



Credit : Amelia Curd

Species on the move (and gene flow)

January 12 2023

A framework for studying the within-range structure of species with discontinuous distributions under climate change

Amelia Curd, Mathieu Chevalier, Mick Vasquez, Aurélien Boyé, Louise Firth, Martin Marzloff, Lucy Bricheno, Mike Burrows, Laura Bush, Céline Cordier, Andy Davies, Mattias Green, Steve Hawkins, Fernando Lima, Claudia Meneghesso, Nova Mieszkowska, Rui Seabra and Stan Dubois



Predicted range changes are often global

Introduction



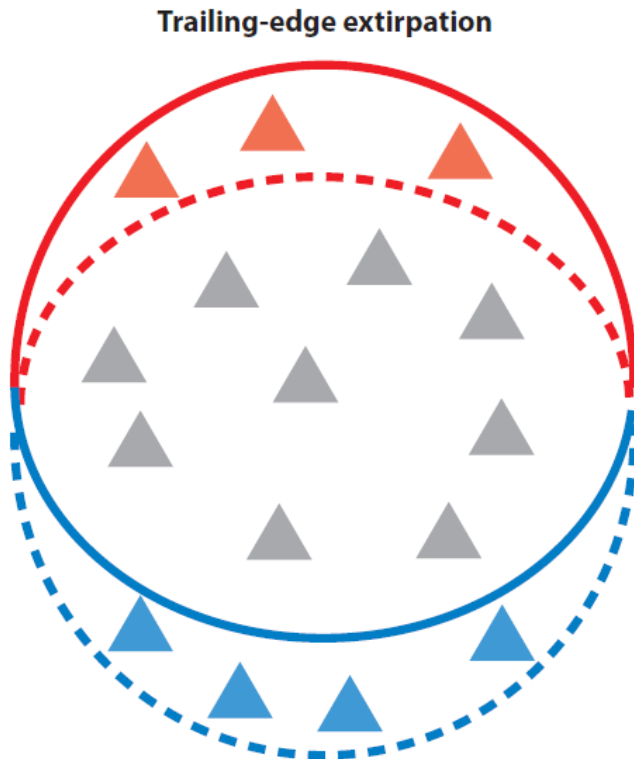
Part I:
SDM



Part II:
LSM



Conclusions



As Earth's climate rapidly changes, species must adapt or move.

Range changes are often modelled as if ranges were homogeneous.

- Species range before climate change
- - - Species range after climate change
- ▲ Local population

Yet many species have fragmented ranges

Terrestrial species: mountain ranges, roads,...

Introduction



Part I:
SDM

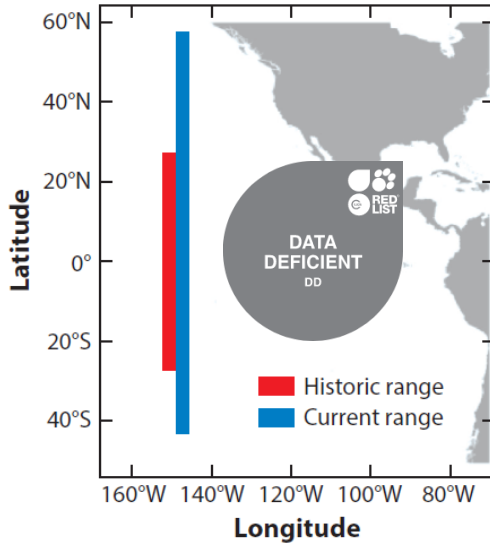


Part II:
LSM

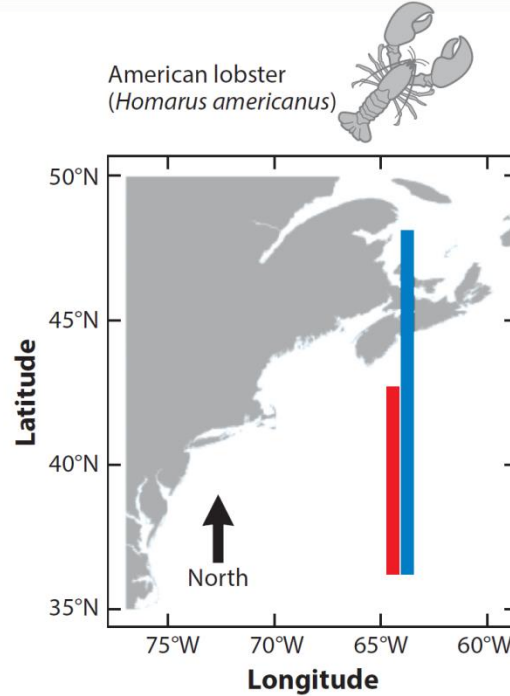


Conclusions

Humboldt squid
(*Dosidicus gigas*)



American lobster
(*Homarus americanus*)



(Pinsky et al., 2020)



Marine species: hydrographic barriers, lack of suitable substrate, ...

Objectives

Using an ecosystem engineer with a naturally fragmented distribution



Introduction

Part I:
SDM



I. Predicted Present & Future scenarios

Range-long species distribution modelling
(SDM)



II. Within-range changes

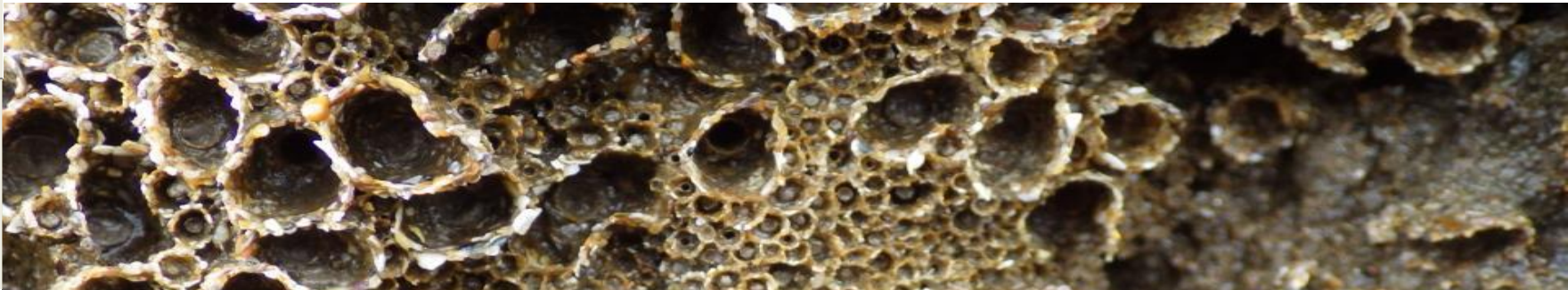
Landscape metrics (LSM) applied to
SDM outputs



Part II:
LSM



Conclusions



The intertidal ecosystem engineer - *Sabellaria alveolata*

Introduction



Ranges from Scotland to Morocco



Part I: SDM



Turns soft substrate
into biogenic reef

Part II: LSM



High-diversity habitat
buffers infauna from
environmental extremes



Credit : Stan Dubois

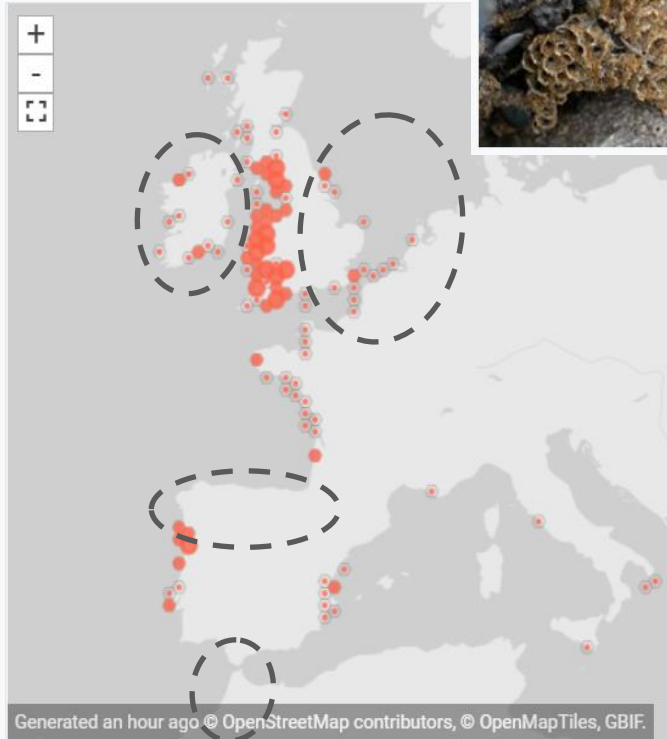
Conclusions



No accurate 'off-the-shelf' occurrence dataset

Honeycomb worm In English **Basionym:** *Sabella alveolata* Linnaeus, 1767

2,297 GEOREFERENCED RECORDS



Generated an hour ago © OpenStreetMap contributors, © OpenMapTiles, GBIF.

Any year

1888 - 2020

accessed on 14-06-2020

Often SDM papers simply state:

"GBIF data for these x species was downloaded" OR "we downloaded IUCN geographic range map polygons"

Spatial bias – we know this doesn't accurately represent *S. alveolata* distribution

Introduction



Part I:
SDM



Part II:
LSM



Conclusions



S. alveolata Records Search Methods

Introduction



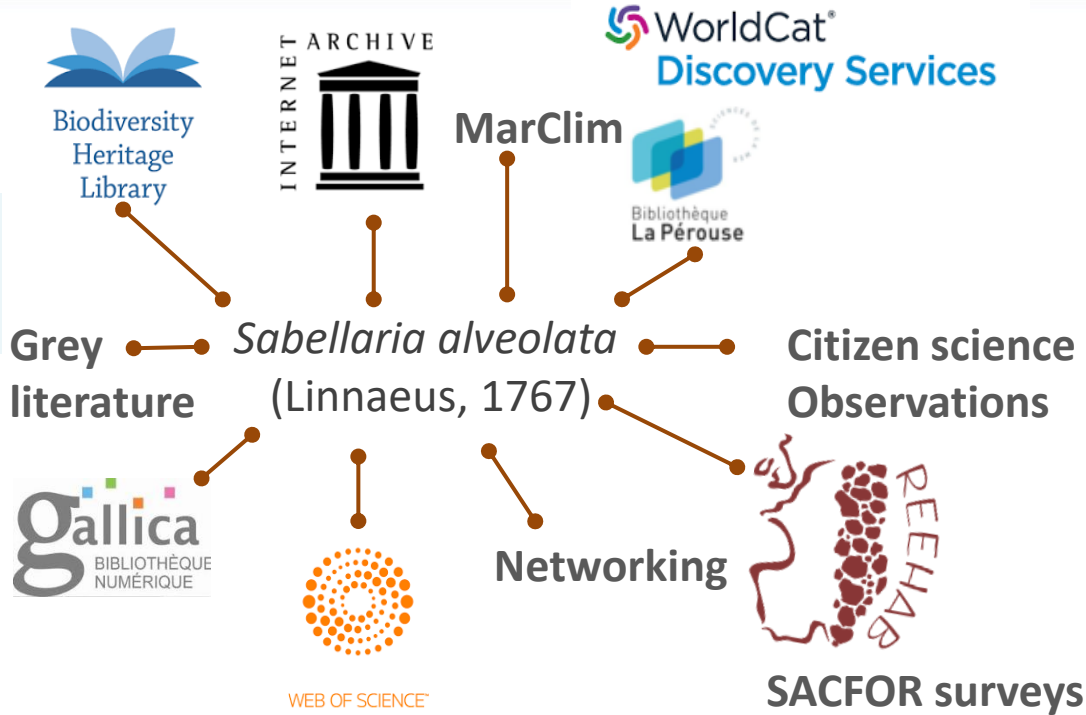
Part I:
SDM



Part II:
LSM



Conclusions



>21,500
occurrence records
collated between
1821-2019

17,425
occurrence records
collated between
2000-2019

One observation
record per raster
cell

Presence selected
over absence

(Curd et al., 2020; Firth et al., 2021)

363 spatially thinned presence records

Introduction



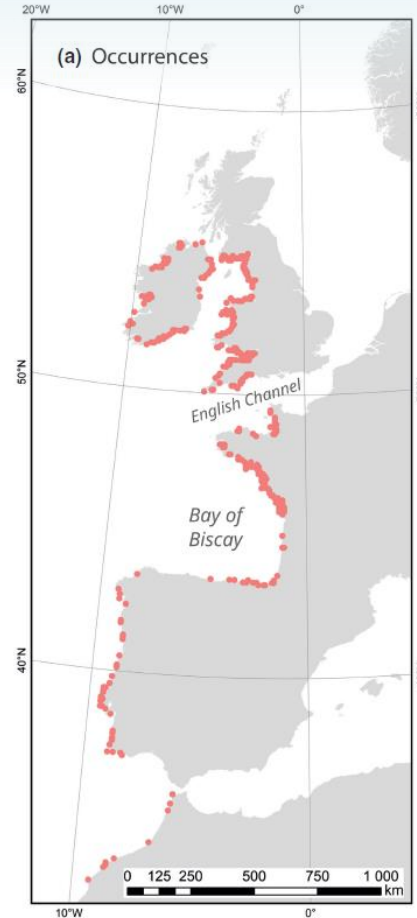
Part I:
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Part II:
LSM



Conclusions



1.pixel⁻¹
2000-2019
1 pixel = 25km²

Lambert
azimuthal
equal-area
projection

Model building and evaluation

Introduction



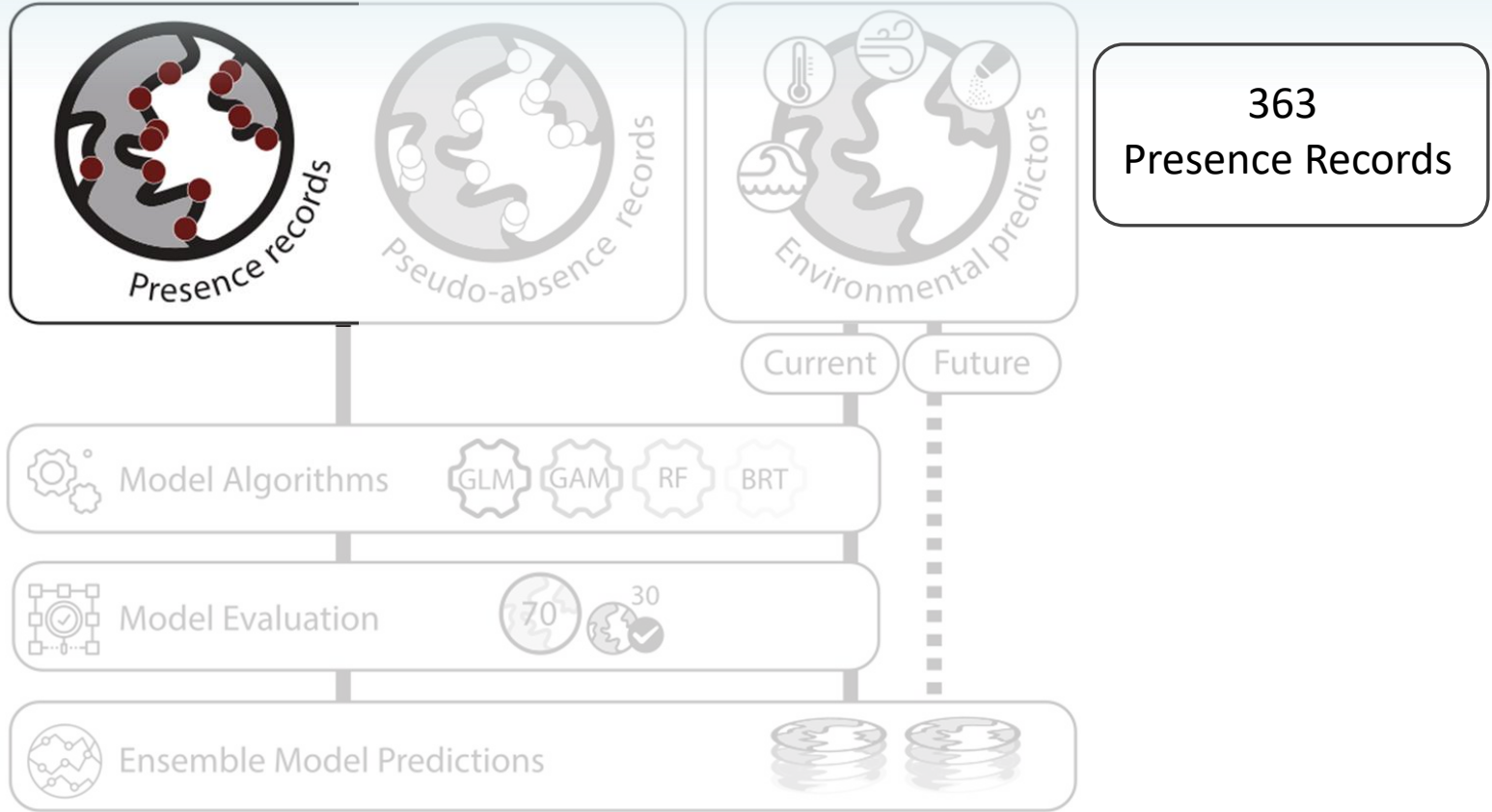
Part I:
SDM



Part II:
LSM



Conclusions



Using the biomod2: package in R (Thuiller et al., 2009)

Model building and evaluation

Introduction



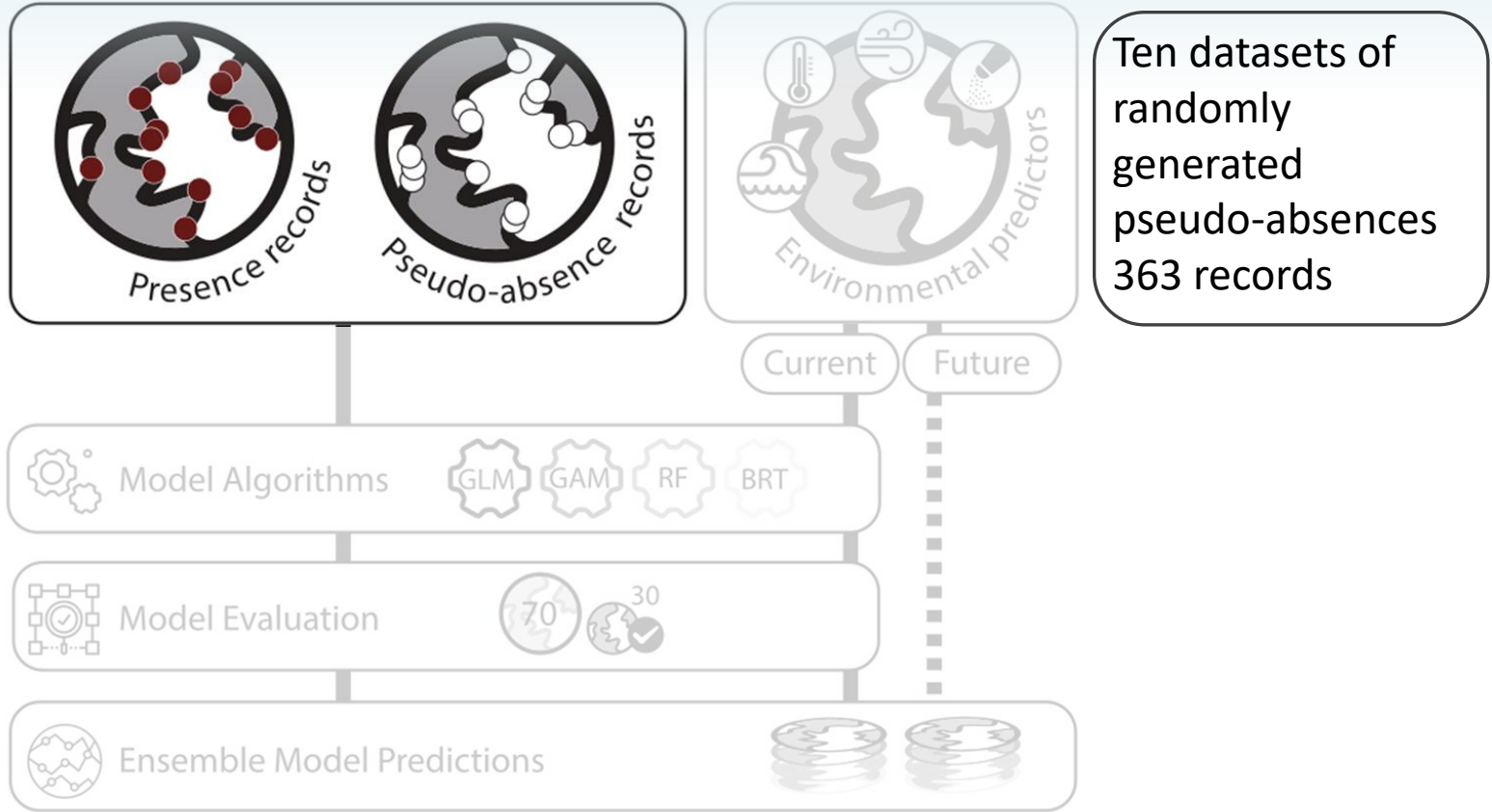
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Using the biomod2: package in R (Thuiller et al., 2009)

Model building and evaluation

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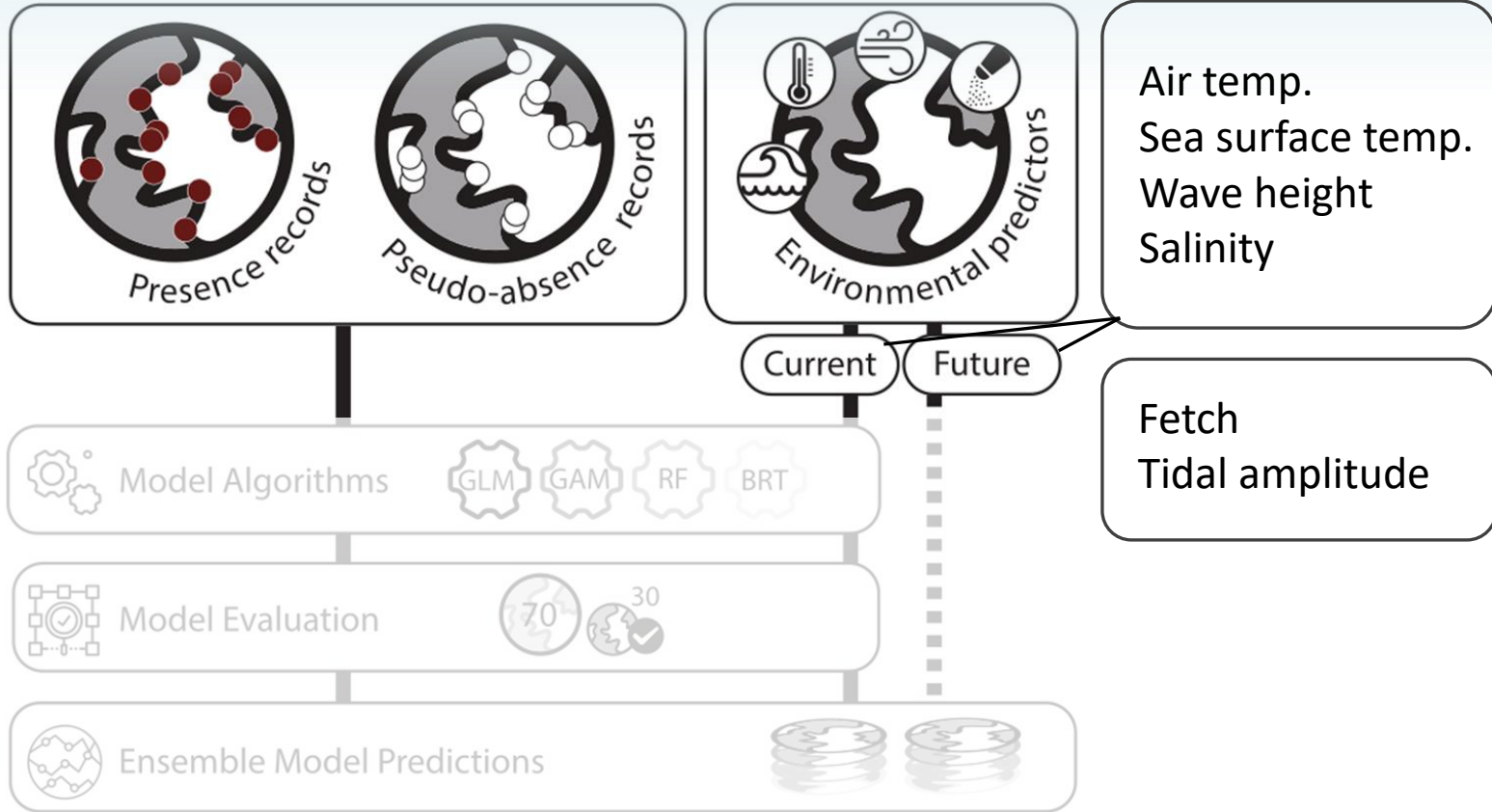
Part I:
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LSM



Conclusions



Model building and evaluation

Introduction



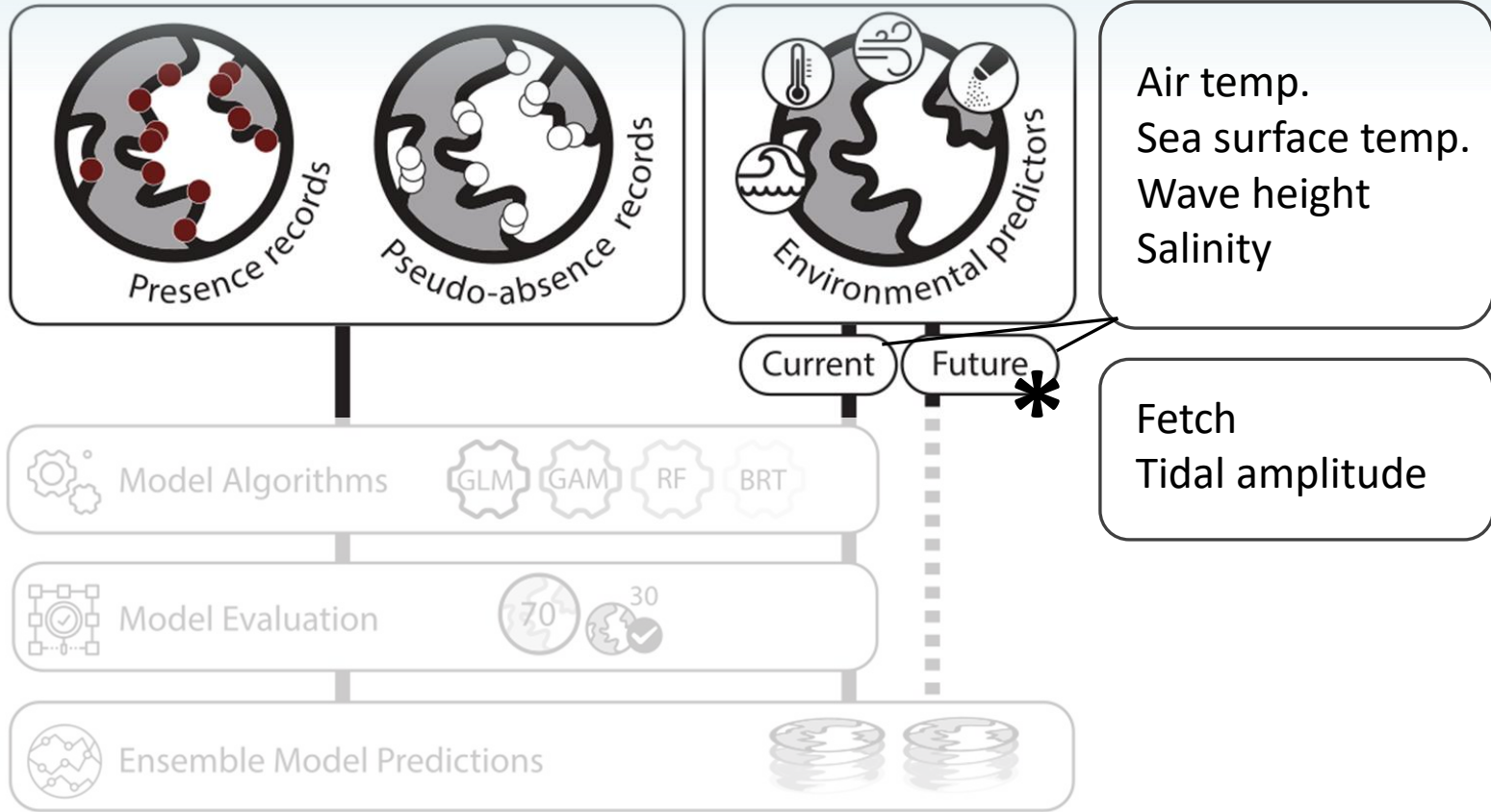
Part I:
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Conclusions



Using the biomod2: package in R (Thuiller et al., 2009)

Future = RCP 4.5 in 2050

Introduction



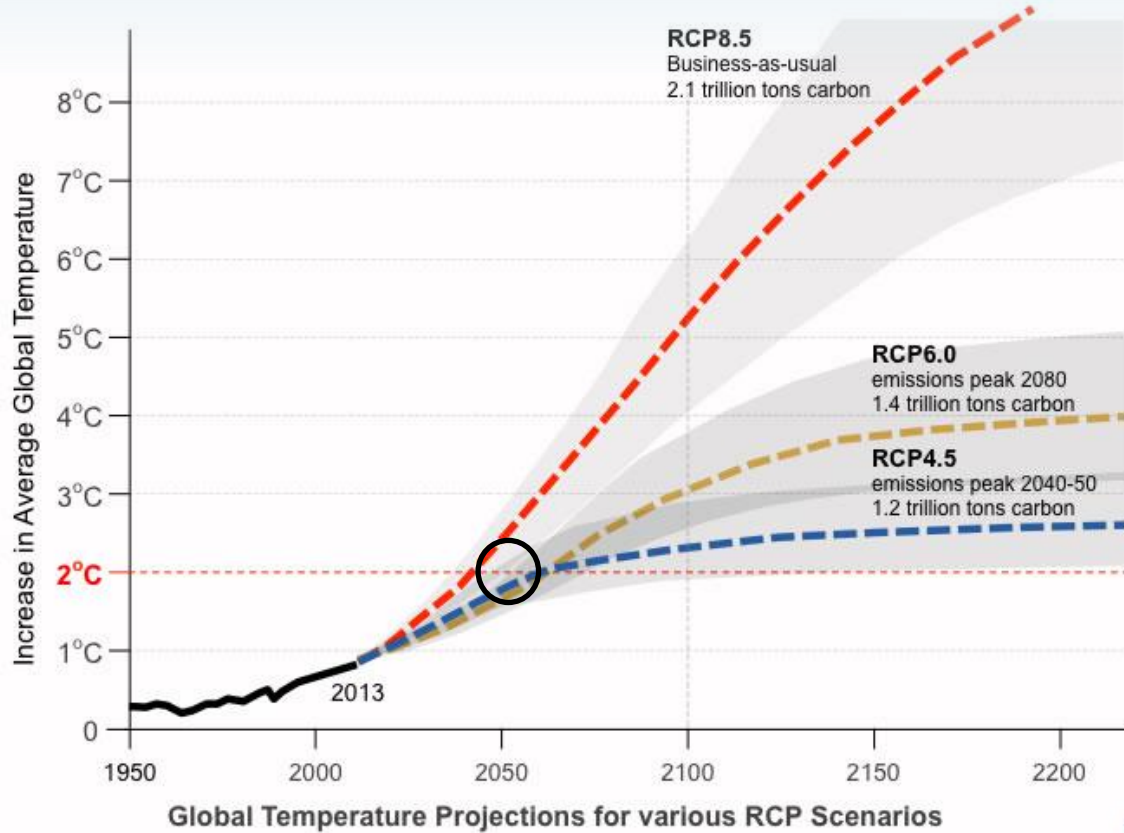
Part I:
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LSM



Conclusions



Source: Architecture 2030; Adapted from IPCC Fifth Assessment Report, 2013
Representative Concentration Pathways (RCP), temperature projections for SRES scenarios and the RCPs.



Ensemble Model Predictions of Present Distribution Performed Well

Introduction



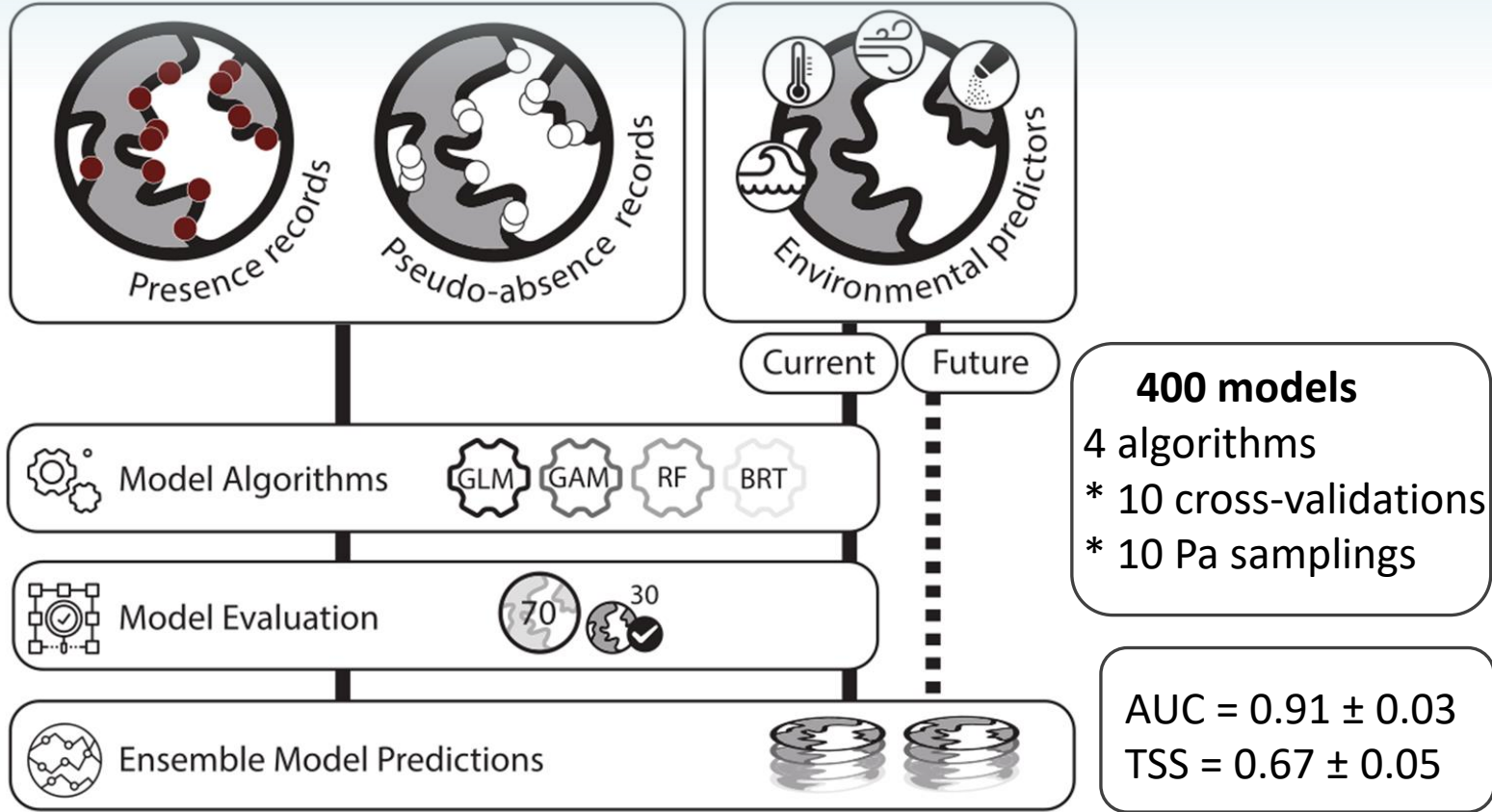
Part I:
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Part II:
LSM



Conclusions



Using the biomod2: package in R (Thuiller et al., 2009)

Current & Future Habitat Suitability Conditions

Introduction



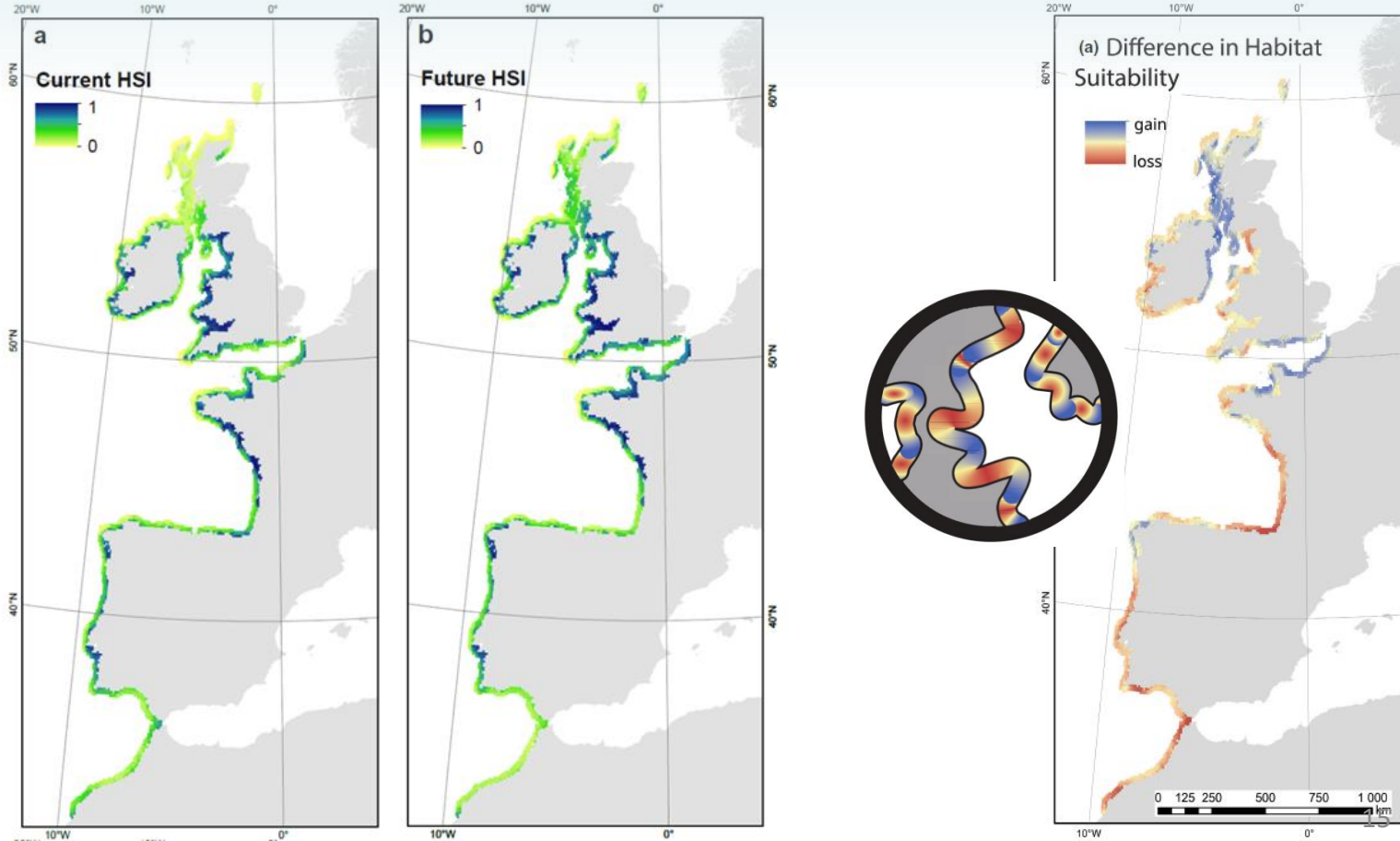
Part I:
SDM



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LSM



Conclusions



Landscape ecology metrics are usually applied to habitat type maps

Introduction



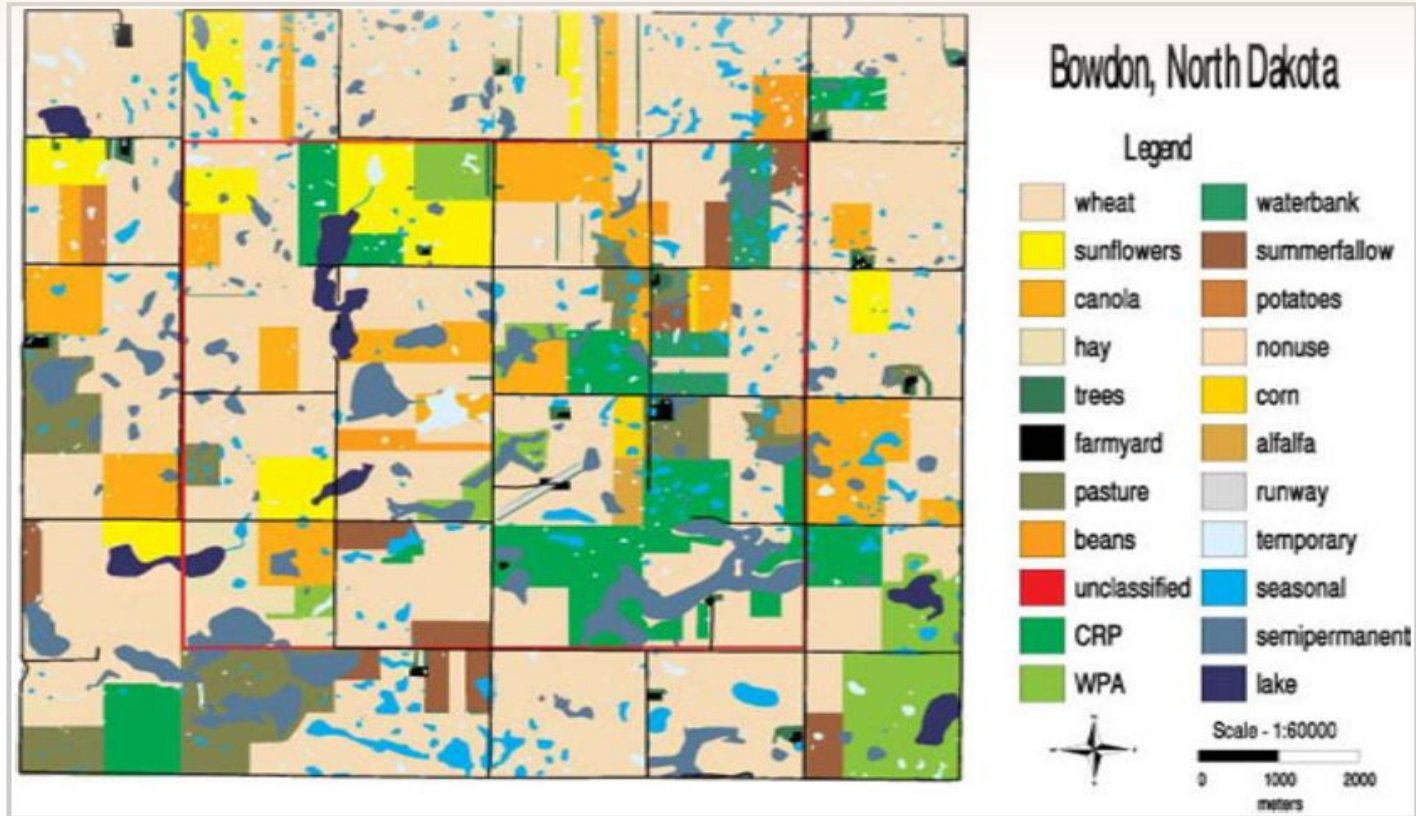
Part I:
SDM



Part II:
LSM



Conclusions



Landscape ecology metrics were applied to binary maps

Introduction



Part I:

SDM

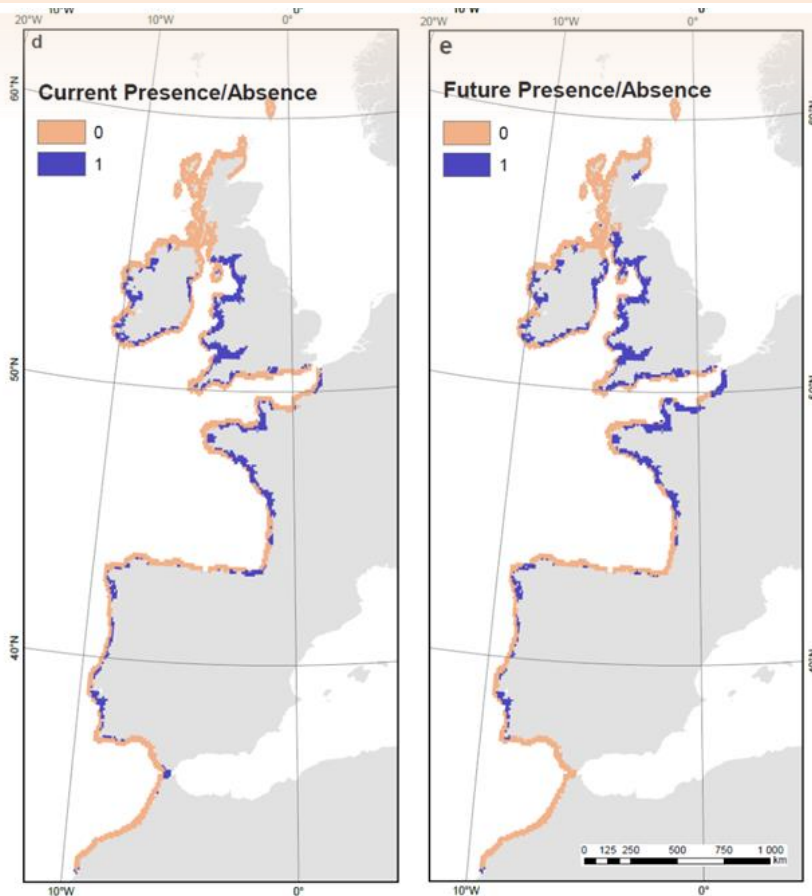


Part II:

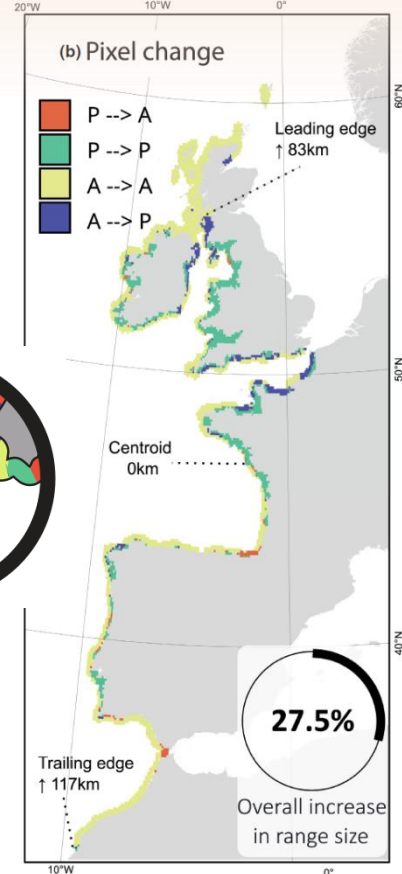
LSM



Conclusions



maxTSS threshold of 0.53



Applying landscape metrics to patches of presence/absence

Introduction



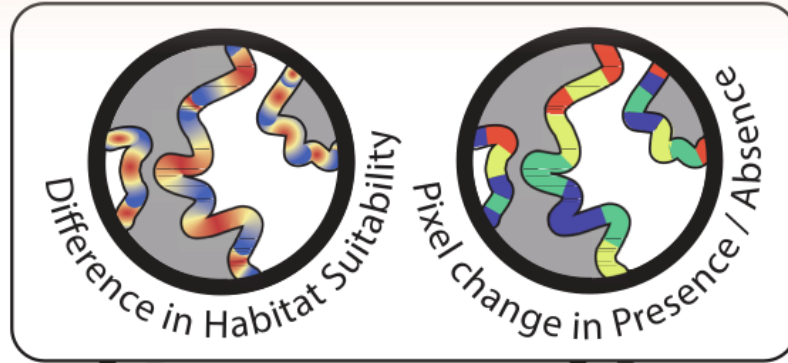
Part I:
SDM



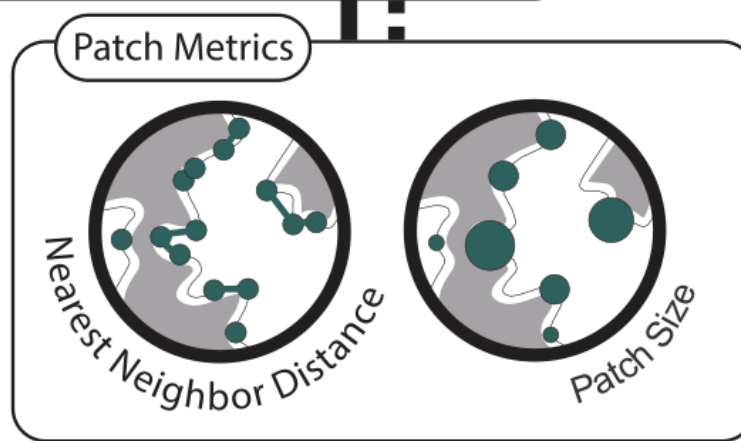
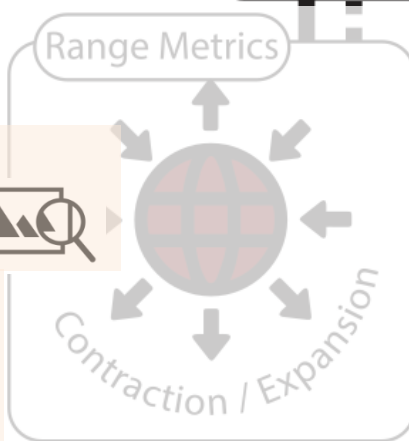
Part II:
LSM



Conclusions



A patch is defined as one isolated, or several adjacent, pixels of the same class



Landscape metrics describe change in patch properties (eg. area, Euclidean distance to the nearest neighbour)

Using the landscapemetrics: package in R (Hesselbarth et al., 2019)

Enhancing within-range model predictive power

Introduction



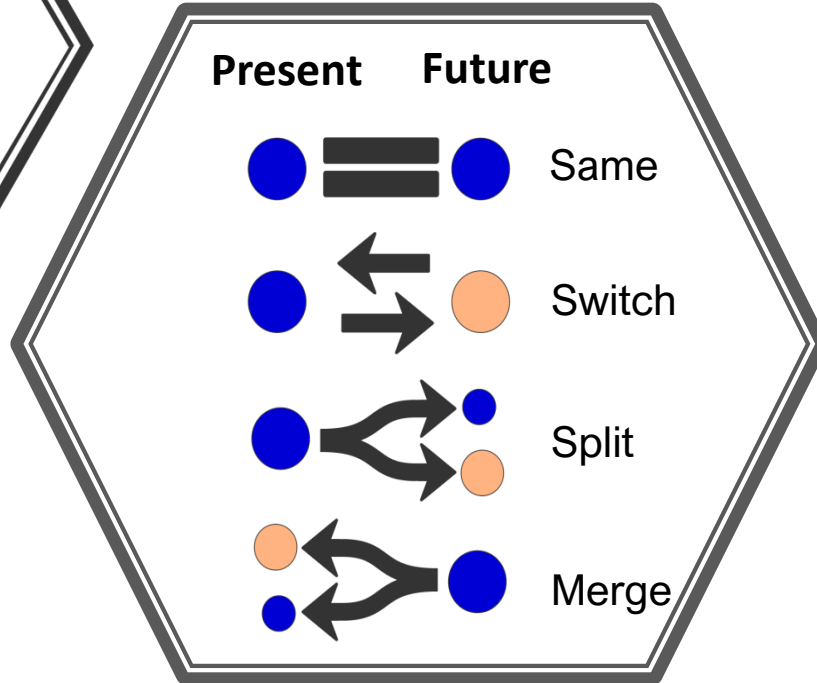
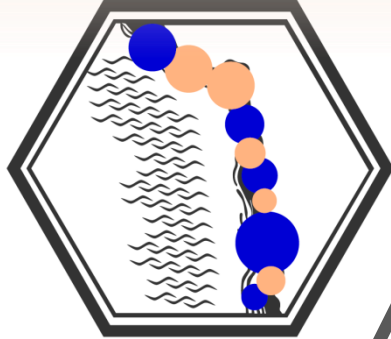
Part I:
SDM



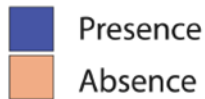
Part II:
LSM



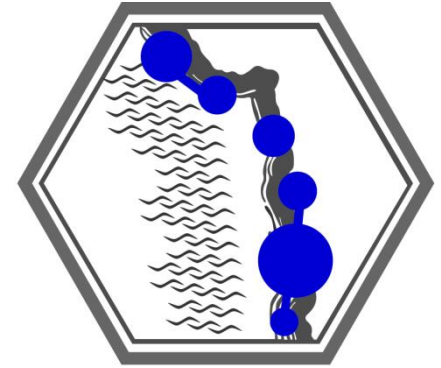
Conclusions



Patch state



Each pixel retains additional quantitative information (i.e. habitat suitability)



i.e. Patch isolation

Localised extirpation in the current range centre

Introduction



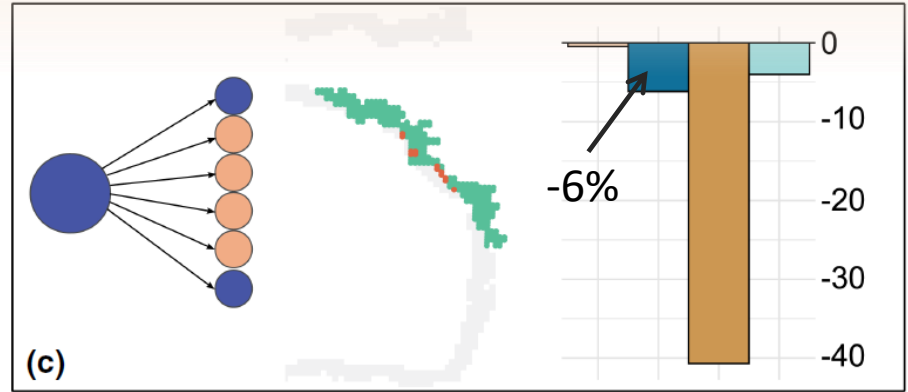
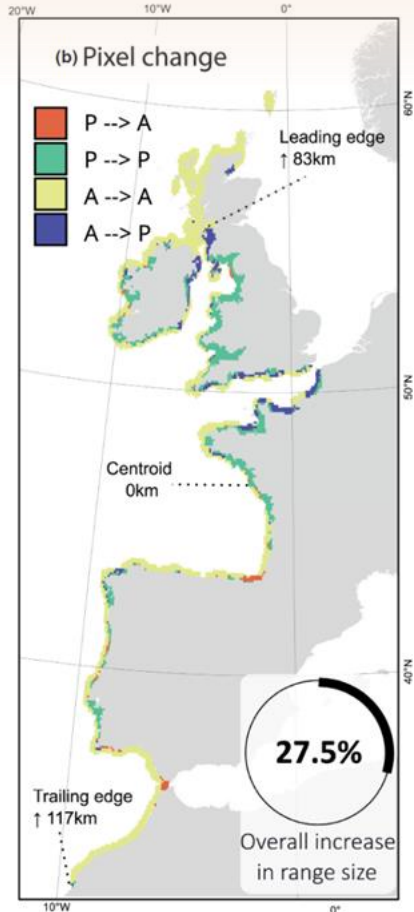
Part I: SDM



Part II: LSM



Conclusions



Patch state

- Presence
- Absence

Pixel change

- P --> A
- A --> A
- P --> P
- A --> P

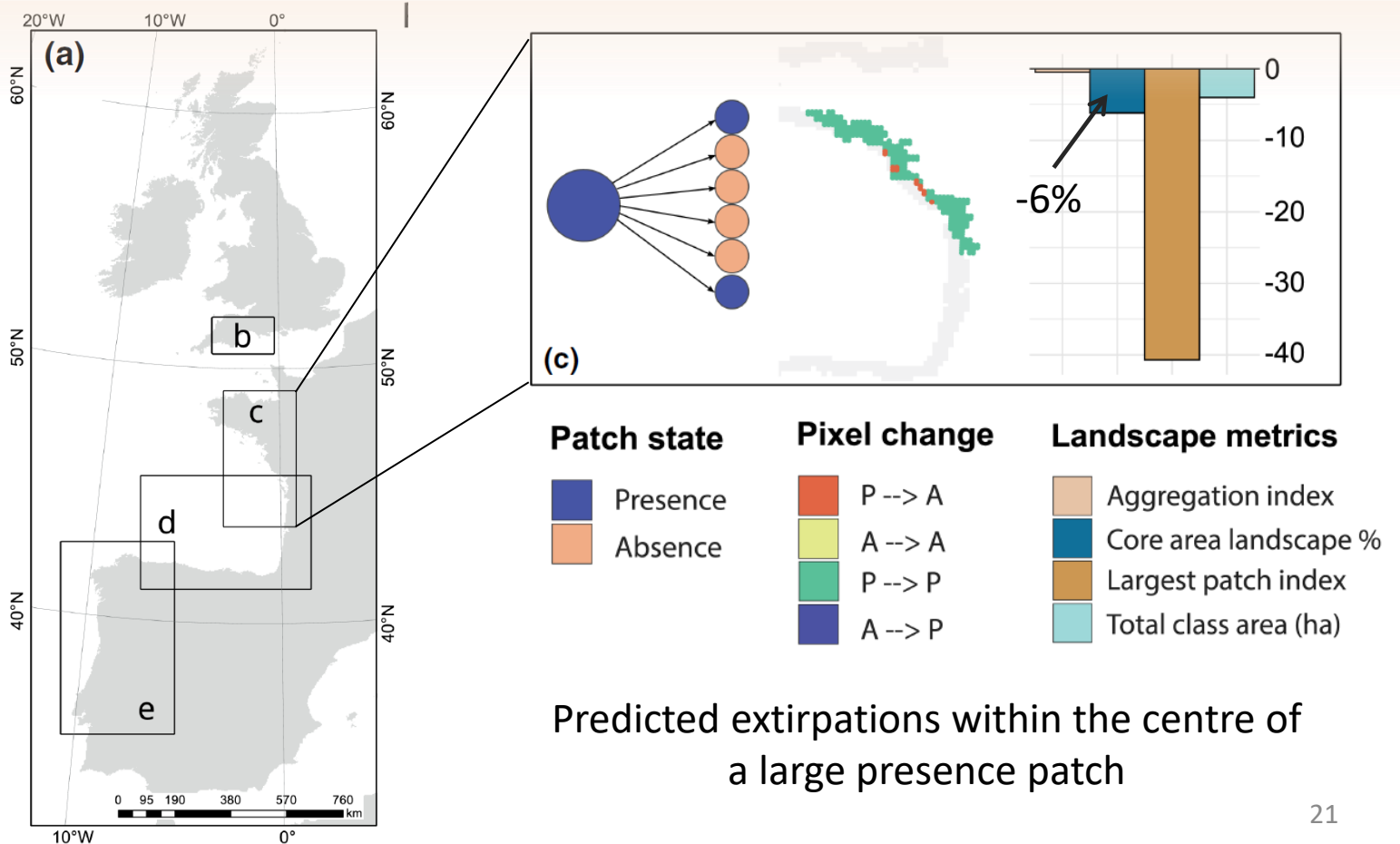
Landscape metrics

- Aggregation index
- Core area landscape %
- Largest patch index
- Total class area (ha)

Predicted extirpations within the centre of a large presence patch

Localised extirpation in the current range centre

- Introduction
- Part I: SDM
- Part II: LSM
- Conclusions



Take home messages

Introduction



Internal range structure metrics are needed to accurately quantify the effects of climate change.

This method can be applied to any species.

Part I:
SDM



Landscape metrics applied to SDM outputs are a robust, non-data intensive method that can aid with broad-scale spatial planning under climate change.



Global Change Biology

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Applying landscape metrics to species distribution model predictions to characterize internal range structure and associated changes

Amelia Curd Mathieu Chevalier Mickaël Vasquez, Aurélien Boyé, Louise B. Firth, Martin P. Marzloff, Lucy M. Bricheno, Michael T. Burrows, Laura E. Bush, Céline Cordier, Andrew J. Davies, J. A. Mattias Green, Stephen J. Hawkins, Fernando P. Lima, Claudia Meneghesso, Nova Mieszkowska, Rui Seabra, Stanislas F. Dubois
... [See fewer authors](#) ^

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Amelia Curd and Mathieu Chevalier should be considered joint first authors.

Part II:
LSM



Conclusions



Thank You

Baie de Douarnenez, February 2020



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Introduction



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SDM

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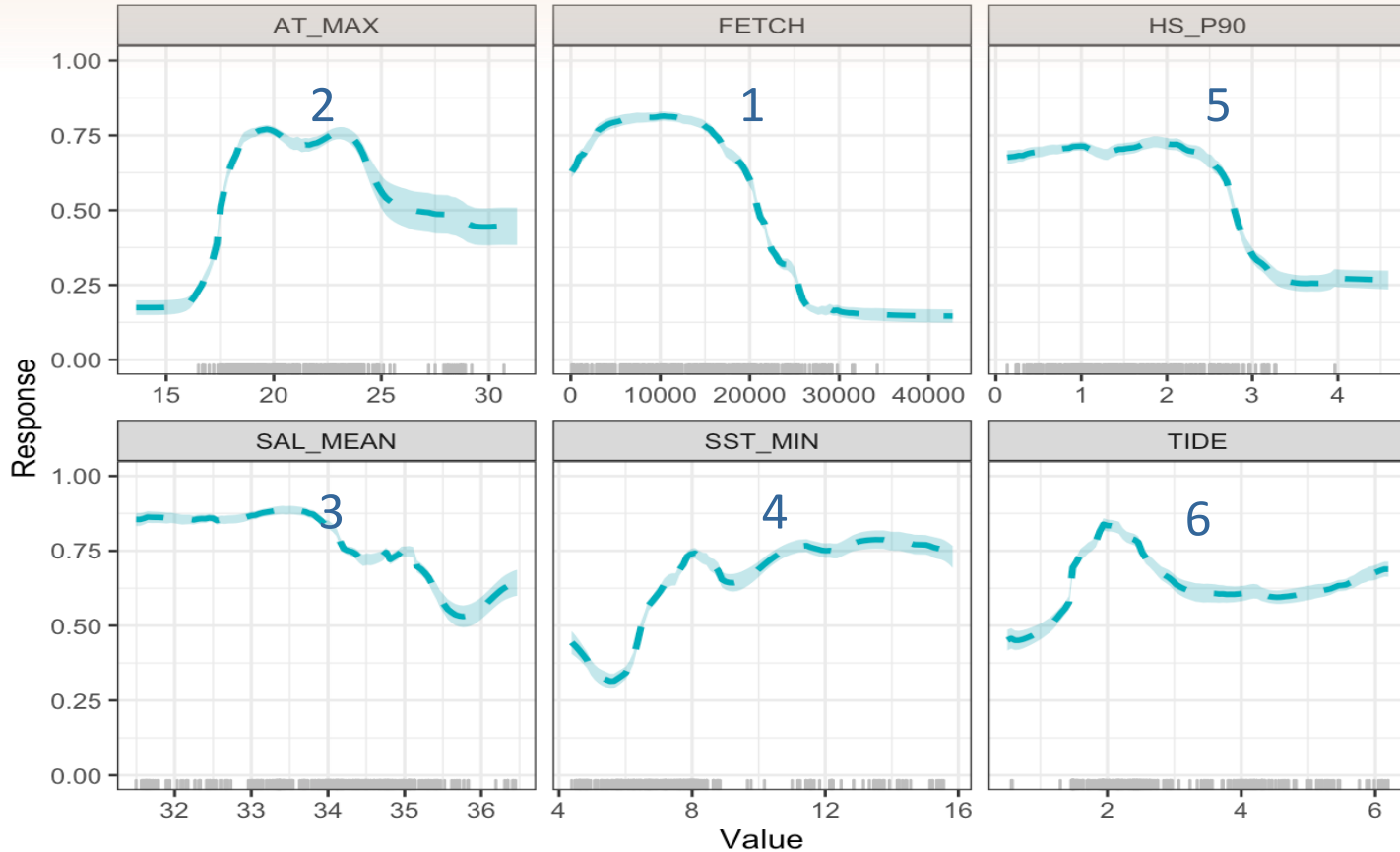
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<https://doi.org/10.1146/annurev-marine-010419-010916>

Conclusions



Variable response curves



Mean habitat suitability tips mid-range

Introduction



Part I:

SDM



Part II:

LSM



Conclusions

