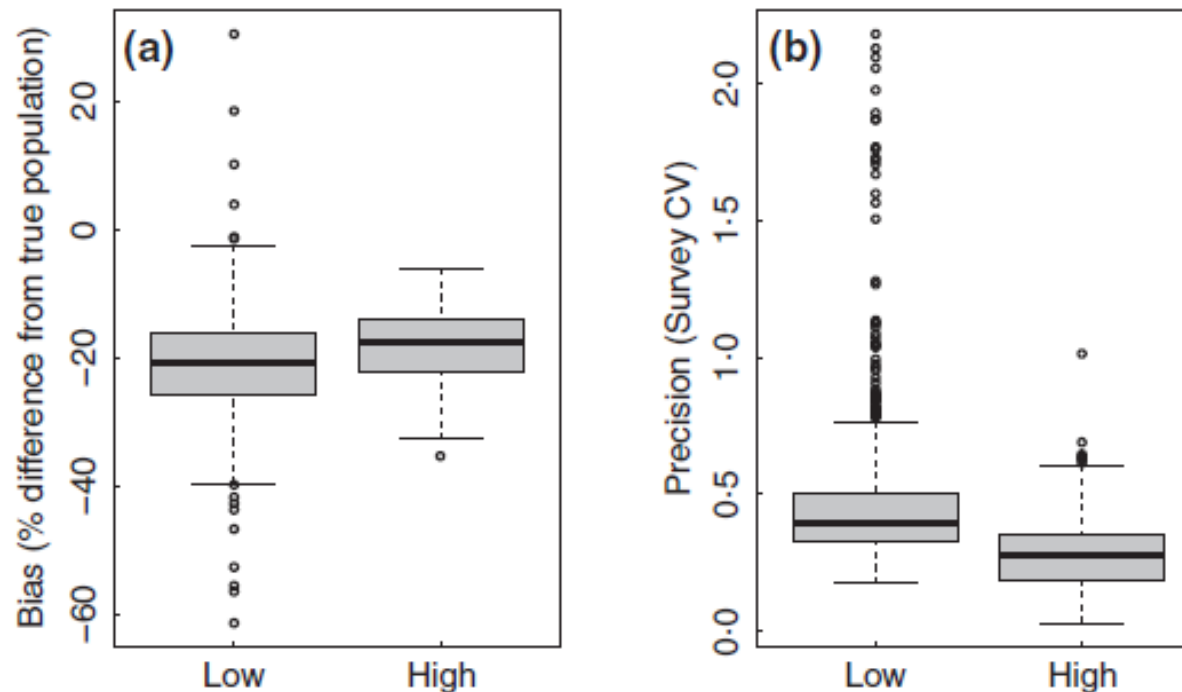
## Wildebeest monitoring:

<u>Population characteristics</u>	Population size Proportion of juveniles (%) Aggregation Spatial autocorrelation
<u>Sampling characteristics</u>	Distance between transects (km) Time between photos (seconds)
<u>Flight characteristics</u>	Mean flight altitude (m) CV (coefficient of variation) error altitude Mean flight speed (km/sec) CV (coefficient of variation) error speed
<u>Observer effects</u>	Minimum error counting juveniles (%) Number of animals in a photo for which 50% juveniles are missed Mean error counting adults (%) CV (coefficient of variation) error counting adults

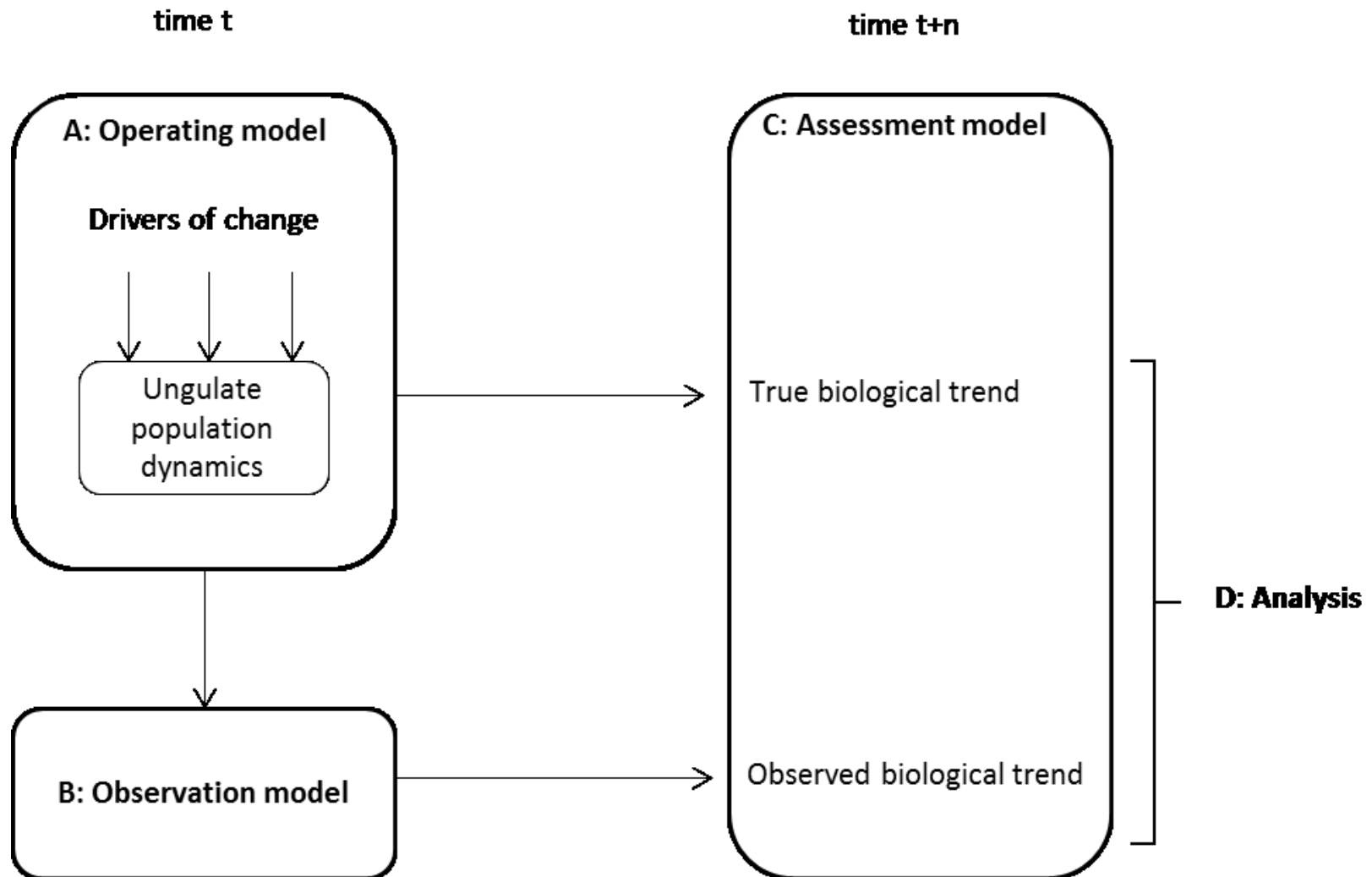
# Results: monitoring wildebeest

## The likely effect of budget on data quality

“Observed” abundance of different species under realistic scenarios of change



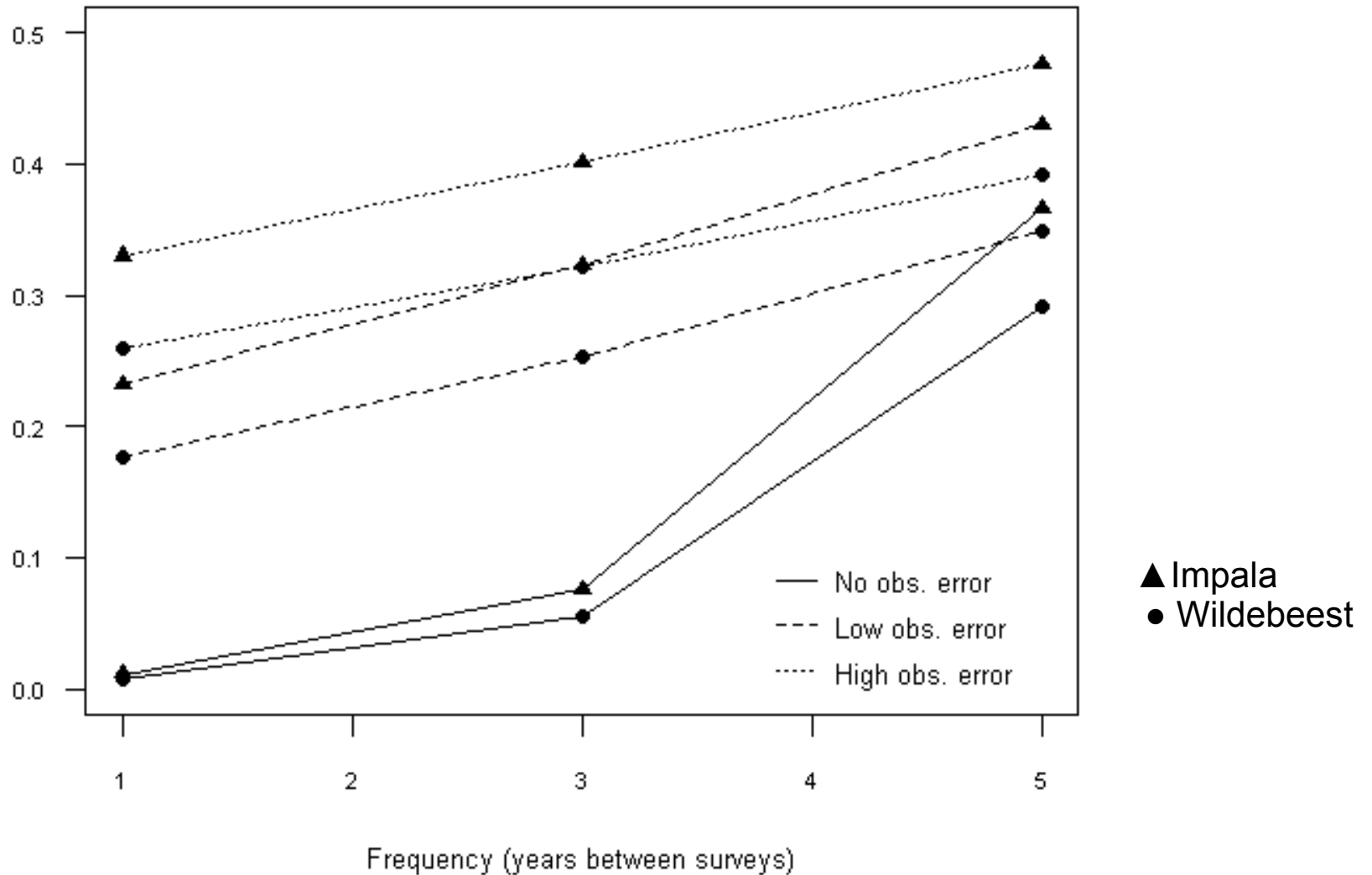
# 3. Assessment model & Analysis





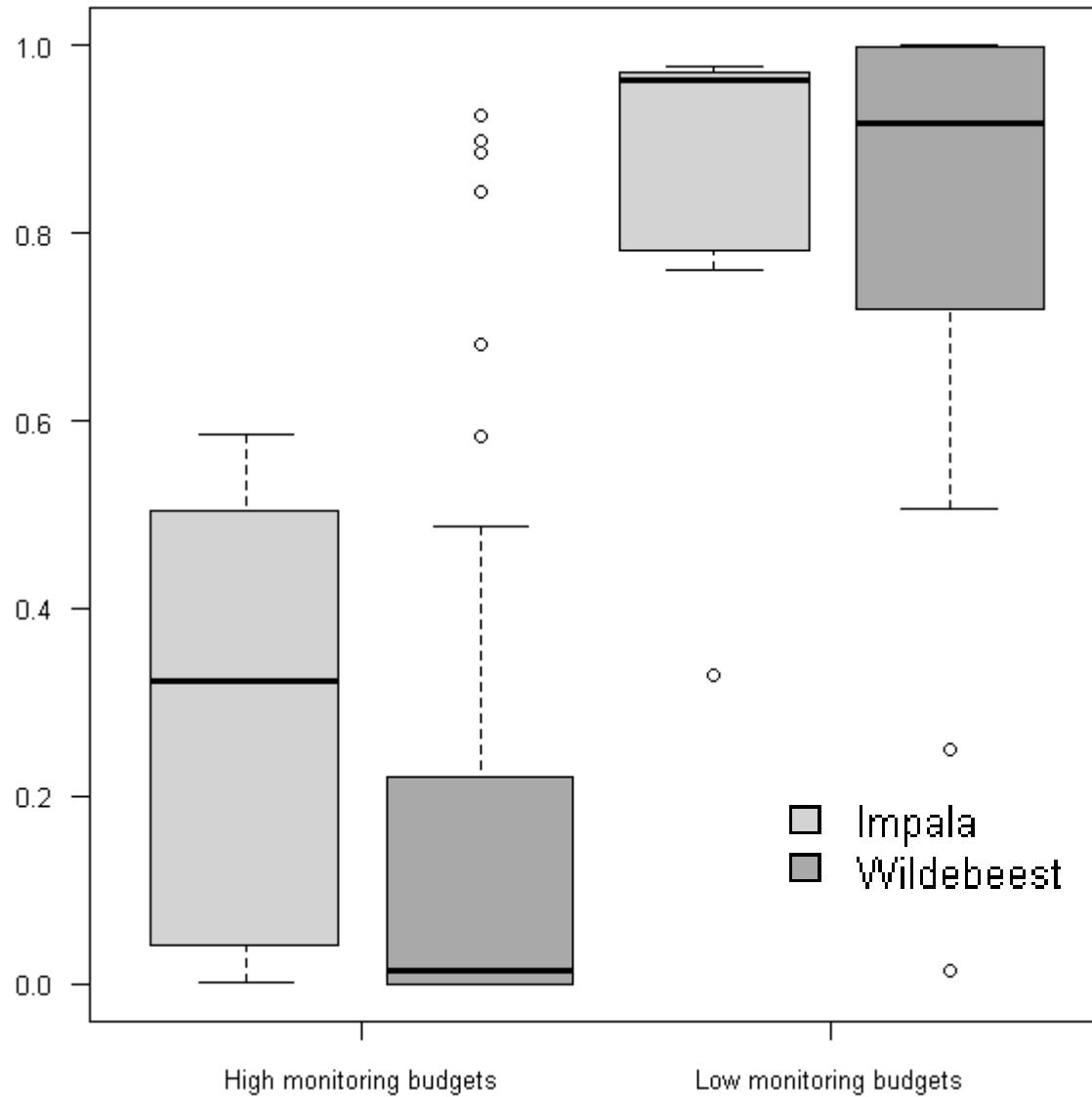
# Results

## Type II error



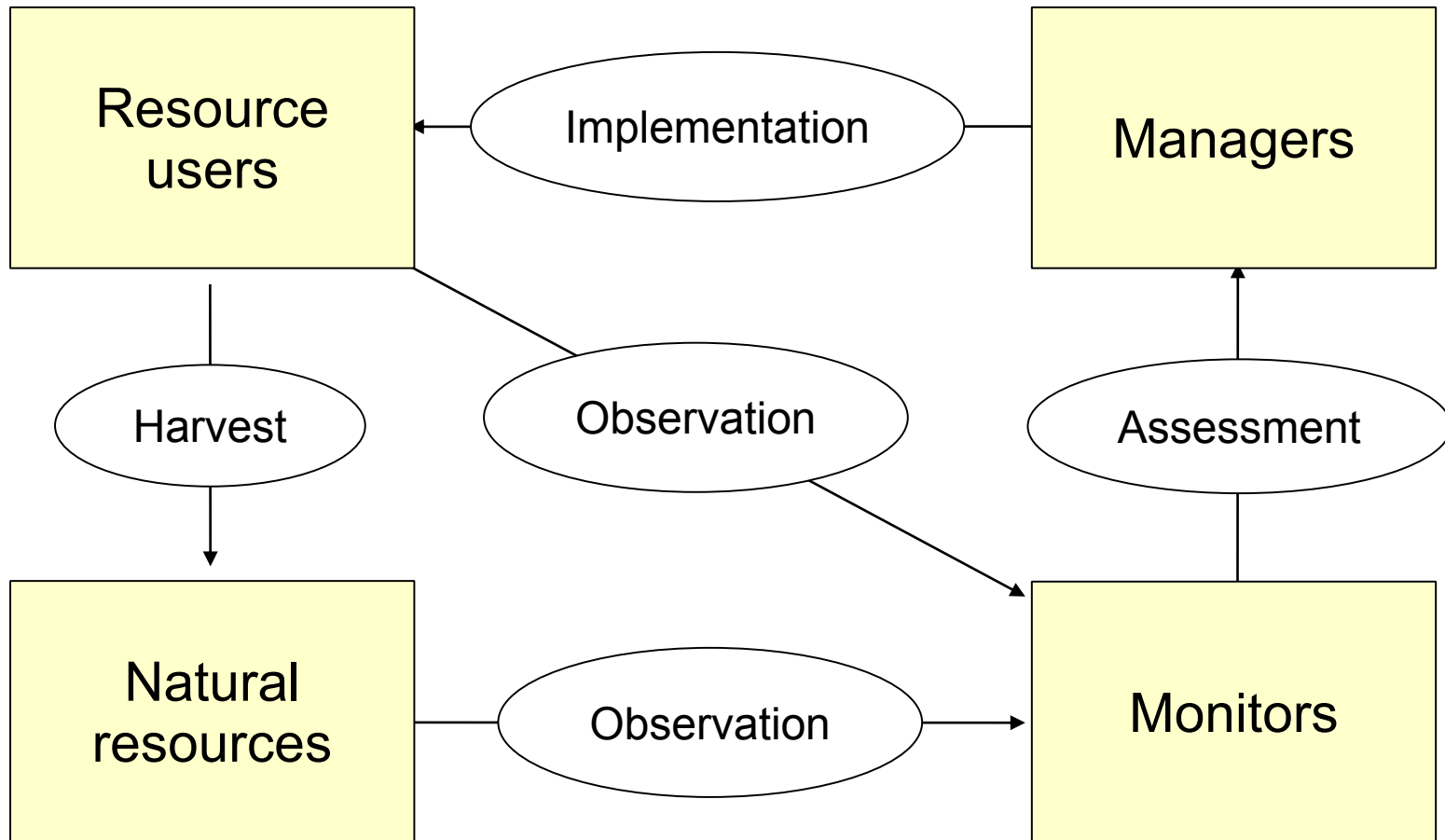
# Results

## Type II error



# Key messages

- To make robust management decisions, we should account for multiple types and sources of uncertainty
- Need to integrate ecological modelling, threat scenarios and costs into decision-theoretic approaches to NRM and conservation
- Our uncertainty mitigation efforts must be focused on the kinds of information which are most valuable



# Acknowledgements & Questions



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