

Partie 1 calibration

Partie 1 calibration inverse

- modèles : **PHENOFIT, CASTANEA**

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- données d'occurrence : **EU-Forest** (+GBIF, WOODIV)

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- article méthodo publié dans **Methods in Ecology and Evolution**

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RESEARCH ARTICLE

Methods in Ecology and Evolution



Estimating process-based model parameters from species distribution data using the evolutionary algorithm CMA-ES

PHENOFIT

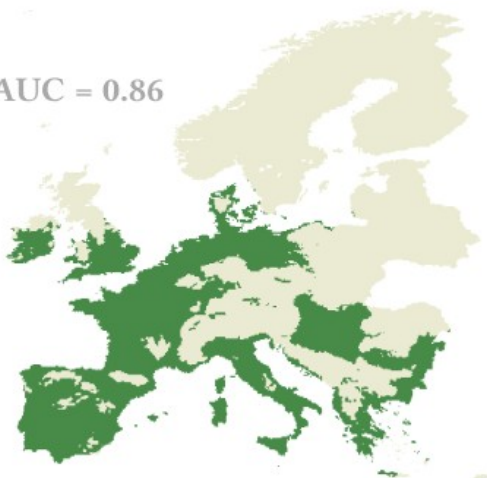
Expert calibration

Species occurrence

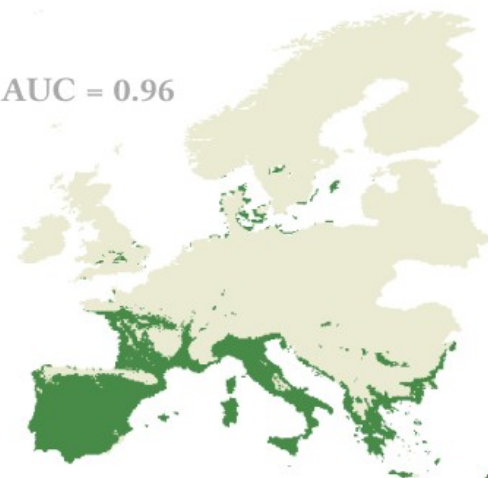
Inverse calibration

AUC = 0.86

Quercus ilex



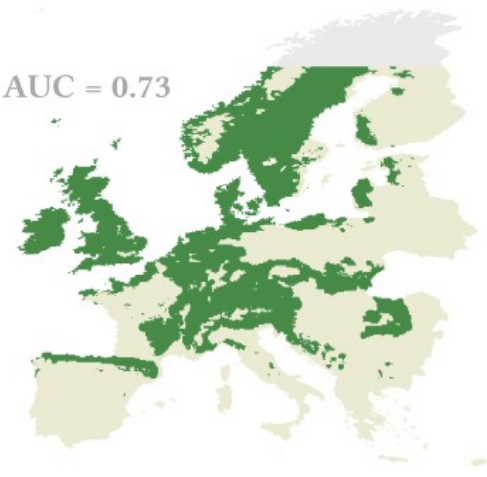
AUC = 0.96



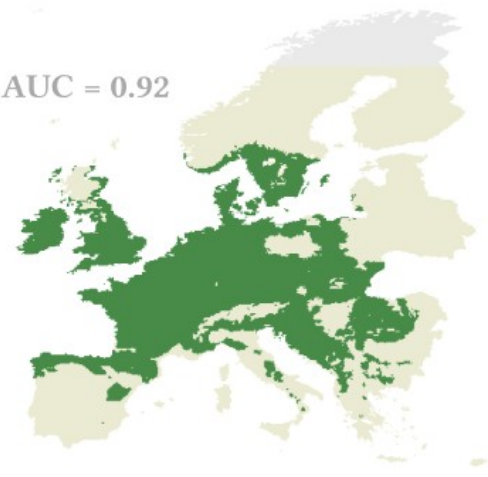
CASTANEA

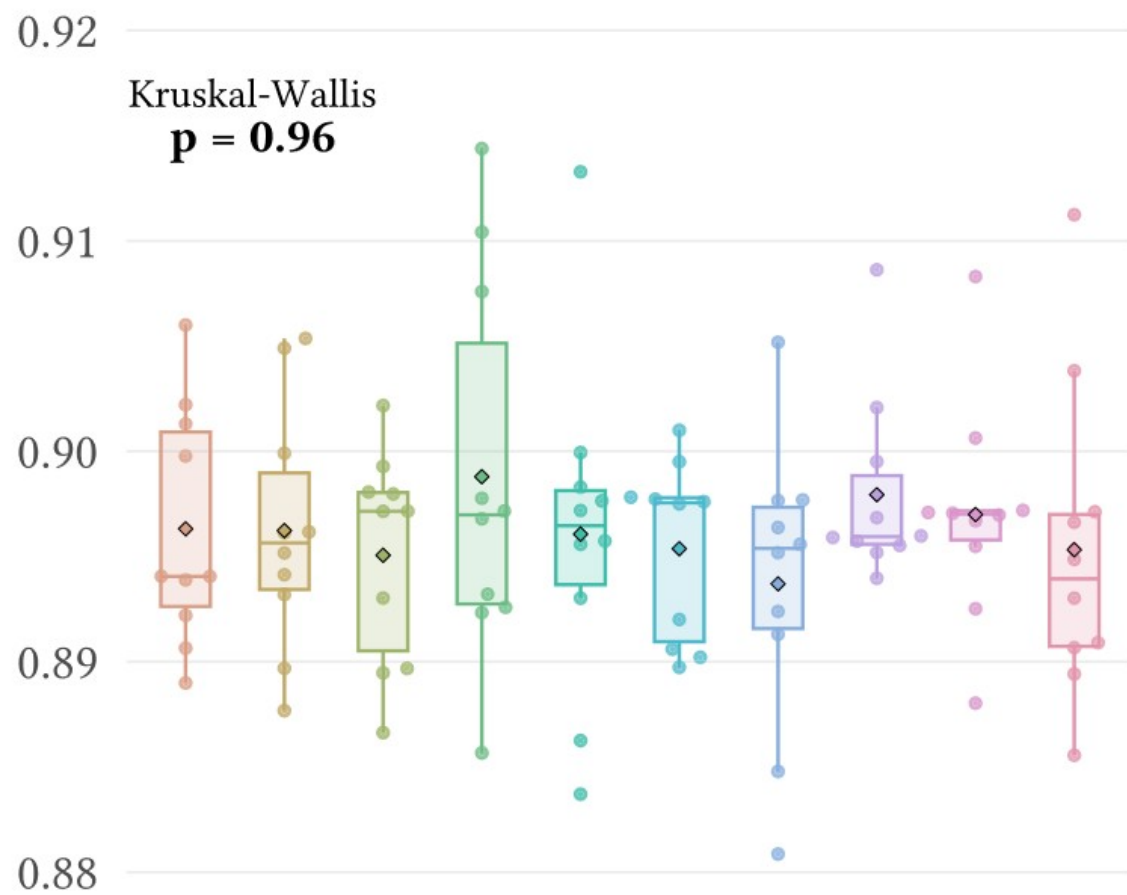
AUC = 0.73

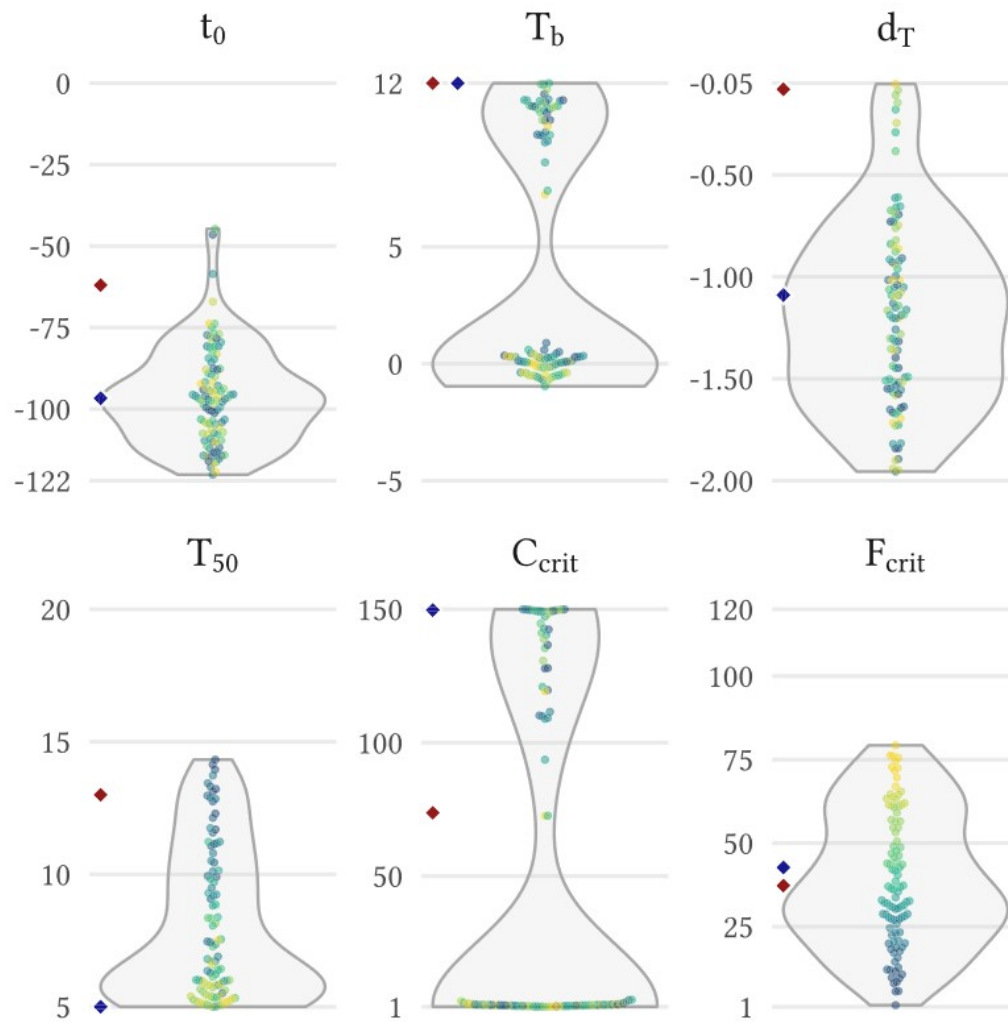
Fagus sylvatica



AUC = 0.92







Partie 1 calibration des modèles corrélatifs

- approche ***presence-only*** inspirée de Valavi et al. (2022)

Ecological Monographs, 92(1), 2022, e01486

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Predictive performance of presence-only species distribution models: a benchmark study with reproducible code

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- **background points** : « *sampled irrespective of the location of species records* »
50.000 points

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- données d'occurrence : **EU-Forest** (+GBIF, WOODIV)
- **background points** : « *sampled irrespective of the location of species records* »
50.000 points
- modèles : GLM with lasso penalty, GAM, BRT, RandomForest
(+ biomod et Maxent)

Partie 1 calibration des modèles corrélatifs

- ***5-fold environmental block cross-validation*** pour estimer les erreurs

Partie 1 calibration des modèles corrélatifs

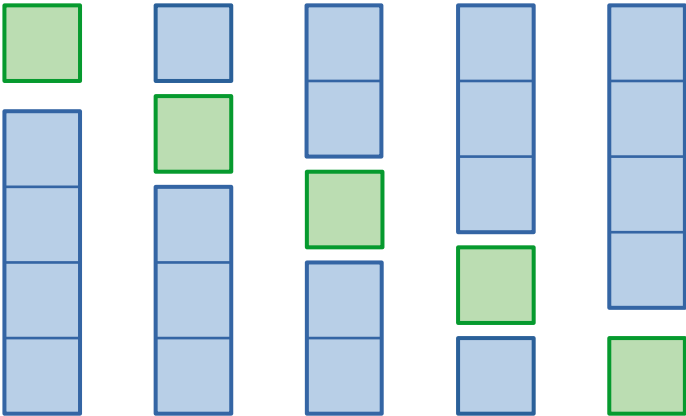
- ***5-fold environmental block cross-validation*** pour estimer les erreurs



Partie 1 calibration des modèles corrélatifs

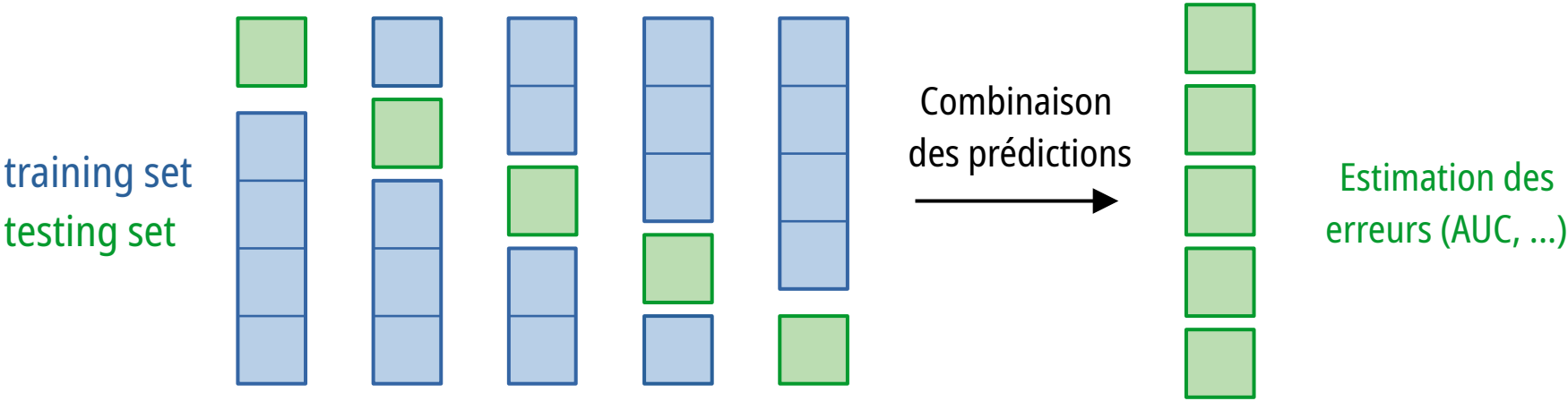
- *5-fold environmental block cross-validation* pour estimer les erreurs

training set
testing set



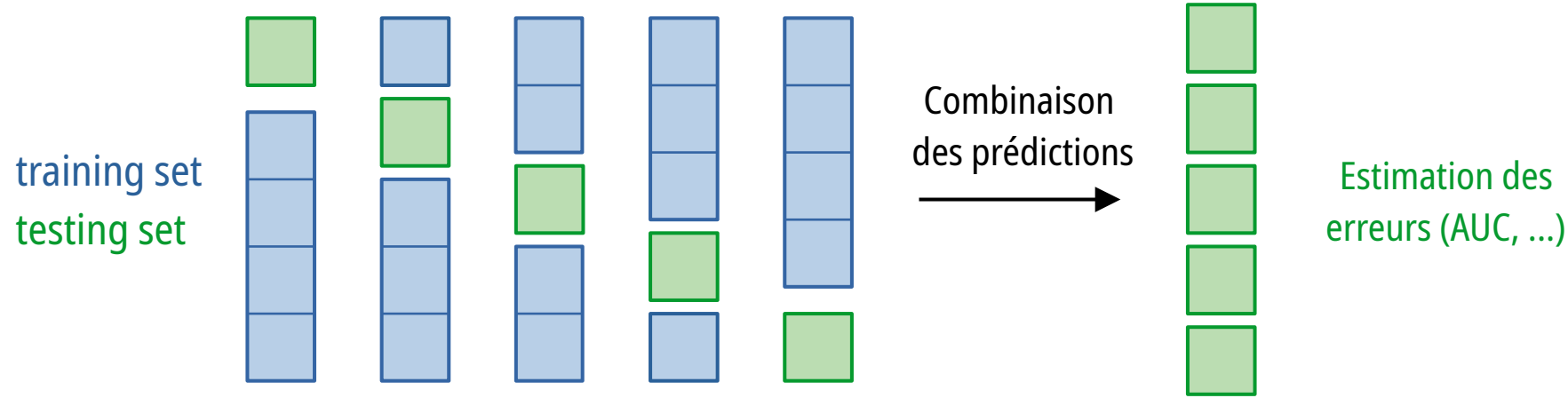
Partie 1 calibration des modèles corrélatifs

- *5-fold environmental block cross-validation* pour estimer les erreurs



Partie 1 calibration des modèles corrélatifs

- **5-fold environmental block cross-validation** pour estimer les erreurs

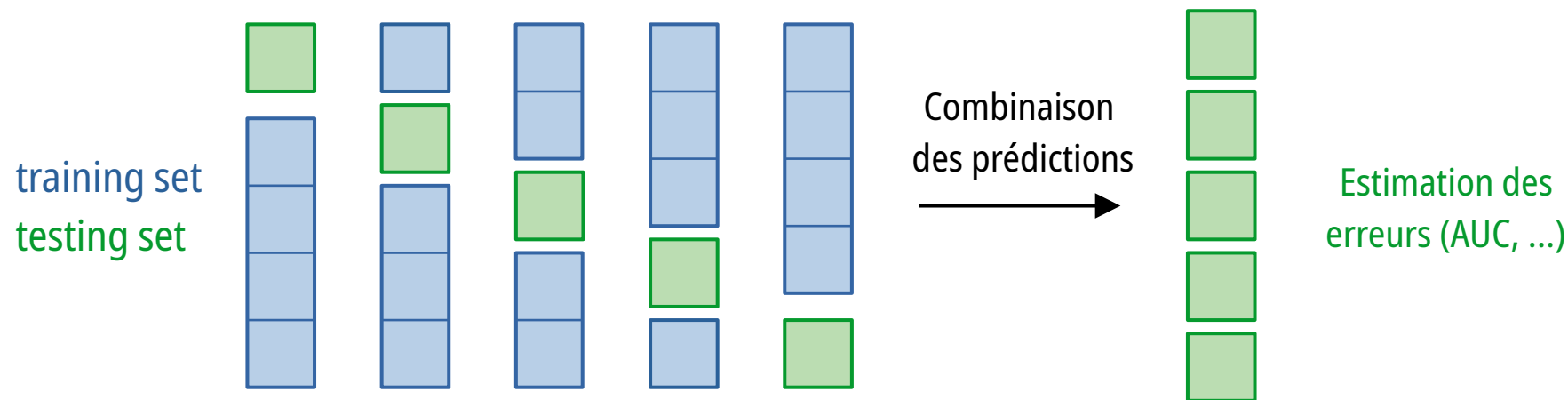


- **final model:** « *all the available training data can be used to fit a new model* »

Favorise la qualité des prédictions (plutôt que l'exactitude des erreurs)

Partie 1 calibration des modèles corrélatifs

- **5-fold environmental block cross-validation** pour estimer les erreurs



- **final model:** « *all the available training data can be used to fit a new model* »

Favorise la qualité des prédictions (plutôt que l'exactitude des erreurs)

Over-estimated
AUC

Partie 1 calibration des modèles corrélatifs

Exemple avec *Fagus sylvatica*

	Lasso GLM	GAM	Random Forest	BRT
« True » AUC	0.68	0.79	0.81	0.79
Over-estimated AUC	0.92	0.93	0.99	0.96

Partie 2 paleo

Temporal coverage per pollen site

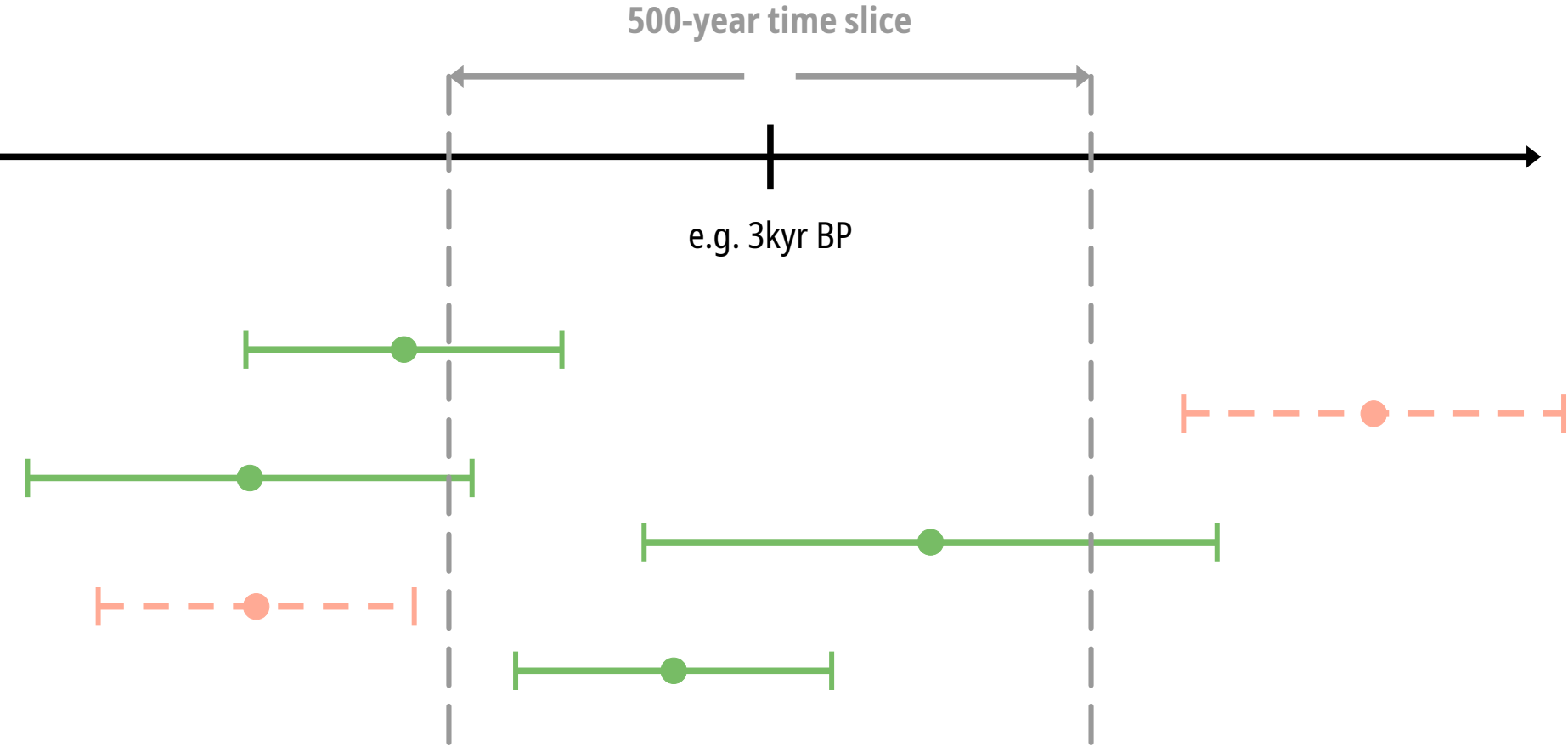


e.g. 3kyr BP

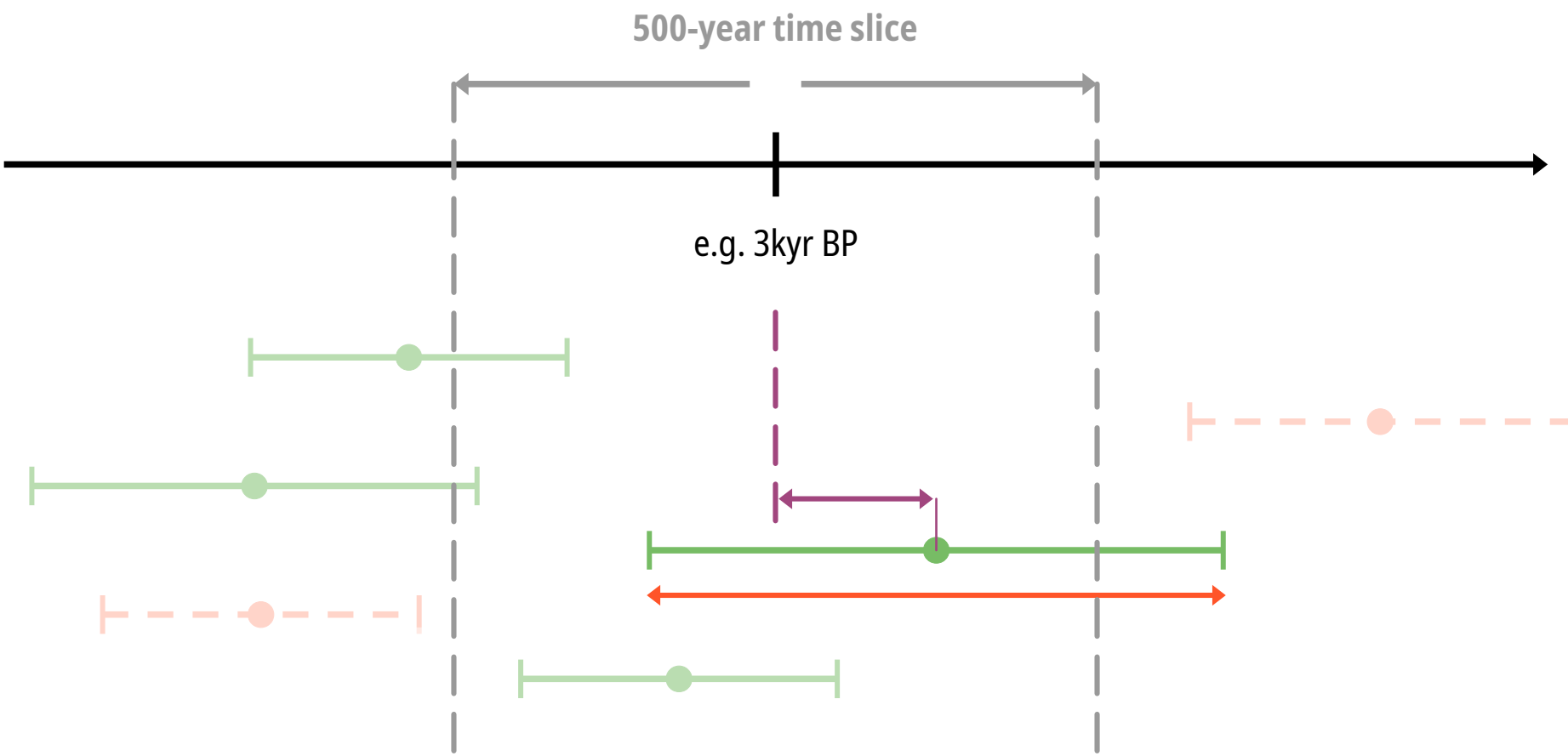


Multiple samples within the same site

Temporal coverage per pollen site



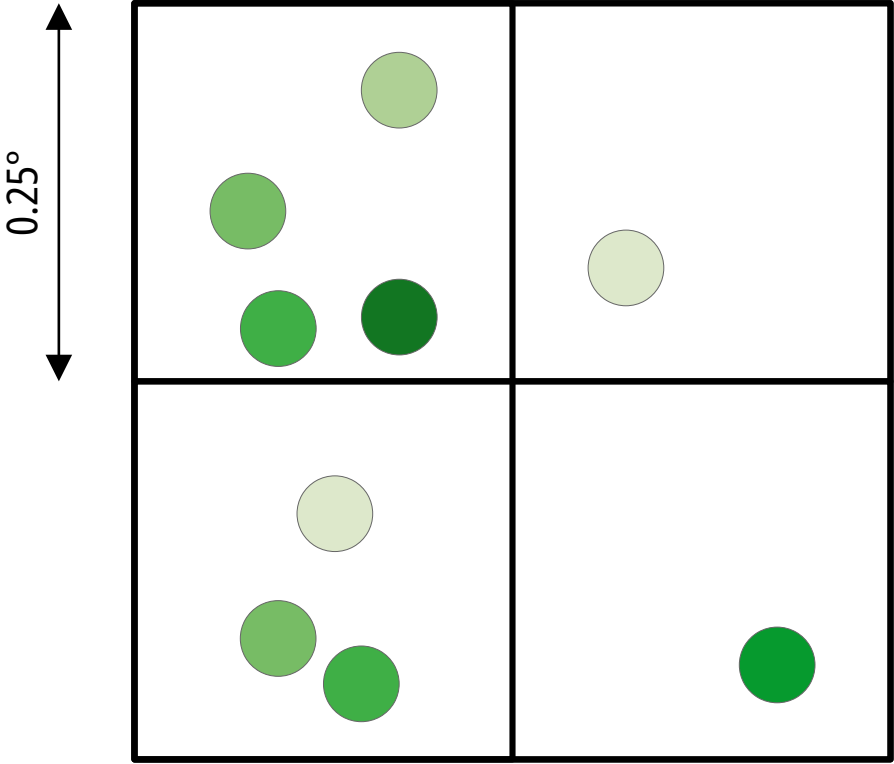
Temporal coverage per pollen site



Weighted mean of pollen counts, taking into account both **uncertainty** and **time distance**

Spatial upscaling

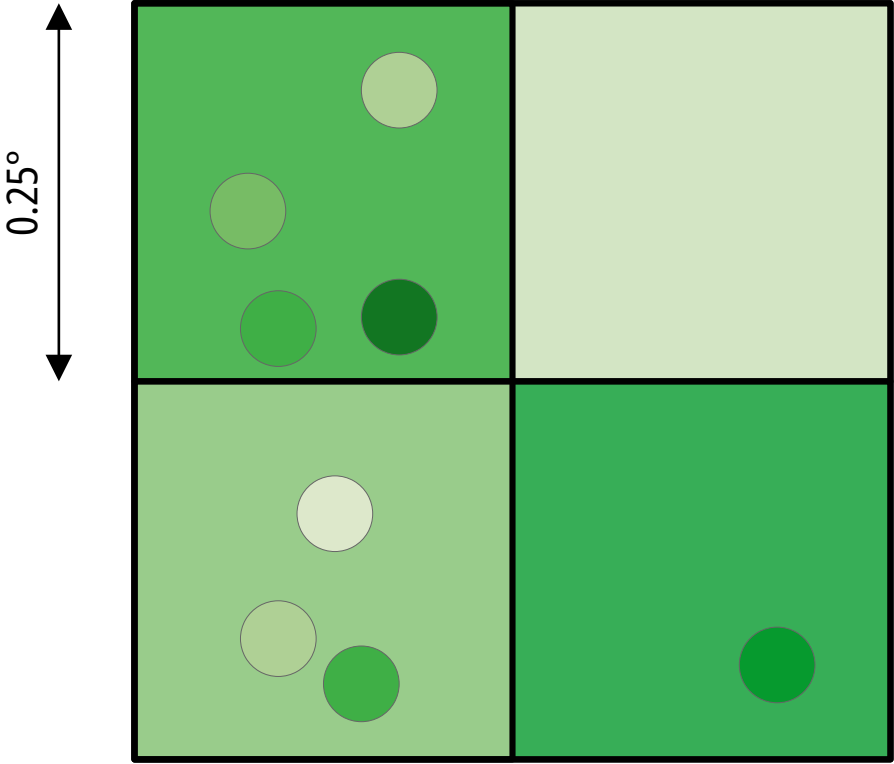
e.g. 3kyr BP



Species pollen relative abundance

Spatial upscaling: relative abundance

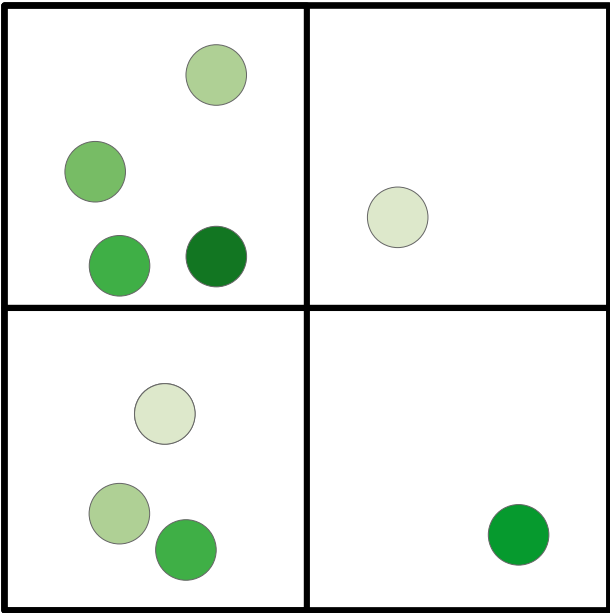
e.g. 3kyr BP



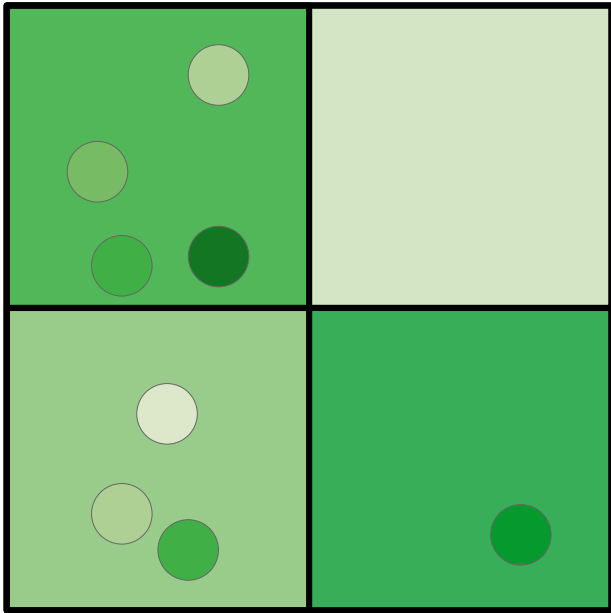
Average species relative abundance

Spatial upscaling: presence/absence

« one is enough »



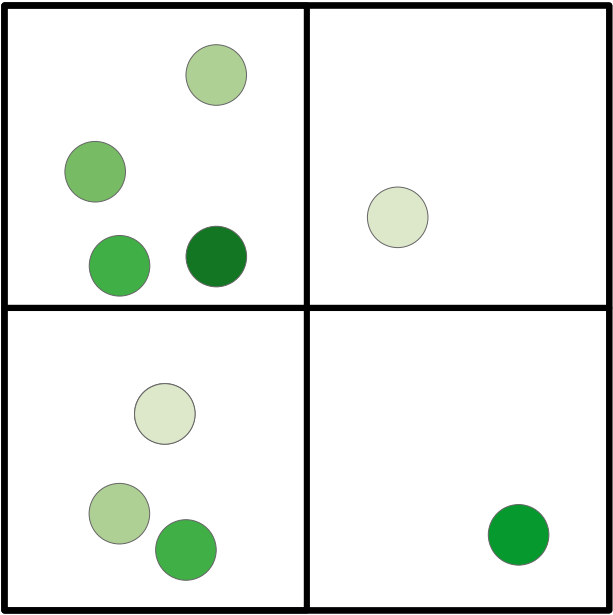
average presence



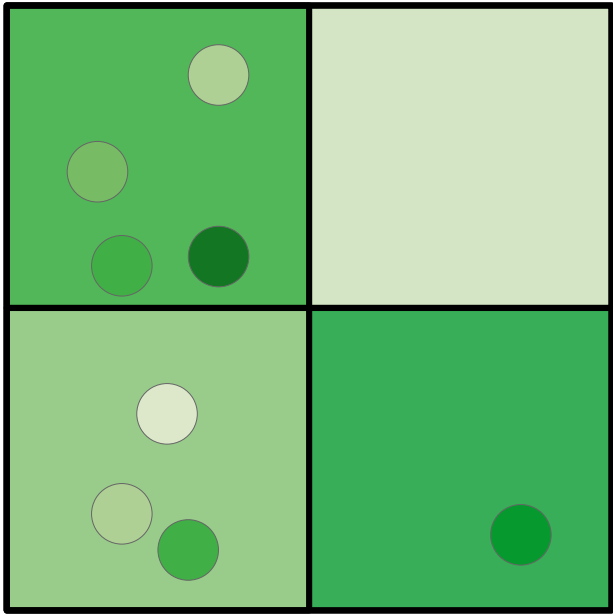
Presence threshold

Spatial upscaling: presence/absence

« one is enough »



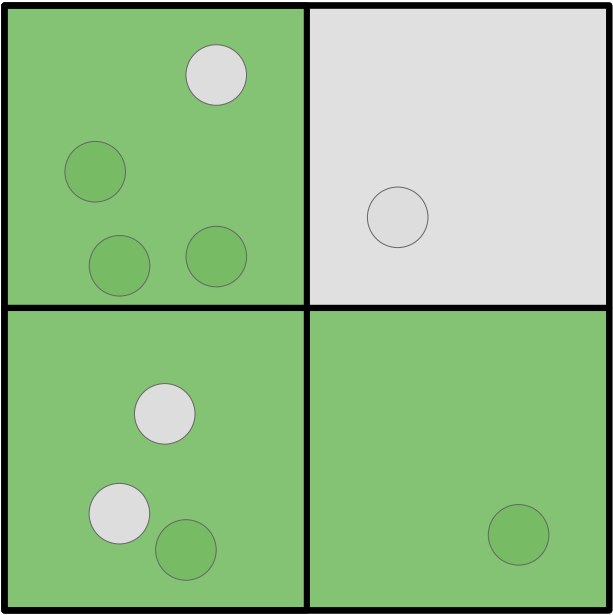
average presence



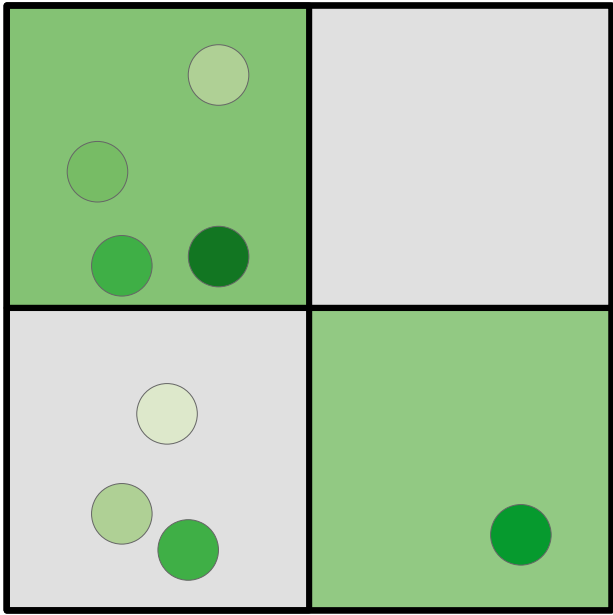
Presence threshold

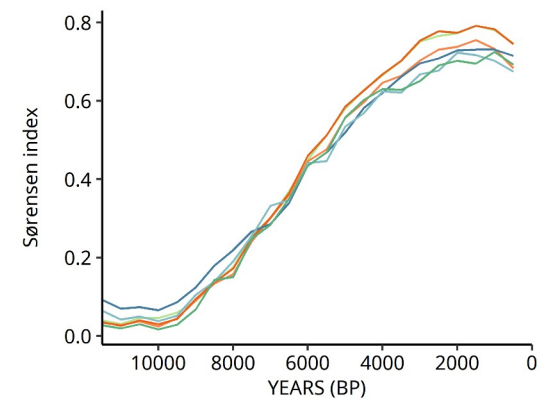
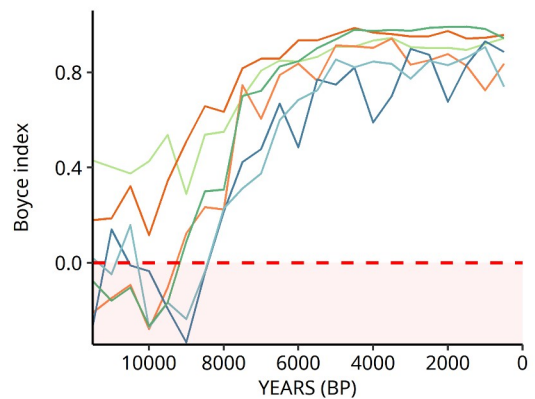
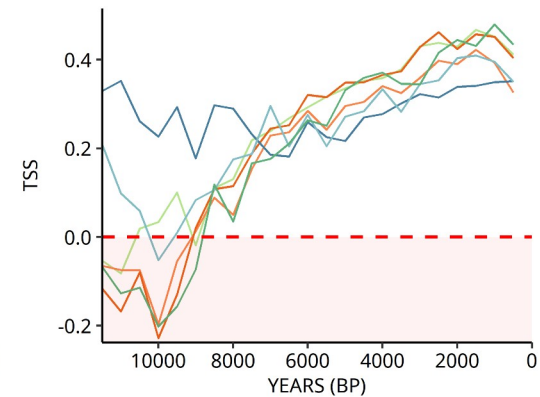
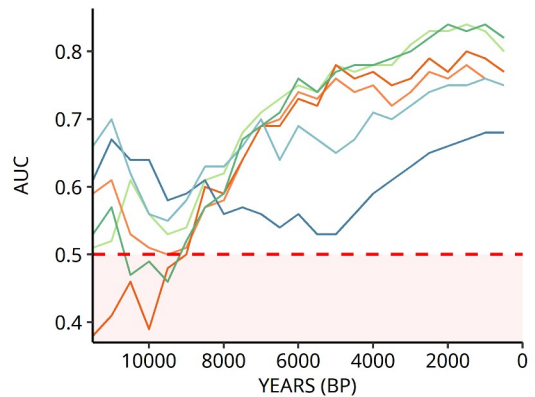
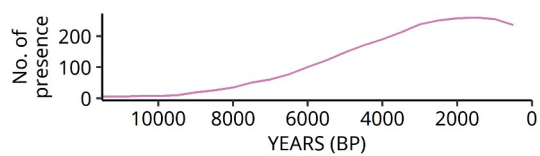
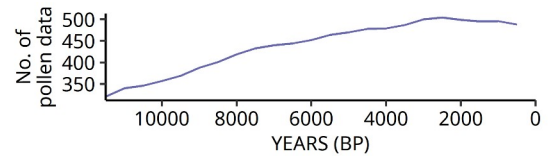
Spatial upscaling: presence/absence

« one is enough »



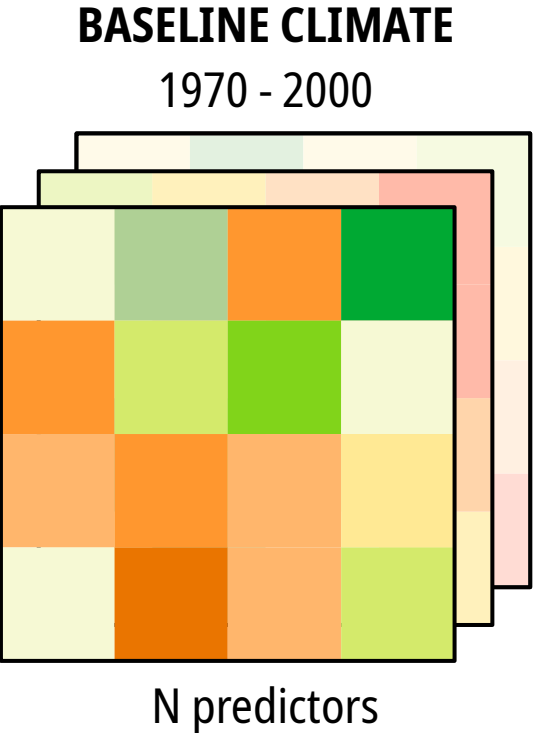
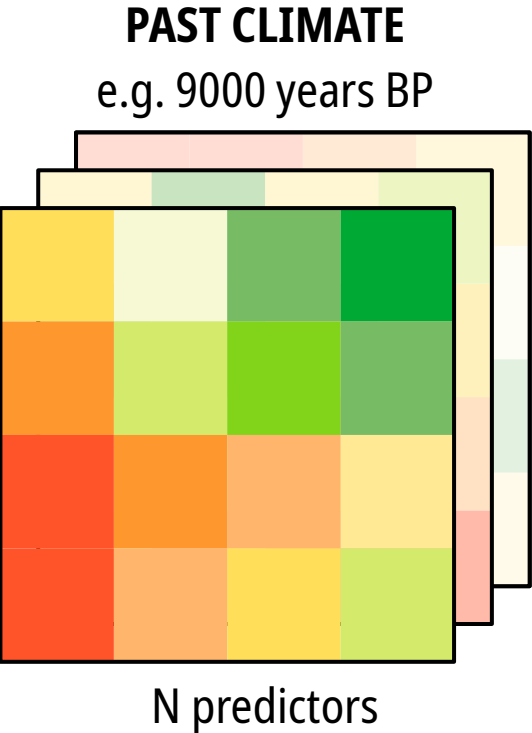
average presence





Lasso GLM Random Forest PHENOFIT
GAM BRT PHENOFIT (fitted)

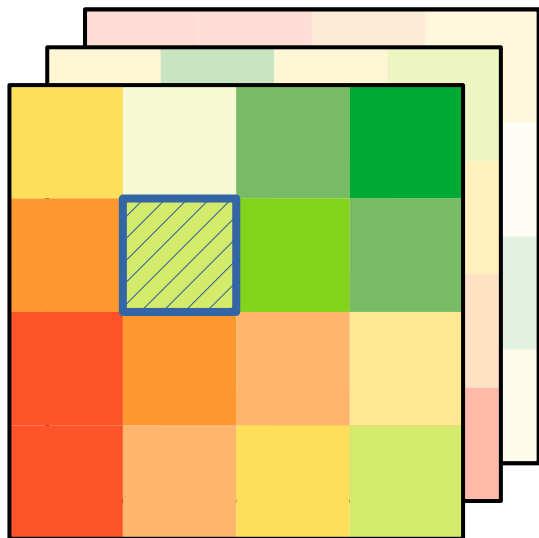
CLIMATE APPROACH: Climatic distance



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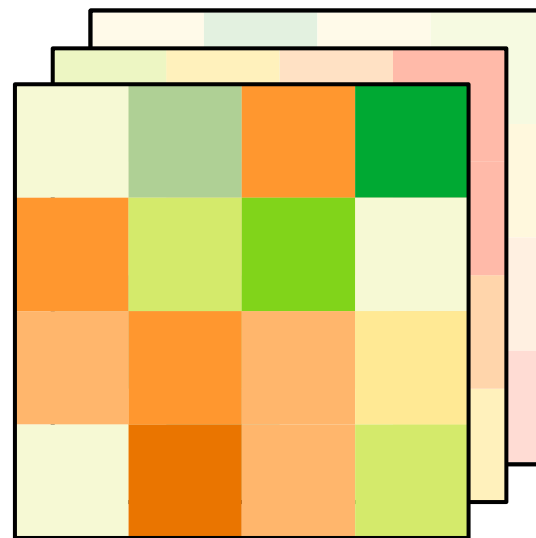
PAST CLIMATE

e.g. 9000 years BP



BASELINE CLIMATE

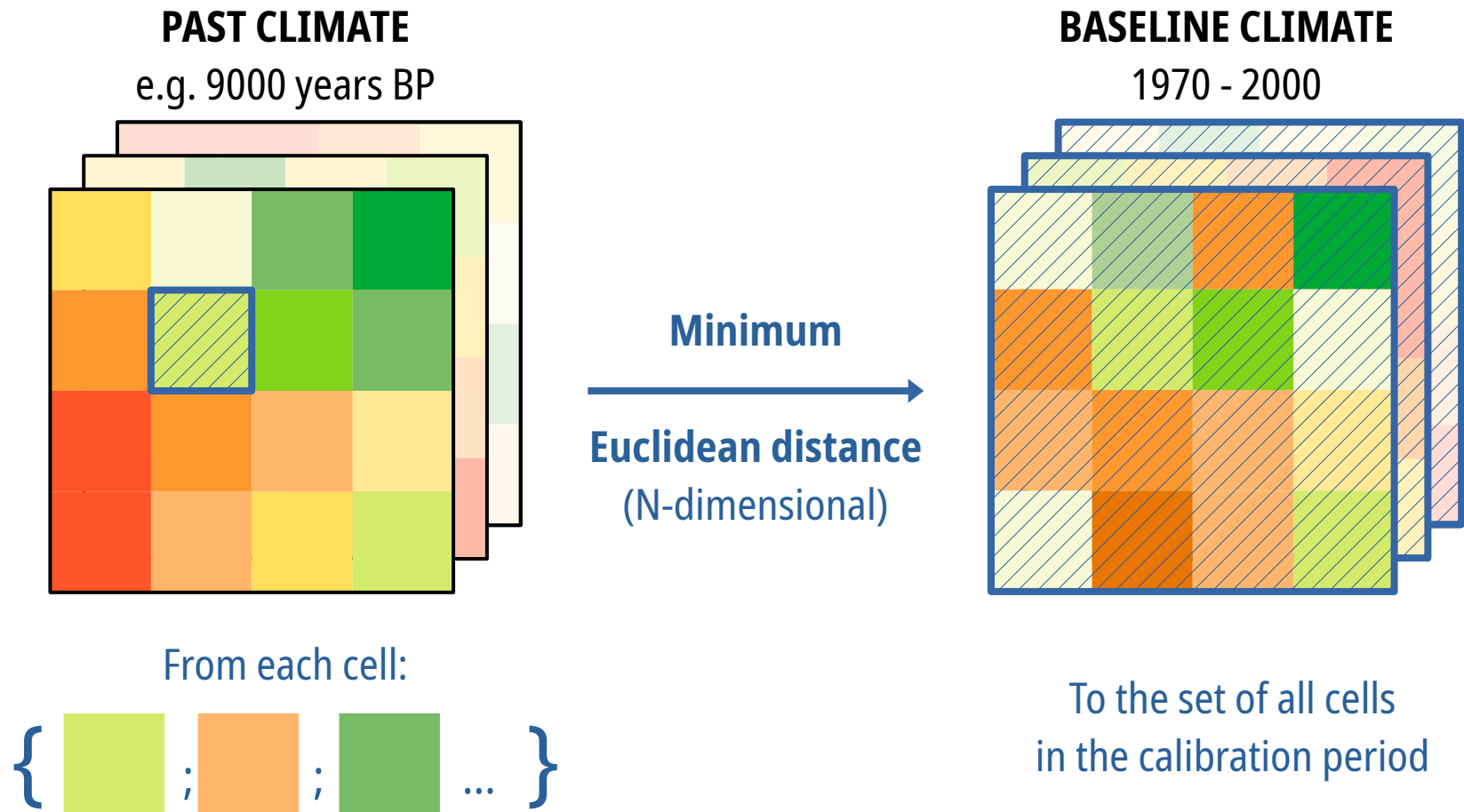
1970 - 2000



From each cell:

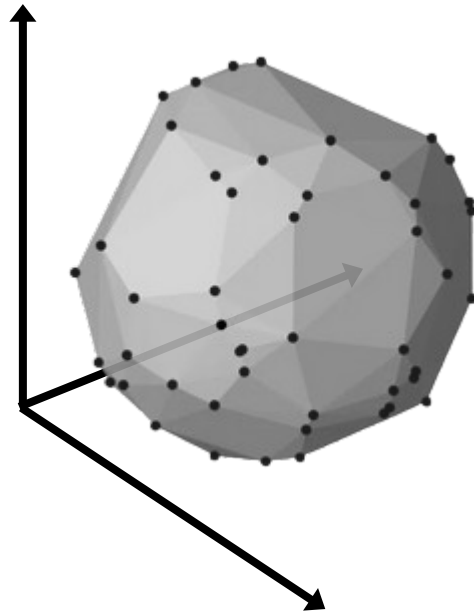
{  ;  ;  ... }

CLIMATE APPROACH: Climatic distance



CLIMATE APPROACH: Hypervolume similarity

PAST CLIMATE
e.g. 9000 years BP

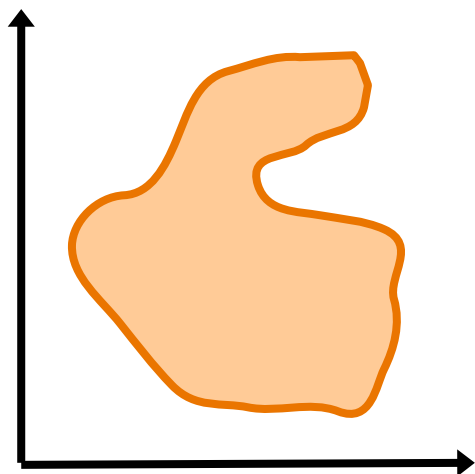


N-dimensional hypervolume

CLIMATE APPROACH: Hypervolume similarity

PAST CLIMATE

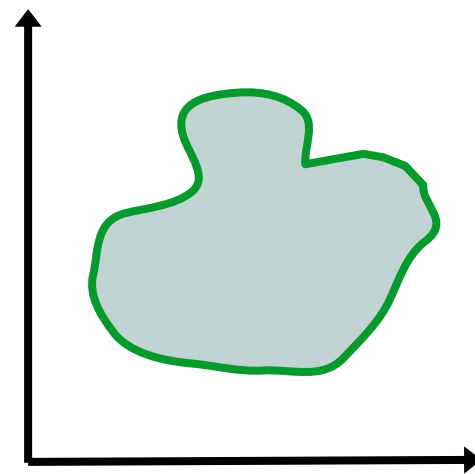
e.g. 9000 years BP



N-dimensional hypervolume

BASELINE CLIMATE

1970 - 2000

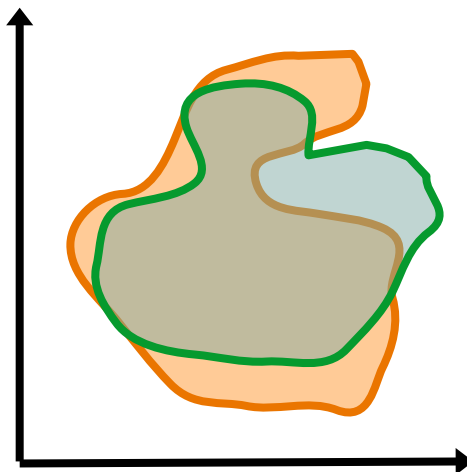


N-dimensional hypervolume

CLIMATE APPROACH: Hypervolume similarity

PAST CLIMATE
e.g. 9000 years BP

BASELINE CLIMATE
1970 - 2000

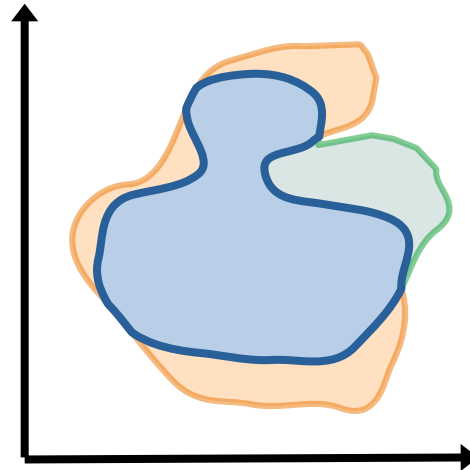


CLIMATE APPROACH: Hypervolume similarity

PAST CLIMATE
e.g. 9000 years BP

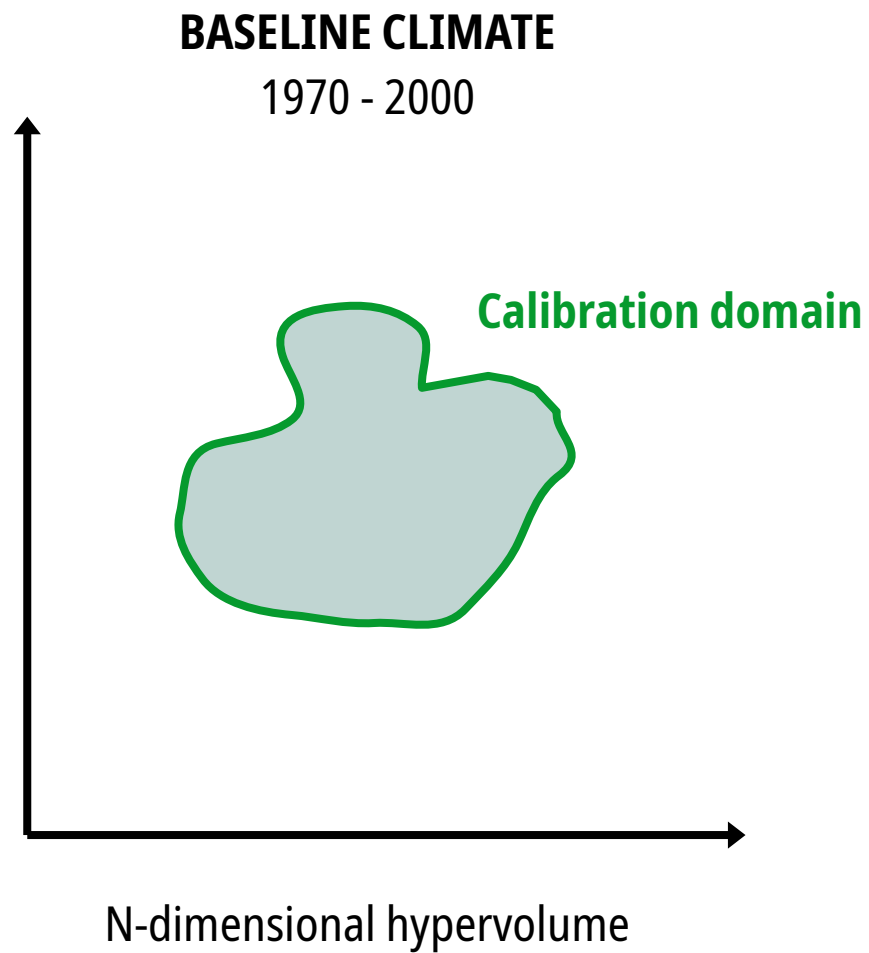
BASELINE CLIMATE
1970 - 2000

Hypervolume overlap

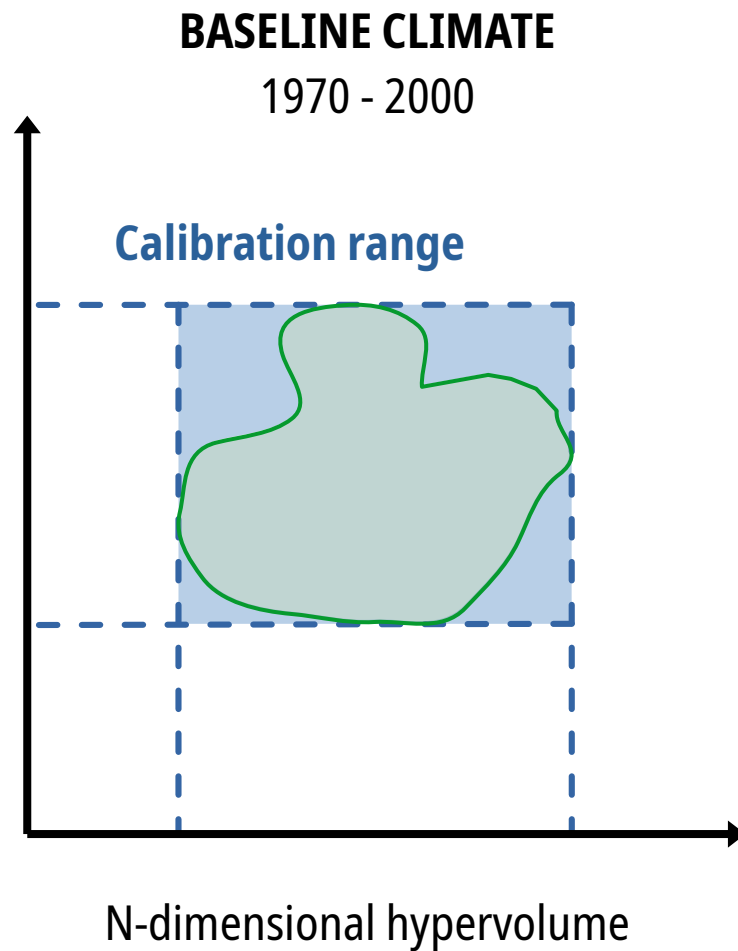


(Sørensen similarity)

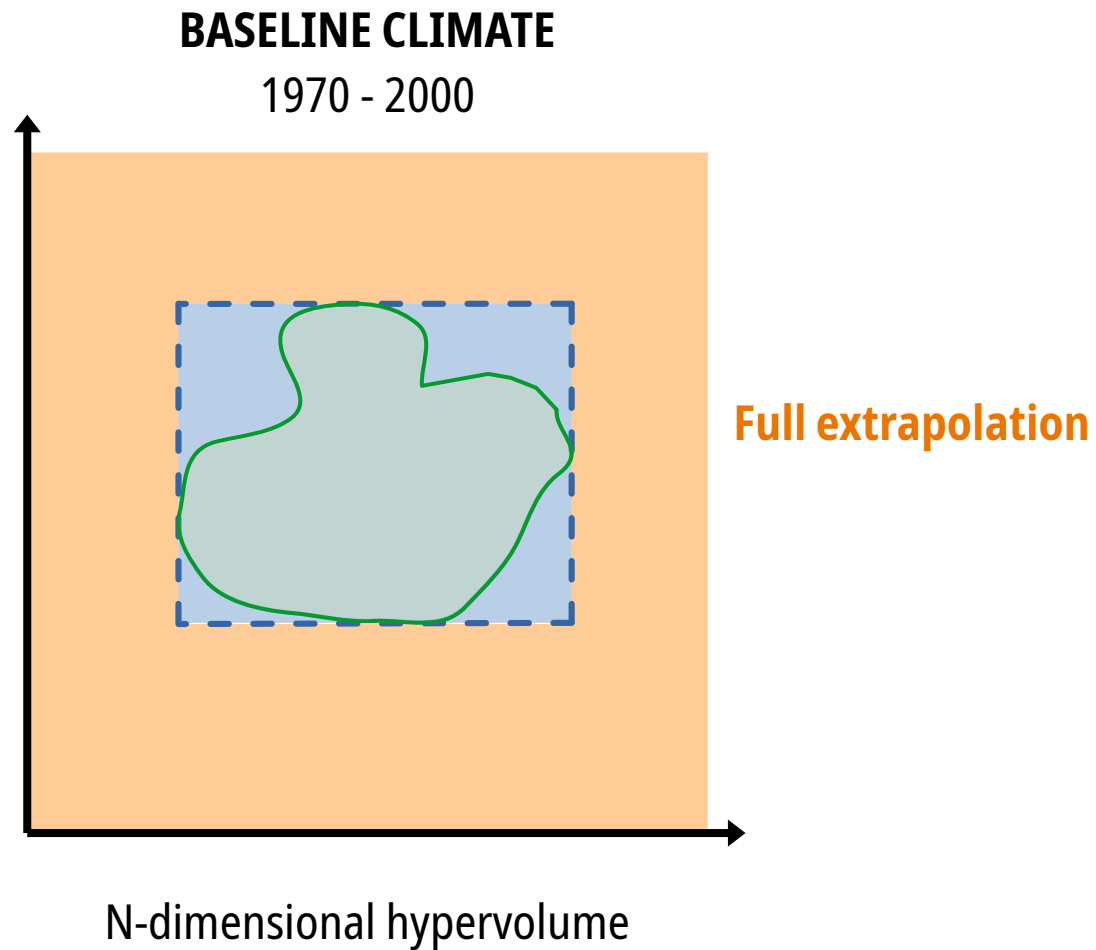
CLIMATE APPROACH: Categorical differentiation



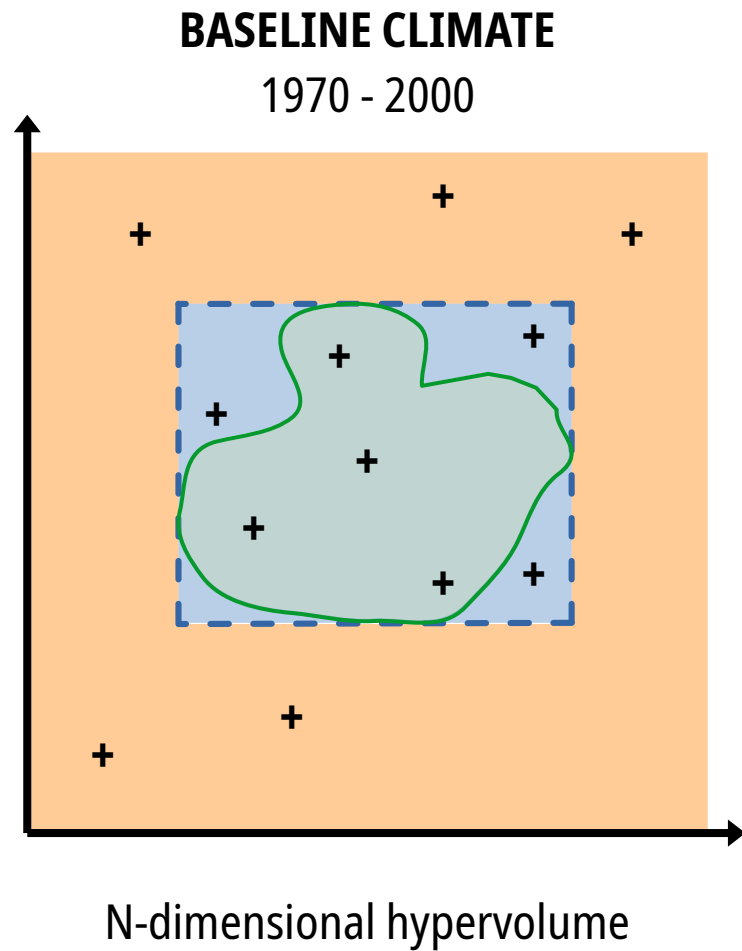
CLIMATE APPROACH: Categorical differentiation



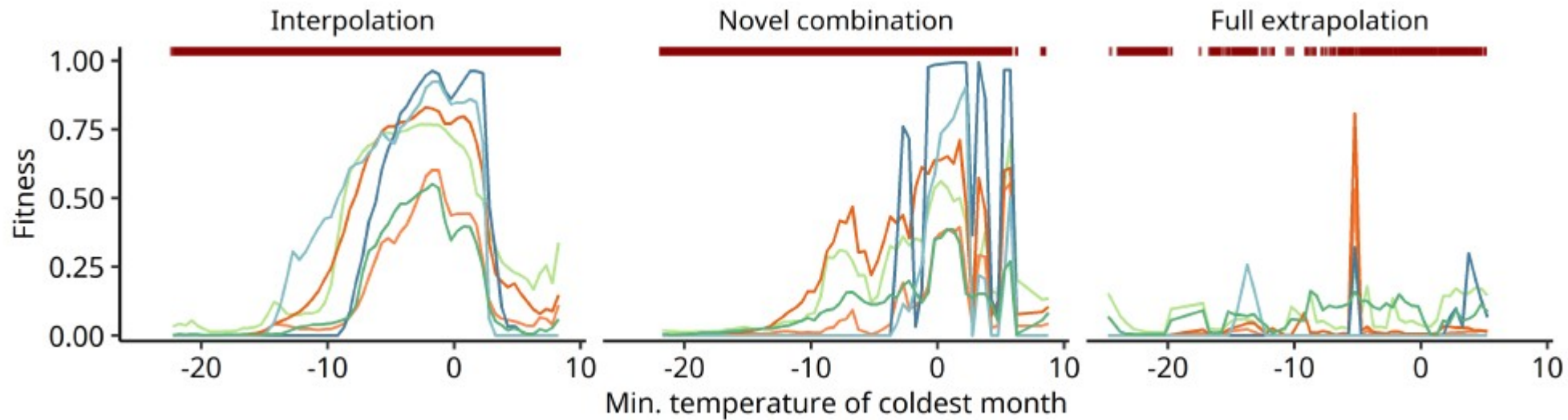
CLIMATE APPROACH: Categorical differentiation



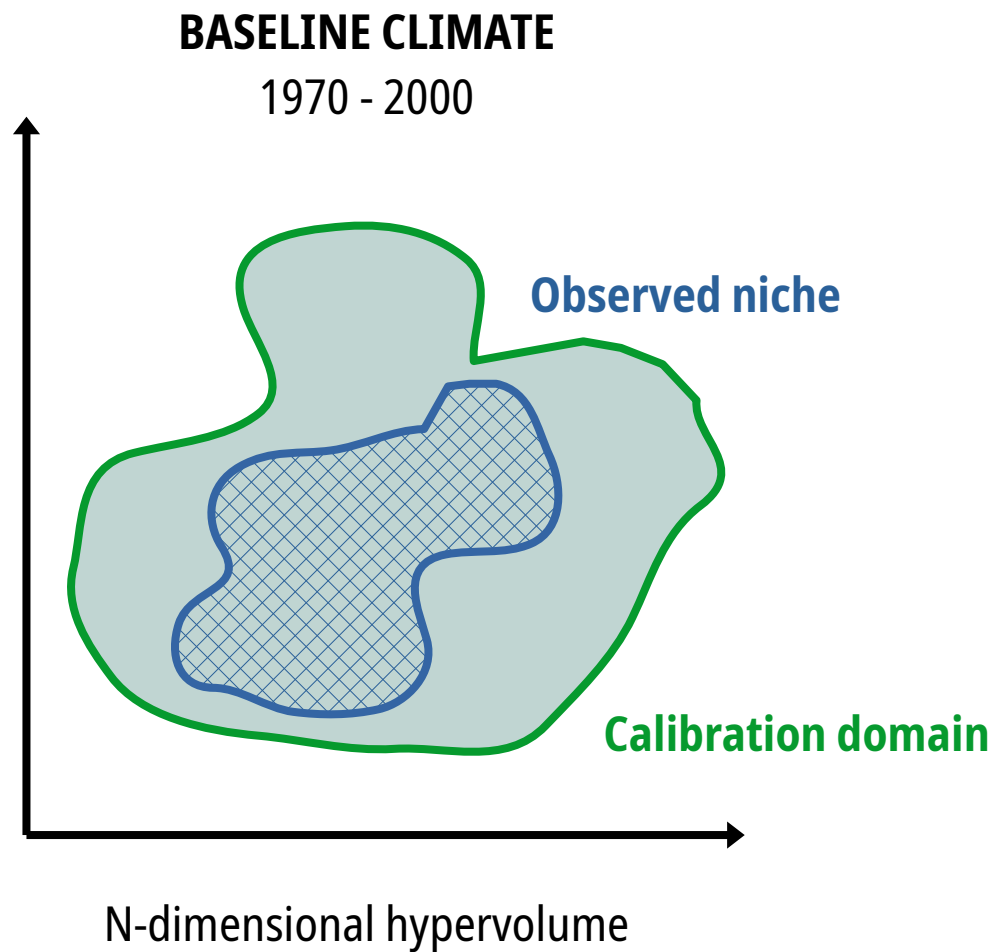
CLIMATE APPROACH: Categorical differentiation



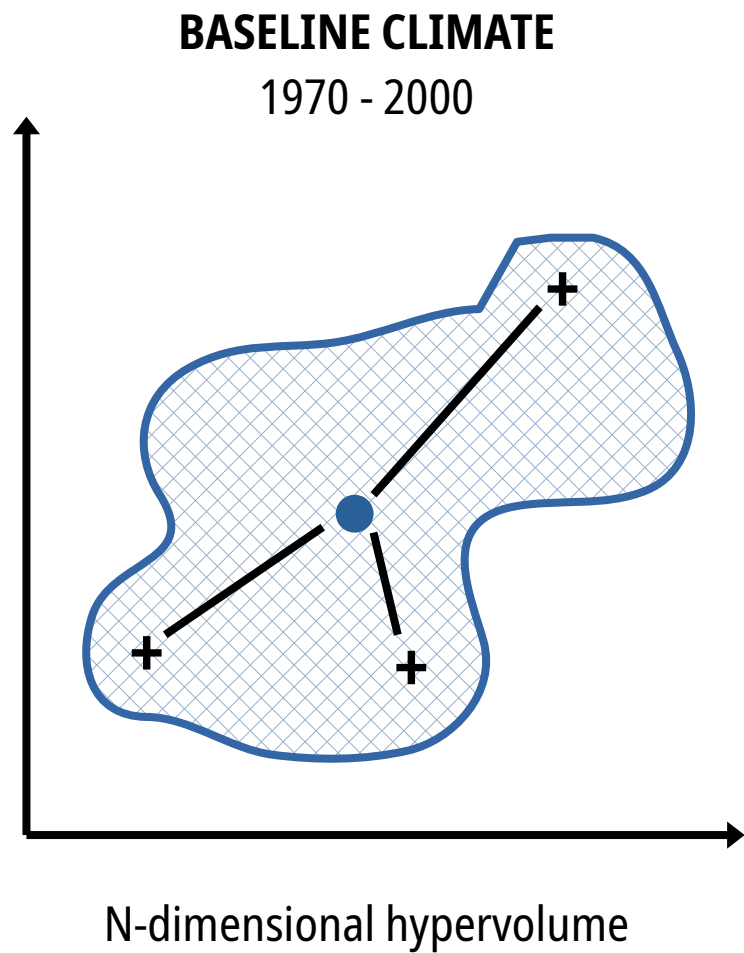
CLIMATE APPROACH: Categorical differentiation and model response



NICHE APPROACH: average distance to centroid



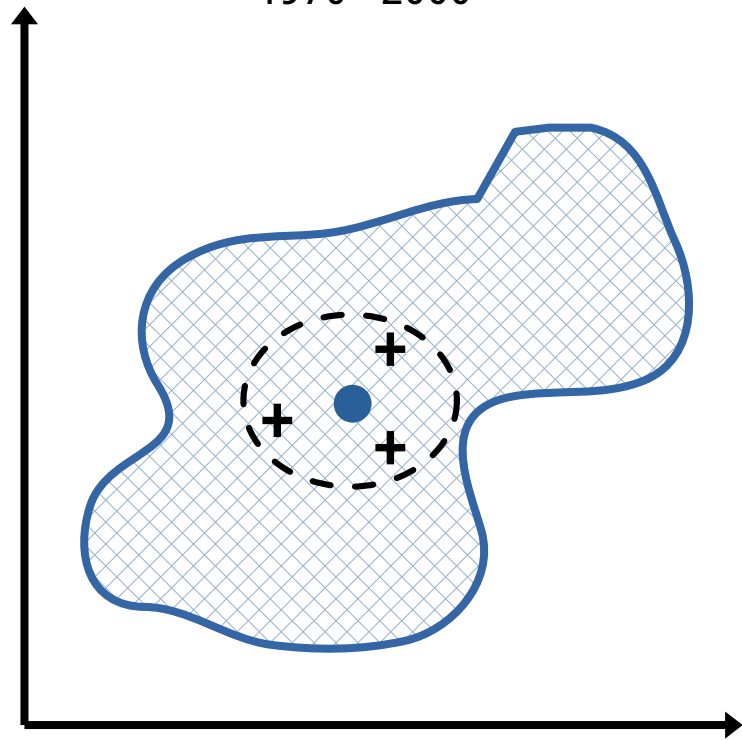
NICHE APPROACH: average distance to centroid



NICHE APPROACH: average distance to centroid

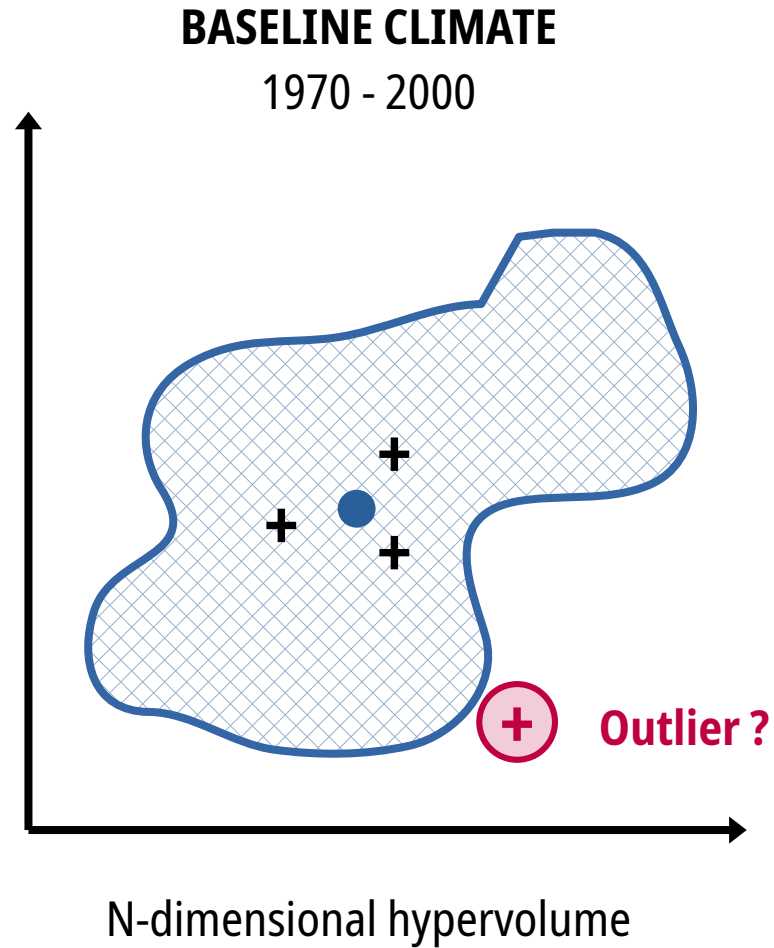
BASELINE CLIMATE

1970 - 2000

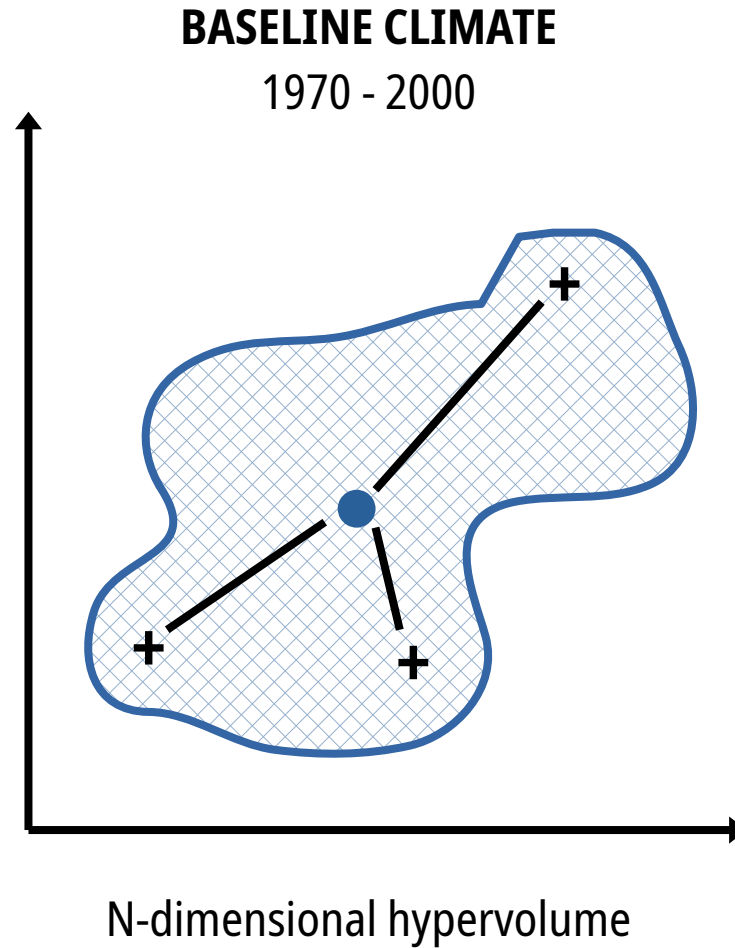


N-dimensional hypervolume

NICHE APPROACH: average distance to centroid



NICHE APPROACH: average distance to centroid



**Average distance
between pollen
records and centroid**