



# WHAT ARE SDM?



Tuesday 3rd, September  
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# OUTLINE OF THE COURSE

**What are SDM?** [9:00 – 10:00]

**Review of SDM applications** [10:15 – 11:15]

**Practice ! Prepare the afternoon exercises** [11:30 – 12:30]

**Run a simple SDM, understand SDM outputs** [13:30 – 15:00]

**Calibration: the most important you should know** [15:15 – 17:30]

**Introduction to different SDM algorithms** [09:00 – 10:00]

**Questions and final practice** [10:30 – ...]



# WHAT ARE SDM?



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# SDM: Species Distribution Models

Models that evaluate the probability of a species to be distributed in an environment characterised by its own conditions

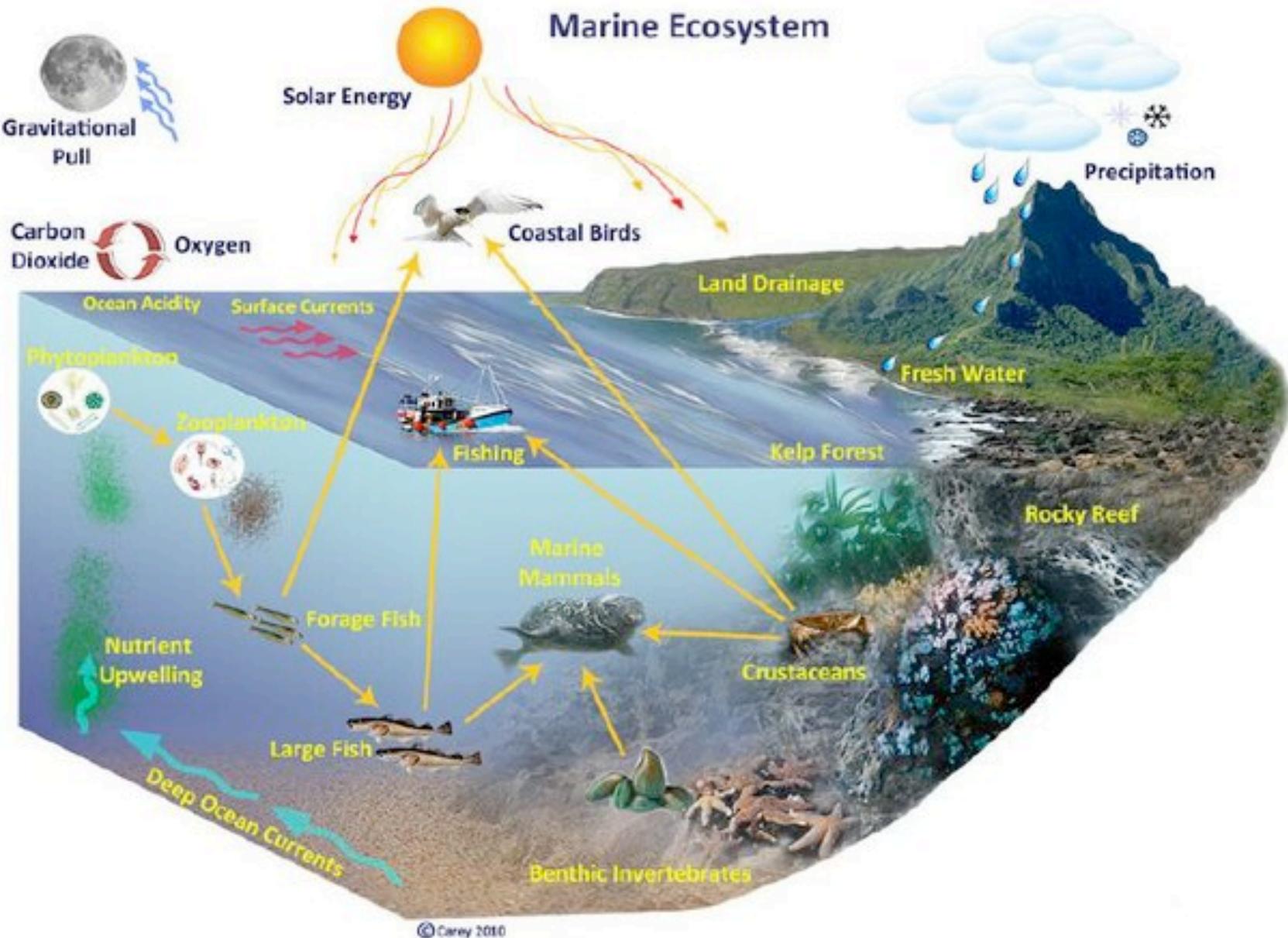
A.K.A. *Climate envelope modelling, habitat modelling, environmental/ecological niche modelling*

## WHY DO WE USE MODELS?

- Simple and fast way to get an idea of the potential distribution of a species
- Models and outputs are generally easy to interpret

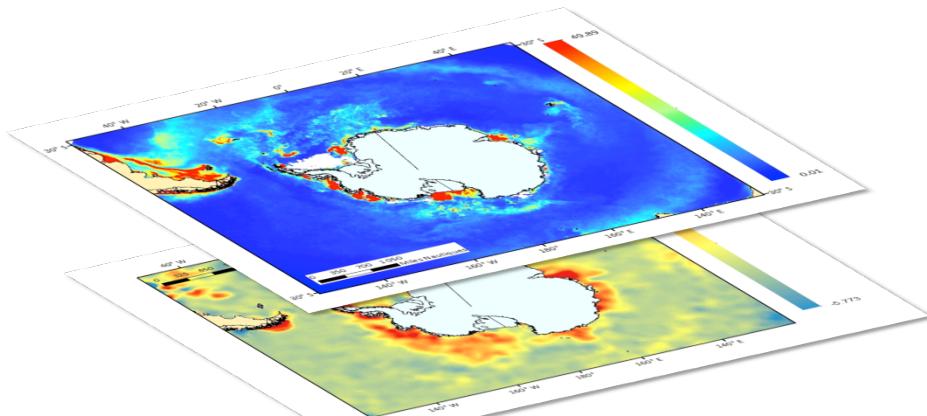
But... be careful...models are wrong !

“all models are wrong; some are useful....the practical question is how wrong do they have to be to not be useful » G. Box



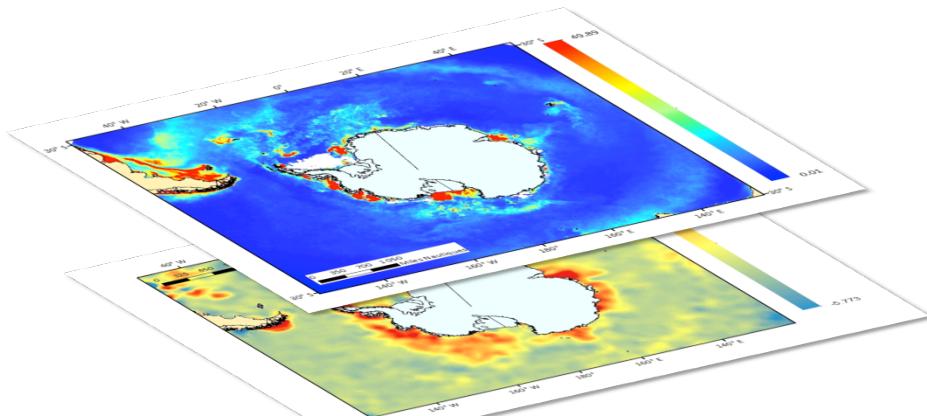
# SPECIES DISTRIBUTION MODELS principle

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[set of environmental descriptors]

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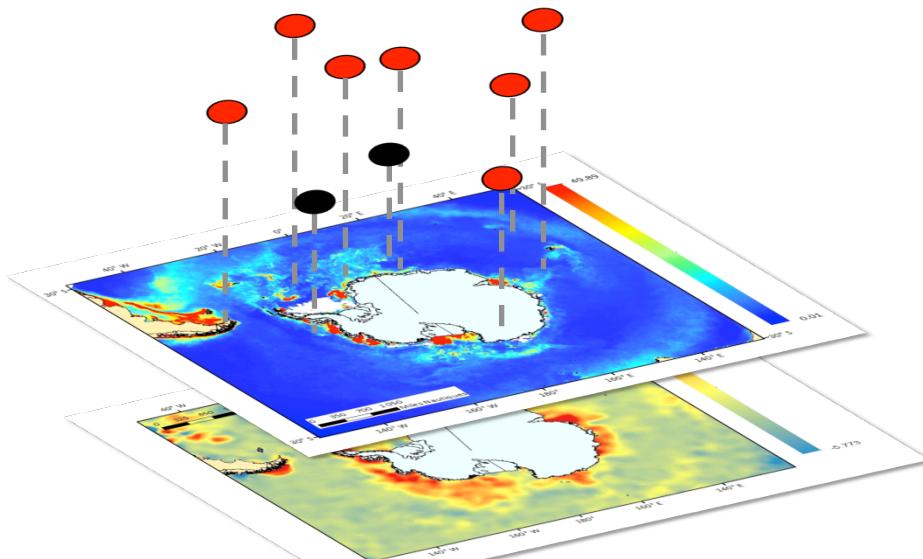


[set of environmental descriptors]

Variables // covariates

# SPECIES DISTRIBUTION MODELS principle

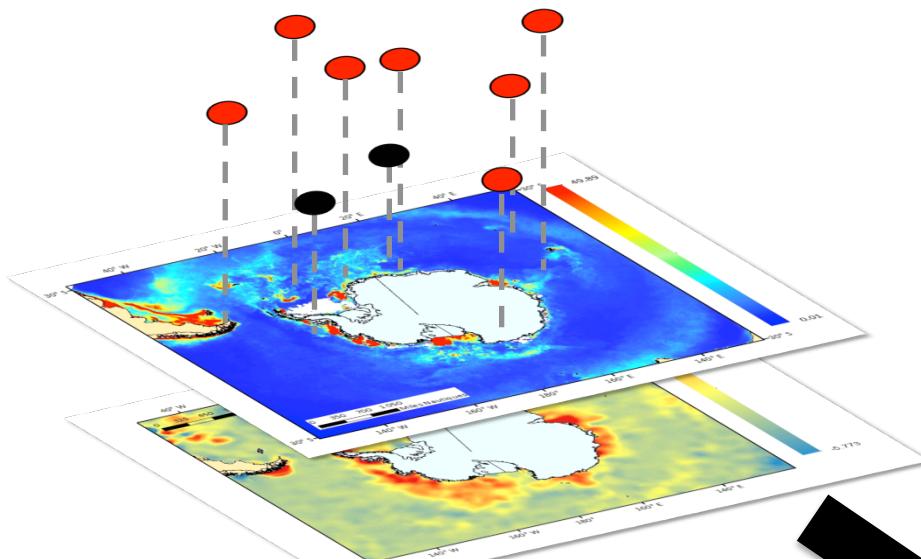
[presence + absence records]



[set of environmental variables]

# SPECIES DISTRIBUTION MODELS principle

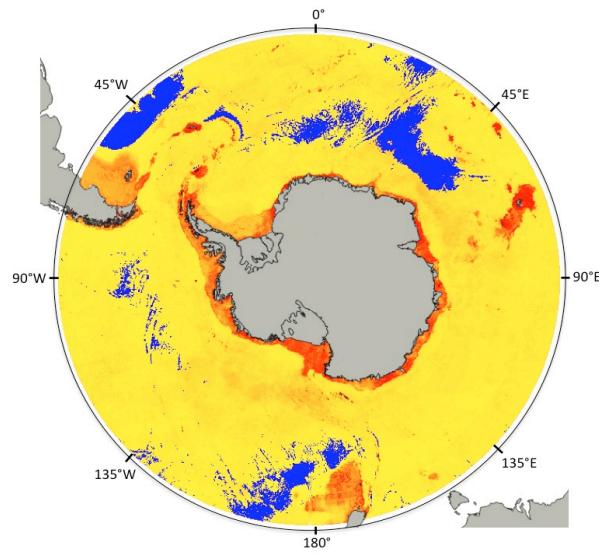
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SDM

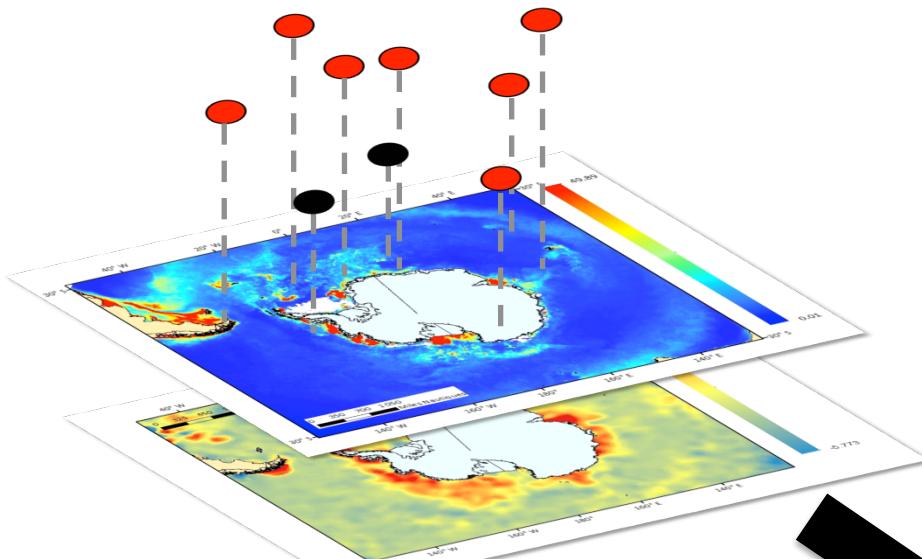
[Predicted distribution]



0 1

# SPECIES DISTRIBUTION MODELS principle

[presence + absence records]



[set of environmental variables]

$$Y \sim f(X)$$

$Y = P/A$  records

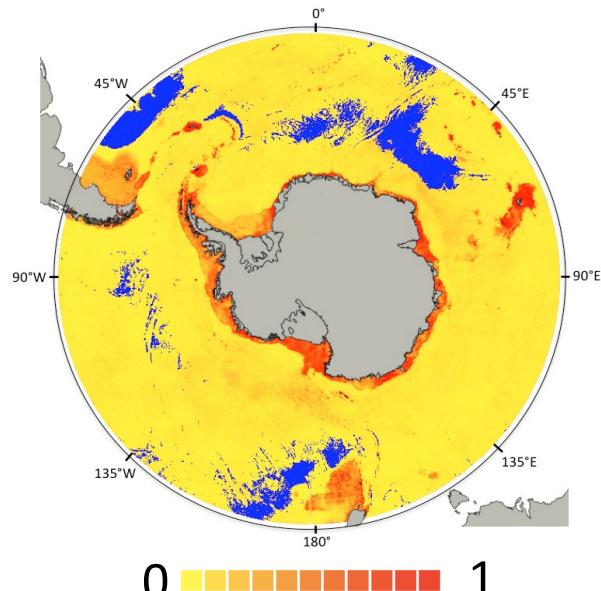
$X =$  Environmental covariates (descriptors)

Function could be linear / non-linear

Presence / absence?	Layer 1 e.g. Depth	Layer 2 e.g. T°	Layer 3 e.g. Salinity
1	-351	0.2	32.4
1	-150	-1.4	32.1
0	-1053	-2	32.8
1	-3042	0.3	31.9
...	...	...	...

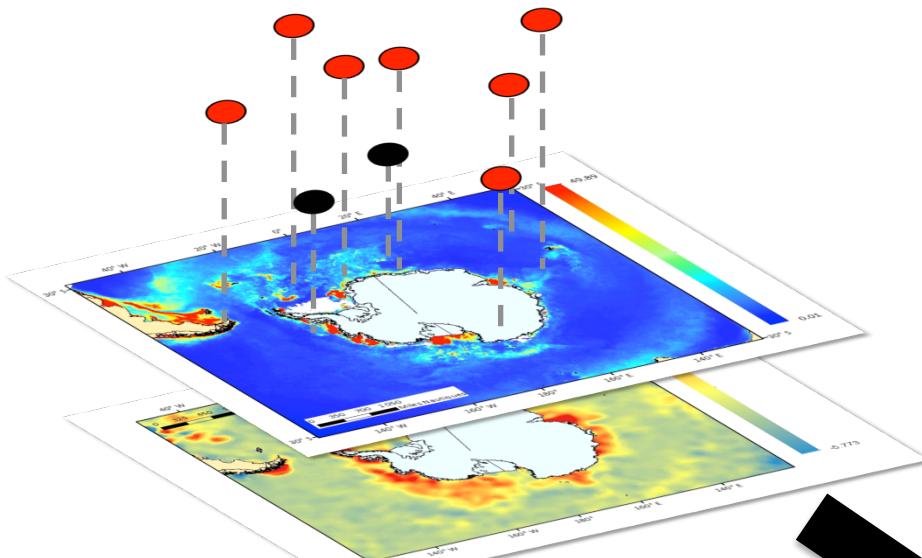
SDM

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# SPECIES DISTRIBUTION MODELS principle

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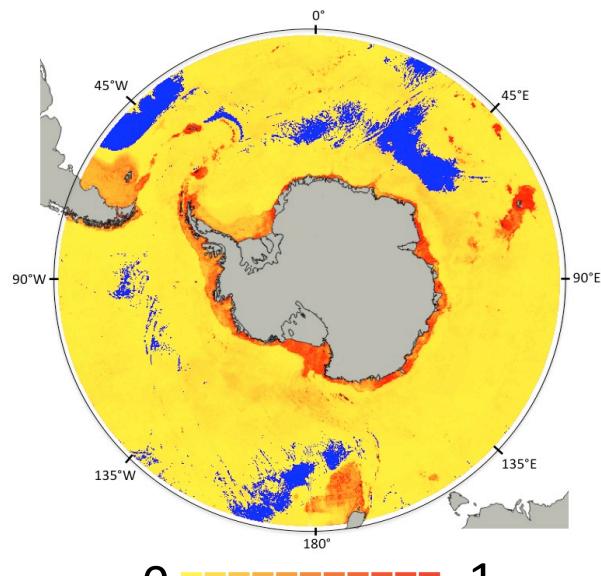


- Statistical / correlative relationship
- Easy to compute
- Several algorithms = several ways of relating occurrence & envi. covariates

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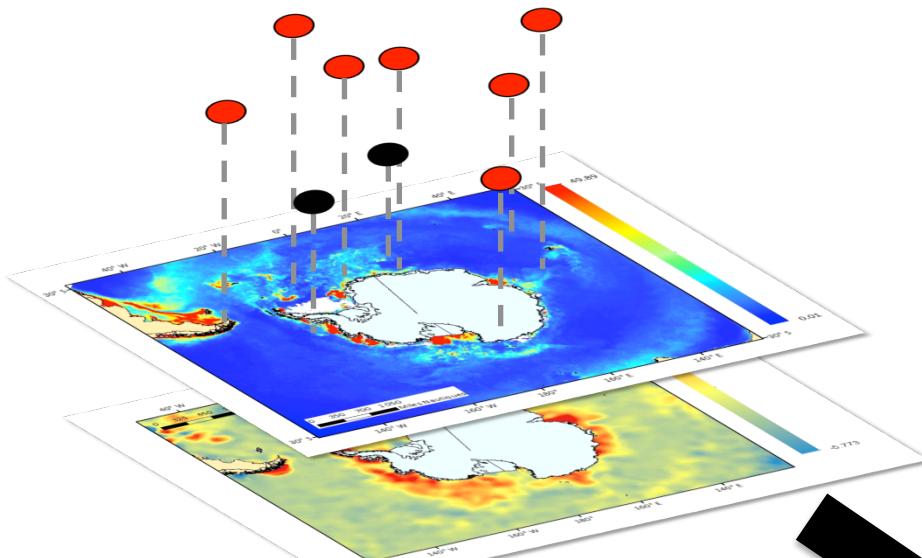
SDM

[Predicted distribution]



# SPECIES DISTRIBUTION MODELS principle

[presence + absence records]



[set of environmental variables]

## INPUTS

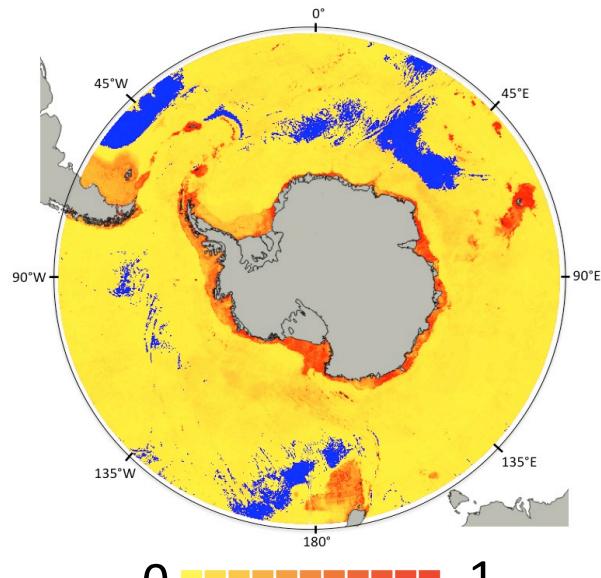
- Presence + absence data
- Presence-only data + background
- Abundance data



Presence / absence?	Layer 1 e.g. Depth	Layer 2 e.g. T°	Layer 3 e.g. Salinity
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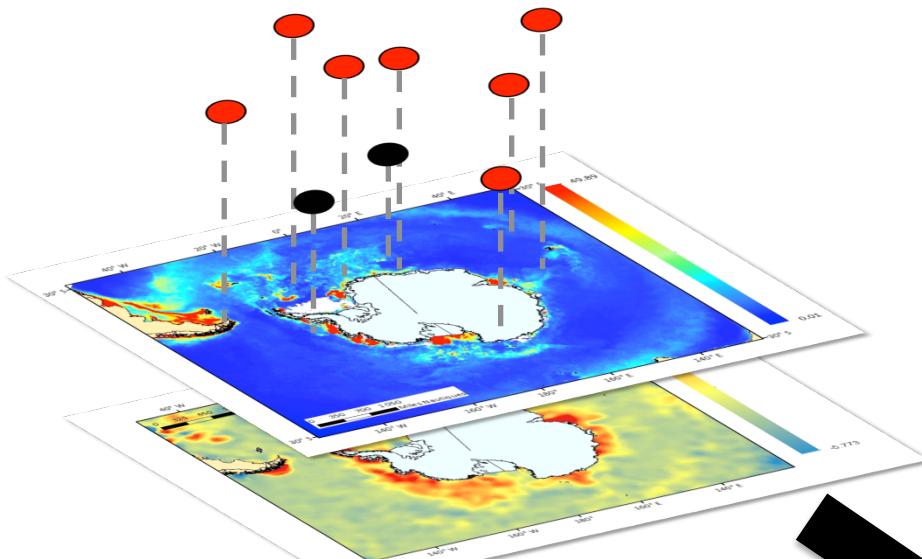
SDM

[Predicted distribution]



# SPECIES DISTRIBUTION MODELS principle

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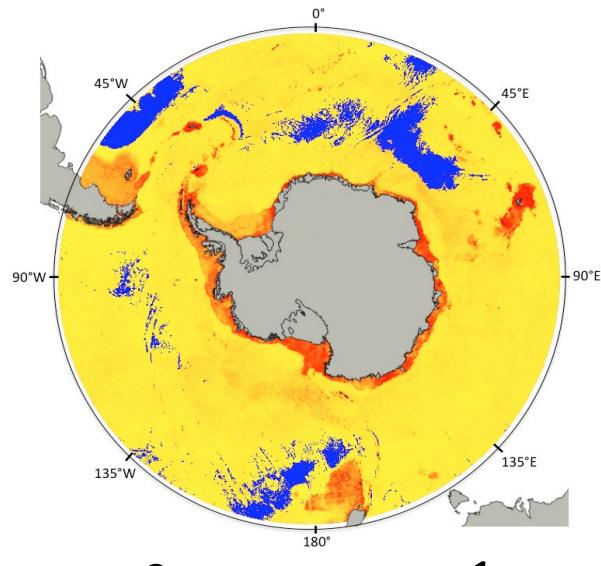


[set of environmental variables]

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SDM

[Predicted distribution]



## OUTPUTS

- Map of probabilities of distribution
- Lot of other things ! (see this afternoon!)



## INTRODUCTIVE LITERATURE

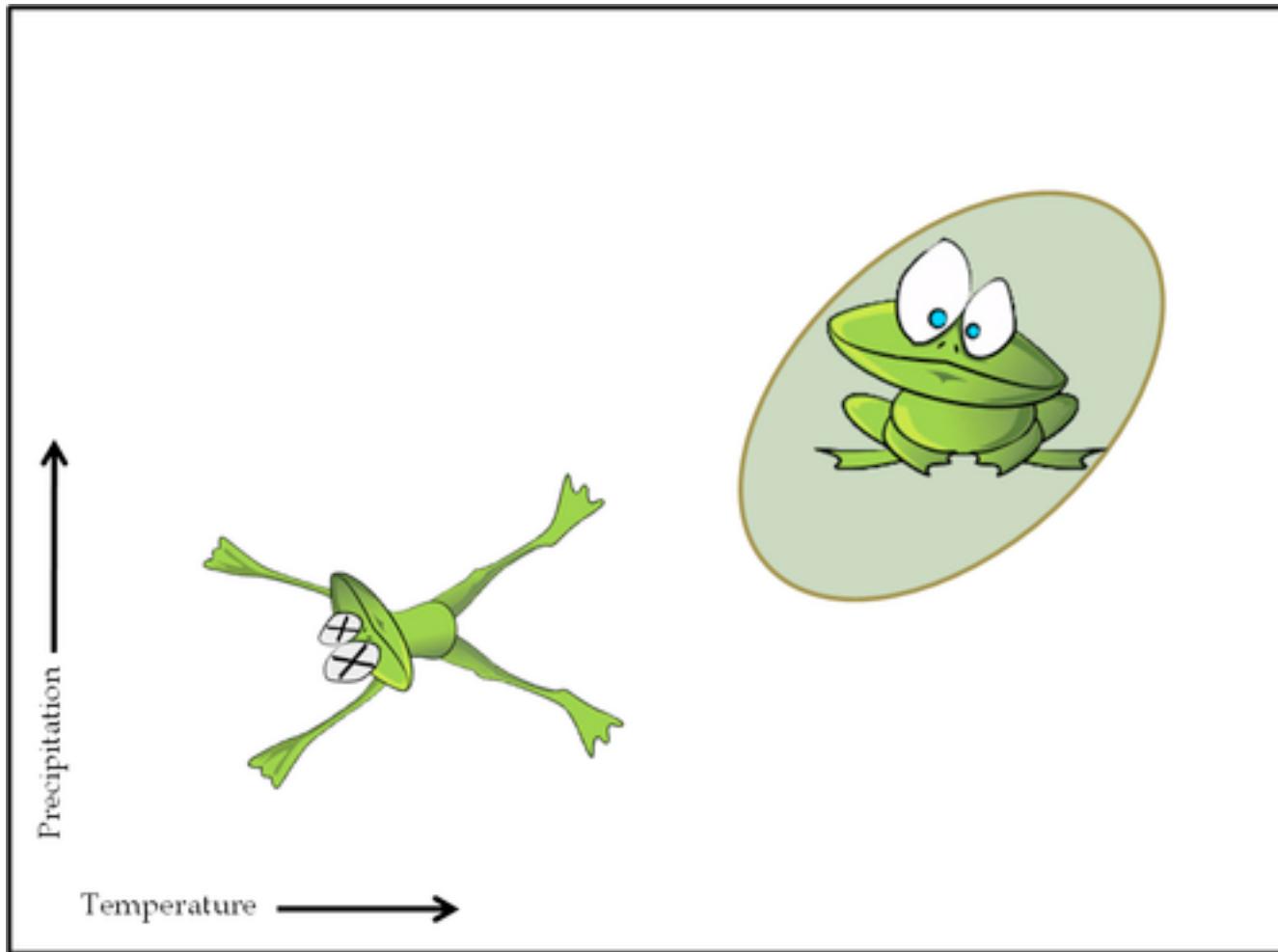
- Elith et al. 2006
- Araujo & Guisan 2006
- Elith & Leathwick 2009
- Guisan & Zimmermann 2000
- Peterson 2011

[all the publications in  
<https://github.com/SCAR/EGABIcourse19/Literature>]

Have also a look at 'dismo', 'raster', 'biomod' R packages -> functions and tutorials

\*\* A very good tutorial for SDMs in R can be found at:  
<https://r-spatial.org/sdm/index.html>

# RELATIONSHIP TO NICHE THEORY

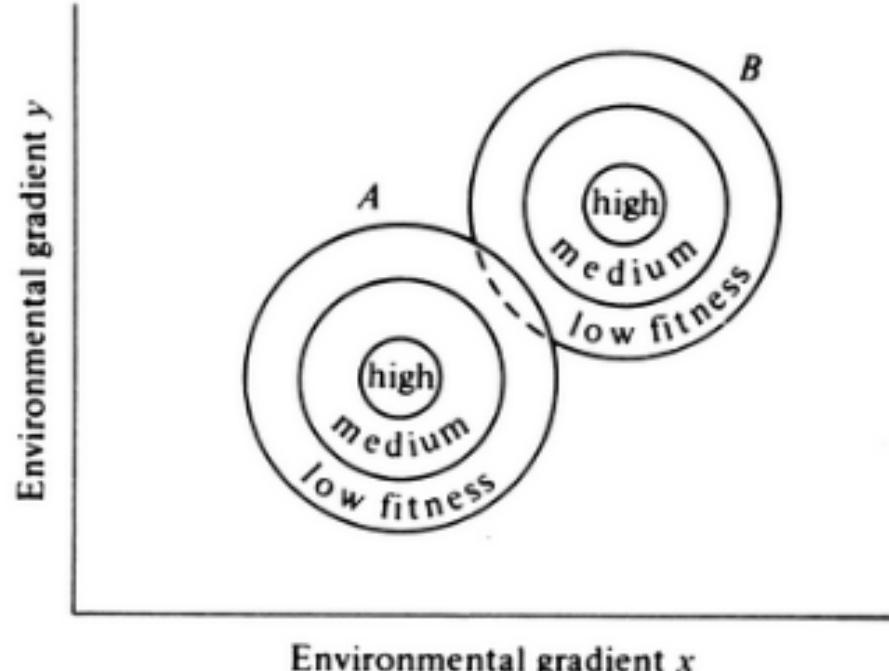
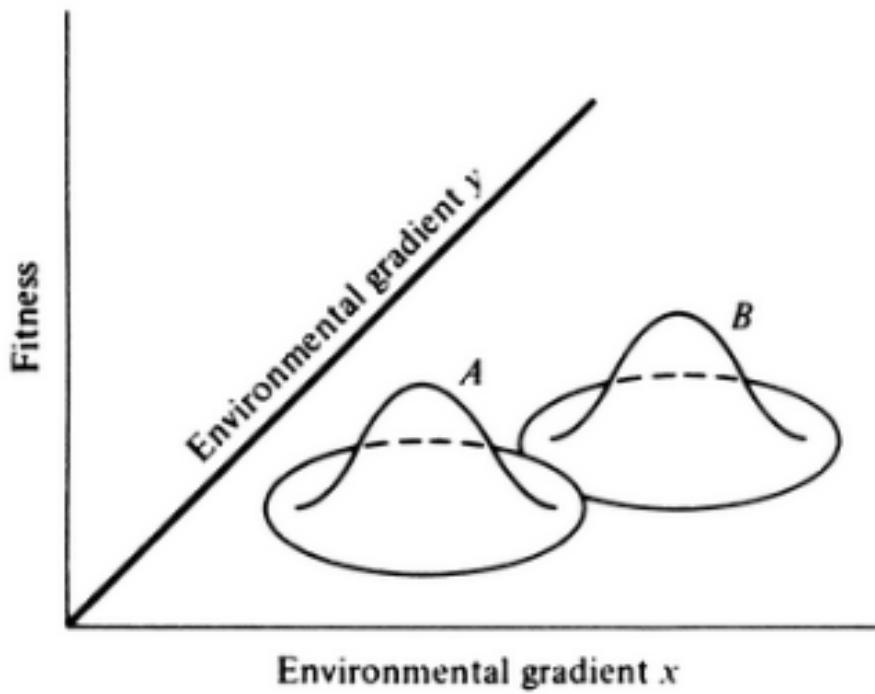




How do you define an  
ecological niche?

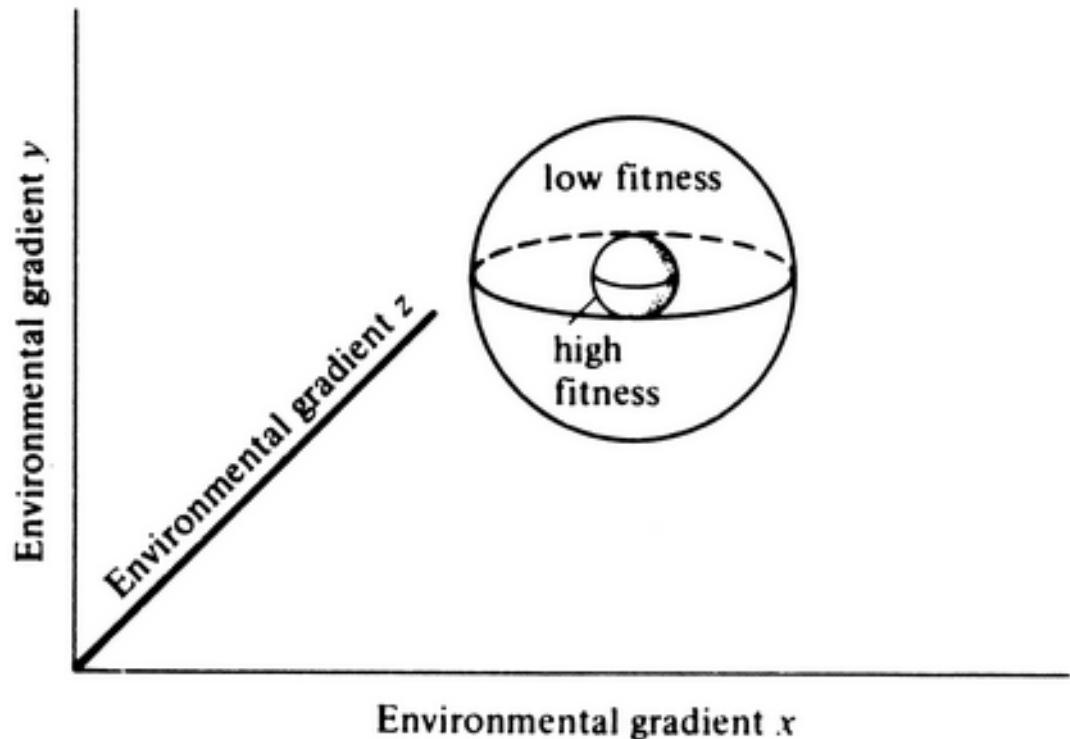
## Ecological niche:

All conditions that enable  
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# Relationship to niche theory...several theories !

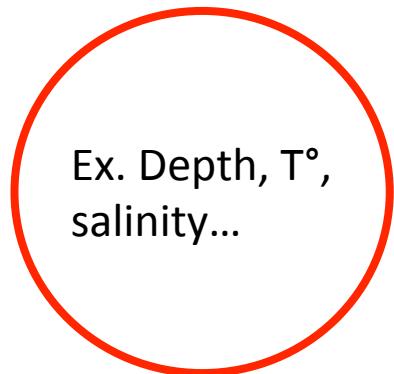
Grinnell (1917)

Ex. Depth, T°,  
salinity...

ABIOTIC CONDITIONS

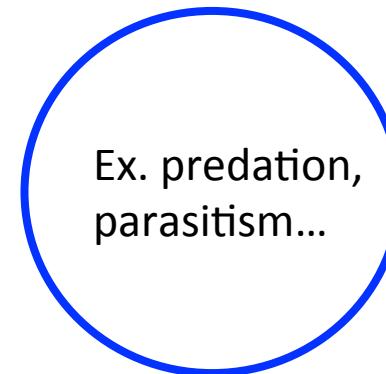
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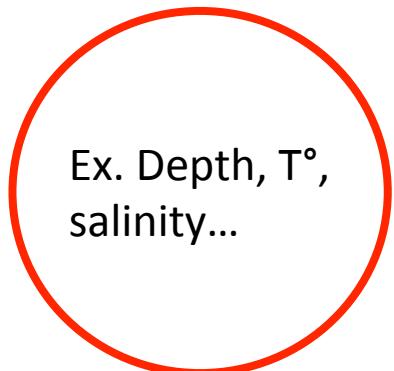
Elton (1927)



BIOTIC INTERACTIONS

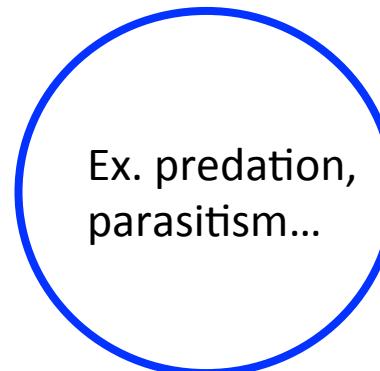
# Relationship to niche theory...several theories !

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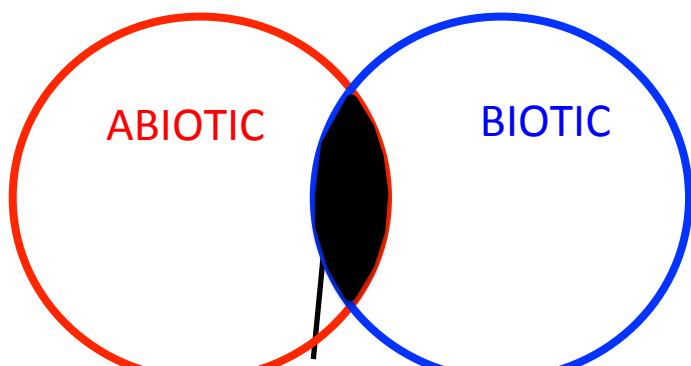
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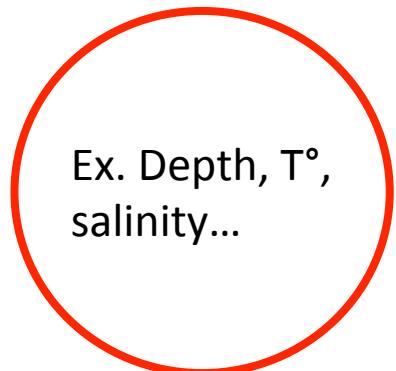
Hutchinson (1957)



Biotic interactions limit the use of abiotic

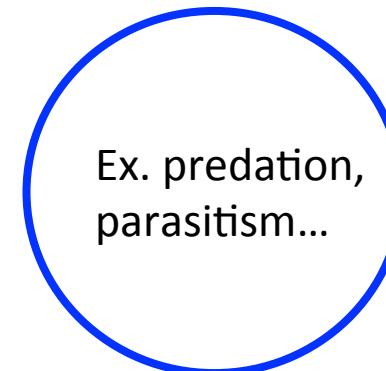
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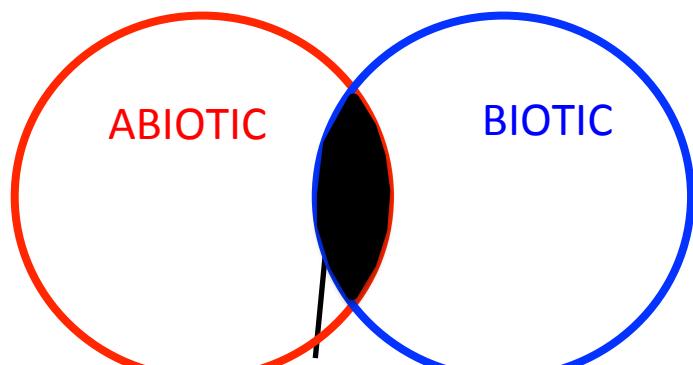
ABIOTIC CONDITIONS

Elton (1927)



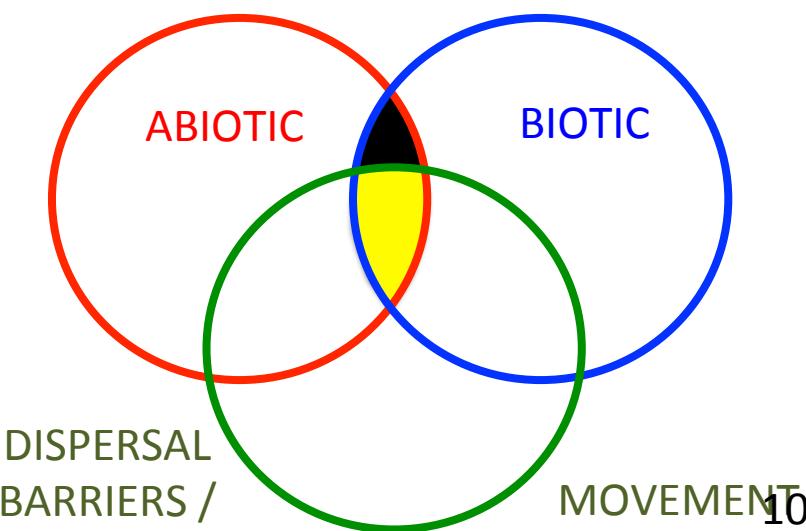
BIOTIC INTERACTIONS

Hutchinson (1957)



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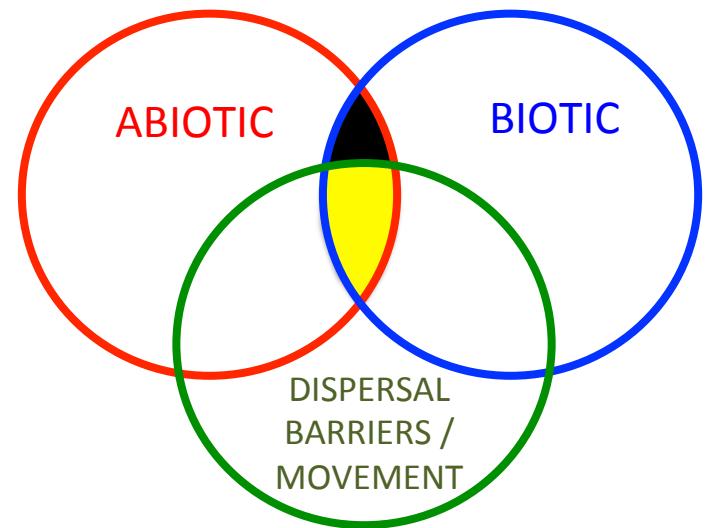
Soberon & Peterson (2005)



DISPERSAL  
BARRIERS /

MOVEMENT 10

SDM ??



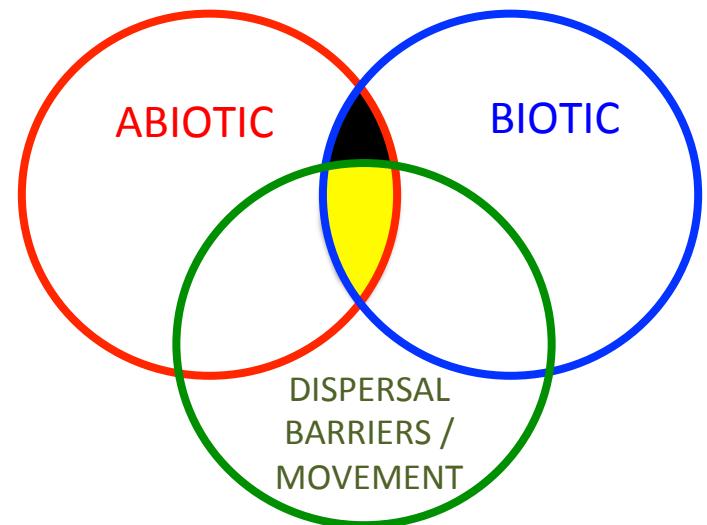
## SDM ??



Calibrated on presence data

-> areas where the species is actually present

-> ABIOTIC + BIOTIC + MOVEMENT impacts



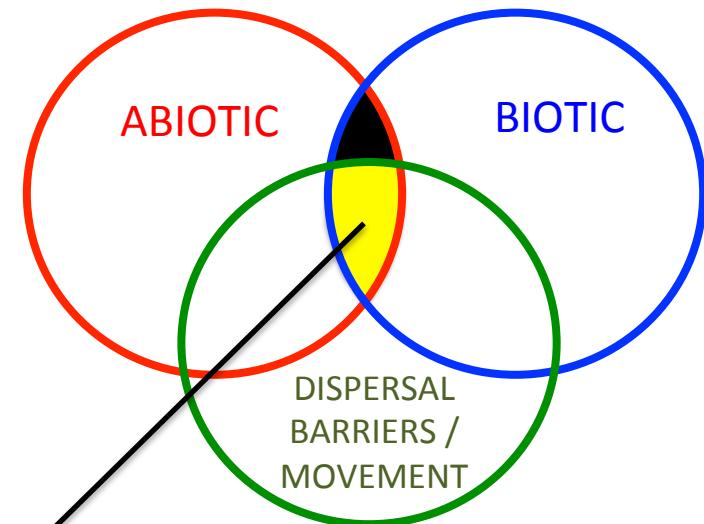
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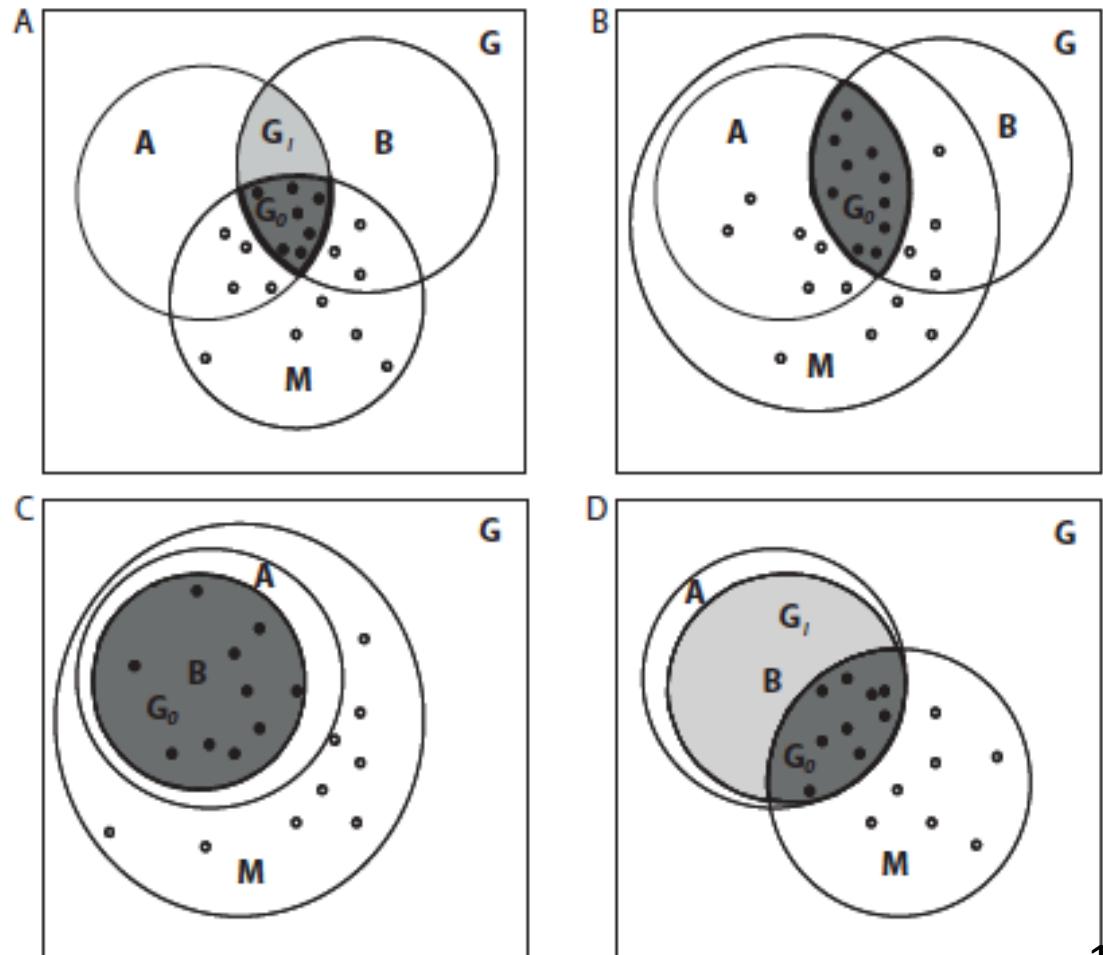


What the SDM  
actually models !  
**= realised niche**

# Relationship to niche theory...several theories !

Theory is not that simple....

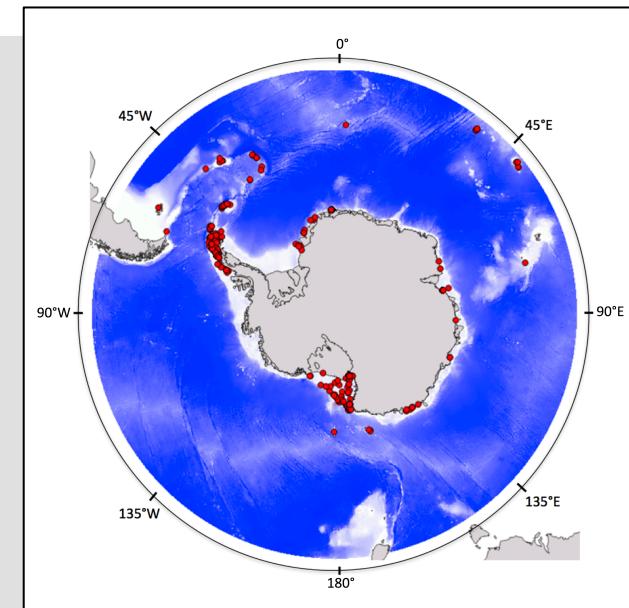
Several ways of representing the BAM diagram...





## DRAWBACKS

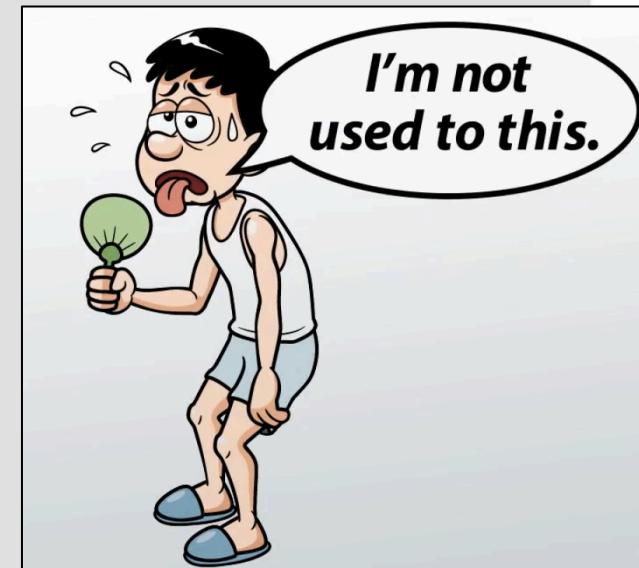
- Definition of the occupied space of presence records strongly dependent of the sampling effort + spatial scale





## DRAWBACKS

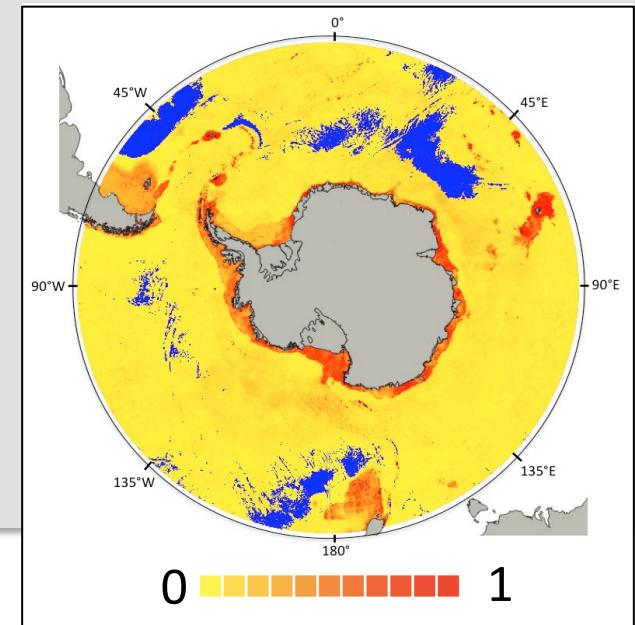
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- Equilibrium occurrences / environment ??





## DRAWBACKS

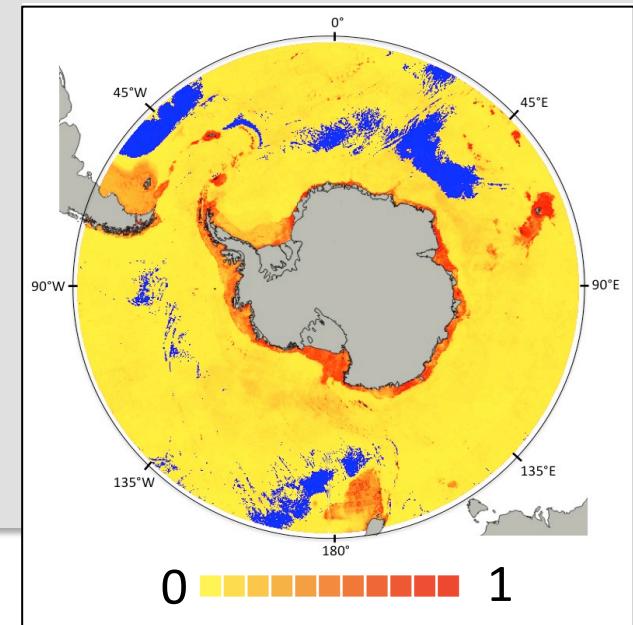
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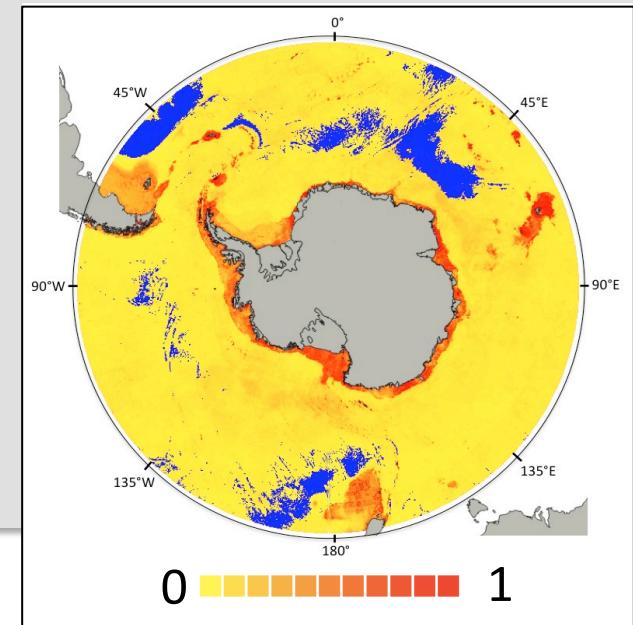
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- SDM sensitive to a lot of biases (cf. following courses)





## DRAWBACKS

- Definition of the occupied space of presence records strongly dependent of the sampling effort + spatial scale
- Equilibrium occurrences / environment ??
- Broad scale projections: results difficult to validate
- SDM sensitive to a lot of biases (cf. following courses)



**TAKE HOME MESSAGE :**  
**BE CAREFUL WITH YOUR INTERPRETATIONS !**



## ADVANTAGES... !

- Enable to simply and quickly describe the species niche with occurrence records (simple information to get)
- Some softwares are user friendly and can help quickly provide results
- Enable to make predictions in space and time
- Results easy to interprete

Questions ?

# Discussion

- 1) What kinds of questions can we answer with species distribution models?
- 2) Can you think of any examples of when SDMs have made a positive impact on conservation?
- 3) Can you think of examples of how SDMs have been used to study potential impacts of climate change?
- 4) If you have ever read a paper that used SDMs, how accessible (easy to understand) were the methods? Did they include their code?

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# COMPUTERS ON !

- Have a look at the provided literature
- Have a look at youtube tutorials to explain SDMs