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# Introduction to IPM

### First things to know about IPM

- IPM = Integrated Population Model
- Use in studies focusing on population dynamics
  - Population dynamics = changes in abundance over time and demographic causes of these changes
- Strength: combine different available data sets to get deeper insights into population dynamics and better estimates of the demographic traits

$$Nt+1 = Nt \times g(s, f)$$

t = year, s = survival, f = productivity

#### 3 main benefits from this method

- IPM includes information about demographic rates both from
  - Explicit data (e.g. mark recoveries for survival)
  - Data on population size
  - => estimation of demographic rates with increased precision which will improve population size estimates
- Case of missing data: demographic rate can be estimated from data on population size
- Simultaneous study of demographic rates and population size allow a comprehensive assessment of the cause of population changes

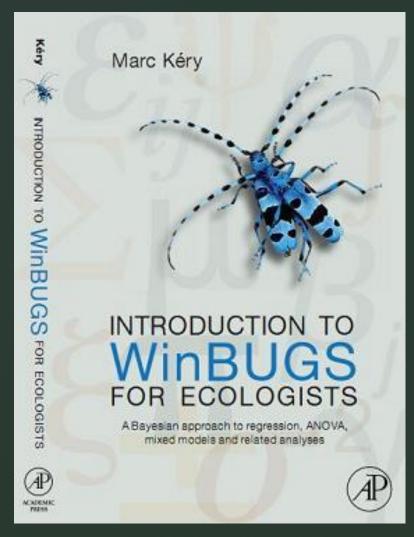
# Development of an IPM: 3 theoretical steps

 1st: develop a population model that links the demographic rates with changes in population size

2<sup>nd</sup>: write the likelihood of all data sets available
 Counts, Survival, Productivity, Immigration, ...

3<sup>rd</sup>: construct the joint likelihood of the complete model

### Want to start?



https://drive.google.com/file/d/14JTu0kFGgHpkMUX s6B780npSlrJ3OogG/view?usp=sharing





### BAYESIAN POPULATION ANALYSIS USING WinBUGS

A hierarchical perspective



## Step 1: Define the link between changes in population size ans demographic rates



E = expected number

$$E(N_{1,t+1} | N_{1,t}, N_{ad,t}) = N_{1,t} * S_{juv,t} * f_t + N_{ad,t} * S_{juv,t} * f$$

$$E(N_{ad,t+1} | N_{ad,t}) = N_{1,t} * S_{ad,t} + N_{ad,t} * S_{ad,t}$$

## Step 2: Define the likelihoods of each Individual Data Set

#### Population counts

Sources of uncertainty: we include demographic stochasticity using appropriate distributions to describe the number of individuals at year t+1

$$N_{1,t+1} \sim \text{Poisson}(N_{1,t} * S_{juv,t} * f_t + N_{ad,t} * S_{juv,t} * f)$$

$$N_{ad,t+1} \sim \text{Binomial}(N_{1,t} + N_{ad,t}, S_{ad,t})$$

#### □ Capture-Recapture data

Modelisation of survival, matrix of capture-recapture

#### Reproductive success

e.g. birds survey: number of nestlings, number of surveyed broods, productivity

# Step 2: Define the likelihoods of each Individual Data Set

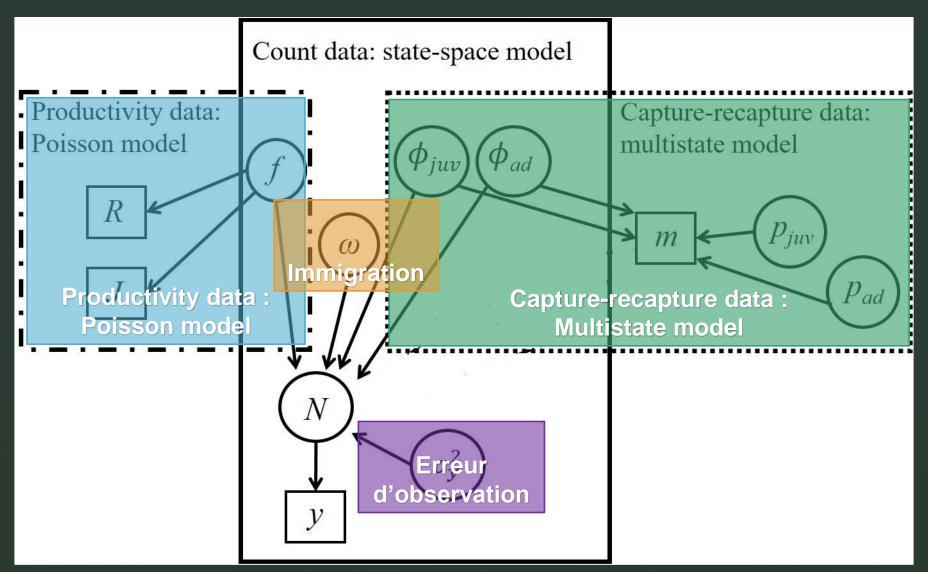
```
# 3.3. Likelihood for productivity data: Poisson regression

for (t in 1: (nyears - 1)) {
    J[t] ~ dpois ( rho[t] )
    rho[t] <- R[t] * f[t]
    }
}</pre>
```

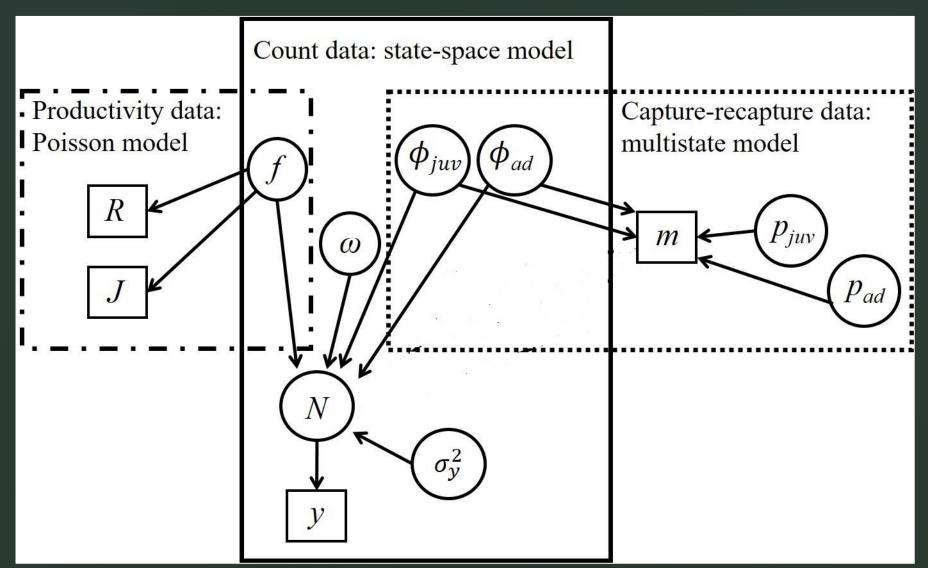
**□** Reproductive success

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### Step 3: Formulate the joint likelihood



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# Example with a simple IPM including counts, capture-recapture, reproduction

- Need for WinBugs or Jags (also for Linux) !!!!
  - https://www.mrc-bsu.cam.ac.uk/software/bugs/the-bugs-projectwinbugs/
  - https://sourceforge.net/projects/mcmc-jags/

Use R instead of R Studio! Too many errors!



# Real data example: Hoopoe population dynamics

