The evolution of Hutchinsonian climatic niche hypervolumes in gymnosperms

Authors: Fernanda S. Caron[1], David F. R. P. Burslem[2], Juliano Morimoto[1],[3*]

Authors' affiliations:

[1] Programa de Pós-graduação em Ecologia e Conservação, Universidade Federal do Paraná,

Curitiba, 82590-300, Brazil

[2] School of Biological Sciences, University of Aberdeen, Cruickshank Building, Aberdeen

AB24 3UU, UK

[3] Institute of Mathematics, University of Aberdeen, King's College, Aberdeen AB24 3FX,

UK

Corresponding author:

Juliano Morimoto

Institute of Mathematics, University of Aberdeen, AB24 3UE, Aberdeen

+44 (0)1224 273218

juliano.morimoto@abdn.ac.uk

Short running title

The evolution of the multidimensional niche in non-flowering woody plants

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The authors have no conflict of interest to declare.

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Data availability statement

Raw data is available through DOI links in supplementary material as the files were too large

to attach with the submission, while code is available in supplementary material [during the

review process to safeguard anonymity] and the Github repository: xxxxxx.

ABSTRACT

Aim

The niche is a fundamental concept in theoretical and experimental ecology and is used to

describe a wide range of ecological processes from species interaction with the environment

to community assemblies. A common way to represent the niche is through a

multidimensional geometry known as the Hutchinsonian niche hypervolume. Ecological

theory predicts that niche hypervolumes have properties such as holes with broader eco-

evolutionary significance, but we lack a comprehensive empirical study of niche

hypervolume properties and their evolutionary significance.

Location

Global

Time period

Holocene

Major taxa studied

Gymnosperms

Methods

We conducted for the first time a systematic and comprehensive test of the evolution of

Hutchinsonian niche hypervolume properties (volume and holes) across 65 genera and 12

families of gymnosperms, which includes many species that are endangered or threatened.

Using cutting-edge computational algorithms, we measured the evolution of geometric (i.e.

volume) and topological (i.e. holes) properties of gymnosperm hypervolumes across a

comprehensive calibrated phylogeny.

Results

Our comparative analysis revealed weak evidence of the non-independent evolution of niche

hypervolume volume and no evidence of the non-independent evolution of hypervolume

holes. We also found that genera and families with low hypervolume volume such as

monotypic groups like *Gingko*, likely experienced shifts in hypervolume evolutionary rates.

Main conclusions

Our results show that geometric and topological properties of gymnosperm climatic niche

hypervolumes evolve independently. This agrees with competitive exclusion hypothesis in

ecological theory where extant groups are likely to be the ones which minimise niche overlap

and competition.

Keywords: climatic niche; persistence homology; phylogenetic comparative data;

phylogenetic signal

INTRODUCTION

The 'niche' is arguably one of the most important concepts in ecology (Chase, 2011; McCann & Gellner, 2020). Although definitions are debated (Hutchinson, 1957; Soberón, 2007; Wennekes et al., 2012), the concept of the niche has enabled unprecedented theoretical and empirical advances in our understanding of how species interact with their environment (e.g., Blonder, 2016; Soberón & Nakamura, 2009; Soberón, 2010; Winemiller et al., 2015; and references therein). In particular, the definition of niche formulated by Hutchinson – the Hutchinsonian niche hypervolume – is widespread in the literature and is simple to apply to the large quantities of ecological data that are increasingly available. In this context, the niche hypervolume can be defined as "an abstract mapping of population dynamics onto an environmental space, the axes of which are abiotic and biotic factors that influence birth and death rates" (verbatim from Holt, 2009; see also Hutchinson, 1957). Niche hypervolumes have had a major influence on the advancement of ecological theory (Soberón & Arroyo-Peña, 2017; Blonder, 2018; Jiménez et al., 2019; Mammola & Cardoso, 2020; Soberón & Peterson, 2020; Carrasco et al., 2022; Conceição & Morimoto, 2022), as well as to uncover insights into niche evolution (Blonder, 2018; Pili et al., 2020; Bates & Bertelsmeier, 2021), niche differentiation (Carvalho & Cardoso, 2020; Huang et al., 2024), biological invasion (Tingley et al., 2014; Helsen et al., 2020; Zhang et al., 2020), community diversity (Chrisholm & Pacala, 2010; Loke & Chrisholm, 2023), ecological specialisation (Bebber & Chaloner, 2022), and global biodiversity patterns (Beaugrand et al, 2020; but see Justus, 2019).

The niche hypervolume concept has evolved with advances in theoretical and empirical ecology (Chase & Leibhold, 2003; Holt, 2009; Wiens, 2011; Kearney et al., 2017; Letten et al., 2017). One aspect of the hypervolume concept that has recently emerged, but remains untested, is the idea that hypervolumes can have holes (Blonder, 2016). Specifically, Blonder (2016) proposed the existence of holes in niche hypervolumes and conjectured that these holes could indicate environmental conditions in which species are vulnerable to be outcompeted in interspecific competition or unaccounted eco-evolutionary processes (e.g. range shifts) that lead to vacant niches. One cannot rule out the possibility of missing data generating artefacts interpreted as holes, but it is plausible – although largely untested in large scales – that holes have ecological meaning (Blonder, 2016; Conceição and Morimoto, 2022). Note that, in this conjecture, holes are representative of a fundamental ecological feature that could evolve if, for example, sister lineages share the physiological or

morphological vulnerabilities that facilitate invasion portions of environmental space by other
lineages. Blonder (2016) tested the holey niche concept in the morphological niche
hypervolume of a community of co-existing finches in the Galapagos and concluded that
"well-known datasets may be described in terms of hypervolumes with holey geometries that
are potentially consistent with unexplored mechanisms" (Blonder, 2016). Thus, Blonder's
conjecture could link niche hypervolume properties that exist in high-dimensional space to
real-world ecological processes, making the study of hypervolume properties a paramount
surrogate and key target of investigation to understanding species' ecology. However, to date,
we still lack large scale tests to directly ascertain the evolution of Hutchinsonian climatic
niche hypervolume geometric and topological properties. Yet, the concept of climatic niche
hypervolumes was originally created to represent species' climatic occupancy and it what
hypervolumes are widely used in many applications today (Blonder, 2018; Vilas et al., 2022).

Studying niche hypervolume properties is not trivial. The incomplete information available
for defining the dimensions of the hypervolume topology poses a challenge. Patchy and
heterogeneous observations prevent reconstruction hypervolume topology from bioclimatic
variables with accuracy (e.g., Peterson et al., 2018; Jiménez et al., 2019), and statistical
models to "fill" hypervolume topologies are criticized (e.g., Qiao et al., 2017; Mammola,
2019; Guillerme et al., 2020). These limitations can be particularly insidious when estimating
hypervolume holes as high dimensionality can pose a challenge (Blonder, 2016; Conceição
and Morimoto, 2022). We recently proposed the use of algebraic topology, specifically the
concept of persistence homology, to identify holes in hypervolumes and overcome the
dimensionality challenges (Conceição & Morimoto, 2022). However, neither we nor others
have yet used approaches to identify and derive biological meaning from holes and other
properties from ecological niche hypervolumes across species within an evolutionary
framework. Such comparative studies are needed to better understand if and how ecological
niche hypervolume properties, including holes, evolved.

In this paper, we addressed an important knowledge gap about niche hypervolumes, namely,
if niche hypervolume properties evolve non-independently in related species. To achieve this,
we present the first comparative study of the evolution of niche hypervolume properties
(volume and holes). Understanding evolutionary patterns of niche hypervolume properties
can be a way to uncover the eco-evolutionary significance of its properties such as holes,
which have been hypothesised to hold meaningful ecological information but still lack large-

scale studies to test this. Plants are excellent models for studying hypervolume properties

because they minimise potential confounding effects of range shifts and migration observed

in animals (e.g., Valladares et al., 2014; Menchetti et al., 2019; Häfker et al., 2022; and

references therein). Many plants are threatened by climate change and understanding the

evolution of niche hypervolumes may uncover new insights into how to protect them (Antão

et al., 2020; Singh et al., 2023). Moreover, climate niche evolution in plants is representative

of similar processes in animals (Liu et al., 2020).

Here, we focused our attention on studying ecological niche hypervolume properties of

gymnosperms. Gymnosperms non-flowering woody plants with major importance for many

ecosystems worldwide. Gymnosperm trees are abundant in many subtropical, temperate, and

boreal forests that collectively represent over one-third of the forested regions on the planet

(Lesiv et al., 2022). Moreover, gymnosperms form the group of plants has assessed as having

high extinction risks (~40% of its species classified as CR, EN, VU) despite their importance

for cultural and provisioning ecosystem services (Forest et al., 2018; Tagliari et al., 2023),

whereas other gymnosperms are a primary source of timber (e.g., *Pinus sp*). Gymnosperms

are also relatively less diverse than flowering plants, likely due to direct competition (Bond,

1989; Coiffard et al., 2012; De Boer et al., 2012), which makes them a tractable but

representative group for investigating the evolution of ecological niche hypervolume

properties. Given gymnosperms' broader evolutionary and socio-ecological significance, we

analysed the environmental niches of 65 gymnosperm genera distributed across 12 families

(Figure 1B). We used genera and families, rather than species, as our taxonomic levels of

comparison because the immense computational power to estimate hypervolume geometric

and topological properties prevents a species-level analysis at this stage, even for high-

performance computers. For example, calculating hypervolume holes in a single

hypervolume with more than a few thousand of data points in dimensions >2 is virtually

impossible with current algorithms, and we still lack a properly validated approach to rarefy

the point cloud (i.e. reduce number of points) without losing topological information. We

constructed niche hypervolumes with 31 environmental variables and applied a recently

developed approach of topological data analysis to estimate hypervolume holes (Conceição &

Morimoto, 2022). We hypothesised that if niche hypervolume properties captured conserved

ecological processes, then hypervolume properties would display strong phylogenetic signals.

For example, if closely related genera and families are more likely to have more similar

climatic niches (e.g. over- or under-dispersed point clouds in niche space), then this would be

captured by our comparative analysis of climatic niche properties such as volume. Our
findings advance our conceptual and biological understanding of the multidimensional niche
and the evolution of its properties.

MATERIALS AND METHODS
Data collection
We obtained occurrence data from the GBIF database (https://www.gbif.org/) for all
available gymnosperms. The search was conducted for Cycadopsida (40,554 entries),
Ginkgoopsida (57,488 entries), Pinopsida (5,723,563 entries), and Gnetopsida (52,648
entries) (Table S1). We processed the GBIF data to remove duplicated points, points with
locations in impossible places (e.g., the sea), and points with large uncertainty. We assumed
that observations outside native ranges were valid in the construction of the realised niche
hypervolume and were therefore maintained. In this respect, we interpreted the realised
climatic hypervolume niche as the multidimensional representation of all measured climatic
conditions where the genus or families have survived (either within its native range or
naturalised in an alien area). Recent studies have used hypervolumes to test the differences in
climatic niche in invasive vs native ranges (e.g. Tingley et al. 2014; Zhang et al., 2020) but
this is not the scope of this paper. We only kept points derived from human observation, as
opposed to fossil records or preserved specimens. The final dataset contained 2,483,316
entries, corresponding to 764 species. The taxonomic classification for the gymnosperms was
followed according to the World of Flora Plant List (http://www.worldfloraonline.org/, last
accessed Oct 13, 2023).
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Apart from the gymnosperm data, we also gathered occurrence data for four outgroup
families (see Data analyses section). These families were Psilotaceae (23,865 entries),
Calycanthaceae (10,013 entries), Amborellaceae (327 entries), and Matoniaceae (836 entries)
(Table S1). For these families, we had a total of 16,361 entries after cleaning and processing
the data, corresponding to 23 species. Climatic data were obtained from the WorldClim
database using the getData function in raster v3.6-26 (Hijmans et al., 2023). This dataset was
downloaded at a resolution of 2.5 minutes of a degree, using the argument "var" as "bio" and
"tmin". Phylogenetic relationships for the genera and families for which we had ecological
data were retrieved from Stull et al. (2021). In this paper we only considered the climatic
component of the niche, as climatic variables represent the primary determinant of variation
in plant distributions globally (e.g. Walter, 1979). We acknowledge that numerous additional

abiotic and biotic factors contribute to niche diversification in plants, including soil
properties, elevation and topography, but incorporating these niche dimensions is beyond the
scope of the current paper.
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Data analyses
We performed analyses of the evolution of the Hutchinsonian niche across gymnosperms at
the level of genera and families. We discuss the limitations of this approach in the discussion
section. We used 31 environmental variables to construct the climatic niche of each taxon.
First, we extracted the climatic variables related to temperature and precipitation from the
WORLDCLIM database (https://www.worldclim.org/) with resolution of 5 minutes for the
occurrence points of each taxon using the extract function in *raster* v3.6-26 (Hijmans et al.,
2023). Then, we conducted a principal component analysis (PCA) with all climatic variables
to reduce the dimensionality of these environmental variables to three orthogonal axes (i.e.,
PC1-3). A PCA was conducted for each gymnosperm genus and family separately using the
function prcomp() in R (R Core Team, 2024). For each taxon, we also calculated their
centroid in the first three PC axes. For this, we calculated the mean of each PC axis for the
taxa individually and for the gymnosperms. Then, we estimated the Euclidean distance
between each taxon centroid to the gymnosperm centroid. While the hypervolume volume is
based on the extreme values of the PCA, the distance between centroids can be regarded as a
measure of the uniqueness of the taxon's climatic niche. Hypervolumes were estimated using
the hypervolume_gaussian function in *hypervolume* v.3.1-4 (Blonder, 2024) with default
parameters. This algorithm provides random points that "fill" the hypervolume space (see
Blonder et al., 2014) and from which properties of the hypervolumes can be estimated. As the
hypervolume analyses are computationally intensive, we had to reduce the dataset of the
genera and families that had more than 50,000 locality entries. The genera that had their
occurrences reduced were *Abies*, *Juniperus*, *Larix*, *Picea*, *Pinus*, and *Taxus*, and the families
were Cupressaceae and Pinaceae. Inspection of the occurrence points derived from the entire
and reduced dataset showed that this reduction in the locality entries did not affect the
coverage of the taxon occurrence (Figure S1). Finally, we estimated the phylogenetic signal
and adaptive shifts for the hypervolume properties and the distance of centroids. The
phylogenetic signal was calculated using the phylosig function in *phytools* v2.3-0 (Revell,
2024). The statistics used were Pagel's λ (Pagel, 1999), with 1,000 iterations, and Blomberg's
K (Blomberg et al., 2003), with 1,000 simulations. We also mapped the hypervolume
properties in the phylogeny using the contMap function in *phytools* v2.3-0 (Revell, 2024). As

a final analysis, we estimated adaptive shifts in the evolution of the hypervolume volume using the bayou package v2.3-0 (Uyeda & Harmon, 2014). This package fits Bayesian reversible-jump multi-optima Ornstein–Uhlenbeck (OU) models to phylogenetic comparative data, identifying the location and magnitude of adaptive shifts (Uyeda & Harmon, 2014). We ran the analyses at the genus and family levels using the default prior configurations. We ran the models three times at each level for 10 million generations, considering 30% as burn-in. All variables were log-transformed prior to the calculations. The phylogeny used was manipulated to be used at the genus and family level, keeping either one random representative per genus or family for this. In addition, we also estimated the dimension 2 holes in the 3D ecological hypervolumes using a state-of-the-art topological data analysis approach (Conceição & Morimoto, 2022) and the *TDAstats* package (Wadwa et al., 2018). We focused on dimension 2 holes because they represent the boundaries of 3D sub-volumes within the 3D hypervolume. We estimated maximum niche hypervolume hole size (i.e. largest hole size) as the maximum "survival" of dimension 2 holes upon Vietoris-Rips filtration and the average and standard error as the mean and standard error of the survival of all dimension 2 holes identified for a given hypervolume (Conceição & Morimoto, 2022). Our motivation for studying these holes was that, if holes exist in ecological niche hypervolumes and evolve non-independently, we could infer their biological significance from the shared ecological properties among species. We did not focus on dimension 0 (holes which emerge based on distance among data points) or dimension 1 (holes in the faces of the hypervolumes) because they are dependent on the distribution of datapoints which defines the hypervolume rather than holes in the structure of our 3D hypervolumes (see Conceição & Morimoto, 2022 and references therein). It is important to note that we cannot rule out that hypervolumes constructed using principal components could distort the holes that exist thereby adding noise to our phylogenetic analysis (false negative). We currently lack a systematic study to ascertain whether our approach, which is common practice in ecology, conserves the topological structures of the niche hypervolume. Such knowledge will have far-reaching implications for ecological studies as many studies rely on the ability of computational algorithms to estimate the topology of niche hypervolumes accurately. All analyses were performed in R v4.4-0 (R Core Team, 2024).

RESULTS

We first tested whether ecological niche hypervolume volume evolved non-independently across genera of gymnosperms. We found weak evidence to support the non-independent

evolution of ecological niche hypervolume volume as only Blomberg's *K* at the genus level

was statistically significant (Table 1). Estimates of Pagel's λ at the genus and family levels

and Blomberg's *K* at the family level were not statistically significant (Table 1 and Table S2).

Next, to gain further insight into the weak support for the non-independent evolution of

hypervolume volume at the genus level, we measured adaptive shifts in evolutionary rates for

the hypervolume volume. Comparing the value of the adaptive regime (θ) in the root of the

phylogeny with the adaptive regimes leading to other lineages, it is possible to assess if these

new adaptive regimes suffer an increase in value or decrease. Thus, this can indicate if a

smaller or larger hypervolume volume has been favoured in these lineages regarding their

ancestor. In gymnosperms, the root value of the adaptive regime (θ) of the hypervolume

volume was estimated as 21.548. Our model showed five major shifts in the adaptive regimes

at the genus level leading to the evolution of smaller hypervolume volumes (Figure 1C). The

clades which went through these decreasing shifts encompassed (1) *Welwitschia* (θ = 18.614,

PP [posterior probability] = 0.438), (2) *Stangeria* (θ = 18.752, PP = 0.355), (3) *Gingko* (θ =

17.273, PP = 0.839), and the outgroup (4) *Calycanthus* (θ = 18.282, PP = 0.310), and (5)

Calycanthus and *Amborella* (θ = 19.169, PP = 0.361). These results were virtually identical

across all three runs and thus, are robust.

We also analysed the evolution of hypervolume holes (Blonder, 2016). However, none of our

analyses of the average size of dimension 2 holes (Figures S2A, S3B), standard error of

estimates of dimension 2 holes (Figures S2B, S3C), and maximum size of dimension 2 holes

(Figures S2C, S3D) showed evidence of non-independent evolution of hypervolume holes.

And while the overall shape and associated persistence diagrams differed amongst

themselves (Figure 1C), pairwise distance matrices of the dimension 2 holes did not reveal

any clusters of pairwise distances which appeared similar (Figures S2E, S3F). In fact, there

was no difference between the observed and randomised pairwise distance matrices (Figure

S4).

Lastly, we tested if the relative distinctiveness of the niche of each genus and family of

gymnosperms evolved non-independently, but the results were not statistically significant

(Text S1). These results suggest that ecological niche hypervolume holes, like hypervolume

volume, likely capture more dynamic ecological processes that do not necessarily evolve

non-independently among lineages.

DISCUSSION

All species have a niche, and their niche are often represented as niche hypervolumes. Thus, the niche hypervolume remains one of the most significant concepts in ecology today (Chase, 2011; McCann & Gellner, 2020). Despite its significance to theoretical and empirical ecology, we lacked a comprehensive understanding of hypervolume properties and whether they evolve non-independently in related species. Here, we answer this question by studying the evolution of the Hutchinsonian climatic niche hypervolume properties in gymnosperms. We mapped how climatic niche hypervolume geometrical and topological properties, such as volume and holes, evolved across the gymnosperms. Our data supported the idea that climatic niche hypervolume properties evolved independently across lineages. There was no phylogenetic signal on hypervolume volume except for a statistically significant estimate of Blomberg's K at the genus but not family levels. Blomberg's K captures the degree of variation within and among lineages and a statistically significant value of K suggests that within lineage variation supersedes variation among lineages (Meireles et al., 2020). The statistically significant results at the genus but not family level were driven by the relatively homogenous hypervolume volumes of genera within the Pinaceae, Araucariaceae, and Podocarpaceae families (Figure 1B). These are genera and families with widespread climatic tolerances which are represented by hypervolumes with comparatively higher volumes in our analysis. Contrastingly, Pagel's λ is a scalar that correlates a trait matrix with a phylogenetic matrix and was not statistically significant in any of our estimates. This is not surprising given the variability of hypervolume volume across gymnosperms found in our data both at the genus and family levels (Meireles et al., 2020).

We found a nearly 2-fold difference between the smallest and largest hypervolume by volume in our dataset. *Gingko, Stangeria*, and *Welwitschia* genera had the lowest hypervolume volume estimates (Figure 1C). *Ginkgo* is a living fossil that has been deemed one of the most critically endangered gymnosperms in the world and, therefore, has a relatively narrow ecological distribution reflected in its hypervolume volume (Forest et al., 2018). Although not classified as (critically) endangered by the IUCN Red List, *Welwitschia* has a unique ecology and occupies arid and semi-arid environments in sub-Saharan Africa with relatively narrow ecological distribution, also being considered a living fossil. Likewise, *Stangeria* is not classified as (critically) endangered by the Red List but has a unique ecology and is endemic to southern Africa (Schönland, 1918). These findings confirm that our hypervolume approach captures ecological characteristics of the genera and families and,

thus, that the lack of evidence for the non-independent evolution of ecological niche
hypervolume properties is meaningful. The causes of such shifts are unknown and
multifactorial, but the direct competition and diversification of angiosperms likely
contributed, although cannot fully explain this pattern. Adaptive shift results at the family
level are available in Text S1.

Multidimensional hypervolumes are complex high-dimensional geometries which poses
challenges for visualisation and computations of its properties. To study climatic niche
hypervolume properties across gymnosperms, we needed to make simplifying assumptions to
guarantee the feasibility of the analysis. One such assumption was that PCA transformation
and dimensionality reduction of our point cloud preserved ecological information. This
assumption is shared with most studies using the concept of niche hypervolumes (e.g., Pianka
et al., 2017; Zhang et al. 2020; Ellis, 2022) but it is worth highlighting that no systematic
study has yet tested the implications of PCA on point cloud structure and hypervolume
properties (but see also Mahoney et al., 2017; Lu et al. 2021). PCA acts as a projection of the
point cloud into lower dimensions and can introduce biases such as for example "filling in"
holes which are present in higher dimensions. Similar biases can occur from our decision to
measure hypervolume properties at the genus and family levels, since holes which are present
in the climatic niche hypervolume of individual species might be filled in when analysing the
climatic niche hypervolume of the genus or family. However, it is important to highlight that
the opposite is not true: we cannot have artificial holes or topological structure emerging after
PCA or at the genus or family levels if these structures are absent in the raw, species-level
data. Thus, our study provides a conservative estimate of the evolution of climatic niche
hypervolume properties. We are currently working to develop algorithms which directly test
the influence of PCA on climatic niche hypervolume properties, and which would allow the
computation of hypervolume properties (particularly holes) more efficiently. This will be the
scope of future work.

Conclusion

The niche is a cornerstone concept in ecology which has stimulated unprecedented advances

in theoretical and empirical studies. Hutchinsonian climatic niche hypervolume is widespread

in the literature and likely to become increasingly common for modelling ecological niches

from open data. We studied the properties of the climatic niche hypervolumes of

gymnosperms and found evidence that the climatic niche hypervolume properties evolve

independently in gymnosperms. These are the first results to systematically probe how

Hutchinsonian hypervolumes properties evolved, and to show that ecological niche

hypervolume properties likely capture dynamic ecological characteristics of the niche. This

probably limits the range of evolutionary inferences which can be made from Hutchinsonian

climatic niche hypervolumes. Future work in other taxa for which phylogenetic relationships

have been well established (e.g., vertebrates) will provide further insights into the

evolutionary insights that can be gained from the concept of the niche hypervolume.

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Table 1. Phylogenetic signal using Blomberg's K (Blomberg et al., 2003) and Pagel's λ

(Pagel, 1999) of hypervolume volume and holes at the genus level. LogL (logL0) refers to the

log-likelihood estimates of the (null) models.

Trait	λ	logL	logL0	p	K	p
Hypervolume	0.817	-128.686	-129.517	0.197	0.606	**0.009**
Mean distance	1.000	5.322	5.322	1.000	0.425	0.358
Maximum distance	0.000	-24.736	-24.736	1.000	0.397	0.503
SD distance	0.000	-15.040	-15.039	1.000	0.378	0.653

FIGURES

Figure 1. Overview of the analyses performed in the present study. **A.** Steps to analyse the data: collection of the occurrence data in GBIF database; extraction of the bioclimatic variables for each occurrence; PCA analysis with the bioclimatic data; estimation of the climatic niche hypervolume volume and properties; calculation of the phylogenetic signal of the hypervolume properties. **B.** Occurrence data for each family studied. Legend indicates the number of genera in each family. **C.** Hypervolume properties, phylogenetic signal, and adaptive shifts estimated. Phylogeny is mapped with hypervolume volume, in which blue corresponds to small hypervolume volume and red to large volumes. Time scale is represented at the base of the phylogeny. Families represented by more than one genus are highlighted in the internal branches. Circles represent the adaptive shifts with a posterior probability higher than 0.3. Graphs at the right represent examples of hypervolumes estimated and the persistence homology diagrams. Green: dimension 0, Blue = dimension 1, and Pink: dimension 2 homology.