

# **Presence probability and environmental favourability**

# Presence probability

## Combines two things:

- the general probability of finding the species anywhere by chance in the study region (which depends on the species' **prevalence** there)
- the **environmental conditions** and how they make presence more likely / less likely than random expectation

If the environment were irrelevant, probability would be the same in all localities; when it is not, probability is higher in some places and (to compensate) lower in others

In any case, the sum of all probabilities equals the sum of presences, i.e. mean presence probability equals species prevalence

# Presence probability

## Ultra-simplified example:

There are 10 pixels recorded as presence for the lynx, and 20 pixels where the environment is perfect for this species. Presence probability can't be 100% in all those 20 pixels simultaneously, because there are only 10 presences.

At most, presence probability can be 50% in each of those 20 pixels, and this would be if all other pixels in the study region had 0% presence probability (which is unrealistic).

If you model again when more lynxes have been detected in other pixels, probability will be higher in those 20 pixels (because there are more presences), even if nothing changed environmentally.

# Probability and favourability

Favourability (like suitability) can be 100% in all perfect pixels, regardless the number of presences.

Favourability (**un**like suitability) is commensurable and directly comparable across species and regions with different prevalence (proportion of presences).

Naturwissenschaften

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CONCEPTS & SYNTHESIS

**Favourability: concept, distinctive characteristics and potential usefulness**

Pelayo Acevedo • Raimundo Real

# Presence probability

Presence-absence data:

## **Logistic regression (GLM)**

- binomial distribution

# Presence probability

Presence-absence data:

## Logistic regression (GLM)

- binomial distribution

Logistic regression follows the expression:

The diagram shows the logistic regression formula  $P = \frac{e^y}{1 + e^y}$  with three blue arrows pointing to its components. One arrow points from the text 'probability of the presence of the species' to the variable  $P$ . Another arrow points from the text 'basis of the natural logarithm' to the  $e^y$  term in the numerator. A third arrow points from the text 'linear regression:  $y = \beta_0 + \beta_1 x_1 + \dots + \beta_n x_n$ ' to the  $e^y$  term in the denominator.

$$P = \frac{e^y}{1 + e^y}$$

probability of the presence of the species

basis of the natural logarithm

linear regression:  
 $y = \beta_0 + \beta_1 x_1 + \dots + \beta_n x_n$

# Presence probability

## Linear predictor

$$y = \beta_0 + \beta_1 x_1 + \dots + \beta_n x_n$$

$\beta_a$   $\ln(n_1/n_0)$   $\beta_b$  estimate

presences absences

$$P = \frac{e^y}{1 + e^y}$$

So...

Probability values will depend on the category with the highest number of cases (presences or absences).

$P = 0.5$  can correspond to a very favourable area if the species is rare, or to a non-favourable area if the species is common.

# Probability and favourability

$$P = \frac{e^y}{1 + e^y}$$

$$y = \beta_0 + \beta_1 x_1 + \dots + \beta_n x_n$$

Favourability:

$$y' = y - \ln(n_1/n_0)$$



# Probability and favourability

$$P = \frac{e^y}{1 + e^y}$$

$$y = \beta_0 + \beta_1 x_1 + \dots + \beta_n x_n$$

Favourability:  $y' = y - \ln(n_1/n_0)$

$$F = \frac{e^{y'}}{1 + e^{y'}} = \frac{e^y}{\frac{n_1}{n_0} + e^y}$$

# Probability and favourability

$$P = \frac{e^y}{1 + e^y}$$

$$y = \beta_0 + \beta_1 x_1 + \dots + \beta_n x_n$$

Favourability:  $y' = y - \ln(n_1/n_0)$

$$F = \frac{e^{y'}}{1 + e^{y'}} = \frac{e^y}{\frac{n_1}{n_0} + e^y}$$

$F$  depends only on the relationship between the presence-absence of the species and the predictors, and not on the overall prevalence.

# Probability and favourability

$$F = \frac{e^y}{\frac{n_1}{n_0} + e^y}$$

$F$  is a logistic function varying between 0 and 1.

Favourability scores greater than 0.5 correspond to localities where the probability of occurrence is higher than that expected by prevalence (or chance), while scores less than 0.5 indicate localities with a lower probability than that expected by chance.

Favourable areas do not necessarily reflect the areas where the species is predicted to be present but favourable areas for the species, even in the absence of it.

Models for all species are then levelled to the same threshold of favourability and can be directly compared and combined.

# Probability and favourability

$$F = \frac{\frac{P}{(1-P)}}{\frac{n_1}{n_0} + \frac{P}{(1-P)}} = \frac{e^y}{\frac{n_1}{n_0} + e^y}$$

**Favourability** can be obtained from **any species distribution model** that gives **probability** of presence as an output.

Environ Ecol Stat (2006) 13:237–245  
DOI 10.1007/s10651-005-0003-3

ORIGINAL ARTICLE

## Obtaining environmental favourability functions from logistic regression

Raimundo Real · A. Márcia Barbosa ·  
J. Mario Vargas

Naturwissenschaften  
DOI 10.1007/s00114-012-0926-0

CONCEPTS & SYNTHESIS

## Favourability: concept, distinctive characteristics and potential usefulness

Pelayo Acevedo · Raimundo Real

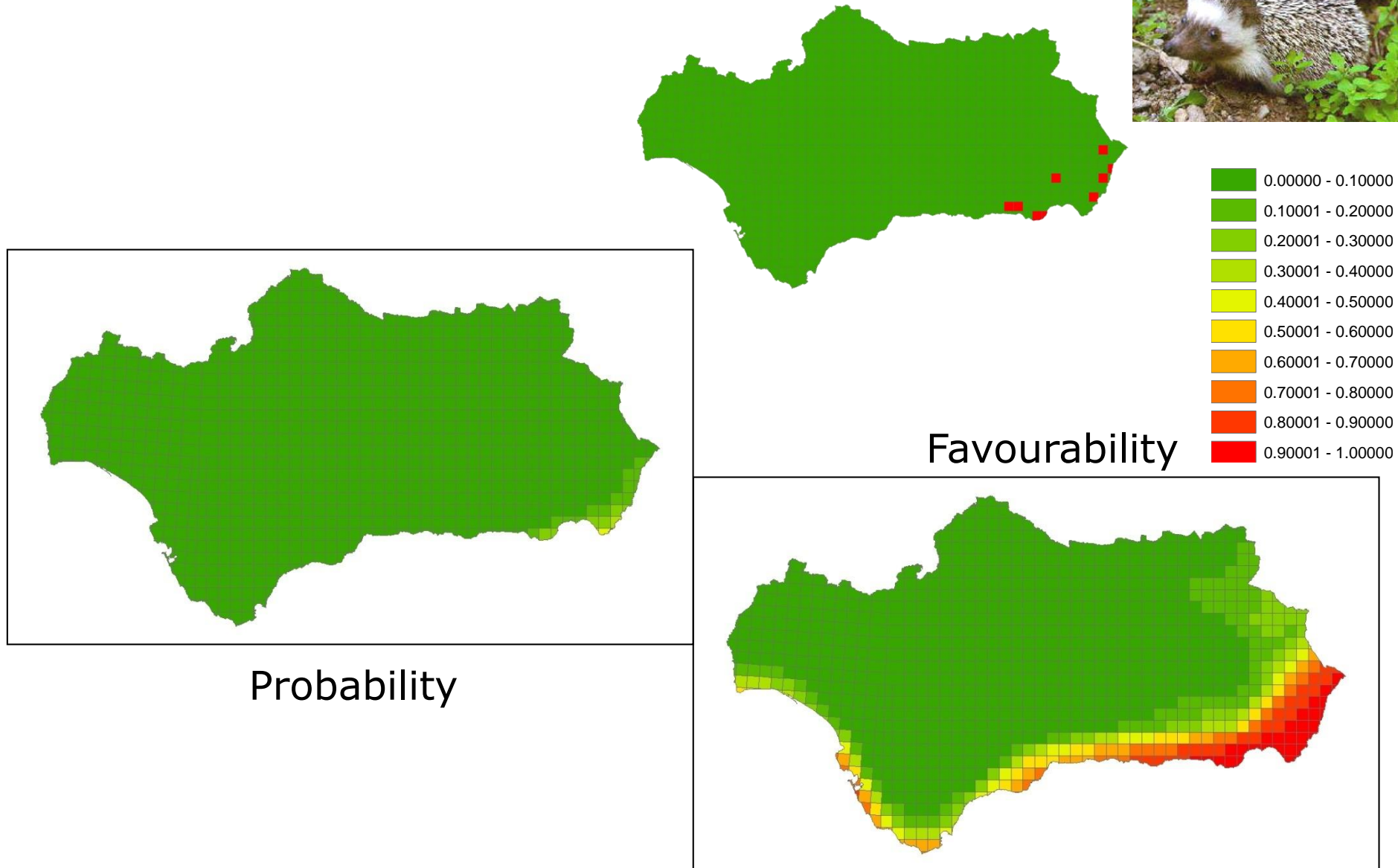
# Probability and favourability

## Some examples



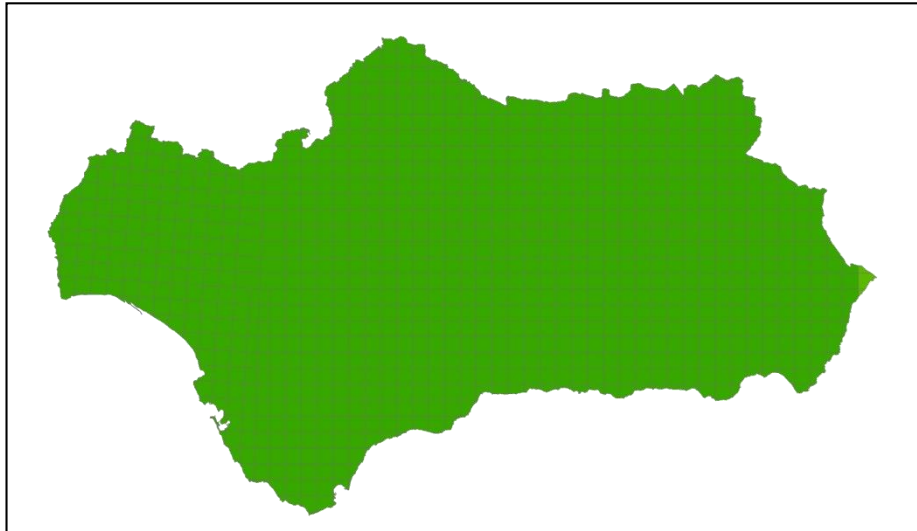
# Probability and favourability

North African hedgehog (*Atelerix algirus*)



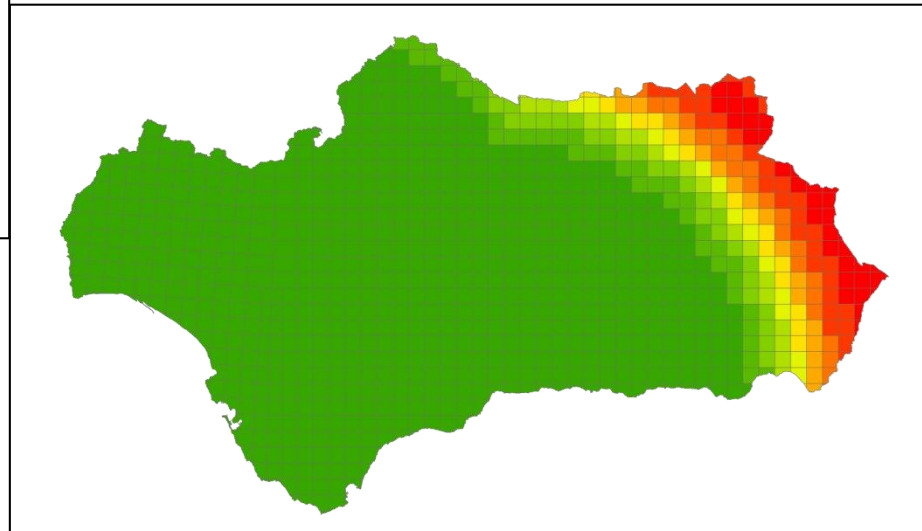
# Probability and favourability

Barbary sheep (*Ammotragus lervia*)



Probability

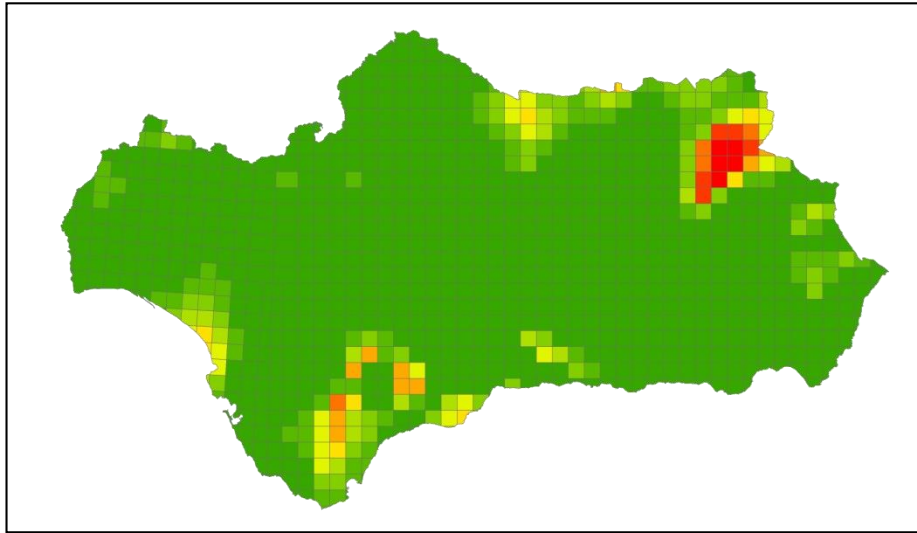
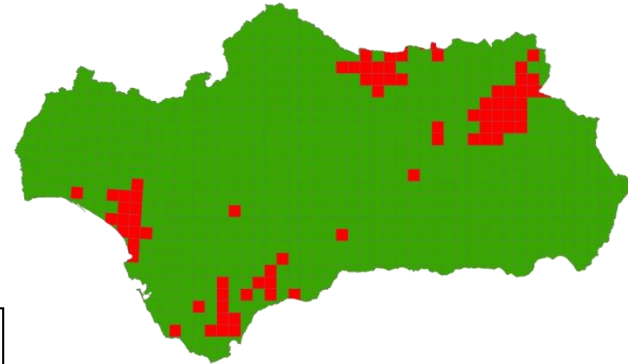
Favourability





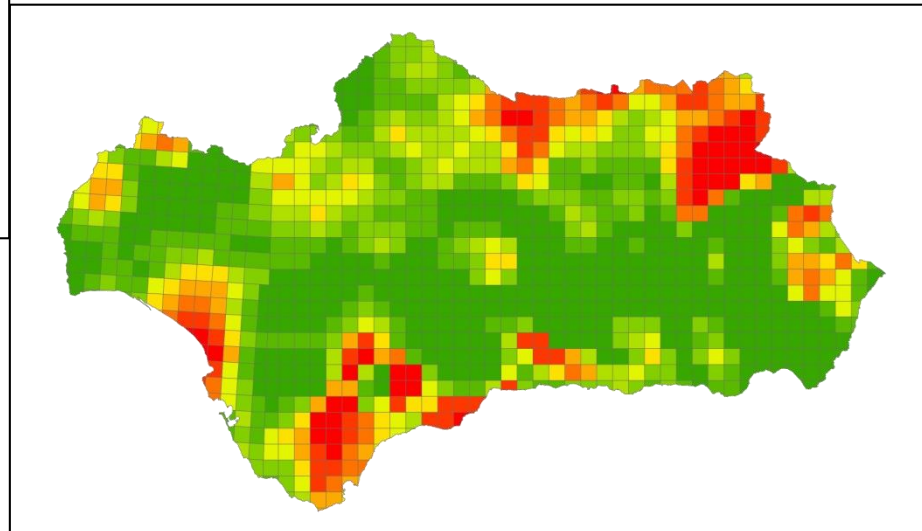
# Probability and favourability

Fallow deer (*Dama dama*)



Probability

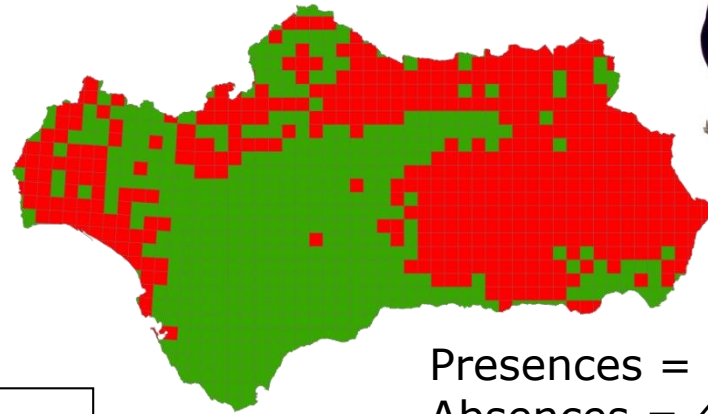
Favourability





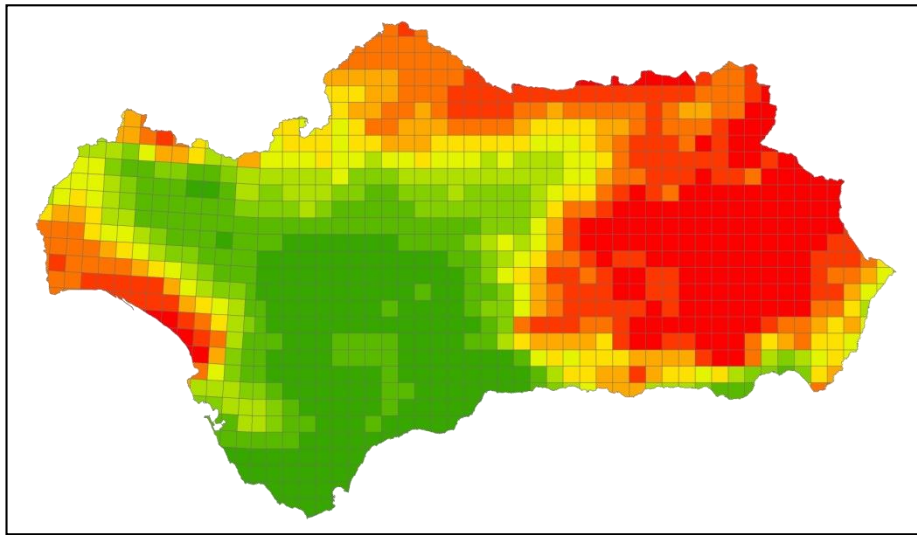
# Probability and favourability

Common magpie (*Pica pica*)



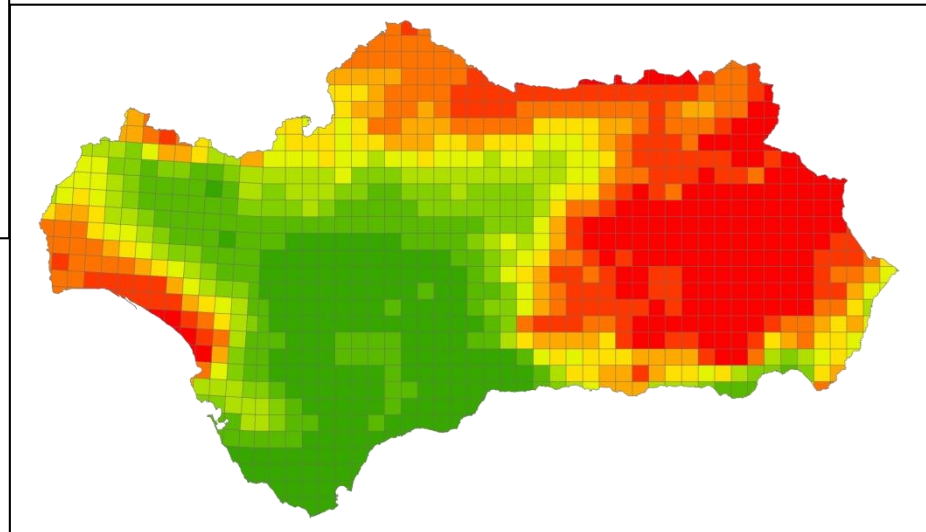
Presences = 478  
Absences = 483

$$F = \frac{e^y}{\frac{n_1}{n_0} + e^y}$$



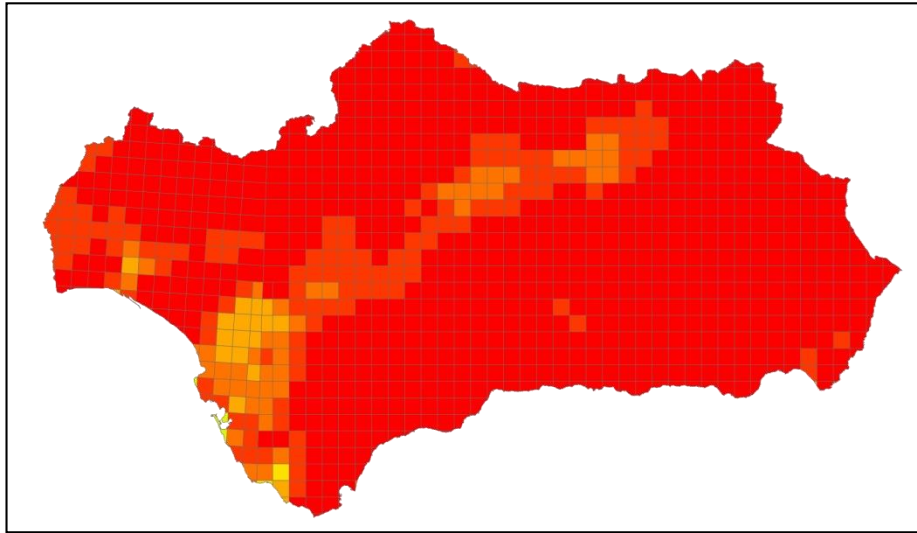
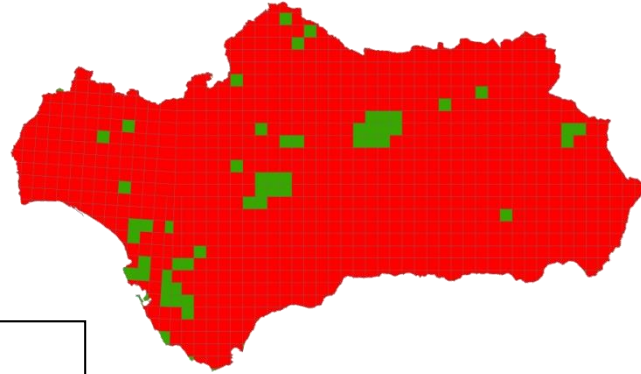
Probability

Favourability



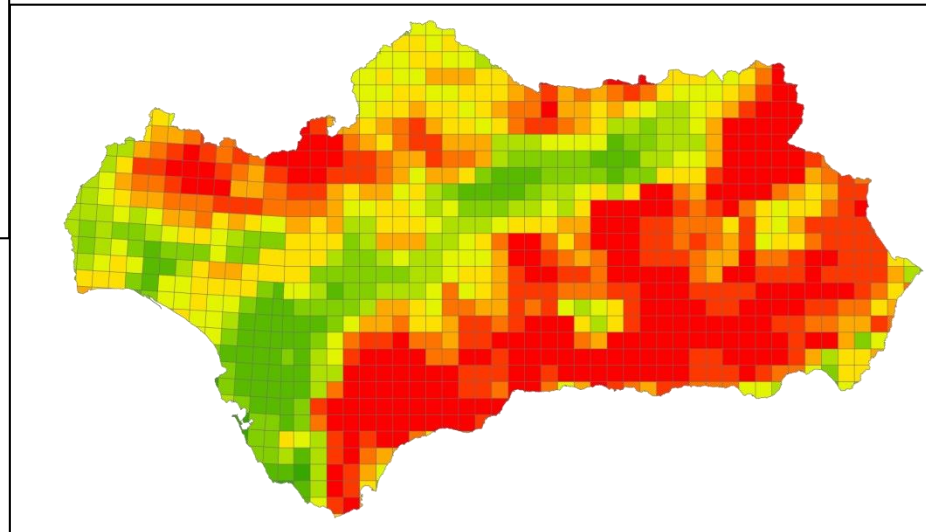
# Probability and favourability

Common blackbird (*Turdus merula*)



Probability

Favourability

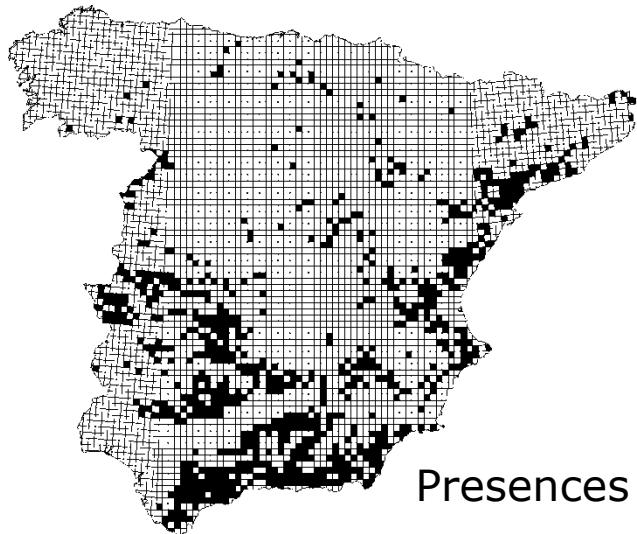


# Favourability

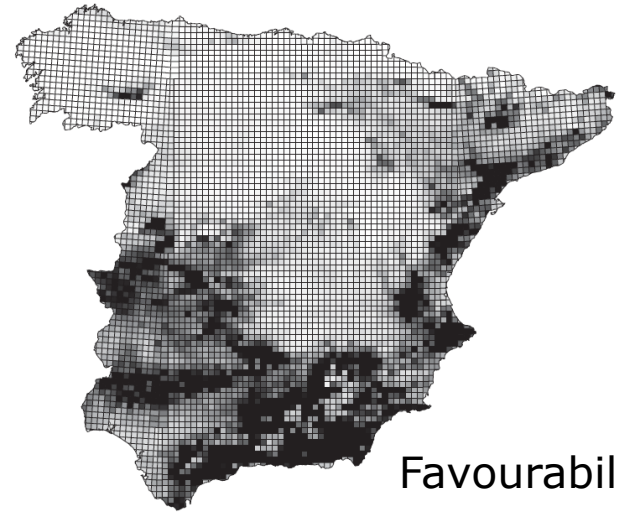
Some applications



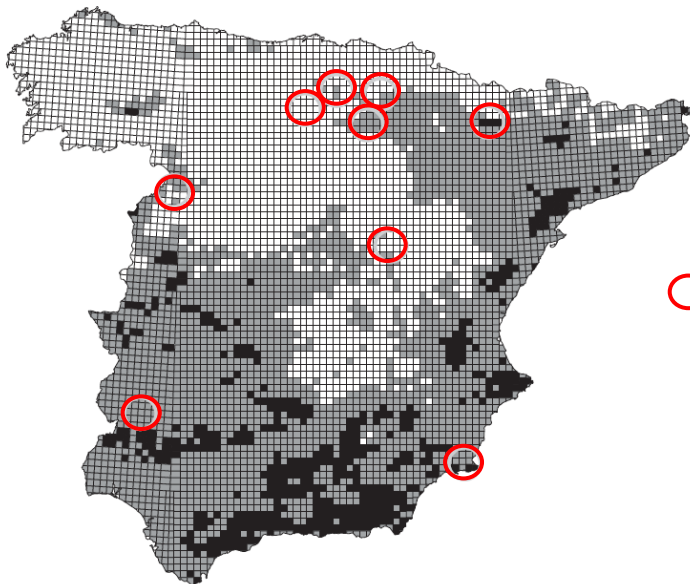
## Bonelli's Eagle (*Hieraaetus fasciatus*) in Spain



Presences



Favourability

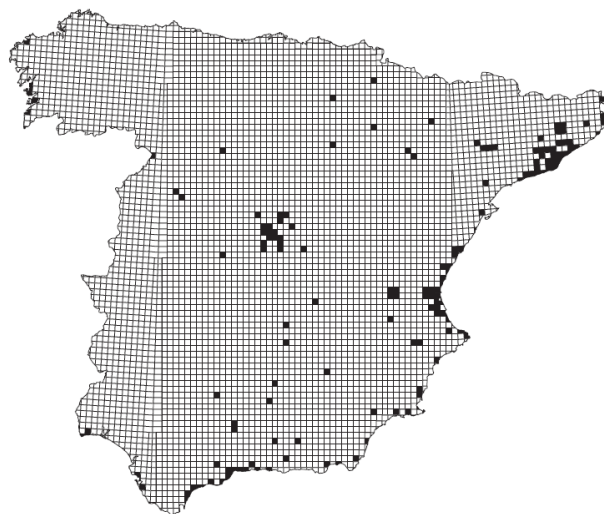


○ Conservation LIFE projects.

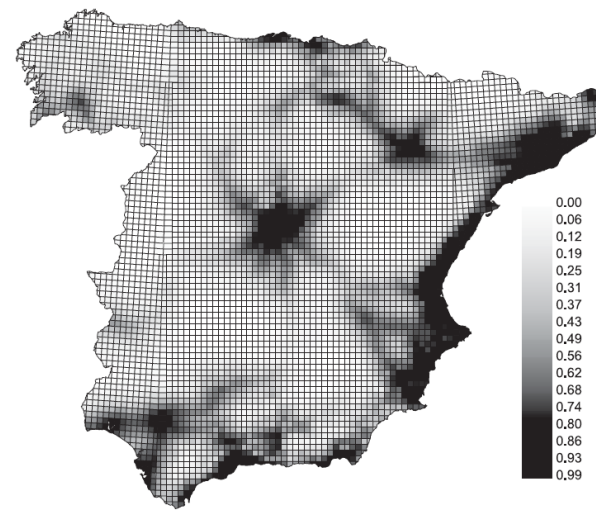


# Monk parakeet (*Myiopsitta monachus*)

## Invasive species in Spain

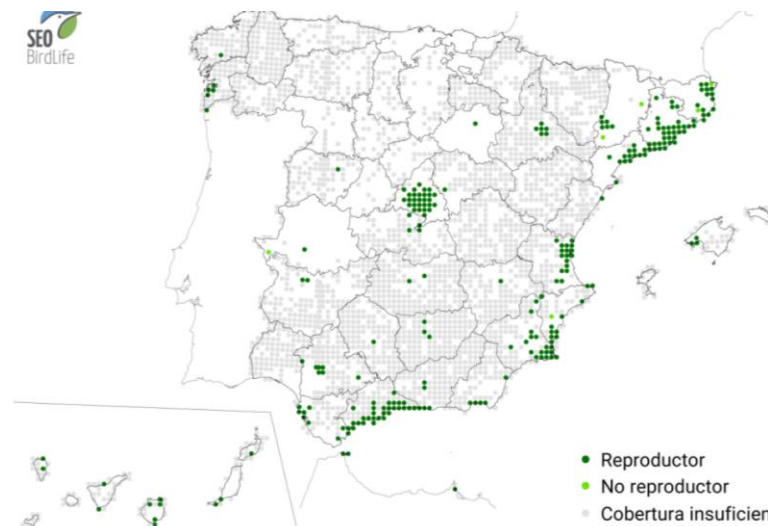
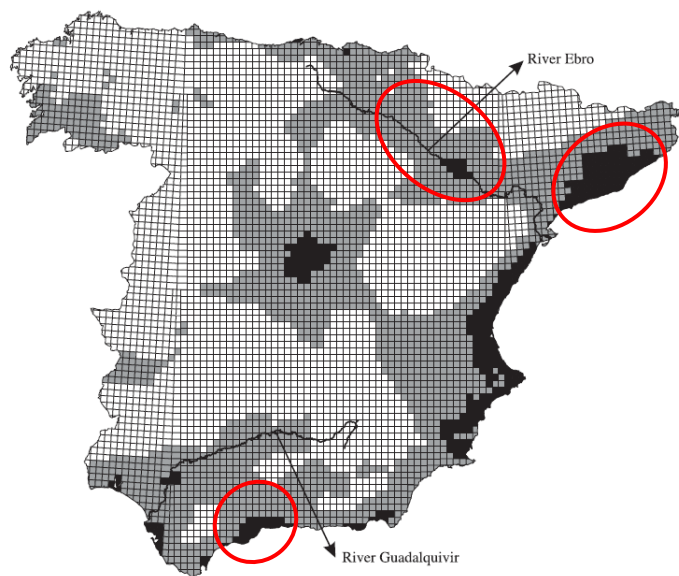


Presences



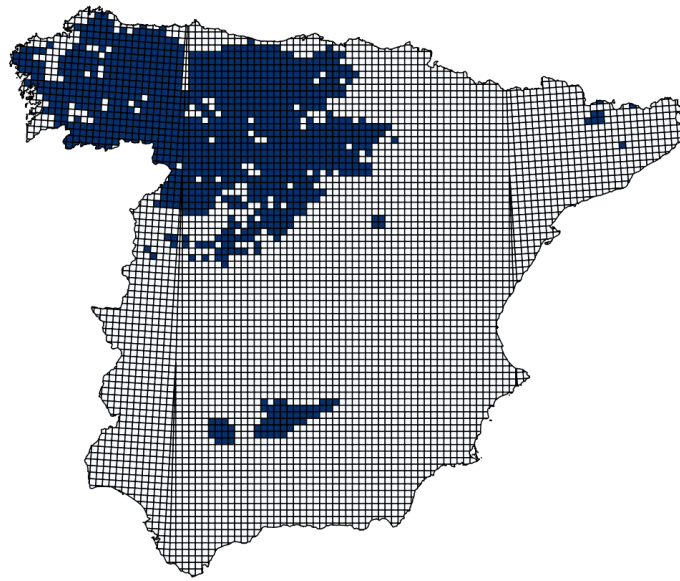
0,00  
0,06  
0,12  
0,19  
0,25  
0,31  
0,37  
0,43  
0,49  
0,56  
0,62  
0,68  
0,74  
0,80  
0,86  
0,93  
0,99

Favourability

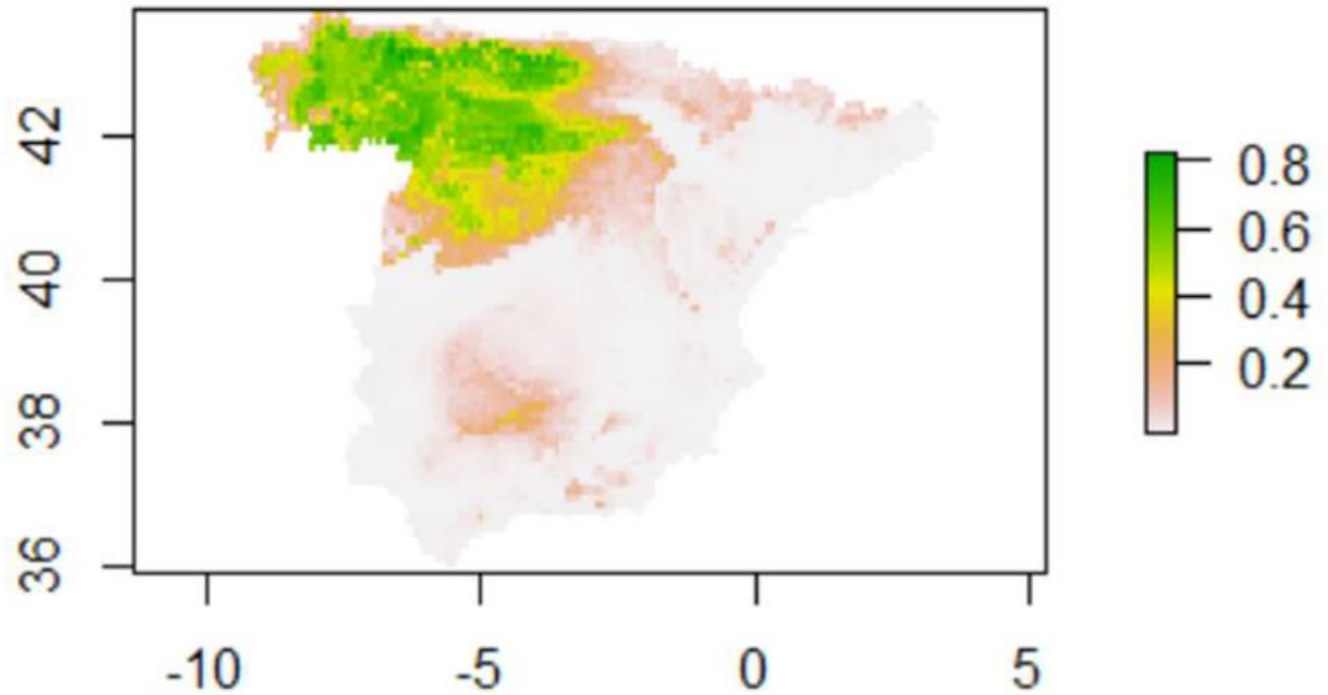


• Reproductor  
• No reproductor  
• Cobertura insuficiente



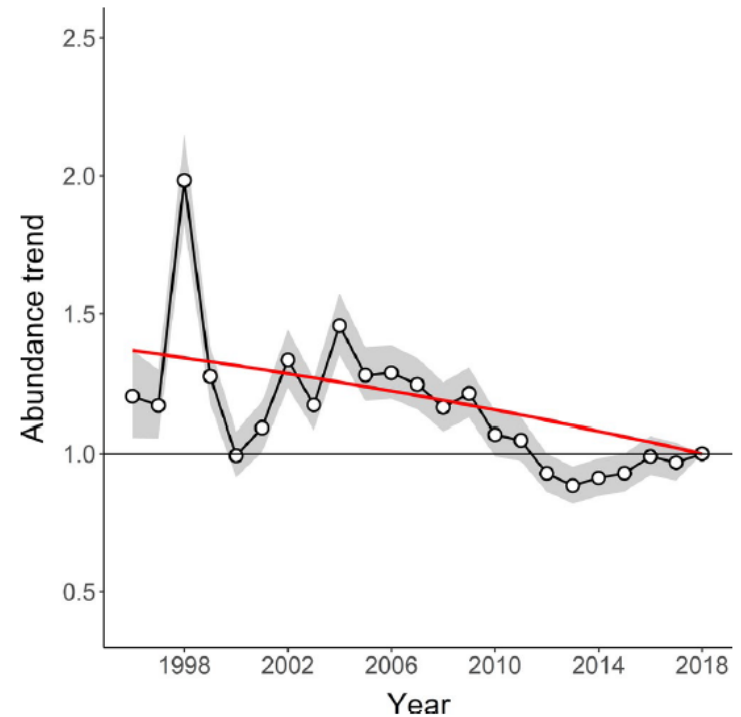
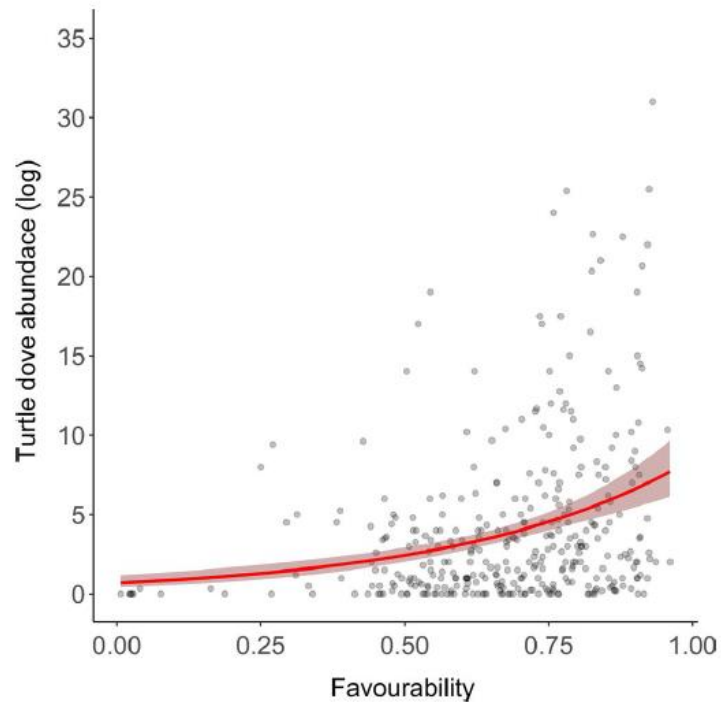


**Wolf** (*Canis lupus*)



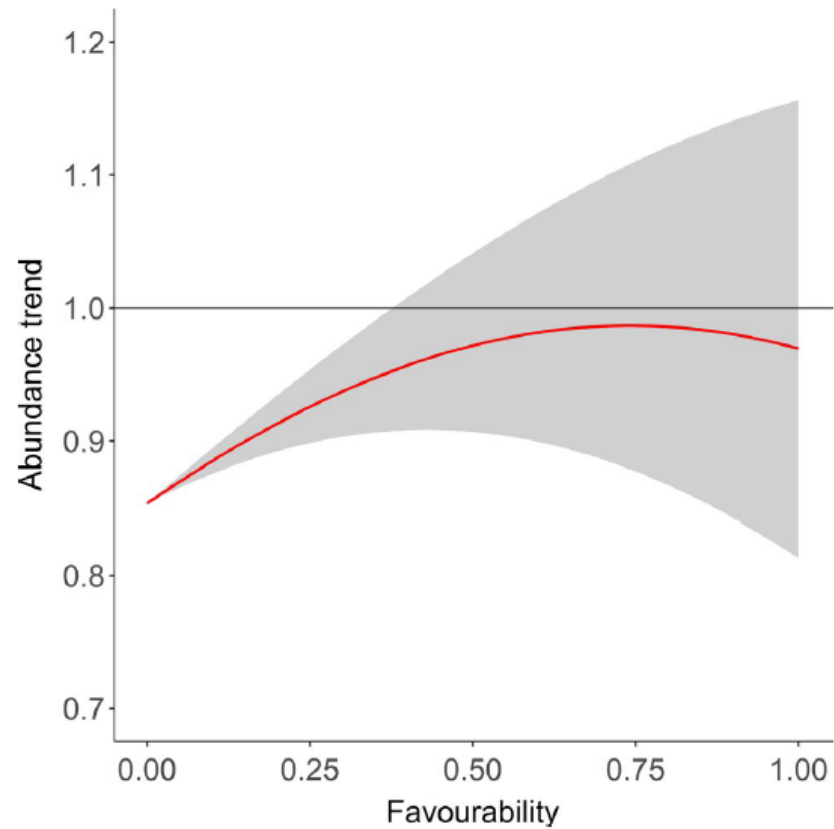
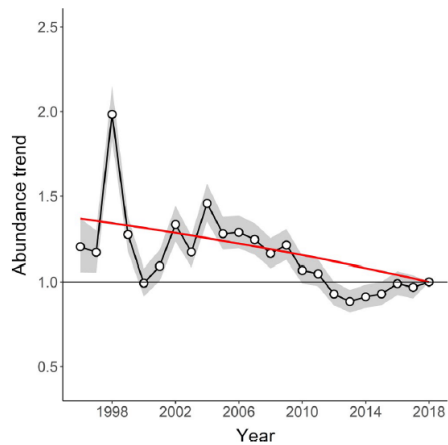
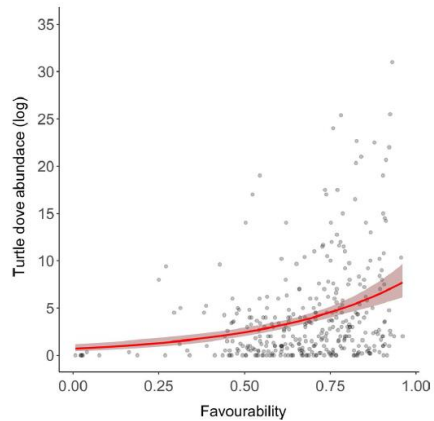


## European turtle dove (*Streptopelia turtur*)





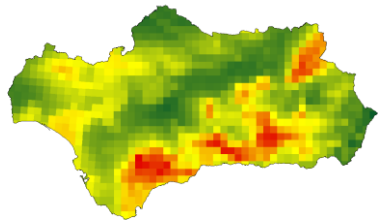
## European turtle dove (*Streptopelia turtur*)



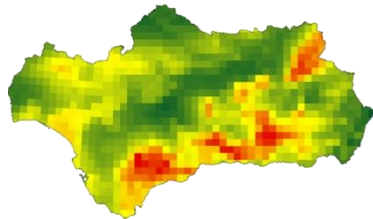


# Combination of models

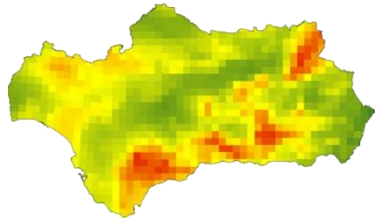
Important areas for mammals after  
aplying different conservation  
criteria and fuzzy logic



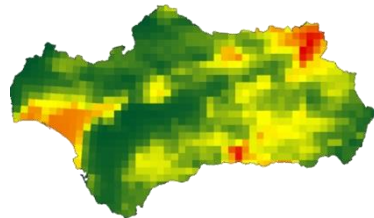
Richness



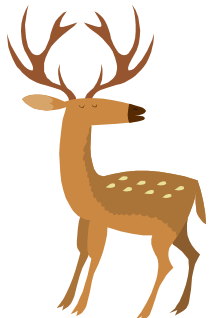
Rarity



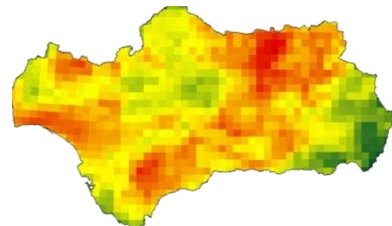
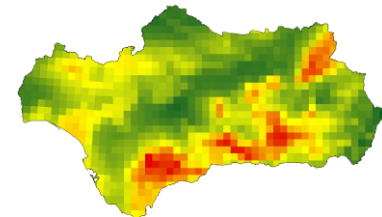
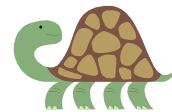
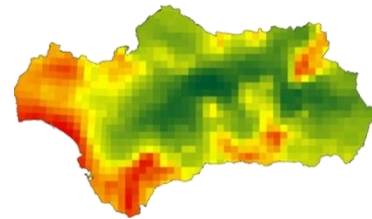
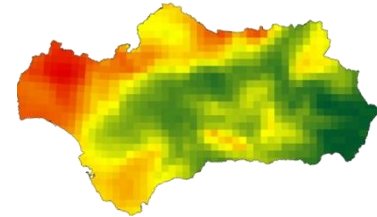
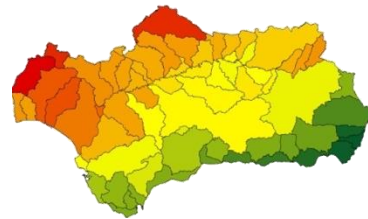
Vulnerability



Endemicity



Important areas for vertebrate  
groups



# PRACTICAL

**# convert probability to favourability:**

```
dat$GLM_F <- Fav(pred = dat$GLM_P, sample.preval =  
prevalence(dat_train[, obs]))
```

```
dat$GAM_F <- Fav(pred = dat$GAM_P, sample.preval =  
prevalence(dat_train[, obs]))
```

# Maxent can't be converted to favourability because it  
does not incorporate sample prevalence

**# try it with your own models while we're here to help!**