Climate change effects on animal presence in the Massaciuccoli Lake basin



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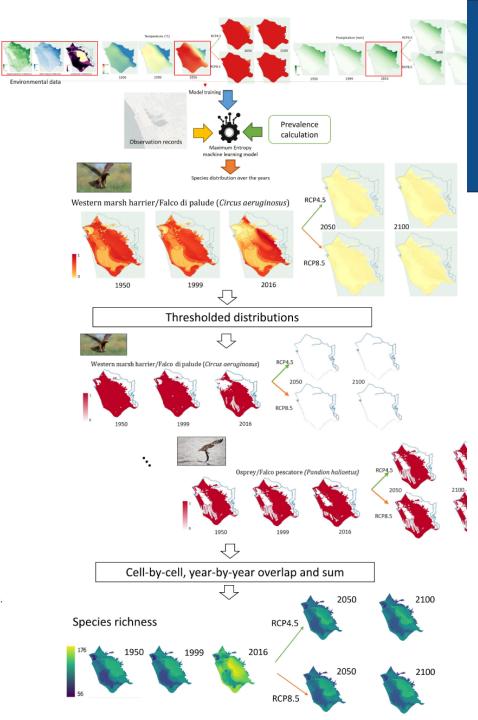
Climate Change Impact on Biodiversity Patterns | Lecce, Italy, 21-22 February 2024

Context

- Climate change poses severe risks to delicate ecosystems such as wetlands (~70% reduction in the 20th c.);
- Big-data mining through Artificial Intelligence models can help forecast macroscopic trends of future biodiversity change well ahead of the times;
- However, their results should be evaluated and considered in their macroscopic indications rather than as detailed answers.







Scope of this presentation

- Predict overall climate change effects on macroscopic trends of animal presence in the Massaciuccoli Lake basin under future medium- and high-greenhouse gas emission scenarios (Representative Concentration Pathways (RCP) 4.5 and 8.5)
- Model **species richness through machine-learning** models that learn from data and project species distributions and richness in the future
- Study how the **current species richness might have changed** with respect to 1999 and 1950.

□NOT IN THIS PRESENTATION:

- Detailed, pixelwise-reliable species distributions
- > What will happen to the single species we study/like/love
- Ecosystem models

The Massaciuccoli Lake basin

- An important tourist attraction in Tuscany because of its varied biodiversity;
- The basin's hydrogeological, chemical, and environmental features directly influence the area's suitability for the presence and persistence of
 - native species

(e.g., black bullhead, eel, tench, largemouth bass,

carp, heron, kingfisher, etc.)

• non-native species

(e.g., sheatfish, red swamp crayfish, etc.)

- The principal water source depends on the pluvial regime of the eastern mountains and the neighbour soils;
- The lake water resources are connected with the intensity of human activities around the basin, which include agriculture (40%), farming, cereal and industrial production, horticulture and olive tree orchards, and train railways.









Methodology



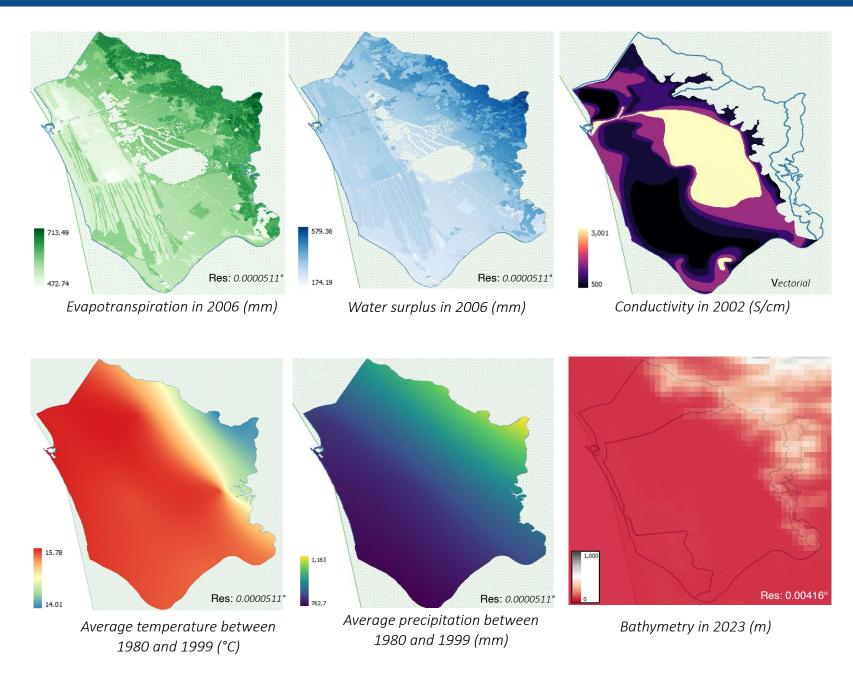


Primary environmental data source: Autorità di bacino distrettuale dell'Appennino Settentrionale (Authority data)

Autorità di bacino distrettuale dell'Appennino Settentrionale

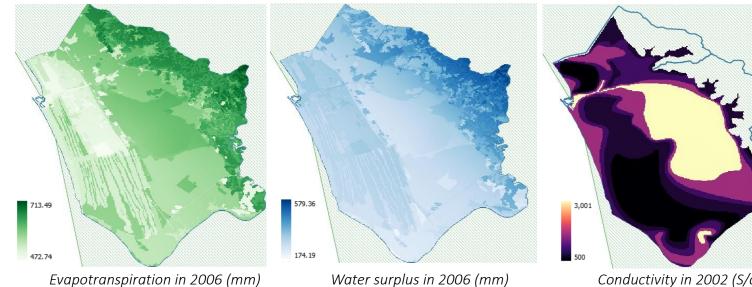
www.appenninosettentrionale.it

We selected the most recent authoritative environmental data.

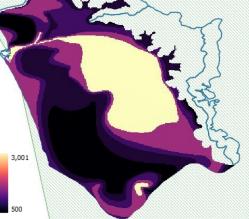


We processed authority data as follows:

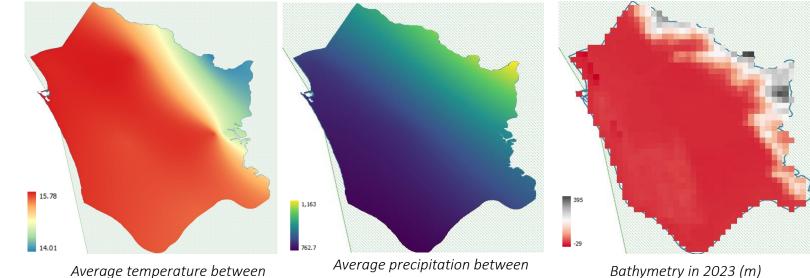
- Scaling to 0.0005° (~50 m) 1. resolution
- Spatially alignment 2.
- Holes filled through 3. interpolation (BIMAC*)



Water surplus in 2006 (mm)



Conductivity in 2002 (S/cm)



*Coro, G. (2024). An Open Science oriented Bayesian interpolation model for marine parameter observations. *Environmental Modelling & Software*, *172*, 105901.

Average temperature between 1980 and 1999 (°C)

Average precipitation between 1980 and 1999 (mm)

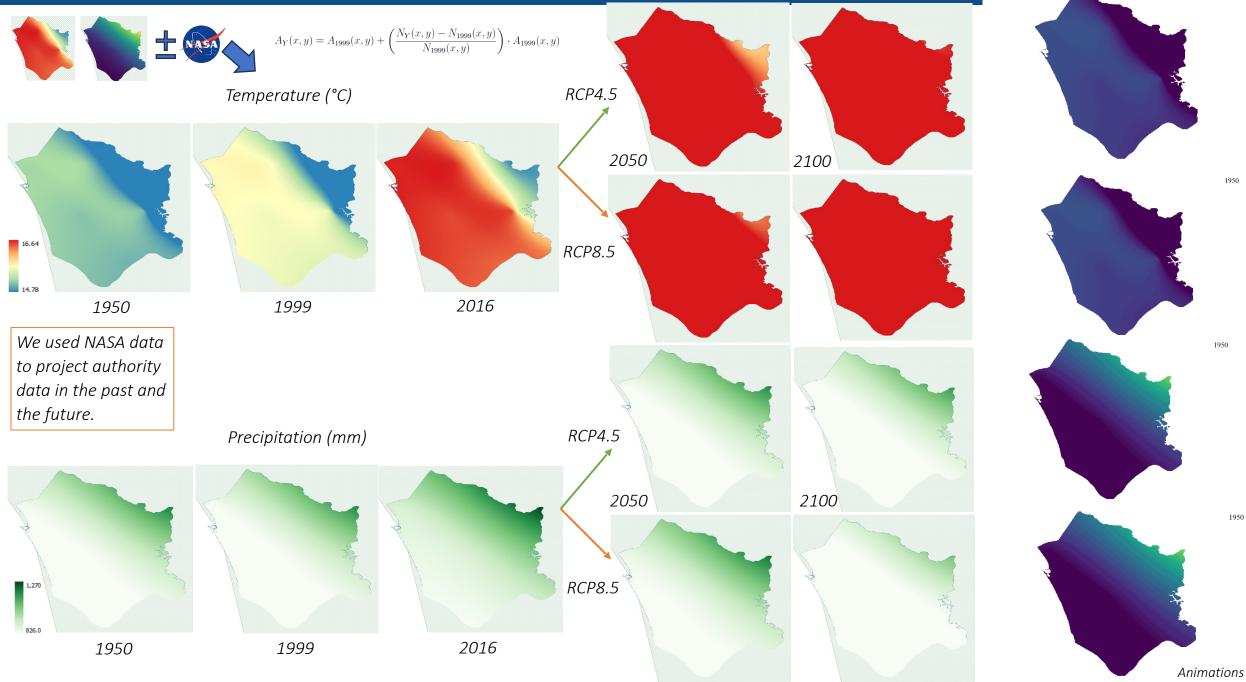
Phase 2: NASA Earth Exchange data and future climatic projections (Resolution: 0.25°)



NASA provides long-term environmental data projections under medium (RCP4.5) and high (RCP8.5) greenhouse gas emission scenarios.

Temperature (K) *RCP4.5* 2050 2100 304.45 2016 1950 1999 RCP8.5 235.08 *RCP4.5* Precipitation (kg m⁻² s⁻¹) 2050 2100 0.000226 2016 1950 1999 RCP8.5

Phase 3: Massaciuccoli Lake data-projection over time

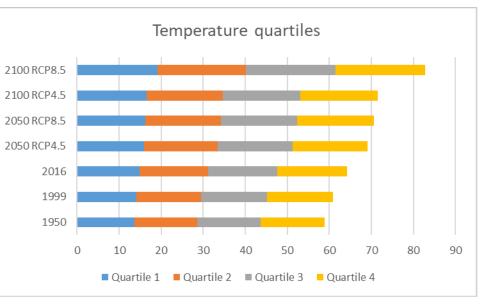


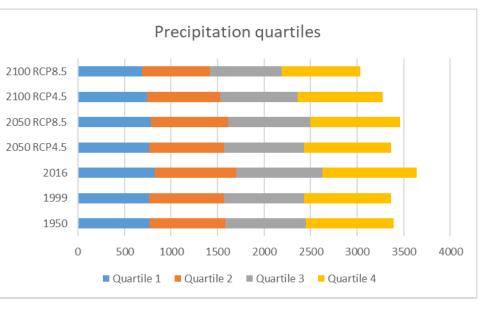
1950

Massaciuccoli Lake data-projection over time – parameter statistics

		Trend: ext	ension change	of high temper	ratures		Trend: extension change of heavy precipitation											
	1999 20.		2050 RCP4.5	2050 RCP8.5	2100 RCP4.5	2100 RCP8.5	trend	1999	2016	2050 RCP4.5	2050 RCP8.5	2100 RCP4.5	2100 RCP8.5					
1950	expansio	expansion	expansion	expansion	expansion	expansion	1950	contraction	expansion	contraction	expansion	contraction	contraction					
1999		expansion	expansion	expansion	expansion	expansion	1999		expansion	expansion	expansion	contraction	contraction					
2016			expansion	expansion	expansion	expansion	2016			contraction	contraction	contraction	contraction					
2050 RCP4.5				expansion	expansion	expansion	2050 RCP4.5				expansion	contraction	contraction					
2050 RCP8.5					expansion	expansion	2050 RCP8.5					contraction	contraction					
2100 RCP4.5						stationary	2100 RCP4.5						contraction					
	Ē	Extension g	rowth of high t	emperature ar	reas (%)		Extension growth of heavy precipitation areas (%)											
	1999 2016 2050 RCP4.5 2050 RCP8.5 2100 RCP4.5 2100 RCP8.5							1999	2016	2050 RCP4.5	2050 RCP8.5	2100 RCP4.5	2100 RCP8.5					
1950	-	-	-	-	-	-	1950	-6.1	61.2	-5.9	9 14.2	-23.9	-61.0					
1999		-	-	-	-	-	1999		71.6	0.1	. 21.5	-19.0	-58.5					
2016			28.5	33.0	33.3	33.3	2016			-41.7	-29.2	-52.8	-75.8					
2050 RCP4.5				3.7	3.7	3.7	2050 RCP4.5				21.4	-19.1	-58.5					
2050 RCP8.5					0.02	0.02	2050 RCP8.5					-33.3	-65.8					
2100 RCP4.5						0.00	2100 RCP4.5						-48.7					

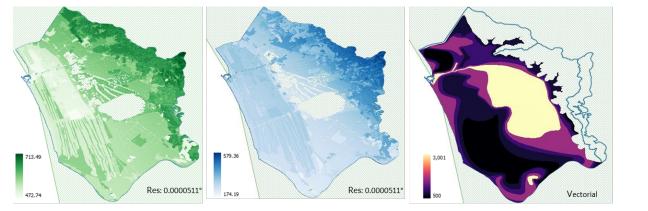
- High-temperature areas will constantly increase in the entire basin. Lower temperatures will be present near the mountains in 2050. high-temperature would saturate the basin in 2100 under the RCP4.5 and RCP8.5 scenarios, reaching up to 300-400 m.
- 2. Heavy precipitation will generally decrease in 2100 but will have a different spatial distribution in 2050 wrt previous years, with heavier rains concentrating more and more over the mountains. A general higher aridity is expected.





Evapotranspiration, Water Surplus, and Conductivity





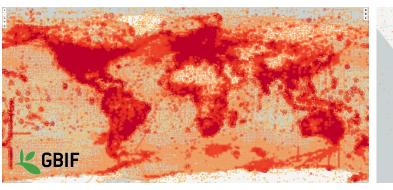
- Projections were unavailable for ET, WS, and C across the years;
- Accurately projecting ET, WS, and C over the years would have required knowledge of weather- and area-specific parameters unavailable for our study;





Phase 3: Species observation data

Large database with more than ~2.5 billion species observation records overall



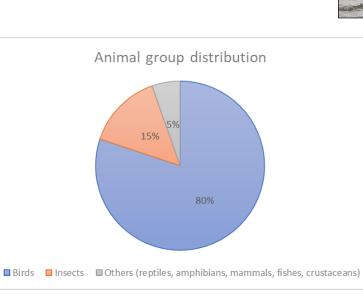
6815 noisy records; 393 species (Animalia)

We collected last 10-year observation data from the GBIF large collector and added recent observations from the field.

Total species (Animalia): 393 Total occurrence records: 6815

Suitable species for modelling were selected after filtering those with statistically meaningful data (>5 obs.) and present in other wetlands:

Total species: 180 species (~ 46% of the total reported species) Total occurrence records: 6540



Citizen-science data from the field (February-September 2023)

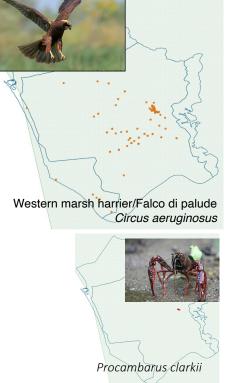


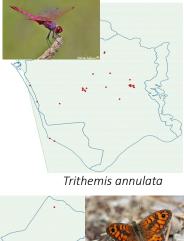
Osprey/Falco pescatore (Pandion haliaetus)

Dama dama



167 verified records; 43 species (Animalia)



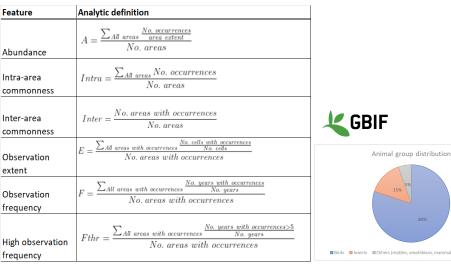


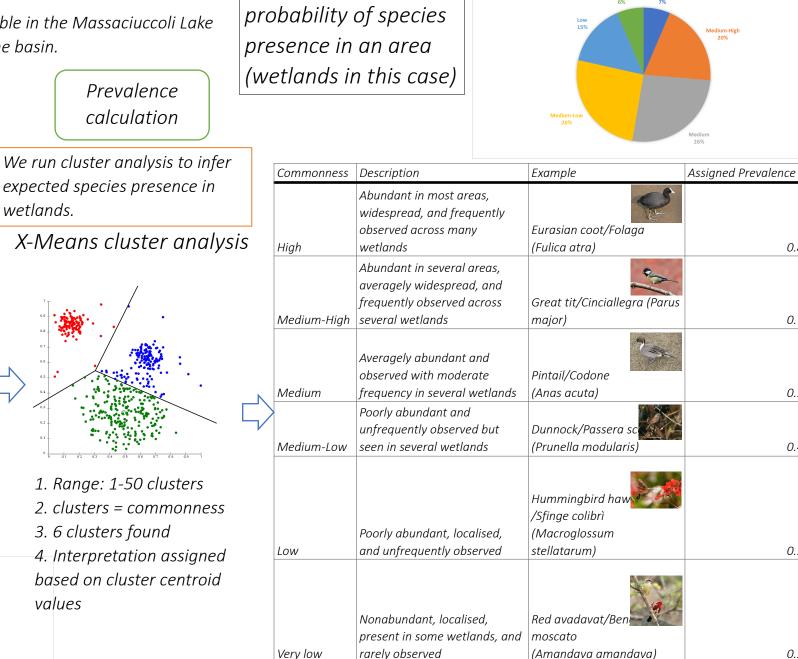


Phase 4: Species prevalence assessment

Simulates questions like "Is the Eurasian coot easily observable in the Massaciuccoli Lake basin?" posed to an Italian-wetland expert before visiting the basin. This strategy reduces data overfitting risk.

Indications by Silvio Marta (IGG-CNR) Ramsar Convention on Wetlands (Zone umide di importanza internazionale ai sensi della Convenzione di Ramsar)





Prevalence = prior

MASSACIUCCOLI ANIMALS' COMMONNESS ACROSS ITALIAN

Medium-High 20%

0.8

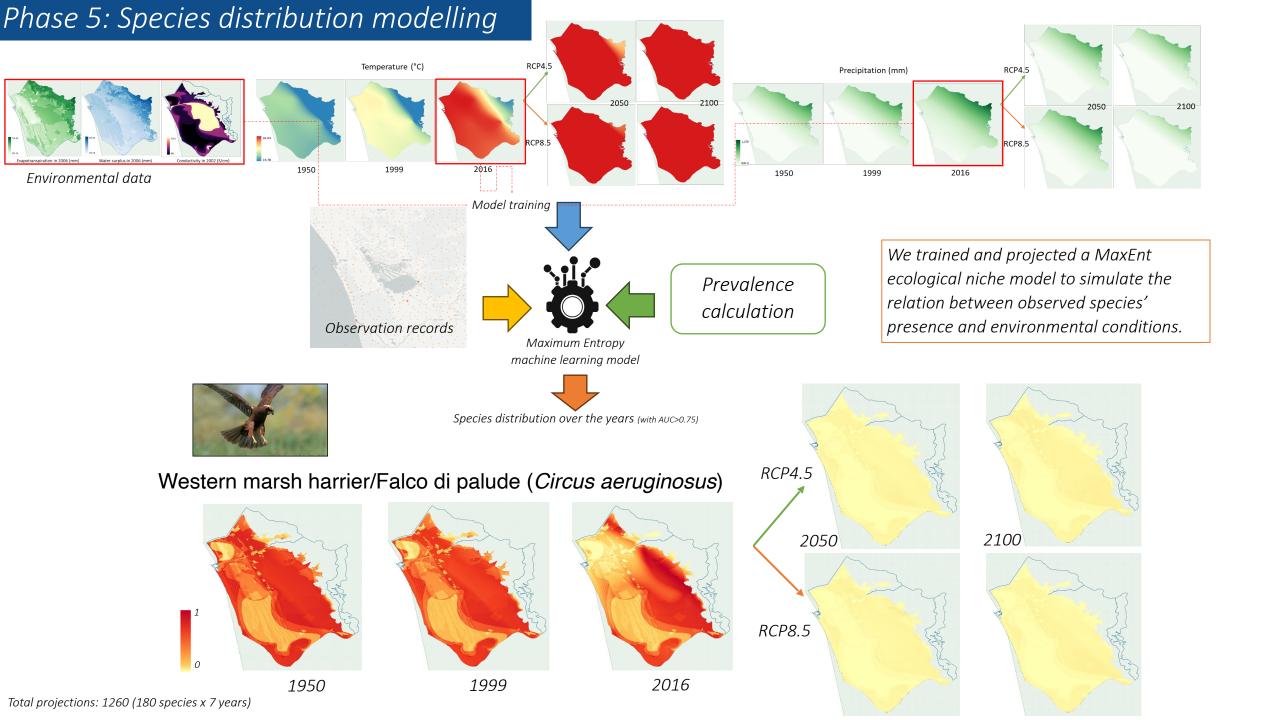
0.7

0.5

0.4

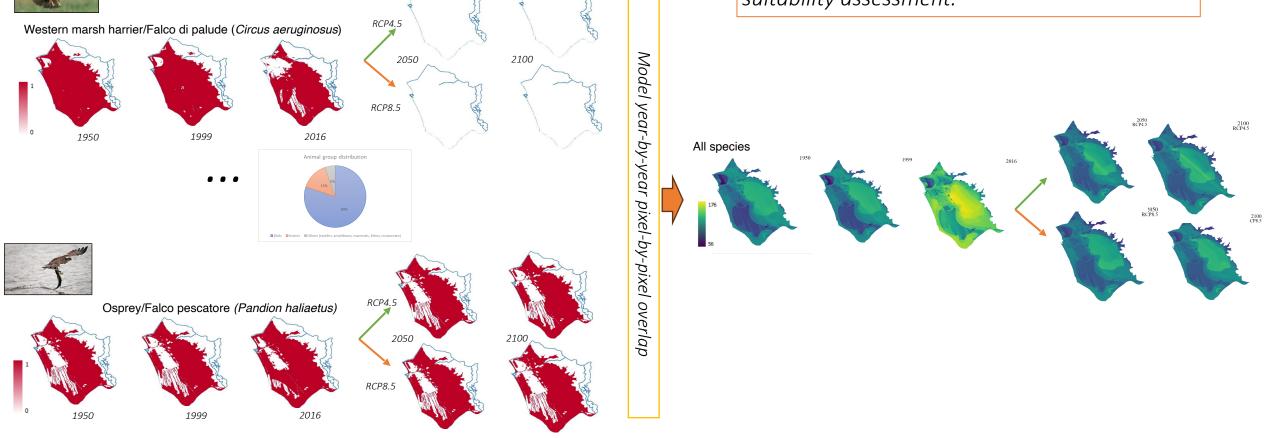
0.3

0.2

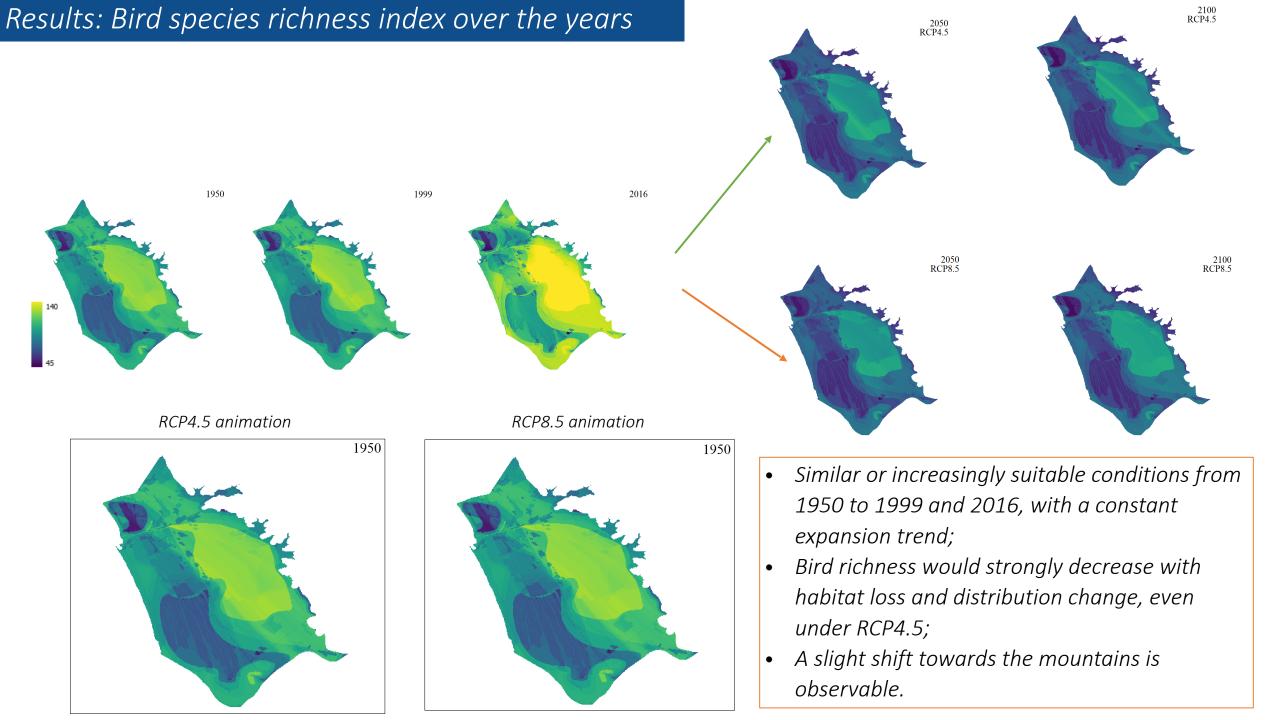


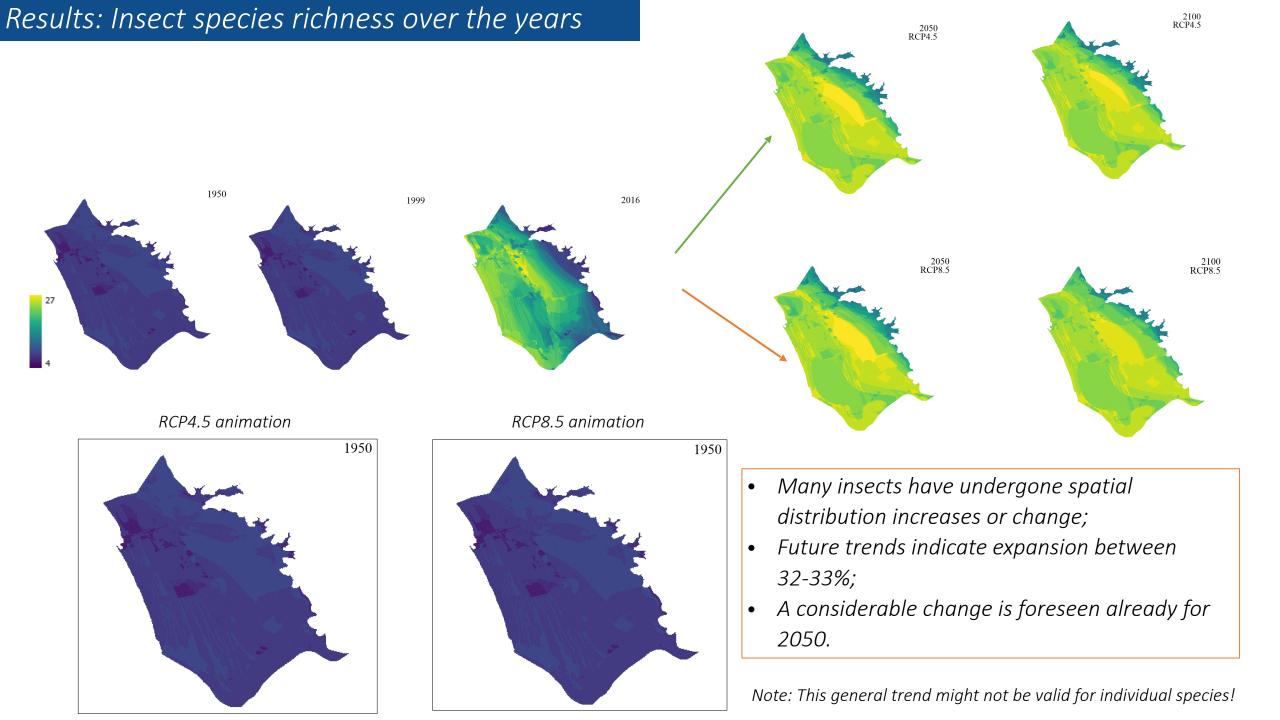
Phase 6: Species richness as species models' overlap

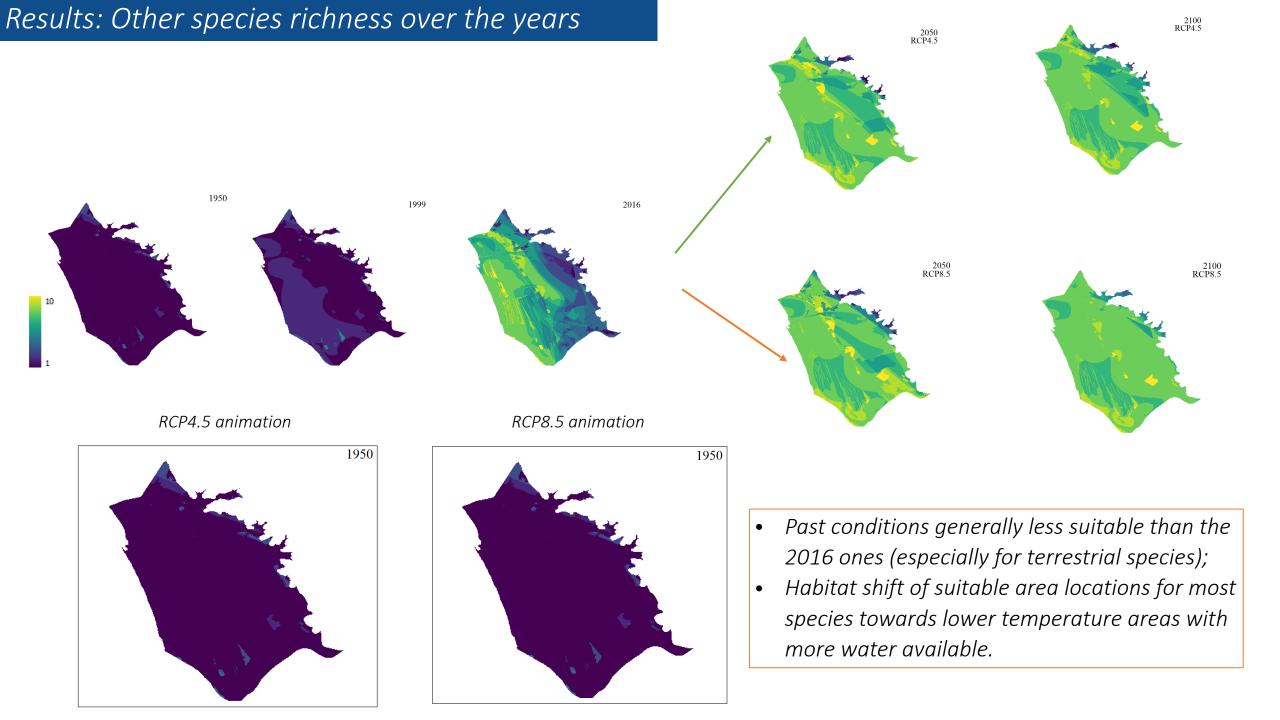
Species distributions were first binarized (present/absent) and then summed: We merged all species distributions over the time by summing the pixel-by-pixel habitat suitability assessment.

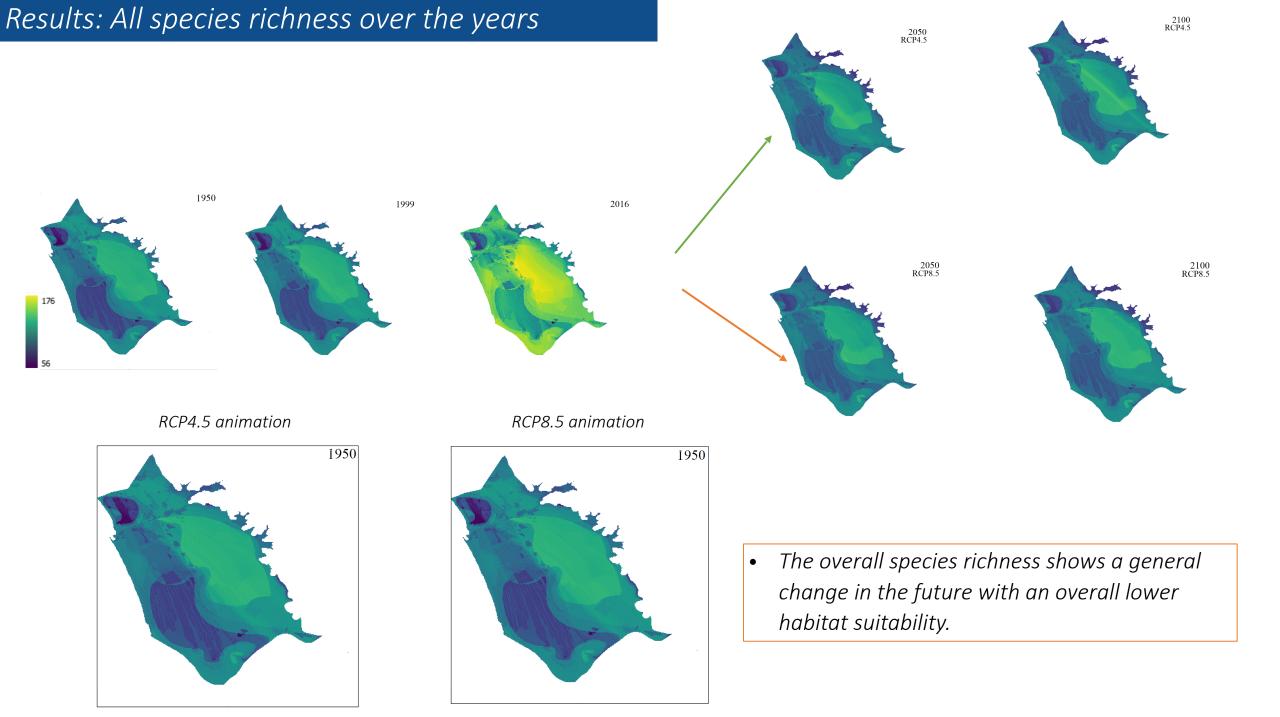


Optimal dichotomic threshold: the value over which the model correctly predicted all training presence locations threshold.









 $Trend_{A \to B} = \left(\frac{|A_l B_h| - |A_h B_l|}{|A_l B_h| + |A_h B_l|}\right)$

 $Similarity_{A \to B} = \left(\frac{|A_l B_l| + |A_h B_h|}{|A|}\right)$

 $Growth_{A \to B} = \left(\frac{|A_l B_h| - |A_h B_l|}{|A_1|}\right) \qquad Agreement_{A \to B} = \frac{|A_l B_h|}{|A_1|}$

 $Agreement_{A \to B} = \left(\frac{Similarity_{A \to B} - Chance \ Agreement}{1 - Chance \ Agreement}\right)$

Results: Numeric evaluation

																					$ A_h $)			(1 - Ch	ance Agreem	eni)	
			All							Birds							Insec	ts			Othe	rs species	(fishes, mai	mmals, crus	aceans, re	ptiles, amph	ibians)	
Similarity (%)							Similarity (%)							Similarity (%)								Similarity (%)						
	1999	201	16 2050 RCP4.5	2050 RCP8.5	2100 RCP4.5	2100 RCP8.5		199	9 20	16 2050 RCP4.	5 2050 RCP8.	5 2100 RCP4	1.5 2100 RCP8.5		1999	2016	5 2050 RCP4.5	2050 RCP8.5	2100 RCP4.	5 2100 RCP8.5		1999	2016 205	50 RCP4.5	2050 RCP8.	5 2100 RCP4.5	2100 RCP8.5	
1950	97.2	42	.2 89.	9 87.	6 92.	6 95.6	1950	97	.5 64	1.5 58	.5 57	.3 5	8.8 57.2	1950	100.0	26.9	э з.	8	\$.0	3.5 2.7	1950	99.5	25.8	2.	2 2	.4 2.	0 0.5	
1999		41	.9 88.	4 86.	0 91.	2 94.1	1999		64	1.9 57	.8 56	.7 5	8.1 56.6	1999		26.9	9 3.	8 4	1.0	3.5 2.7	1999		26.3	2.	7 2	.9 2.	5 0.9	
2016			34.	8 32.	8 37.	6 41.6	2016			26	5 25	.3 2	6.7 25.2	2016			76.	7 7	7.0	76.4 75.8	2016			76.	4 76	.6 76.	2 74.7	
2050 RCP4.5				97.	5 97.	1 93.2	2050 RCP4.5				98	.5 9	7.1 98.6	2050 RCP4.5				99	9.6	99.5 98.9	2050 RCP4.5				99	.8 99.	8 98.3	
2050 RCP8.5					94.		2050 RCP8.5						8.2 99.8	2050 RCP8.5						99.3 98.7	2050 RCP8.5					99.		
2100 RCP4.5						96.0	2100 RCP4.5						98.4	2100 RCP4.5						99.0	2100 RCP4.5						98.5	
			1	1						1	1						1								1			
		Agre	ement (Landis	& Koch, 1977)		1		Agreement (Landis & Koch, 1977)								Agree	ment (Landis	& Koch, 1977)				Agreement (Landis & Koch, 1977)						
	1999	201	16 2050 RCP4.5	2050 RCP8.5	2100 RCP4.5	2100 RCP8.5		199	- 20	16 2050 RCP4.	5 2050 RCP8.	5 2100 RCP4	.5 2100 RCP8.5		1999	2016	5 2050 RCP4.5	2050 RCP8.5	2100 RCP4.	5 2100 RCP8.5		1999	2016 205	50 RCP4.5	2050 RCP8.	5 2100 RCP4.5	2100 RCP8.5	
1950	Almost perfect	Slight	Moderate	Fair	Substantial	Almost perfect	1950	Almost perfe	ct Fair	Slight	Slight	Slight	Slight	1950	Almost perfect Sli	ght	Slight	Slight	Slight	Slight	1950	Slight	Slight Slig	ht	Slight	Slight	Slight	
1999		Slight	Moderate	Fair	Substantial	Substantial	1999		Fair	Slight	Slight	Slight	Slight	1999	Sli	ght	Slight	Slight	Slight	Slight	1999		Slight Slig	ht	Slight	Slight	Slight	
2016			Slight	Slight	Slight	Slight	2016			Slight	Slight	Slight	Slight	2016			Slight	Slight	Slight	Slight	2016		Poo	or	Slight	Slight	Slight	
2050 RCP4.5				Almost perfec	t Almost perfec	t Substantial	2050 RCP4.5				Poor	Poor	Poor	2050 RCP4.5				Almost perfe	ct Almost per	fect Almost perfect	2050 RCP4.5				Almost per	fecAlmost perfec	t Fair	
2050 RCP8.5					Substantial	Moderate	2050 RCP8.5					Poor	Poor	2050 RCP8.5					Almost per	fect Substantial	2050 RCP8.5					Almost perfec	t Fair	
2100 RCP4.5						Almost perfect	2100 RCP4.5						poor	2100 RCP4.5						Almost perfect	2100 RCP4.5						Fair	
																									1			
	Trend (extension change)						Trend (extension change)							Trend (extension change)						Trend (extension change)								
	1999	201	16 2050 RCP4.5	2050 RCP8.5	2100 RCP4.5	2100 RCP8.5		199	99 20	16 2050 RCP4.	5 2050 RCP8.	5 2100 RCP4	1.5 2100 RCP8.5		1999	2016	5 2050 RCP4.5	2050 RCP8.5	2100 RCP4.	5 2100 RCP8.5		1999	2016 205	50 RCP4.5	2050 RCP8.	5 2100 RCP4.5	2100 RCP8.5	
1950	contraction	expansio	n contraction	contraction	contraction	contraction	1950	expansion	expansio	on contraction	contraction	contractio	n contraction	1950	stationary ex	pansion	expansion	expansion	expansion	expansion	1950	expansion	expansion exp	ansion	expansion	expansion	expansion	
1999		expansio	n contraction	contraction	contraction	contraction	1999		expansio	on contraction	contraction	contractio	n contraction	1999	ex	pansion	expansion	expansion	expansion	expansion	1999		expansion exp	ansion	expansion	expansion	expansion	
2016			contraction	contraction	contraction	contraction	2016			contraction	contraction	contractio	n contraction	2016			expansion	expansion	expansion	expansion	2016		exp	ansion	expansion	expansion	expansion	
2050 RCP4.5				contraction	expansion	expansion	2050 RCP4.5				contraction	expansion	contraction	2050 RCP4.5				contraction	expansion	expansion	2050 RCP4.5				contraction	expansion	expansion	
2050 RCP8.5					expansion	expansion	2050 RCP8.5					expansion	contraction	2050 RCP8.5					expansion	expansion	2050 RCP8.5					expansion	expansion	
2100 RCP4.5						expansion	2100 RCP4.5						contraction	2100 RCP4.5						expansion	2100 RCP4.5						expansion	
	Trend (%)						Trend (%)						Trend (%)							Trend (%)								
	1999	201	16 2050 RCP4.5	2050 RCP8.5	2100 RCP4.5	2100 RCP8.5		199	99 20	16 2050 RCP4.	5 2050 RCP8.	5 2100 RCP4	1.5 2100 RCP8.5		1999	2016	5 2050 RCP4.5	2050 RCP8.5	2100 RCP4.	5 2100 RCP8.5		1999	2016 205	50 RCP4.5	2050 RCP8.	5 2100 RCP4.5	2100 RCP8.5	
1950	-89%						1950	27		7% - 10 0				1950	-	100%				00% 100%	1950	100%	100%	1009				
1999		100					1999		85	9% - 10 0				1999		100%				00% 100%	1999		100%	1009				
2016			-1009				2016			-100				2016			999			99% 100%	2016			1009				
2050 RCP4.5				-795	6 96	% 100%	2050 RCP4.5				-78	1% 1	0% -93%	2050 RCP4.5				-5	5%	68% 100%	2050 RCP4.5				-100			
2050 RCP8.5					905		2050 RCP8.5					8	2% -54%	2050 RCP8.5						71% 100%	2050 RCP8.5					100		
2100 RCP4.5						100%	2100 RCP4.5						-94%	2100 RCP4.5						84%	2100 RCP4.5	_					100%	
	Growth (%) (extension change)							Growth (%) (extension change)							Growth (%) (extension change)							Growth (%) (extension change)						
	1999 2016 2050 RCP4.5 2050 RCP8.5 2100 RCP4.5 2100 RCP8.5					199	99 20	16 2050 RCP4.	5 2050 RCP8.	5 2100 RCP4	1.5 2100 RCP8.5		1999	2016	5 2050 RCP4.5	2050 RCP8.5	2100 RCP4.	5 2100 RCP8.5		1999	2016 205	50 RCP4.5	2050 RCP8.	5 2100 RCP4.5	2100 RCP8.5			
1950	-1.9	100	-46.	5 -58.	9 -28.	9 -3.9	1950	1	.5 74	1.8 -96	.9 -99	.6 -9	6.3 -99.9	1950	-			-	-	-	1950.0	-	-	-	-	-	-	
1999		100	-45.	5 -58.	1 -27.	5 -2.0	1999		72	2.1 -97	.0 -99	.6 -9	6.3 -99.9	1999		-	-	-	-	-	1999.0		-	-	-	-	-	
2016			-88.	4 -91.	1 -84.		2016			-98	.3 -99		7.9 -99.9	2016			31.	6 31	1.3	32.1 33.2	2016.0			31.	31 31	.5 32.		
2050 RCP4.5				-23.	2 32.	9 79.7	2050 RCP4.5				-87	.8 2	2.4 -96.4	2050 RCP4.5				-0	0.2	0.3 1.2	2050 RCP4.5				-0	.2 0.		
2050 RCP8.5					73.	0 133.9	2050 RCP8.5					90	3.3 -70.3	2050 RCP8.5						0.6 1.4	2050 RCP8.5					0.		
2100 RCP4.5						35.2	2100 RCP4.5						-97.0	2100 RCP4.5						0.8	2100 RCP4.5						1.5	

The numeric analysis confirms the previous observations.

The worst case is the birds' species richness.

Future scenarios for species richness (SR), compared to 2016:

- Birds' SR will decrease between 98.3% (2050 RCP4.5) and 99.9% (2100 RCP8.5)
- Insects' SR will increase between 31.6% (2050 RCP4.5) and 33.2% (2100 RCP8.5)
- Other species' SR will include between 23.6% (2050 RCP4.5) and 25.3% (2100 RCP8.5) new territory

Past scenarios compared to 2016:

- Birds' SR has increased between 74.75% (1950) and 72.09% (1999)
- Insects have occupied 73.1% new habitat previously unsuitable
- Other species have occupied between 74.2% (1950) and 73.7% (1999) new habitat previously unsuitable

The overall species richness has improved from the past to today but will worsen in the near future.

Results: Quantile analysis



The quartile analysis confirms the previously observed trends.

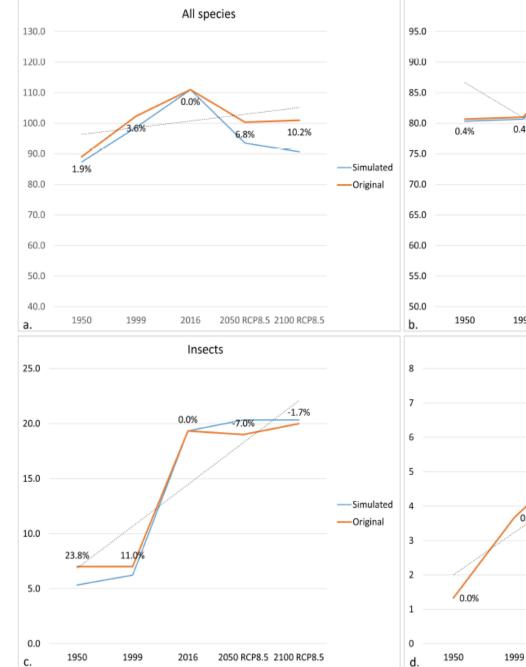
Model sensitivity

Hypotheses on ET, WS, C:

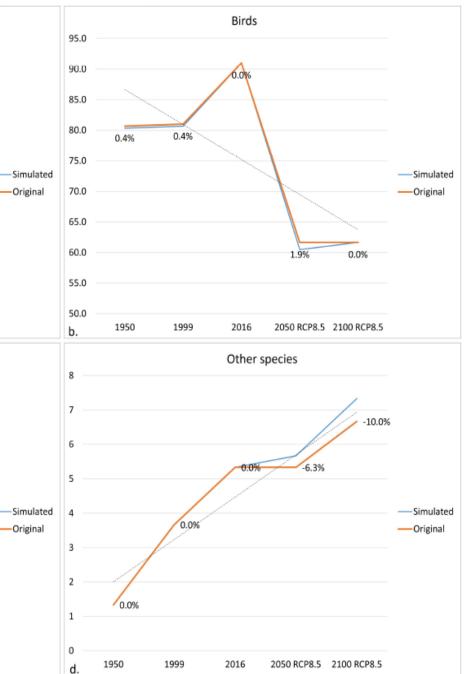
- These parameters were influential in most models;
- •Could substitute bathymetry and water presence in producing some consistent results (e.g., fish in waters);
- •Based on the Thornthwaite formula and sea-close wetland analyses, we simulated their variation range over the years;
- •The detected trends over the species groups were consistent with the ones assuming values fixed to 2016.

Other assessments:

- •MaxEnt consistently extrapolated the probability outside of the training ranges (16% extension required);
- •Species richness change was not an artefact of the models:
 - ✓ Habitat condition similarity between 2100-RCP8.5 and 2016 was ~20% (Habitat Representativeness Score);
 - ✓ They were dissimilar independently of the ENMs;
 - ✓ Species richness change was consistent with this dissimilarity.



Average species richness across the years



Conclusions



Model:

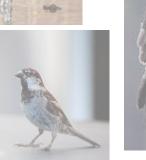
- We have presented a spatially-explicit Bayesian model combining unsupervised (X-Means clustering) and supervised (MaxEnt) models;
- All data and scripts are openly accessible on Zenodo: <u>https://zenodo.org/record/8380273</u>
- They are also available in the ITINERIS Critical Zone Virtual Research Environment.
- The results are ready to be used in ecosystem models and spatial planners.

<u>Results:</u>

- There might have been benefits in the last 70 years to animal biodiversity. However, the expected drying of most of the basin, with heavy precipitation confined more and more to the mountain areas, would negatively affect species composition in the future (even under RCP4.5);
- Birds will likely be the most impacted group, with an extensive species-richness loss already foreseen for 2050;
- The insect group (22% of the total insects) will likely see habitat increase in the short- and long-term future;
- Terrestrial and water species will likely move towards water-richer and cooler areas, radically changing their presence in the basin;
- Generally, the species-groups trends do not exclude that some species representing a minor but very important percentage might go extinct because of future habitat unsuitability;
- We gave indication of the time frame of the risk (->2050) vs. current initiatives that aim to (slowly) guarantee water presence in the lake;
- The results agree with other studies* which have indicated general biodiversity and ecosystem service degradation, and eutrophication and drought. *Colombaroli et al. (2007), Giugliano et al. (2011), Colombaroli et al. (2013), Bertacchi et al. (2015), Lastrucci et al. (2017).













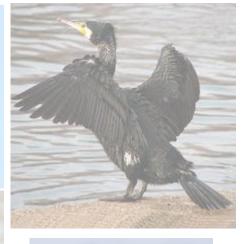
Thank you





















For questions write to <u>gianpaolo.coro@cnr.it</u>

LifeWatch ERIC 2024 Thematic Service Workshop Series

Thank you for your attention! Any questions?



Taxonomy | Brussels, Belgium, 30 January 2024



Climate Change Impact on Biodiversity Patterns | Lecce, Italy, 21-22 February 2024



Animal Movement and Biologging | Ostend, Belgium, 22 March 2024



Biogeography | Bologna, Italy, 4-5 April 2024



Biodiversity Observatory Automation | Ljubljana, Slovenia, 11 April 2024



Habitat Mapping | Aveiro, Portugal, 3 May 2024

