



La Rochelle Université

Master's Thesis

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# **Characterisation of the functional diversity of meso- and bathypelagic fish in the Bay of Biscay submarine canyons**

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*There are some people in life that make you laugh a little louder, smile a little bigger and live just a little bit better.*

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# 1 Presentation of the host structure

The Centre d'Etude Biologique de Chizé (CEBC - UMR 7372) is a joint research unit, interested in the adaptation processes of species to climate change with a view to establishing conservation programmes. Different ecosystems are studied by three research teams. The first team focuses on the mechanisms of adaptation in response to environmental variables. The second team is studying the impact of land use changes due to increased agricultural needs on the demography and spatial distribution of vertebrates. Finally, the last team is interested in the impact of climate change on marine mammal and bird populations, particularly in the polar regions. Since 2014, this "Marine Predators" research team has been working together with the PELAGIS observatory, so that the data collected by the observatory can be integrated into international management plans for marine biodiversity.

Pelagis observatory (UMS 3562) is a joint unit of the CNRS and La Rochelle University, in partnership with the Ministry of Ecology. Specialized in marine mammals and birds monitoring, PELAGIS play an crucial role for biodiversity conservation. Indeed, PELAGIS is responsible for the demographic monitoring of marine mammals and birds in French waters and is in charge of the National Stranding Network. The presence of numerous correspondents throughout the coastline allows rigorous monitoring of strandings. Observation campaigns at sea, whether visual, acoustic or telemetric, provides information on the abundance and distribution of animals. This monitoring is essential for assessing conservation objectives, particularly for species on the IUCN red lists. General health of marine mammals and birds populations are highly dependant of the lower trophic levels they rely on, as main source of food and energy. In this context, PELAGIS, in collaboration with Ifremer's campains, are involved in projects to assess health of these lower trophic levels.

In particular, the SUMMER (Sustainable Management of MEsolpelagic Ressources) aims to increase the knowledge of mesopelagic ecosystems and to contribute to the preservation of process regulating climate and to the mitigation of impacts of climate change. Many partners, including the University of La Rochelle and Ifremer, are thus working together to know more about the currently unknown mesopelagic communities. Main objectives are to evaluate whether and how mesopelagic resources can be exploited, while quantifying and preserving the ecosystem services the mesopelagic community provide.

## **2 Literature review**

### **2.1 Structure and dynamics of ecosystems: how can species coexist in same environment?**

Of all the questions raised when it comes to study Nature, the most common yet complex one is “how do organisms and environment interact with each other?” (Sutherland *et al.* 2013). In other words, what are the processes and rules that define structure and functioning of ecosystems? Taken as a whole, an ecosystem can be seen as a giant network: all individuals from every species are linked to one another through intra- and inter-specific relationships, that implies competition, parasitism, predation...; and each individual is linked to its physical environment, on which it depends for food prospection, shelter and/or favorable conditions for breeding. The main purpose of ecology is to study those links and ultimately, to be able to map the central relationships and flows that are keys to maintain stable ecosystems (Albouy *et al.* 2011). Community ecologists, regardless of the ecosystem they are studying, try to answer some fairly similar questions such as “how do species share environmental resources?” or “how can species relying on the same resource to thrive and survive can coexist?”. Indeed, the mere observation that species can live and develop a population without encroaching each other suggests that, even if species compete to access the same resources, the use of resources is balanced and allows stable relationships between species to develop. Most of all, if species depend on the same resources to survive, how can diversity within an ecosystem last over time?

### **2.2 Concepts and definition for studying ecosystems’ dynamic.**

To answer those questions, the structure and dynamic of ecosystems need to be investigated and ecological concepts must be defined.

First, a “community” is made up of all living organisms (all species combined), which interact and occupy a specific habitat. Within this habitat, the concept of “ecological niche” reflects the fact that distinct populations use differently space and trophic resources to meet their needs. In 1917, Grinnell was the first to scientifically as “ecological niche” all the requirements that a species needs to thrive (Grinnell 1917). This concept covers both biotic (food abundance and availability, competition within and among species, predation-prey relationships ...) and abiotic conditions (environmental factors such as temperature or pressure, shelter availability ...), and it shapes the areas suited for species according to their needs.

This definition is refined by Hutchinson (1957): resources and their availability are the main drivers for the coexistence of species, since resources are essential for species to thrive and are therefore considered limiting factors. Furthermore, Hutchinson’s definition distinguishes the concepts of (i) “fundamental niche”, which is a potential niche for a given species that offers all the optimal conditions for that species to flourish and (ii) “realized niche”, which corresponds to the actual resources used by a species and which is often smaller than the fundamental niche,

mainly because of competition between species. If resources are limited, competition between species that seek to simultaneously exploit the same resources may arise, either because they hunt the same prey or because they live in the same specific habitat and are therefore more likely to meet (Blondel & Bourlière 1979). When the resources are abundant enough, species may be able to share it without entering competition (Nagelkerke *et al.* 2018).

According to competition theory, community structures are defined by the way species are able to share or not resources. Therefore, to study the structure and dynamics of community and to identify the main factors that enable species to coexist, it is essential to determine the degree by which species share resources, in other words, quantify the overlap between ecological niches (Geange *et al.* 2011).

## 2.3 Tools to study diversity in ecosystems and their limits

Niche overlap can be approached from the habitat (beta overlap) or food (alpha overlap) perspective (Mouillot *et al.* 2005). In both cases, a high degree of overlap means that the species are likely to compete for the same resources making their coexistence virtually impossible. Conversely, a low degree of overlap tends to suggest that species, even if they rely in part on the same resources, have a sufficiently wide range of accessible resources not to compete with each other (Mouillot *et al.* 2005). No overlap means that species occupy distinct niches, are likely to use very different resources and that no competition is expected (Figure 1). This approach has been widely developed over the last decades to study the distribution of abundance and the mechanisms favoring species coexistence, in particular to predict the impact of disturbances, such as the introduction of invasive species or climate change (Albouy *et al.* 2011; Geange *et al.* 2011; Martini *et al.* 2020).

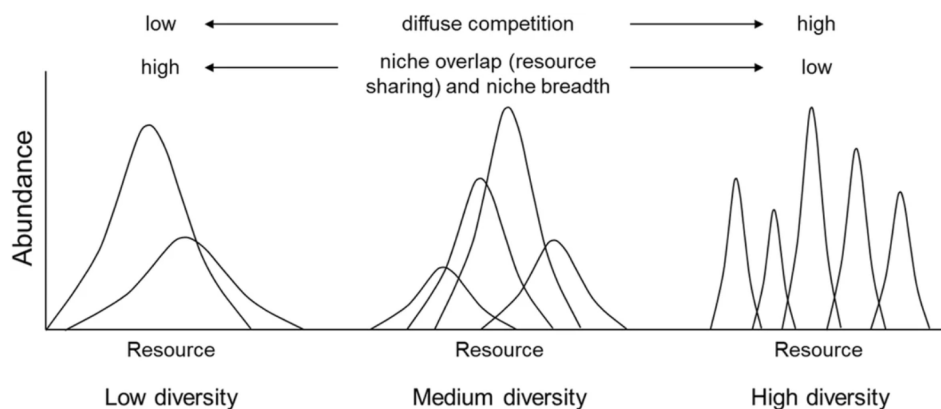


Figure 1: Characteristics of niches along a resource gradient at different levels of species diversity, from Kim & Ohr (2020).

To quantify niche overlap, several indices have been developed since the 60's. Indices and threshold values are commonly used for studying specific, taxonomic or phylogenetic diversity.

However, used alone, a result of diversity estimation through any index is usually poor and inaccurate, because complex and rich systems can not be described only by the result of a computation (Mejri 2009). Indeed, four of the best-known niche overlap indices, which are based on the intensity of utilisation of a resource use by species, were compared by Linton *et al.* (1981) to assess the precision and accuracy: Morisita (1959) updated by Horn (1966), Schoener (1968) and Pianka (1973). Even if they lead to the same general conclusions, these four indices often give different results, because they use different computation parameters (Blondel & Bourlière 1979). Moreover, they are often highly sensitive to sample size, which adds uncertainty when it comes to interpreting their values (Linton *et al.* 1981). Finally, Grossman (2009) points out that threshold values for those indices can be considered as arbitrary and might differ from one ecosystem to another, leading to an impossibility of comparing them. For all these reasons, using those indices to estimate if species share or not the same resources, and if so, how much is shared, does not seem relevant (Mouillot *et al.* 2005). As such, they provide a qualitative assessment of the overlap rather than a quantitative one (Linton *et al.* 1981).

Therefore, to understand how the structure and the dynamics of an ecosystem are defined and how such complex relationships can last for several generations, numerical models are often used (see Ecopath models, <https://ecopath.org>). This approach requires a simplification of the ecosystem, because simulating very complex models make the outcome virtually impossible to compute (Albouy *et al.* 2011). Simplifying an ecosystem can be done in many ways: focusing on specific compartments of the ecosystem (*e.g.*: pelagic or benthic fauna), grouping species based on their trophic level, or taxonomy or similaire behavior ... Obviously, simplifying with any of these methods comes down to approximating the relationships and much of the complexity of an ecosystem, but if done properly, models are still able to produce reliable simulations of what is going on in real life (Albouy *et al.* 2011; Evans 2012; Piroddi *et al.* 2015). Yet, the main difficulty is to determine the criteria that are relevant to gather species and to simplify models. Whether they are too restrictive, or not enough, these criteria condition not only the accuracy of the model, but also its ability to be generalized (Moon *et al.* 2017; Pease *et al.* 2015; Pont *et al.* 2006). For instance, if a model uses a taxonomic grouping of species, it will only be suited to study other ecosystems that contain the same set of species or taxonomic groups. Its transposition to other unrelated ecosystems will thus be limited, if not impossible (Moon *et al.* 2017). In the end, this modeling approach imposes a specific model for each ecosystem, which is highly time consuming and limits the possibilities of comparisons between ecosystems (Martini *et al.* 2020; McGill *et al.* 2006). Therefore, this approach remains very specific to a studied ecosystem and the species that compose it.



## 2.4 Emergence of a more global approach based on functional traits.

### 2.4.1 General overview

Community ecology aim to establish general rules explaining the functioning of communities. Species-centred approaches only provide information for a few specific systems but not general principles, that can be applied to a wide variety of communities or ecosystems (Albouy *et al.* 2011; Martini *et al.* 2020). Therefore, ecologists had to find a way to study ecosystems, to (i) give clues of how species interacts with each other and (ii) to assess how strongly species are related to their environment. Indeed, some scientists emphasized the urge to get rid of methods that were highly dependent of species, time or space, such as the ones described previously, and to use a more predictable and quantitative science that could play a major role in assessing global changes issues (Brind'Amour *et al.* 2011; McGill *et al.* 2006; Olden & Jackson 2002). To this extend, McGill *et al.* (2006) define a **trait** as a “well-defined, measurable property of organisms, usually measured at the individual level and used comparatively across species” and suggest that community ecology should try to understand how these traits interact with fundamental niches to define realized niches.

The notion of “trait” has been widely used in the literature, but with slightly different meanings. For instance, Violle *et al.* (2007) defined a trait as “any morphological, physiological or phenological feature measurable at the individual level, from cell to whole organism”. To ensure a consistent approach to community ecology studies, Martini *et al.* (2020) suggests that the definition of Violle *et al.* (2007) is precise enough, that it should serve as a reference and therefore should be used systematically. Yet, not all measurable traits provide the same information: for ecologists, traits that inform about (i) the interactions between species and the environment and (ii) the fitness of individuals are the most valuables (Kremer *et al.* 2017). These specific traits are defined as “functional traits” and can relate to behavior, life history, morphology or physiology, influencing the general performances of organisms Martini *et al.* (2020); McGill *et al.* (2006). They provide information on the main functions of organisms, such as acquisition of food or locomotion (Mejri 2009).

### 2.4.2 Improvement of the method over the years

The functional-traits approach was first developed in studies based on terrestrial plants. They showed that the morphology of species was correlated with their environment and that changes in their habitat could lead to changes of their morphology because this approach relies on the plasticity of traits (Boissezon 2014; Lavorel *et al.* 1997; Martini *et al.* 2020). Applied to aquatic animals, structure-function relationship has been well documented since the 1970s (Gosline 1971; Lagler *et al.* 1977; Webb 1984) and approaches based on morphological traits seemed suitable to compare species (Norton 1995) or to explore niches and compare communities (Wine-miller 1991). For instance, Albouy *et al.* (2011) developped a model to determine the diet of any marine species based on morphological traits, and thus establish trophic guilds.

While the flexibility and intrinsic variability of species should not be ignored, it can be hard to predict (Diderich 2006; Martini *et al.* 2020). It is therefore essential to identify and select relevant traits, that can be used to explain most interactions between species and their environment. This is one of the main challenges of the functional traits approach, because the selected traits must be sufficiently variable between the levels being compared (species, populations, individuals ...), and the observed variations must explain the actual differences in fitness or coexistence of species (Kremer *et al.* 2017).

Yet, the flexibility in traits is what makes this approach so useful, as it allows for the quantification of intraspecific variability (especially when the environmental conditions change Martini *et al.* (2020)) and interspecific variability that explains the interactions between species and their environment. In a nutshell, the traits to be used for functional trait approach must offer the best compromise between being (i) sufficiently informative with respect to the objectives, (ii) generic enough to be comparable across species — even if they are very different morphologically — and (iii) easily measurable to ensure repeatability between studies (Dumay *et al.* 2004; Kremer *et al.* 2017).

## 2.5 The advent of functional diversity

The functional approach is relatively recent. It developed in the 1980s with the collapse of populations, species extinctions and the biodiversity crisis (Wilson *et al.* 1988). The functions performed by species began to be studied in greater depth when ecologists noticed that if a species disappeared from an ecosystem, it did not necessarily mean that the whole ecosystem was disturbed or even collapsed (Mejri 2009). The question “Are all species essential for the proper functioning of ecosystems?” became central, as did the need to define the role of species within ecosystems. In other words, can we consider that species are “redundant” if they play the same role, fulfill the same function, in an ecosystem? To answer these questions, the functional trait approach seems relevant because it provides information on the roles of species in their environment, which is complementary to those provided by classical diversity indices, such as specific diversity, richness distribution or evenness (Marcon 2015; Mejri 2009).

More importantly, functional traits and species role attribution are crucial in determining functional diversity, which is the primary factor explaining stability and productivity, and should therefore be preferred to specific or taxonomic diversity when studying community ecology (Dumay *et al.* 2004; Mejri 2009). In fact, the resilience and health of ecosystems depends much more on the range of functions and functional traits exhibited by species than on the number of species *per se* (i.e. species richness). Indeed, indices of specific abundance and diversity assume that all species are equivalent, and do not take into account the functions provided by these species (Mejri 2009). From this functional perspective, the richness of an ecosystem is determined by the extent of functional diversity provided by the species (Rocklin 2004).

To estimate functional diversity, species must first be classified into “functional groups”, which reflects the similarities of species according to 3 criteria. Within a functional group, species must (i) share the same habitat and trophic level (Brind’Amour *et al.* 2016), (ii) play a similar role in the habitat, through the functions they provide (Dumay *et al.* 2004; Mejri 2009), and (iii) display similar responses to changing environmental pressures (Brind’Amour *et al.* 2016; Dumay *et al.* 2004; Mejri 2009).

To form these groups and to evaluate the response of species for each of these 3 items, morphological traits are often used, because they reflect the capacities as well as their modes of interaction with their environment. They can therefore be used as indicators of trophic networks or habitats (Brind’Amour *et al.* 2016). Indeed, according to the “niche filtering hypothesis”, which considers habitat characteristics as filters, only species that with adapted traits can thrive in a specific set of environmental conditions (Brind’Amour *et al.* 2011; Zobel 1997). This assumption also means that species, if they share similar functional traits, must use the same resources, probably in the same way, and thus have overlapping niches. Conversely, if species have very different functional traits from each other, they probably use resources in very different ways, or even distinct resources. Quantifying the overlap between species is key to understand their coexistence or exclusion (Costa-Pereira *et al.* 2019).

### **2.5.1 Benefits of this approach**

Species in a same functional group can be considered “functionally equivalent”, with similar or interchangeable functions. The ecosystem in which they occur then has “functional redundancy”, which reduces the risk of a functional loss in the event of ecosystem disturbance. Conversely, a species can also be the only representative of a functional group (qualified as a “monospecific group”). It is then considered “essential”, because if it disappears, the functions it provides will also disappear, causing a major disturbance of the ecosystem and other essential functions (Mejri 2009).

For conservation issues and the prediction of climate change impacts on ecosystems and biodiversity, the functional approach and the study of niche overlap seem relevant, as these tools provide a quantitative estimate of the resilience and/or resistance to change of communities and ecosystems. At a specific level, knowing which species have the most specialised diet or which are the species are essential, from a functional perspective, are really useful to target species that needs to be protected in conservation plans (Cooke *et al.* 2020; Mejri 2009; Norton 1995). In addition, those tools can also be used to predict changes in diet niche for species in competition, if one of the abundances is affected by fishing pressure (Diderich 2006) or if an invasive species colonizes the environment (Albouy *et al.* 2011; Geange *et al.* 2011; Nagelkerke *et al.* 2018). As these approaches are not based on species or taxonomy, they are better suited to the generalization and identification of the ecosystem services provided (Martini *et al.* 2020; McGill *et al.* 2006) and the relationships involved in stable coexistence of species (Albouy *et al.* 2011). They thus improve our ability to predict ecological dynamics and their fluctuations, in

an environment facing strong anthropic influence (Kremer *et al.* 2017).

### 3 Introduction

The deep ocean is the largest marine habitat of Earth, and represents 95% of ocean's volume (Danovaro *et al.* 2017; Salazar *et al.* 2016; Webb *et al.* 2010). From a biology perspective, deep-sea encompasses everything beneath euphotic (or epipelagic) zone, where the solar radiations are too low and precludes photosynthesis (Baker *et al.* 2020; Danovaro *et al.* 2017; Salazar *et al.* 2016) (Figure 2). Between 200 to 1000m deep (mesopelagic zone), light fades and temperature decreases, because solar luminance is absorbed exponentially in upper sea layers (Reynolds & Lutz 2001). From 1000 to 4000m deep (bathypelagic zone), no sunlight remains and the habitat is pitch-black; salinity and temperature are stable (between -1.8 to 2°C), and pressure keeps on increasing by 1 atm every 10m (Danovaro *et al.* 2017).

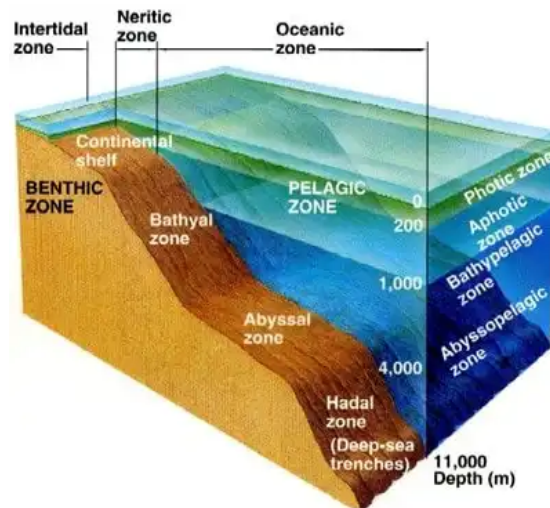


Figure 2: Sea layers along depth, from The MarineBio Conservation Society (<https://www.marinebio.org/oceans/deep-sea/>).

Despite these extreme conditions, deep-sea is far from being lifeless. In fact, deep-sea is considered to be the largest biome of the Earth, and contains 70% of ocean's microbial cells and 60% of its heterotrophic activity, playing a crucial role in biogeochemical cycles (Salazar *et al.* 2016). Studies from Grassle & Maciolek (1992); Parkes *et al.* (1994); Todo *et al.* (2005) shown that life could be found everywhere in the deep-sea, with remarkably high and stable diversity. Moreover, these very particular conditions have resulted in a high specialization of the inhabiting fauna, with species that are absent from shallower waters (García-Seoane *et al.* 2021). With first studies launched in the 60's, less than 0.0001% of the area has been investigated so far and this habitat remains understudied (Danovaro *et al.* 2017; Richards *et al.* 2019). Thus, deep-sea remains the most unknown biome of the planet with estimated 10 million species that

are yet to discover (Danovaro *et al.* 2017; Grassle & Maciolek 1992). In particular, data are lacking to evaluate the impact of climate change on the biodiversity of the largest reservoir of biomass, mainly because exploring deep-sea is difficult and requires specific tools, such as rovers (Danovaro *et al.* 2008; Danovaro 2014). Firstly, deep-sea were regarded as a ore reservoir of its soil, where manganese and other metal deposits could be found and extracted, or even as a dumping site for nuclear wastes (Baker *et al.* 2020; Gillet 2013; Halfar & Fujita 2002). But since past decades, capacity of exploration of the deep-sea expanded spectacularly, allowing to discover more about the deep-sea ecosystems (Danovaro 2014).

In particular, continental margins, which separates continental shelf from abyssal plains are investigated, because their heterogeneous topography implies varied habitats and hydrodynamics, with impacts on the whole food webs (Danovaro *et al.* 2009; Fernandez-Arcaya *et al.* 2017). Along continental margins, deep-sea canyons, that incises the edges of continental shelf, appears to be “biodiversity hotspots” for pelagic life, in terms of diversity and abundance (Aïssi *et al.* 2012; Danovaro *et al.* 2009; Gillet 2013; Robertson *et al.* 2020). Canyons are also reported having a high level of endemism (Danovaro *et al.* 2009, 2017).

Because they have a crucial role in transferring organic matter and sediments from rich and productive shallow shelf to the low-nutrients deep-sea, canyons constitute peculiar habitats, with evidences of an important biomass and diversity inside and around them (Canals *et al.* 2006; Danovaro *et al.* 2009; De Leo 2012; Sion *et al.* 2019; Stefanescu *et al.* 1994). Indeed, canyons have higher nutrients concentrations than in adjacent areas, due to down-welling currents creating a funnel-effect (Fernandez-Arcaya *et al.* 2017). Thus, primary production is enhanced, and makes canyons favorable habitats for filters and suspension feeders (Fernandez-Arcaya *et al.* 2017; Sion *et al.* 2019), but also for low to medium trophic levels organisms, such as euphausiids, shrimps, squids and meso- and bathypelagic fishes (Aïssi *et al.* 2012; Gaskett *et al.* 2001; Pusch *et al.* 2004). Abundance of nutrients and preys attracts top predators (cetacean, sharks, large pelagic), some of them being only encountered in these habitats (Aïssi *et al.* 2012). Finally, canyons provides many ecological services and play a role in sustaining deep-sea food webs through the transport of nutrients, providing habitat for nursery and refuges (Fernandez-Arcaya *et al.* 2017). Company *et al.* (2008) suggests that by these services, canyons enhance recruitment of commercialized species, and thus, may mitigate the effect of their overexploitation. Therefore, canyons can be described as “keystone structures”, as an interface between productive continental shelf and deep-sea, with evidence of their benefits and supports for fisheries (Company *et al.* 2012; Fernandez-Arcaya *et al.* 2017).

Meso- and bathypelagic fishes are found abundantly in every ocean, except Arctic, and are the dominant zooplankton consumers in most oceans, playing a key role in trophic networks (Davison *et al.* 2015; Salvanes & Kristoffersen 2009). Living between 200-1000m (mesopelagic) and over 1000m (bathypelagic) deep, these deep-sea fishes displays very high biomass, estimated to be around ten billion tonnes in total (García-Seoane *et al.* 2021; Gjoesaeter & Kawaguchi 1980; Richards *et al.* 2019). Though, abundance of these fishes varies along depth and daytime,

because most of them perform vertical diel migration to feed on shallower depth during night, and abundance's estimation can be biased by sampling time (Catul *et al.* 2011; Gaskett *et al.* 2001; García-Seoane *et al.* 2021; Pusch *et al.* 2004; Salvanes & Kristoffersen 2009). Performing migrations, meso- and bathypelagic fishes ensure biogeochemical cycling through respiration and excretion but also when predated by carnivorous (García-Seoane *et al.* 2021; Spitz *et al.* 2019). Because of their ubiquity, their biomass and the high efficiency of energy transfer from phytoplankton (respiring 10% of the primary production), meso- and bathypelagic fish play an important part of the biological pump (García-Seoane *et al.* 2021; Spitz *et al.* 2019).

Meso- and bathypelagic fish can show adaptations to their environment such as highly sensitive eyes, dark body and ventral light organs (photophores) to match their low-light habitat and reduced metabolic rates to lower oxygen consumption in poorly oxygenated waters (Salvanes & Kristoffersen 2009; Farré *et al.* 2016). Photophores have a role in camouflage, foraging, courtship behavior, with different patterns between males and females. They are also species specific which helps identification (Paitio *et al.* 2020; Salvanes & Kristoffersen 2009). Finally, depth and associated pressure play a role in the morphology of deep-sea fishes, which tend to have more elongated body with increasing depth, while manifesting an enlargement of the anterior body that increase gill surface and the ability to capture oxygen (Farré *et al.* 2016). Most of the life history traits of meso- and bathypelagic fish remains unknown and needs to be further investigated, with relatively poor and non consistent literature (Childress *et al.* 1980; Salvanes & Kristoffersen 2009). The mesopelagic communities are dominated by Myctophidae family, in terms of abundance, diversity and biomass, and represents at least 20% of the whole oceanic ichthyofauna (Catul *et al.* 2011; Kozlov 1995; Pusch *et al.* 2004).

Several studies focused on exploring deep-sea fish diversity near seamounts, mid-ocean ridges or in abyssal depths (Cook *et al.* 2013; Sutton *et al.* 2013), but very little is known about meso- and bathypelagic species inhabiting deep-sea canyons (Kenchington *et al.* 2020). Nevertheless, given the essential role of the oceanic pelagic fish community in food webs, linking the epipelagic organic matter to top predators, requires a better knowledge of species constituting this fundamental compartment (Davison *et al.* 2015; Gaskett *et al.* 2001). Furthermore, considering how important canyons are for fisheries and carbon sequestration, knowing more about the communities inhabiting them is crucial to ensure sustainability of ecosystems and provided services, through marine management and conservation (Fernandez-Arcaya *et al.* 2017; van den Beld *et al.* 2017b).

Located in the temperate North-east Atlantic Ocean, the Bay of Biscay's continental shelf is highly productive, with nearly 700 fish species and 35% of the world total marine mammals identified in this region (Borja *et al.* 2019). This productivity relies on heavy rivers discharge and strong influence of eastward winds, tides and eddies (Borja *et al.* 2019; Akpınar *et al.* 2020). Thus, plankton, benthic and pelagic communities have been widely studied for several decades, with some fish communities being annually monitored (Borja *et al.* 2019; Doray *et al.* 2018). Conversely, there is little knowledge on canyon, abyssal and bathyal communities in this area

(Borja *et al.* 2019). The continental slope of the Bay of Biscay divides in two the of France's Atlantic EEZ (Exclusive Economic Zone) and is incised by about 135 canyons (Bourillet *et al.* 2006; Spitz *et al.* 2019; van den Beld *et al.* 2017a) (Figure 3). If proven to be rich in cold-water coral reefs, the largest part of the area remains poorly explored, especially deep-pelagic communities (García-Seoane *et al.* 2021; van den Beld *et al.* 2017b; Webb *et al.* 2010). In consequence, the similarity or differences within species inhabiting these ecosystems are unknown (Kenchington *et al.* 2020).

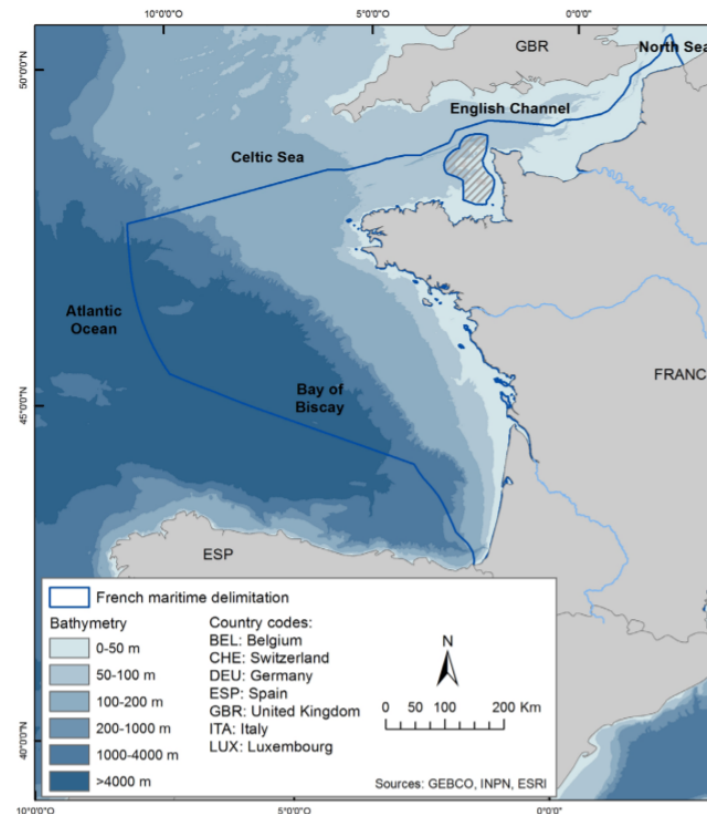


Figure 3: Location of the studied area, from (Béarez *et al.* 2017).

One way to characterize an ecosystem is to look at the factors that control biodiversity patterns and to identify the key functions provided by this ecosystem (Aneesh Kumar *et al.* 2017; Brind'Amour *et al.* 2011; Farré *et al.* 2016). Functional diversity, which is the value and range of functional traits displayed by the organisms of a given ecosystem, can inform on ecosystems functioning and about their resilience facing a change in the environment (Dumay *et al.* 2004; Martini *et al.* 2020). Moreover, the use of functional traits to characterize functional niches of species highlights some competition or adaptation processes within a community of an ecosystem (Aneesh Kumar *et al.* 2017). Indeed, comparison of functional niches is an effective way of assessing ecological similarity of species, based on the way they share, or not, certain morphological, behavioral or physiological characteristics (Aneesh Kumar *et al.* 2017; Farré *et al.* 2016; Winemiller 1991).

This approach seems particularly well suited to study fish communities, because morphological traits are considered being good indicators of ecological habits of species, indicating how species use available resources (Farré *et al.* 2016; Winemiller 1991). Successfully applied for freshwater ecosystems and marine coastal environments, this approach has not been much used on deep-sea communities where functional traits shaping ecological niches remains mostly unknown (Aneesh Kumar *et al.* 2017; Farré *et al.* 2016). Conditions become more extreme and the food availability decreases with depth, so deep-sea are often thought to be poor in terms of functional diversity (Aneesh Kumar *et al.* 2017; Mason *et al.* 2008; Novotny 2018). This would mean that most (if not all) deep-sea species are generalists, and suggests that competition is highly probable to access the little food available .

Because species displaying the same functional niche can be considered as part of the same functional group, our hypothesis is that species occupying similar functional niches insure redundant function within an ecosystem and be in competition, whereas species displaying very different functional niches would be segregated. Hence, the aim of this work is to assess functional diversity of deep-sea canyons fish of the Bay of Biscay, which, for the moment, is barely known (Kenchington *et al.* 2020). Using functional traits to assess functional niches of species, our main objectives are (i) to characterize functional diversity of most-abundant canyon species, (ii) to measure the range and degree of overlap of functional niches and (iii) to identify the traits that structure the most these communities.

## 4 Materials & Methods

### 4.1 Sampling and specimens

Fishes were collected during Ifremer's EVHOE (EValuation Halieutique de l'Ouest Européen) research cruises, surveying the Bay of Biscay every fall onboard the *R/V Thalassa*. Several hauls are regularly performed at night to investigate pelagic deep fauna. Each station is precisely defined with its GPS coordinates and located above canyons, at the edge of the continental shelf. Pelagic trawling is performed at night, between 700 and 2000 meters, because those fishes perform diel vertical migrations and tend to come closer to the surface at nighttime. To this end, a 25 meters-wide opening trawl is used, with a mesh size decreasing from 76mm to 48mm at the end of the trawl. The trawl-haul duration was 1 hour at 4 kn. Once the trawl is pulled back onboard, fishes are sorted, identified up to the species level, and frozen at -20°C. Eleven of the most abundant species in the Bay of Biscay (all teleosts) have been selected for this study. Four of them belong to the Myctophid family (lanternfish), which is the most abundant and widespread family across all oceans (de Busserolles *et al.* 2014) and could represent up to 65% of the pelagic deep-sea biomass (Poulsen *et al.* 2013): *Lampanyctus crocodilus*, *Myctophum punctatum*, *Notoscopelus kroeyeri* and *Ceratoscopelus maderensis*. The second most represented family is the Platytroctidae with two species: *Searsia koefoedi* & *Normichthys operosus*. This family seems



to be found in all oceans but not in the Mediterranean Sea (Orrell & Hartel 2016). Finally, five families are represented by one species each: *Xenodermichthys copei* (Alepocephalidae), *Arctozenus risso* (Paralepididae), *Argyropelecus olfersii* (Sternoptychidae - Hatchetfishes), *Serrivomer beanii* (Serrivomeridae) and *Stomias boa* (Stomiidae) which are common species, found abundantly in every ocean (Carvalho & Almeida 1988; Froese & Pauly 2019; Geidner 2008; Germain *et al.* 2019). See A.1 for a phylogenetic tree of these species.

## 4.2 Morphological measurements and functional traits

In the laboratory, the fish were thawed and 24 morphological variables were measured, using an electronic caliper with a precision of 0.01mm. Some of these measurements had previously been recorded by students from La Rochelle University during practical classes in 2018 ( $n = 99$ ), 2019 ( $n = 45$ ), 2020 ( $n = 9$ ) and the rest during this study ( $n = 212$ ). For the sake of statistical robustness and representativity, at least 25 individuals were measured for each species (Table 1).

Table 1: Number of individuals measured for each species ( $n_1$ : previous studies,  $n_2$ : this study,  $n_{Tot}$ :  $n_1 + n_2$ ), with their mean standard size and range values in millimeters.

| Species                          | $n_1$ | $n_2$ | $n_{Tot}$ | Mean length<br>(mm) | Size range<br>(mm) |
|----------------------------------|-------|-------|-----------|---------------------|--------------------|
| <i>Lampanyctus crocodilus</i>    | 39    |       | 39        | 107.60              | 73.3 - 146.5       |
| <i>Xenodermichthys copei</i>     | 38    |       | 38        | 109.68              | 82.3 - 132         |
| <i>Normichthys operosus</i>      |       | 38    | 38        | 104.69              | 75.64 - 131.62     |
| <i>Argyropelecus olfersii</i>    | 37    |       | 37        | 56.55               | 32.16 - 89.07      |
| <i>Notoscopelus kroyeri</i>      | 6     | 30    | 36        | 76.30               | 52.63 - 130.84     |
| <i>Searsia koefoedi</i>          | 5     | 31    | 36        | 119.94              | 84.8 - 142.75      |
| <i>Arctozenus risso</i>          | 20    | 10    | 30        | 158.36              | 117.6 - 181.31     |
| <i>Serrivomer beanii</i>         |       | 30    | 30        | 546.17              | 373 - 879          |
| <i>Ceratoscopelus maderensis</i> |       | 30    | 30        | 62.72               | 53.29 - 78.95      |
| <i>Stomias boa</i>               |       | 26    | 26        | 239.00              | 144 - 311          |
| <i>Myctophum punctatum</i>       | 8     | 17    | 25        | 65.48               | 52.53 - 80.14      |

21 functional traits were calculated for each individual from the morphological measurements. They inform on 3 main functions: food acquisition, locomotion and habitat (Table 2).

## 4.3 Data analysis

All data analyses were performed using R version 4.0.3 (R Core Team 2021).

### 4.3.1 Data pre-processing

Because measurements came from several observers, raw data had to be checked for outliers. To do so, all values (except the standard length  $s_l$ ) were standardized by  $s_l$  and the interquartile range (IQR) method of outlier detection was applied to remove outliers. According to this

Table 2: Description and formulas of the functionals traits computed from morphological measurements, following (Albouy *et al.* 2011; Aneesh Kumar *et al.* 2017; Boyle & Horn 2006; Brind’Amour *et al.* 2016; Diderich 2006; Dumay *et al.* 2004; Habib *et al.* 2019; Ibañez *et al.* 2007; Sibbing & Nagelkerke 2000; Webb 1984; Winemiller 1991). Abbreviations used in formulas are provided by raw measurements and detailed in appendices A.2, A.3 & A.4. oga, git, pc, pht are categorical variables directly provided by raw measurements with the first two scores detailed respectively in appendices A.5 & A.6.

| Function          | Functional trait       | Description  | Formula       |
|-------------------|------------------------|--|---------------|
| <b>Feeding</b>    | Oral gape axis         | Feeding position and depth in the water column                             | oga           |
|                   | Eye size               | Detection of preys and visual acuity for predators                         | ed/hd         |
|                   | Orbital length         | Preys size and behavior (buried, camouflaged)                              | ed/sl         |
|                   | Oral gape surface      | Type and size of preys   | mw*md / bw*bd |
|                   | Oral gape shape        | Strategy to capture prey   | md/mw         |
|                   | Oral gape position     | Fedding position in the water column                                       | mo/hd         |
|                   | Lower jaw length       | Compromise between power and opening speed of the mouth                    | ljl/sl        |
|                   | Gill raker type        | Filtration capacities of fish  | git           |
|                   | Gill outflow           | Succion capacities of fish   | ow            |
|                   | Head length            | Maximum prey size  | hl/sl         |
| <b>Locomotion</b> | Pyloric caeca          | Presence/Absence of pyloric caeca  | pc            |
|                   | Anus position          | Digestive tract length   | pal/sl        |
|                   | Body depth             | Swimming capacities of fish linked to their food prospection behavior      | bd/sl         |
|                   | Pectoral fin position  | Maneuvrability of fish   | pfi/pfb       |
|                   | Pectoral fin insertion | Maneuvrability of fish   | ppl/sl        |
|                   | Transversal shape      | Position in the water column and hydrodynamism                             | bd/bw         |
|                   | Caudal throttle width  | Swimming strategy (cruiser/sprinter) and endurance                         | cpd           |
|                   | Dorsal fin insertion   | Swimming type and behavior   | pdl/sl        |
|                   | Eye position           | Position in the water column (pelagic/sedentary)                           | eh/hd         |
|                   | Presence photophores   | Presence/Absence of photophores (camouflage, foraging, courtship behavior) | pht           |
| <b>Habitat</b>    | Operculum volume       | Filtering capacity and oxygen captation                                    | od/ow         |

method, for each measurement and species, outliers are defined as every value outside this interval:

$$[Q1 - 1.5 \times IQR, Q3 + 1.5 \times IQR]$$

with  $Q1$  and  $Q3$  being respectively the first and third quartile, and  $IQR = Q3 - Q1$ .

Missing values initially present in the dataset ( $n = 52$ ) and induced by the outlier removal function ( $n = 307$ ), were then imputed using the  $k$ -Nearest Neighbor (kNN) algorithm. Suppose that the individual  $i$  has a missing value  $X_i$  for the variable  $X$ . The algorithm identifies the  $k$  nearest neighbors of  $i$  based on all available variables (*i.e.* all variables but  $X$ ). The values of  $X$  observed in the  $k$  nearest neighbors of  $i$  are then used to infer  $X_i$  using Euclidean distances between  $i$  and its  $k$  nearest neighbors. The computations were performed by the `step_knnimpute()` function from the `tidymodels` R package (Kuhn & Wickham 2020), with a number of nearest neighbors of  $k = \sqrt{N}$ , with  $N$  being the number of individuals for each species. The accuracy of the imputation was then checked with a linear regression of each variable with respect to `sl`. From this cleaned dataset, the functional traits were computed using formulas in Table 2.

#### 4.3.2 Factorial Analysis of Mixed Data (FAMD)

To assess the similarities or differences of traits in species, a Factor Analysis of Mixed Data (FAMD) was performed using the `FactoMineR` package. This type of multivariate analysis is suited for datasets containing a mix of qualitative and quantitative variables. It performs a Principal Component Analysis (PCA) on quantitative variables and a Multiple Correspondence Analysis (MCA) on qualitative variables. The results of an FAMD are interpreted in the same way as those of a PCA: both methods are used to assess (i) similarities and differences among individuals and (ii) to check for associations between variables. Because *Serrivomer beanii* does not have pectoral nor pelvic fins, and because this analysis can not handle missing values, zero values were attributed for PFB, PFI, PPL and PVL. Because of this specific particularity, complementary analysis was run. First, the same FAMD analysis was run without *S. beanii*, to assess the discrimination between all remaining species. Then, the analysis was run with all species (including *S. beanii*) but without the traits missing for *S. beanii* (*i.e.* PFB, PFI, PPL and PVL), to verify that the observed differences were not exclusively dependants on these traits. The categorical variables were managed as follow: scores were used for both oral gape axis and gill raker type (Figures A.6 and A.5), whereas pyloric caeca and photophores were binary defined (0 = absent, 1 = present). For each principal component (PC), all traits that have a contribution greater than or equal to a threshold  $t$  are considered relevant (with  $t = 100/\text{number of variables}$ ). Here, 21 functional traits were computed, meaning that  $t \approx 4.8$ . On the resulting FAMD graph, we added 95% confidence interval ellipses representing the functional niche of each species. These ellipses assume a multinormal distribution of the functional traits.

## 4.4 Functional niche analysis

The coordinates of individuals projected on the FAMD axes were used to compute (i) the surface of the functional niche of each species, and the overlap of niches for all possible pairs of species. This analysis was only run on the first two factorial axes (PCs), because they are the ones carrying most of the information about the community's structure. The method used here is similar to isotopic niche analysis, which is much more documented. We used the SIBER package (Stable Isotope Bayesian Ellipses in R) and adapted it to our purpose (Jackson *et al.* 2011). For each species the ellipse surface was computed, and the overlap of ellipses between all pairs of species was assessed with the `maxLikeOverlap()` function. Absolute niche surfaces were then standardized by the smallest niche, to facilitate the comparison of relative differences in niche sizes. The relative overlap was assessed as the ratio of the overlap value to the size of the niche, for each species of each pair. Finally, the total overlap for a pair of species was determined by dividing the overlap value by the sum of the area of the niches of the two species. In order to assess the sensitivity of the method to insufficient sample size, niche surfaces were also computed for various sample sizes ( $n$ ) following a bootstrap procedure. To this end, between 100 to 10 000 individuals from our dataset were sampled at random, and area of all niche's was recalculated 10 000 times.

Functional niches were further investigated using the `funrar` R package, to compute functional rarity (Matthias Grenié *et al.* 2017). Based on indices characterizing the rarity of functions within a system (Violle *et al.* 2017), the aim is to assess the local functional diversity of the traits in our dataset. First a distance matrix is computed using Gower's distance as it can deal with both quantitatives and qualitatives variables (Brind'Amour *et al.* 2016; Matthias Grenié *et al.* 2017). Then, the `distinctiveness_global()` function is applied to measure how functionnally rare a species is, compared to other species of the community. Distinctiveness results range from 0 (no distinctiveness) to 1, when a species is, locally and/or functionnally, different from the others (Matthias Grenié *et al.* 2017).

## 4.5 Kernel density estimation

When two or more niches overlap, it is interesting to detail which traits are most similar between species. To this end, we used a parametric kernel density function (Mouillot *et al.* 2005), which has been used in a similar context by Aneesh Kumar *et al.* (2017). Along a trait axis, the function returns the overlap value between  $N$  overlapping species, ranging from 0 (no overlap) to 1 ( $N$  species have identical, fully overlapping densities).

## 5 Results

### 5.1 Factorial Analysis of Mixed Data

The first 5 FAMD components explained 80% of the total variation (Table 3). The first principal component (PC1) (30.5% of explained variance) is strongly correlated with the shape of the body and of the head with traits such as *body depth* (absolute contribution  $a = 11.7$ ), *lower jaw length* ( $a = 11.5$ ), *oral gape axis* ( $a = 11.1$ ), *orbital length* ( $a = 8.35$ ) and *head length* ( $a = 8.21$ ), thus, mostly to feeding and locomotion (Table 3). Along this horizontal axis, all traits have increasing values towards the right, while mouth orientation is shifting upwards (Figure A.7 for details). Three groups of fish can be distinguished (Figure 4). For low PC1 values, species have a low transversal shape (meaning that both *bd* and *bw* have similar values, consistent with an elongated body), short lower jaw, small oral gape surface and a terminal oral axis, such as *A. risso*, *S. boa* and *S. beanii*. On the right of this axis, species display high body depth values suggesting a laterally compressed form and a superior-oriented oral axis, such as *A. olfersii*.

The second axis (21.6% of explained variance) is correlated to feeding behavior, through food prospection with *pectoral fin insertion* ( $a = 11.4$ ), *eye size* ( $a = 9$ ), *pectoral fin position* ( $a = 7.1$ ) and food acquisition through *gill raker type* ( $a = 17.8$ ) and *oral gape axis* ( $a = 12.3$ ) (Table 3). This vertical axis separates the three species on the left, *A. risso* and *S. boa* display higher values of pectoral fin insertion, meaning that the fin is inserted further on the body than *S. boa*, while the fin position on the body depth is lower. As *S. beanii* does not have pectoral fin, the same analysis has been run without traits referring to pectoral or pelvic fins to look for and confirm the discrimination between these species. Similar results were obtained (Figure 4).

The third axis (explaining 12.2% of the total variance) mainly carries traits linked to the foraging and swimming behavior, with a strong influence of *anus position* ( $a = 23.8$ ), *gill raker type* ( $a = 19.2$ ), *dorsal fin insertion* ( $a = 15.5$ ) and *pectoral fin position* ( $a = 14.2$ ) (Table 3). On the left of this horizontal axis, species are characterized by a rather high pectoral fin insertion and close-to-head dorsal fin insertion and anus position (Figures 5 and A.8). Finally, the fourth axis (7.9% of the total variance) is mainly related to feeding and habitat traits, with *pyloric caeca* ( $a = 31.6$ ), *operculum volume* ( $a = 17$ ) and *presence of photophores* ( $a = 10.9$ ) (Table 3). Because *X. copei* is the only species having pyloric caeca, this variable clearly separates that species from the others, on the PC4 axis. The remaining PC scores (20% of variance) are mainly linked to food acquisition. Overall, this FAMD analysis detects similarities between species niches', with some ellipses largely overlapping. Conversely, some species are well segregated along these first four axes, suggesting the existence of several functional groups within studied community.

PC1 and PC2 carry most of the information in the functional analysis. This suggests that the traits strongly associated with these axes are the most relevant to segregate species. In particular, *lower jaw length*, *body depth*, *pectoral fin insertion* and *eye size* are the quantitative traits that are the most distinct among species and helps to distinguish them. As for qualitative variables,

it seems that *oral gape axis* and *gill raker type* are the ones separating the most species. This makes sense considering they have the most modalities, allowing a more precise description than binary *presence of photophores* and *pyloric caeca* scores.

Table 3: Contributions of functional traits to the first 5 principal components. In bold, contributions higher than the threshold of  $t = 4.8$ .

|            |                        | PC1<br>(30.5%) | PC2<br>(21.6%) | PC3<br>(12.2%) | PC4<br>(7.9%) | PC5<br>(7.8%) |
|------------|------------------------|----------------|----------------|----------------|---------------|---------------|
| Function   | Trait                  |                |                |                |               |               |
| Feeding    | Oral gape axis         | <b>11.07</b>   | <b>12.28</b>   | 3.32           | 3.27          | <b>7.13</b>   |
|            | Eye size               | 1.29           | <b>9.01</b>    | 3.52           | 4.08          | 1.40          |
|            | Orbital length         | <b>8.35</b>    | 2.38           | 0.00           | 2.24          | 4.54          |
|            | Oral gape surface      | <b>7.78</b>    | 3.06           | 2.93           | 0.10          | 2.78          |
|            | Oral gape shape        | 0.18           | 3.10           | 0.05           | <b>9.49</b>   | <b>10.41</b>  |
|            | Oral gape position     | 0.42           | 1.21           | 1.99           | <b>9.16</b>   | 3.94          |
|            | Lower jaw length       | <b>11.52</b>   | 0.00           | 0.04           | 1.97          | 2.44          |
|            | Gill raker type        | 4.38           | <b>17.80</b>   | <b>19.23</b>   | 0.32          | 3.42          |
|            | Gill outflow           | <b>5.47</b>    | 0.82           | 0.02           | 2.22          | <b>22.48</b>  |
|            | Head length            | <b>8.21</b>    | 3.10           | 2.50           | 0.78          | 4.50          |
|            | Pyloric caeca          | 0.23           | 0.48           | 0.04           | <b>31.62</b>  | <b>5.81</b>   |
|            | Anus position          | 0.00           | <b>5.28</b>    | <b>23.81</b>   | 0.07          | 0.77          |
| Locomotion | Body depth             | <b>11.68</b>   | 0.93           | 1.41           | 0.64          | 1.92          |
|            | Pectoral fin position  | 1.72           | <b>7.15</b>    | <b>14.22</b>   | 0.37          | 0.32          |
|            | Pectoral fin insertion | <b>4.95</b>    | <b>11.39</b>   | 0.05           | 0.12          | 0.74          |
|            | Transversal shape      | <b>5.96</b>    | 4.33           | 5.45           | 1.70          | 2.10          |
|            | Caudal throttle width  | 3.72           | <b>5.01</b>    | 0.28           | 1.60          | <b>16.30</b>  |
|            | Dorsal fin insertion   | 2.58           | 4.78           | <b>15.52</b>   | 0.00          | 1.33          |
| Habitat    | Eye position           | 0.19           | <b>5.41</b>    | 0.78           | 2.34          | 1.40          |
|            | Presence photophores   | <b>7.79</b>    | 2.45           | 3.23           | <b>10.89</b>  | 0.59          |
|            | Operculum volume       | 2.52           | 0.03           | 1.61           | <b>17.02</b>  | <b>5.68</b>   |

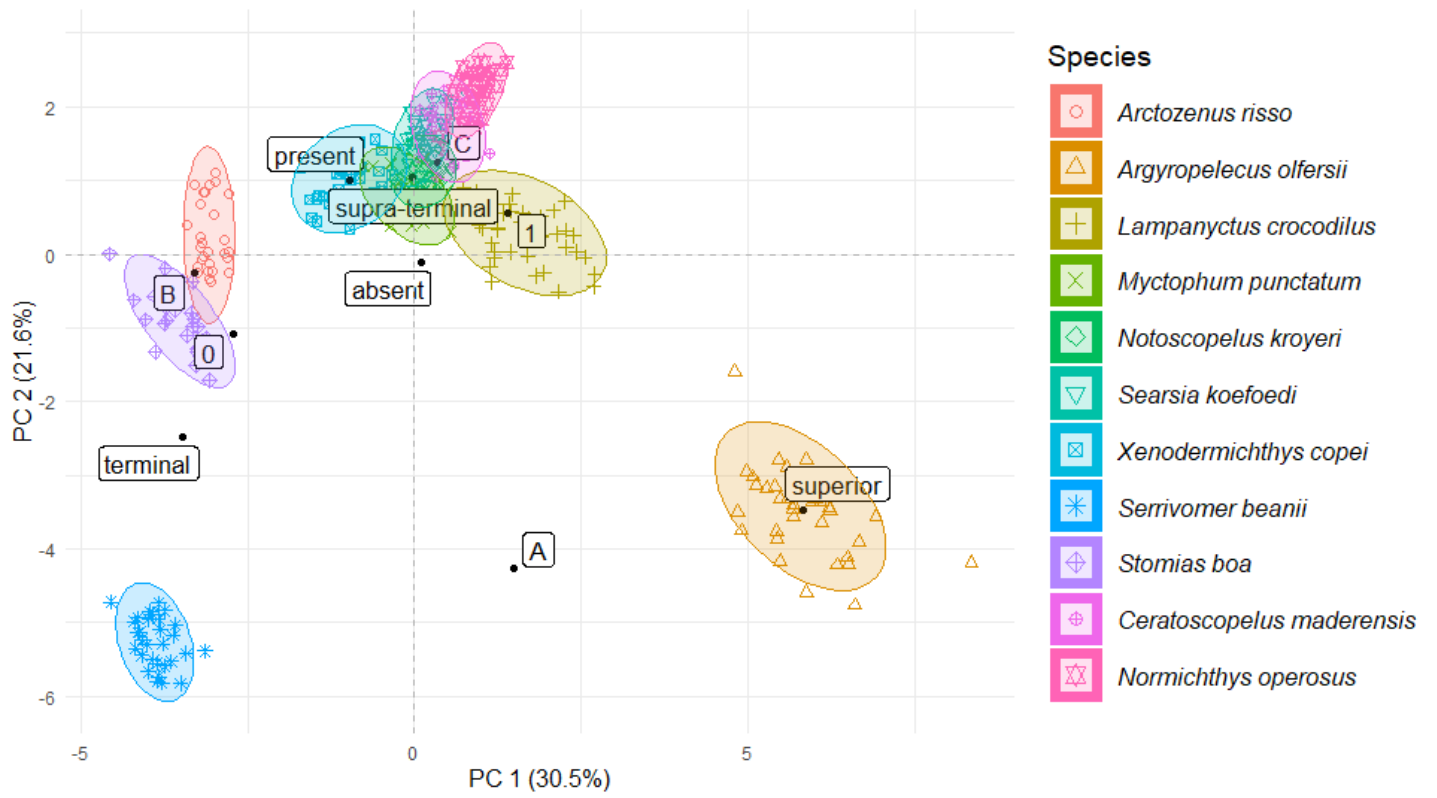


Figure 4: FAMD results for PC 1 and 2. Labels correspond to the levels of 4 categorical variables: *presence of pyloric caeca* (0 or 1), *gill raker type* (A, B or C), *presence of photophores* (present or absent) and *oral gape axis* (superior, terminal or supra-terminal).

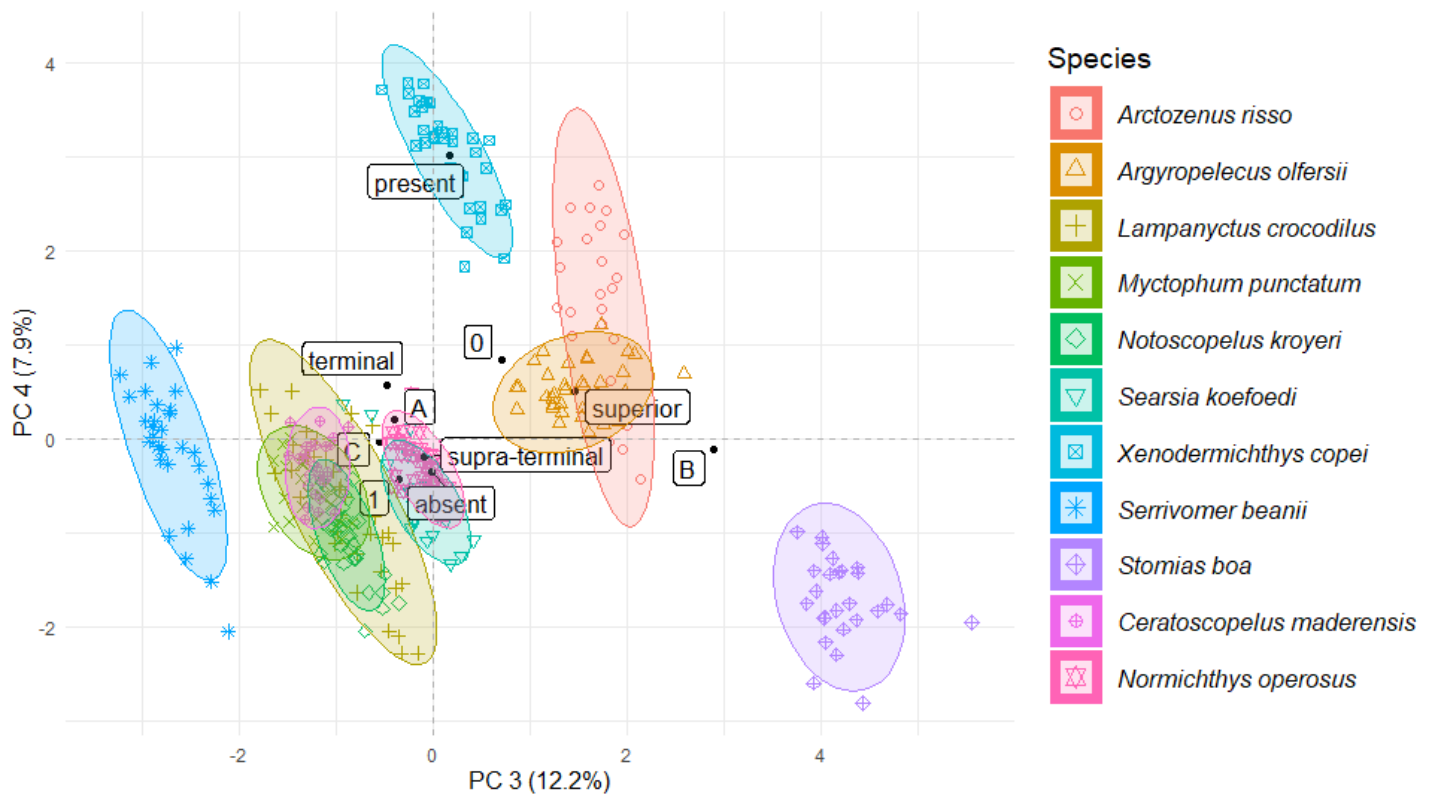


Figure 5: FAMD results for PC 3 and 4. Labels correspond to the levels of 4 catagorical variables: *presence of pyloric caeca* (0 or 1), *gill raker type* (A, B or C), *presence of photophores* (present or absent) and *oral gape axis* (superior, terminal or supra-terminal).



## 5.2 Functional niche surface and overlap

Overall, several species' ellipses overlap on these first four principal components (Figures 4 and 5). For these species, the aim is now to measure the extent of these overlaps. On the first and second principal components, all 4 Myctophidae and 2 Platytroctidae species, plus *X. copei* are more or less overlapping, not displaying much differences along PC1 nor PC2 (Figure 4). *A. risso* and *S. boa* seems to slightly overlap each other niches, which are mainly separated along PC2 (Figure 4). *S. beanii* and *A. olfersii* are the only two species not showing any overlap. On the third and fourth principal components, *A. risso* and *A. olfersii* are showing a partial overlap (Figure 5). Once again, all 4 Myctophidae and 2 Platytroctidae species overlap. Especially, *N. operosus* and *S. koefoedi* have very similar looking niches which are almost fully overlapping. Among this group of species, *L. crocodilus* has the widest niche. It overlaps widely with *C. maderensis*, *M. punctatum* and *N. kroyeri*'s niches.

The niche surface estimation showed that *N. kroyeri* had the narrowest niche among the studied community, followed by *N. operosus* and *S. koefoedi* (Table 4). Then, *C. maderensis*, *A. risso*, *S. beanii* and *M. punctatum*, *S. boa* and *X. copei* all have niches almost two to three times wider than *N. kroyeri*'s. Finally, compared to *N. kroyeri*'s niche, *L. crocodilus*'s is four times wider, while *A. olfersii*'s is more than seven times wider. In fact, all Myctophidae (except *L. crocodilus*) and Platytroctidae have rather small niches and are the ones overlapping the most in Figure 4.

The effect of sample size on the estimate of the average niche area, calculated by bootstrap, showed no significant variation with  $n$  (Figure A.9). Hence, the area of the niches seems to be influenced more by the variability of the traits of the individuals sampled than the number of individuals itself. Yet, the estimated values of the area of the niches converge quickly for  $n \geq 30$ .

Table 4: Standardized surface of functional niches.

| Species                          | Relative surface |
|----------------------------------|------------------|
| <i>Argyropelecus olfersii</i>    | 7.4              |
| <i>Lampanyctus crocodilus</i>    | 4.0              |
| <i>Xenodermichthys copei</i>     | 2.6              |
| <i>Stomias boa</i>               | 2.5              |
| <i>Myctophum punctatum</i>       | 2.1              |
| <i>Serrivomer beanii</i>         | 1.9              |
| <i>Arctozenus risso</i>          | 1.8              |
| <i>Ceratoscopelus maderensis</i> | 1.7              |
| <i>Searsia koefoedi</i>          | 1.3              |
| <i>Normichthys operosus</i>      | 1.2              |
| <i>Notoscopelus kroyeri</i>      | 1.0              |

Nine species show overlapping niches with at least one other species (Figure 4) and the smallest niches are the ones overlapping each other the most (Tables 4 and 5). The maximum overlap is found between *M. punctatum* and *N. kroyeri*, as almost 69% of the latter's niche is

covered by the first. In total, these two species share 22% of their niches. *S. koefoedi* is sharing more than 28% of its niche with both *C. maderensis* and *N. kroyeri*, which are the two highest total overlap values here (Table 5). Overall, *N. kroyeri*'s niche is fully overlapped by six other species. *C. maderensis*, *S. koefoedi* and *M. punctatum* are overlapping five other species. Finally, *L. crocodilus*, *X. copei* and *N. operosus* are involved in overlap with three other species, and *A. risso* and *S. boa* are only overlapping each other (Table 5). Finally, *N. kroyeri* and *N. operosus* show minimum total overlap value of 0.2%, which might not be significant and mostly due to some individuals of the latter in *N. kroyeri*'s ellipse (Figure 4).

Table 5: Species' ellipses overlap. Here, we present only pairs of species for which an overlap greater than 0 exists.

| Species 1            | Species 2            | Total overlap (%) | Overlap of Species 2 over Species 1 (%) | Overlap of Species 1 over Species 2 (%) |
|----------------------|----------------------|-------------------|---|---|
| <i>S. koefoedi</i>   | <i>C. maderensis</i> | 28.2              | 65.4                                    | 49.6                                    |
| <i>N. kroyeri</i>    | <i>S. koefoedi</i>   | 28.1              | 65.4                                    | 49.2                                    |
| <i>M. punctatum</i>  | <i>N. kroyeri</i>    | 22.0              | 32.3                                    | 68.7                                    |
| <i>M. punctatum</i>  | <i>X. copei</i>      | 20.2              | 44.9                                    | 36.6                                    |
| <i>C. maderensis</i> | <i>N. operosus</i>   | 19.0              | 31.8                                    | 47.1                                    |
| <i>N. kroyeri</i>    | <i>C. maderensis</i> | 15.1              | 41.6                                    | 23.7                                    |
| <i>M. punctatum</i>  | <i>S. koefoedi</i>   | 12.5              | 20.3                                    | 32.4                                    |
| <i>S. koefoedi</i>   | <i>N. operosus</i>   | 7.9               | 15.0                                    | 16.9                                    |
| <i>N. kroyeri</i>    | <i>X. copei</i>      | 6.4               | 22.9                                    | 8.8                                     |
| <i>S. koefoedi</i>   | <i>X. copei</i>      | 5.9               | 17.5                                    | 8.9                                     |
| <i>L. crocodilus</i> | <i>M. punctatum</i>  | 4.2               | 6.5                                     | 12.2                                    |
| <i>A. risso</i>      | <i>S. boa</i>        | 3.9               | 9.4                                     | 6.6                                     |
| <i>M. punctatum</i>  | <i>C. maderensis</i> | 3.2               | 5.8                                     | 7.0                                     |
| <i>L. crocodilus</i> | <i>C. maderensis</i> | 1.7               | 2.5                                     | 5.7                                     |
| <i>L. crocodilus</i> | <i>N. kroyeri</i>    | 1.0               | 1.2                                     | 4.8                                     |
| <i>N. kroyeri</i>    | <i>N. operosus</i>   | 0.2               | 0.5                                     | 0.4                                     |

Niches distinctiveness informs on functional diversity of species within a community, with increasing values meaning that, locally, species display rarer functions. Here, Myctophidae and Playtroctidae families are all equally functionally distinct from one another (Table 6). Even if the values are rather close, *S. koefoedi* and *M. punctatum* seems to be the most alike species. Conversely, *A. olfersii*, *S. beanii* and *S. boa* tend to have more distinct niches, which is consistent with previous results (Figure 4). Here, species with the most atypical morphological feature are the most distinct in terms of niche.

### 5.3 Kernel density estimation

Kernel density estimation helps to understand which the traits have the same distribution for several species. Looking at these distributions for species with overlapping niches gives informations on traits, and thus, functions similarities among species. The estimation of kernel

Table 6: Niche dissimilarity of studied species

| Species                          | Distinctiveness value |
|----------------------------------|-----------------------|
| <i>Argyropelecus olfersii</i>    | 0.54                  |
| <i>Serrivomer beanii</i>         | 0.51                  |
| <i>Stomias boa</i>               | 0.46                  |
| <i>Arctozenus risso</i>          | 0.40                  |
| <i>Lampanyctus crocodilus</i>    | 0.37                  |
| <i>Xenodermichthys copei</i>     | 0.37                  |
| <i>Ceratoscopelus maderensis</i> | 0.31                  |
| <i>Normichthys operosus</i>      | 0.31                  |
| <i>Notoscopelus kroyeri</i>      | 0.30                  |
| <i>Searsia koefoedi</i>          | 0.29                  |
| <i>Myctophum punctatum</i>       | 0.29                  |

densities for the 7 overlapping species show that these species are overlapping for 7 of the 17 computed traits (Figure 6; Table 7). The overlap is maximum for *oral gape position* (trait n°5) with an overlap value of 0.34. This means that, along this functional trait, these 6 species share nearly 34% of the trait density distribution. For this trait, most of the distributions are centered around of values of [0.5-0.8], yet *L. crocodilus* displays a pretty wide distribution, despite being the most sampled species (Table 1). The same observation can be done for this particular species for *body depth* (trait n°11) and *pectoral fin insertion* (trait n°13). Species share also nearly 25% and 29% of their density when looking at *body depth* (trait n°11) and *eye position* (trait n°17) respectively. Finally, *lower jaw length* (trait n°6) and *pectoral fin position* (trait n°12) values also seem to be common to those species, with 16% and 19% of density shared, respectively. To a lesser extent, species share nearly 12% of the *eye size* values (trait n°2).

Furthermore, we can notice that *oral gape surface* (trait n°3), *operculum volume* (trait n°8) and *pectoral fin insertion* (trait n°13) display bimodal distributions (Figure 6). For these traits, *L. crocodilus*, *N. operosus* and *S. koefoedi* constitutes the first mode, and the other species the second. Conversely, *eye size* (trait n°1) shows multimodal distribution, with nearly every species having its own distinct mode.

For most traits, *N. kroyeri* (green) and *M. punctatum* (blue) have very similar distributions (Figure 6). When looking at these two species only, the analysis shows that they are overlapping for each of the 17 traits, with particularly high values for *eye size* (overlap  $o = 0.915$ ), *operculum volume* ( $o = 0.901$ ), *gill outflow* ( $o = 0.882$ ), *pectoral fin insertion* ( $o = 0.828$ ) and *caudal throttle width* ( $o = 0.782$ ), with the mean overlap of the 17 traits being  $\bar{o} = 0.561$ .

## 6 Discussion

The results of our study provide evidence of both segregation and overlap of functional niches within the deep-sea fish community inhabiting canyons of the Bay of Biscay. Specifically, dif-

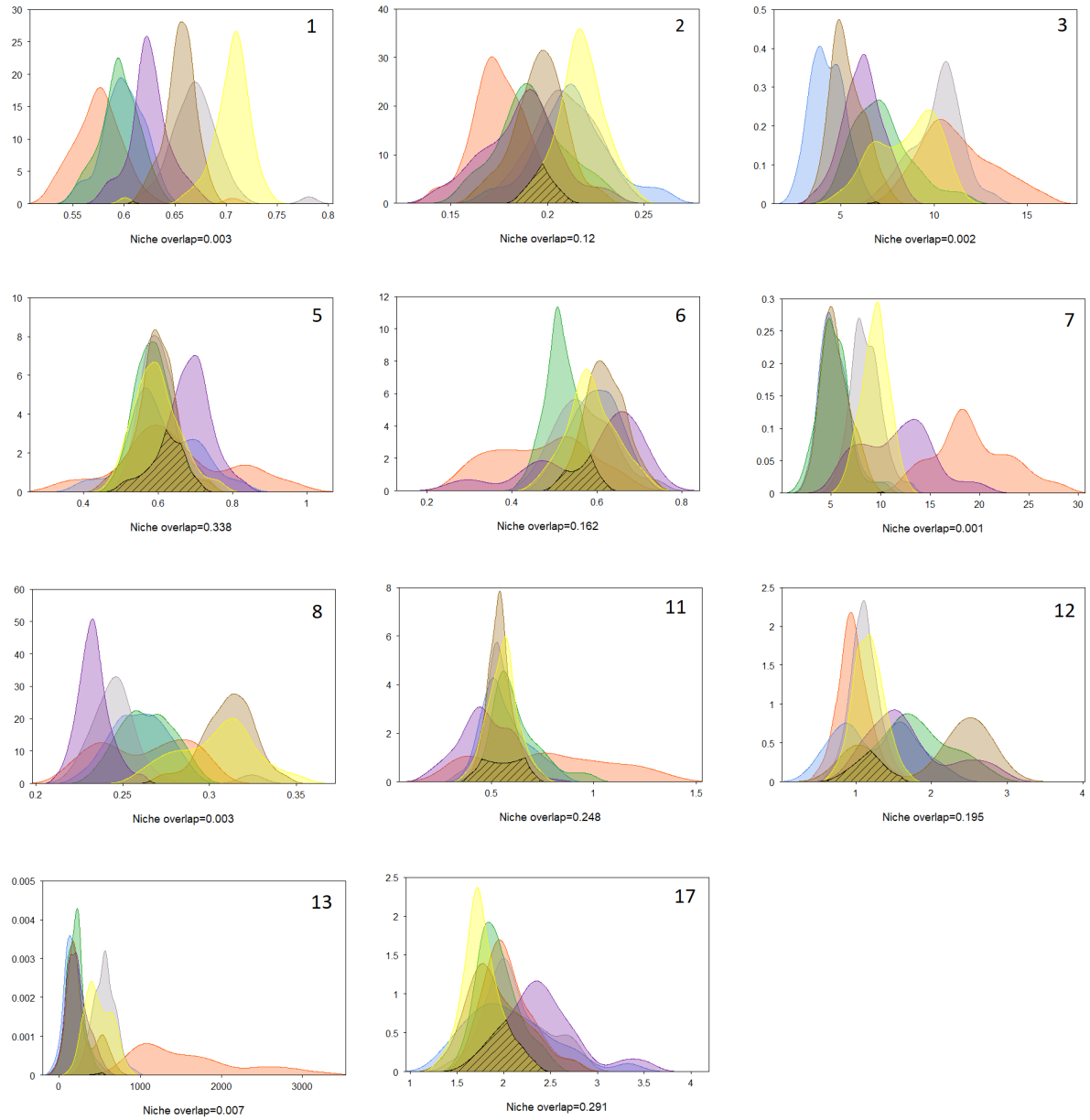


Figure 6: Kernel density overlap for 11 functional traits and the 7 overlapping species. Colors correspond to following species: orange - *L. crocodilus*; brown - *C. maderensis*; yellow - *N. operosus*; purple - *X. copei*; green - *N. kroyeri*; blue - *M. punctatum*; grey - *S. koefoedi*. Overlap is represented by shaded lines. Here, are displayed every traits that showed non-null overlap. Codes for traits are the same as in Table 7.

Table 7: Kernel density overlap values for the 17 computed traits for the seven overlapping species. Values in bold are significant ( $p < 0.01$ ) and shown in Figure 6.

| Trait code | Functional trait       | Total overlap (o) |
|------------|------------------------|-------------------|
| 1          | Eye size               | 0.00              |
| 2          | Orbital length         | <b>0.12</b>       |
| 3          | Oral gape surface      | 0.00              |
| 4          | Oral gape shape        | 0.00              |
| 5          | Oral gape position     | <b>0.34</b>       |
| 6          | Lower jaw length       | <b>0.16</b>       |
| 7          | Gill outflow           | 0.00              |
| 8          | Operculum volume       | 0.00              |
| 9          | Head length            | 0.00              |
| 10         | Anus position          | 0.00              |
| 11         | Body depth             | <b>0.25</b>       |
| 12         | Pectoral fin position  | <b>0.20</b>       |
| 13         | Pectoral fin insertion | <b>0.01</b>       |
| 14         | Transversal shape      | 0.00              |
| 15         | Caudal throttle width  | 0.00              |
| 16         | Dorsal fin insertion   | 0.00              |
| 17         | Eye position           | <b>0.29</b>       |

ferences among species were primarily shaped by traits referring to body and head morphology and by foraging related traits, which also give information on their habitat (Schoenfuss & Blob 2007). Most of the detected overlap is found between some Myctophidae, Platytroctidae and Alepocephalidae species. However, the overlap appeared to be higher between families rather than within families. Species with the most atypical morphology (*i.e.* *A. risso*, *A. olfersii*, *S. beanii* and *S. boa*) have clearly distinct niches and showed null/low overlap, within the community. These results reveal that the most common species of deep-sea communities of the Bay of Biscay show a relatively high functional diversity and several degree of segregation. This supports the hypothesis of a high partitioning of resources in these ecosystems and promotes coexistence of species, which might be essentially driven by food resources, but also swimming abilities (Aneesh Kumar *et al.* 2017; Preciado *et al.* 2017).

No sex or maturity distinction was made when measuring individuals, and this source of variability was not investigated in our analysis. For fishes, both variables could influence morphologic features: sexual dimorphism being mostly related to standard length and fins position and maturity to prey selection (Geidner 2008; Nagelkerke *et al.* 2018). Such difference could explain a part of trait variability and lead to very different results of niche partitioning (da Silva *et al.* 2019; Dumay *et al.* 2004; Nagelkerke *et al.* 2018).

In this study, the relationship between species functional traits and environmental (biotic or abiotic) parameters were not investigated. In an ecosystem, species interact also with their environment. Whether it shapes the habitat or define availability of resource breadth, environ-

ment is influencing realized niche (Costa-Pereira *et al.* 2019; Ibañez *et al.* 2007; Kremer *et al.* 2017). Adding these parameters in future studies could potentially allow to associate the different niches to particular environmental characteristics, as well as investigate site influence. Because traits are morphological responses to environmental constraints, their interpretation could vary from one context to another, making it hard to extract the main drivers of trait variation. (Kremer *et al.* 2017). Comparing communities living in different sites is relevant to link some functional traits with habitat particularities, thus assess how environment influence functional niches (Mejri 2009). Moreover, including local environmental conditions could explain the part of trait variability due to pressures from ecological divergence (da Silva *et al.* 2019).

In a context of climate change, studying this relationship is important to predict how disturbances of the habitat could affect fish communities (Brind'Amour *et al.* 2011). Finally, previous studies showed that functional niche overlap and species abundances were linked (Aneesh Kumar *et al.* 2017; Mason *et al.* 2008). More precisely, the most abundant species of an ecosystem tend to be functionally separated from the others (Farré *et al.* 2016). For future studies, species' abundances could be taken into account, and could help refine functional diversity estimations.

Here, morphological measurements alone highlighted clear differences among species, with segregation along functional traits. However, using only morphological traits to describe functional niche segregation has some limits (da Silva *et al.* 2019). Grossman (2009) showed that species with strong morphological divergences sometimes use the same resources in a similar way, whereas morphologically close species can have very different diets. In order to overcome the limits imposed by their morphology and/or habitat for the acquisition of food, organisms can indeed modulate their behavior and show great adaptability (Blondel & Bourlière 1979; Grossman 2009). Although morphology sets limits to resource use, species can exhibit some plasticity to adapt to prey availability and environmental conditions (Ibañez *et al.* 2007; Sibbing & Nagelkerke 2000). Completing present results with data on dietary preferences could increase robustness and confirm first conclusions. To do so, Preciado *et al.* (2017) suggests that both stable isotope analysis and stomach content analysis give complementary, or even opposite information. Considering few information known about present studied species, additional analysis might also help drawing conclusions from functional analysis. Especially, examining stomach content can be useful when not enough functional traits were computed, or if the latter can not explain much of the variability found between species (Albouy *et al.* 2011). This will also inform on how, for deep-sea species communities, functional traits change regarding trophic level or diet, and thus, help interpretation of functional diversity assessment.

First, *A. olfersii* have the most distinct and widest niche of all studied species with very differentiated morphological and habitat-related traits. *A. olfersii* showed an atypical laterally compressed body, long lower jaw, superior-oriented gape-axis and absent/rudimentary gill rakers. All these elements are consistent with *A. olfersii* being a predator, mainly feeding on teleostei juveniles, euphausiids and gelatinous organisms (Eduardo *et al.* 2020). These morphological

features suggests that this species catch its prey from underneath, with what might be a suction mechanism. On the opposite side of the morphologic spectrum are found the elongated, short-head fishes, with (supra-) terminal-oriented mouth.

All these three species being primarily piscivorous top predators with sharp teeth, *S. beanii* has been reported having a generalist diet, feeding on wide range of preys (cephalopods, teleosts, crustaceans ...) (Geidner 2008). For generalist species, Sibbing & Nagelkerke (2000) emphasize the difficulty to link morphology to foraging characteristics and/or diet, because such species are able to switch prey depending on which is more abundant, and do not exhibit specific food-related morphological traits. Ultimately, such mixed diet can require less time and energy prospecting for food (Geidner 2008). This is consistent with *S. beanii* which seems to have a different swimming strategy than *A. risso* and *S. boa* (see PC3 on Figure 5). Conversely, the latter has a rather selective diet which is dependent of their foraging strategy (Sutton & Hopkins 1996). Stomiids use lures to attract prey, they are dependent on prey appeal for lures to feed and target rather big ones, which narrows the range of potential preys (Geidner 2008; Germain *et al.* 2019).

For the moment, being the only known species of its genus, very little is known about *A. risso* and recent studies highlighted confusions between this particular species and what might be a new species, based on morphological differences (Ho & Duhamel 2019). Looking at functional diversity through morphology can thus play a role in assessing local biodiversity and help distinguish species that look alike. Vesik *et al.* (2021) recent work emphasize that species traits give information to understand the why and where species occurred in an environment, and the parameters that makes this environment suitable. Looking at species traits can thus be a promising tool to predict environmental conditions and species distribution.

Overall, *S. beanii*, *A. risso*, *A. olfersii* and *S. boa* all have the most distinct niches among all eleven studied species and live in deeper waters (Froese & Pauly 2019). These species all are mesopelagic top predators, confirming the observed relation between oral anatomy and trophic level (Colborne *et al.* 2013; Wainwright & Richard 1995). Indeed, trophic level impacts how specialised a species can be in terms of diet: apex predators will often favor one feeding strategies among others, so they are very efficient for one strategy, and have limiting capacities in others. This principle can be summed up as a “trade-off strategy”: greater abilities for one strategy lead to a decrease of abilities in other areas Norton (1995), because of morphological specificities (Nagelkerke *et al.* 2018). Consistent with Farré *et al.* (2016) observations, redundancy seems to decrease with depth, as these four deep-living species show null/low redundancy. Therefore, these four species occupy different niches and should have low competitive interactions (Mouillot *et al.* 2005).

On the other hand, higher overlap among species belonging to Myctophidae and Platytroctidae. Indeed, the six species have close niches based on the morphology of their body and head (PC1), their feeding strategies (PC2), their diet (PC3) and prey selection (PC4), suggesting similar use of resources. Morphologically, these species are all characterized by a rather

large and elongated body, supra-terminal oral orientation, well-developed gill rakers and the presence of photophores (except *N. operosus*). Both families have relatively big eyes, which are highly specialized for dim-light environments and detecting/localizing sources of light (de Busserolles *et al.* 2014; Novotny 2018). Platytroctidae also display a luminous organ, called shoulder organ, that produces light through bioluminescent fluid that appears to disorient predators (Novotny 2018). However, Myctophidae perform diel vertical migration to feed on wide variety of shallower-water zooplankton preys, which Platytroctidae do not (Sutton 2013). Furthermore, Myctophidae are reported to be opportunistic predators, feeding on euphausiids, copepods, ostracods, fish eggs and larvae, depending on the available food and the habitat Catul *et al.* (2011); Kozlov (1995). Yet, Platytroctidae seems to have a more specialized diet, not being truly a generalist Novotny (2018).

Because all six species have rather close niches, size of niche might therefore inform on the way species partition resources. One hypothesis might be that species with wider niche have higher flexibility in resource utilization and can thus feed on more diverse preys. For example, *L. crocodilus* wide feeding-niche can be explained by seasonal variations of preferred preys type Fanelli *et al.* (2014). Conversely, species that have small niches might have more restricted diet variability, because it is equally abundant all year or because they are not morphologically able to feed on other preys (Mejri 2009). Another hypothesis is the competition theory in which communities' structures are constraints by competition relationships, which make sense here regarding the similarity in niches of these species (Geange *et al.* 2011). Under this hypothesis, the size of the niche is directly influenced by the availability of prey, which depends on what the other species of the community predate and how resources are shared.

In our case, *N. kroyeri* and *M. punctatum* have highly overlapped niches, the latter overlapping nearly 69% of the first. Because *M. punctatum*'s niche is twice wider, this might suggest that while both species are competing for the same resource, *N. kroyeri* is limited in its resource use by *M. punctatum*. For these two species, phylogenetic closeness might explain the likeness of niches, as it is linked to functional-trait diversity (Tucker *et al.* 2018). Indeed, traits density estimation showed very similar results for both species, which are 56% overlapping on the 17 functional-traits studied. Overlap is the highest for traits that are linked foraging strategies, suggesting that while the two species use the same resource, they also do it in the same way. Hence, *N. kroyeri* and *M. punctatum* can theoretically compete, especially if their food is limiting.

Finally, *X. copei*, which is not Myctophidae nor Platytroctidae but Alepocephalidae, show only a slight overlapping three with species from the first two families. Yet, *X. copei* has the third widest realized niche of all studied species, mostly elongated, indicating a rather high morphological variability (see Table 4 & PC1 on Figure 4). This species being the only one here to have pyloric caeca, its relative segregation might be influenced by this specific feature, which plays a role in digestion abilities (Buddington & Diamond 1986). Another explanation might be the high variability of prey they feed on, depending on the habitat they are living in. Mauchline & Gordon (1983) indeed showed that, for this species, diet varied along life stage,



with juveniles feeding exclusively on copepods and ostracods, while adults showed a much more diverse diet, including euphausiids and other fish from deeper waters.

Looking at overlap for each traits helps us to understand how *X. copei* resembles to Myctophidae and Platytroctidae. *X. copei* showed similar trait-density variation with most species of these two families, being the closest with *M. punctatum*. In particular, these two species are similar regarding at morphological features, such as body depth, pectoral fin position and insertion. For this latter trait, high resemblance is found between *X. copei* and Myctophidae (except *L. crocodilus*), while the two Platytroctidae species look similar to one another. Finally, considering all these traits together suggest that despite high morphological and locomotion similarities, *X. copei* is unlikely to compete with neither Myctophidae or Platytroctidae, because they are targeting different preys.

Here, effect of phylogeny is not that obvious. For example, despite Alepocephalidae being evolutionary close to Platytroctidae (see Figure A.1), null/low overlap is found. It is also interesting to notice that despite close phylogenetic history between *S. boa* and *A. olfersii*, both belonging to Stomiiformes order, no similarities in niche's occupation were found. This suggest that, when looking at how species share resources, functional traits overrides some effects of phylogeny (Kremer *et al.* 2017). However our results tend to show that, within Myctophidae and Platytroctidae, overlap is lower between species than between families. Being close from a phylogeny perspective, this observation might suggest that selective forces have led to evolutionary divergence within each of these families. As it applied to both families, this divergence caused what seems to be greater resemblance between families than inside families. Indeed, species that took different genetic paths (*i.e* evolution of two distinct families example) could end reaching same traits (Natarajan *et al.* 2016). Ultimately, this can lead to greater competition between species from different families, rather than within family, as what could be expected.

## 7 Conclusions

Because studies of functional diversity on submarine canyons communities are scarce, comparisons with other systems are limited. This work provides a first overview of how deep-sea fish functional niches are structured in the canyons of the Bay of Biscay. We found that deep-sea fish species displayed significant functional diversity, which is consistent with Aneesh Kumar *et al.* (2017) and Carrington *et al.* (2021). Some of these species being functionally specialized, suggesting low competitive interactions, conversely to what might be expected in such a nutrient-poor environment. These results are in agreement with Preciado *et al.* (2017), who showed that these communities do not seem to display high dietary overlap, indicating a high degree of resources partitioning. Finally, overlap even seems to decrease with depth, because specialization is stronger (Carrassón & Cartes 2002; Farré *et al.* 2016).

Furthermore, having better knowledge of these communities is crucial to evaluate their vulnerability facing disturbance of ecosystem. Carrington *et al.* (2021) highlighted that, if diversity in deep-sea ecosystems is not to be questioned, very little is known about the way species inhabiting these systems might respond to pressures shifting. Because diversity range within an ecosystem is a good indicator of its health, measuring functional diversity might help quantify the effect of environmental disturbance Carrington *et al.* (2021); Villéger (2017). Despite being, currently, rather spared by anthropic influence, deep-sea ecosystems are nonetheless facing several threats. With the improvement of technology, deep-sea exploitation, and especially fishing, is increasing (Carrington *et al.* 2021). Yet, because of their slow life histories and the complexity of their diversity, deep-sea communities might be more sensitive to biodiversity loss than shallow-water communities (Carrington *et al.* 2021; Danovaro *et al.* 2017). Another concerning issue that deep-sea communities is facing is ocean pollution. In particular, submarine canyons being conduits linking shallow to deeper waters, they are particularly exposed to pollution coming from continental shelf. In particular, studies have shown high density of marine litter in Bay of Biscay's canyons (van den Beld *et al.* 2017a). Being mainly microplastic, this pollution affects all water column, from pelagic to deep-sea species (Pereira *et al.* 2020). Metallic and organic pollutants contamination have also been reported for deep-sea communities (Spitz *et al.* 2019).

Finally, climate change could be the most influent yet harder to quantify threat of all for these communities. Inhabiting deep-sea environments for millions of years, meso- and bathypelagic species had to adapt to previous changes, but none was as fast and intense as the current one (Catul *et al.* 2011). In particular, by 2100, ocean warming is projected to induce a 1°C increase in deep-waters, reducing oxygen concentrations and acidifying water (Danovaro *et al.* 2017). These changes are foreseen to be even more important in shallower waters, on which deep-sea communities feed on, with already happening changes (Danovaro *et al.* 2017). Ultimately, this will affect capacity of these community to recover from other disturbance, with potential detrimental impacts on their metabolism, growth rate and reproduction success. Because of

their essential role, ensuring energy transfer from shallow to deep-waters, health of meso- and bathypelagic communities is key determining the whole trophic chain (Davison *et al.* 2015; Gaskett *et al.* 2001). If deep-sea fish abundance were to decrease, the established relations between species in competition will change, with repercussion on higher trophic levels. Aïssi *et al.* (2012) and Kenchington *et al.* (2020) emphasized the importance of canyons deep-sea communities as major food supply supporting whale, large pelagic predators and also marine birds.

To mitigate global change effects on deep-sea communities, and thus others compartments, an effective management of these resources have to be decided. To do so, a much complete understanding of functional diversity and composition of these communities is required, and could help predict impact and responses to global change and exploitation (Carrington *et al.* 2021; Dumay *et al.* 2004; Kremer *et al.* 2017). Special effort should be made to expand knowledge on biology, life history and trophic relations of deep-sea communities, which is essential to address the additive effects of human pressures and global change (Danovaro *et al.* 2017).

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## A Appendice

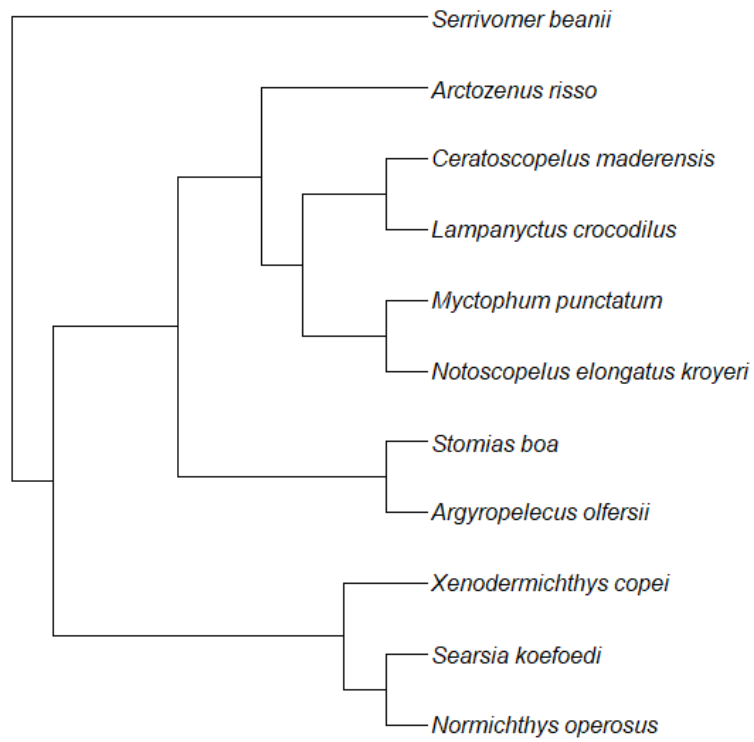


Figure A.1: Phylogenic tree of studied species, using R *rotl* package (OpenTreeOfLife *et al.* 2019) .

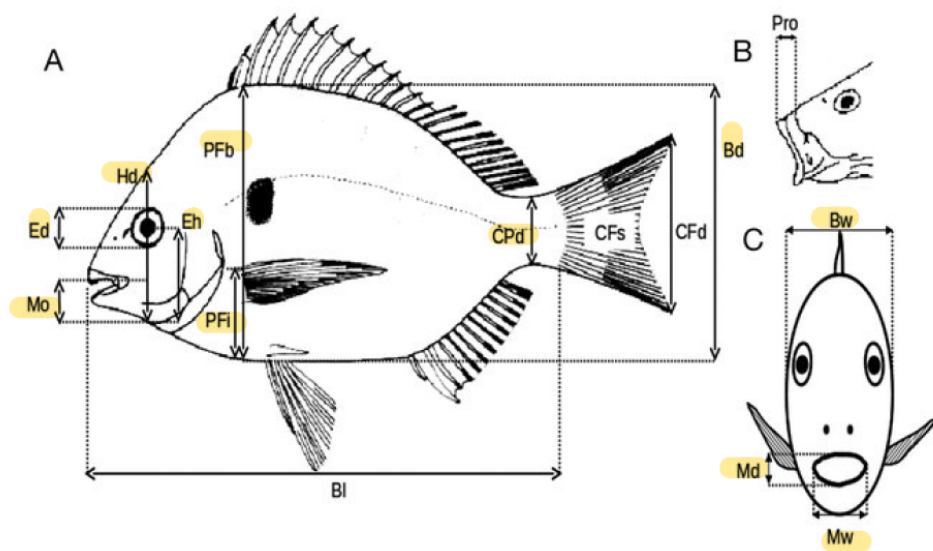


Figure A.2: Morphological measurements, from Albouy *et al.* (2011). bd, body depth; bw, body width; cpd, caudal peduncle minimal depth; ed, eye diameter; eh, distance between the bottom of the head and the eye center along the head depth axis; hd, head depth along the vertical axis of the eye; md, mouth depth; mo, distance between the tip of the upper jaw and bottom of the head; mw, mouth width; pfb, body depth at the level of the pectoral insertion; pfi, distance between the insertion of pectoral fin and the bottom of the body.

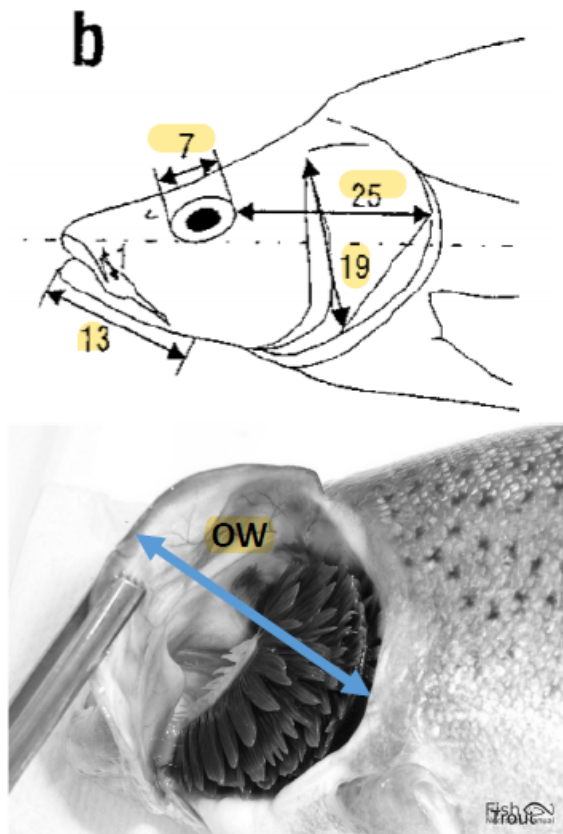


Figure A.3: Morphological measurements of the head, from Diderich (2006), following Sibbing & Nagelkerke (2000). 7 being ed, eye diameter; 13 ljl, distance between the tip and the insertion point of lower jaw; 19 od, depth of the operculum from point of insertion to bottom; 25 pol, shortest distance between the eye and the end of the head; ow, operculum maximum width.

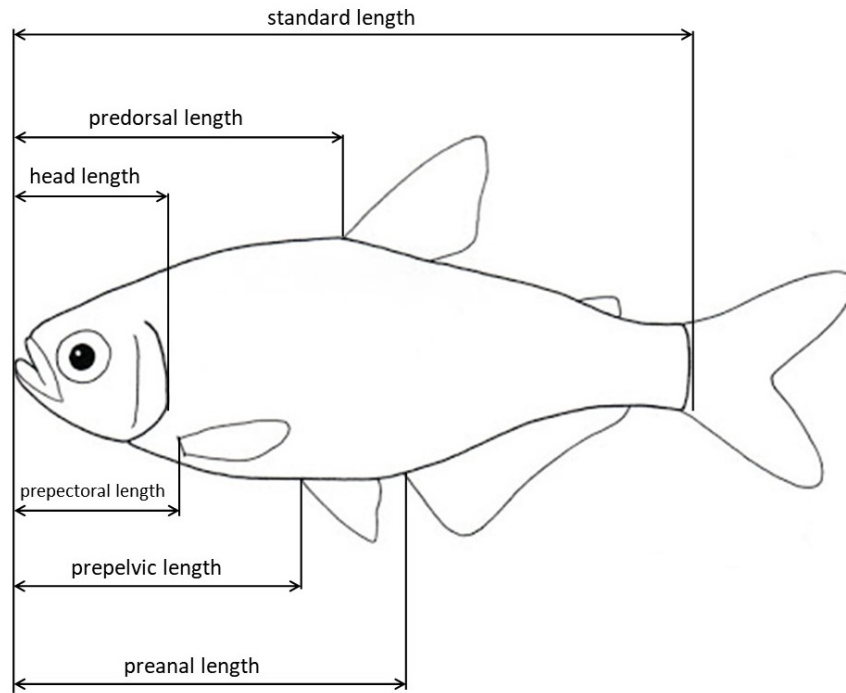


Figure A.4: Morphological measurements of the head and fins, adapted from Keat-Chuan Ng *et al.* (2017); Habib *et al.* (2019). h1, head length, from the nose to the closest-to-caudal-fin point of the operculum; pa1, distance between the tip of the nose and the insertion of anal fin; pd1, distance between the tip of the nose and the insertion of dorsal fin; pp1, distance between the tip of the nose and the insertion of pectoral fin; pv1, distance between the tip of the nose and the insertion of pelvic fin; sl, standard length.

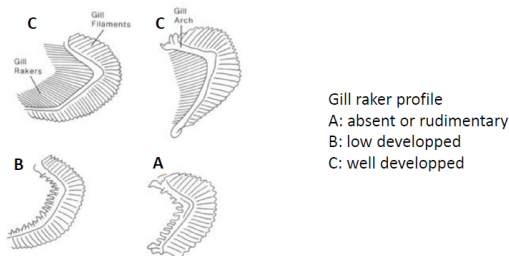


Figure A.5: Scores of gill rakers types git, based on their length.

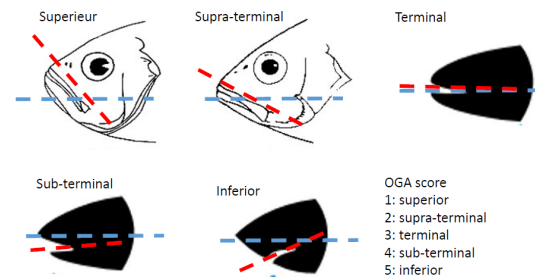


Figure A.6: Scores of oral gape axis oga, based on the angle between mouth orientation (red) and a fictive mid-depth lateral line (blue).

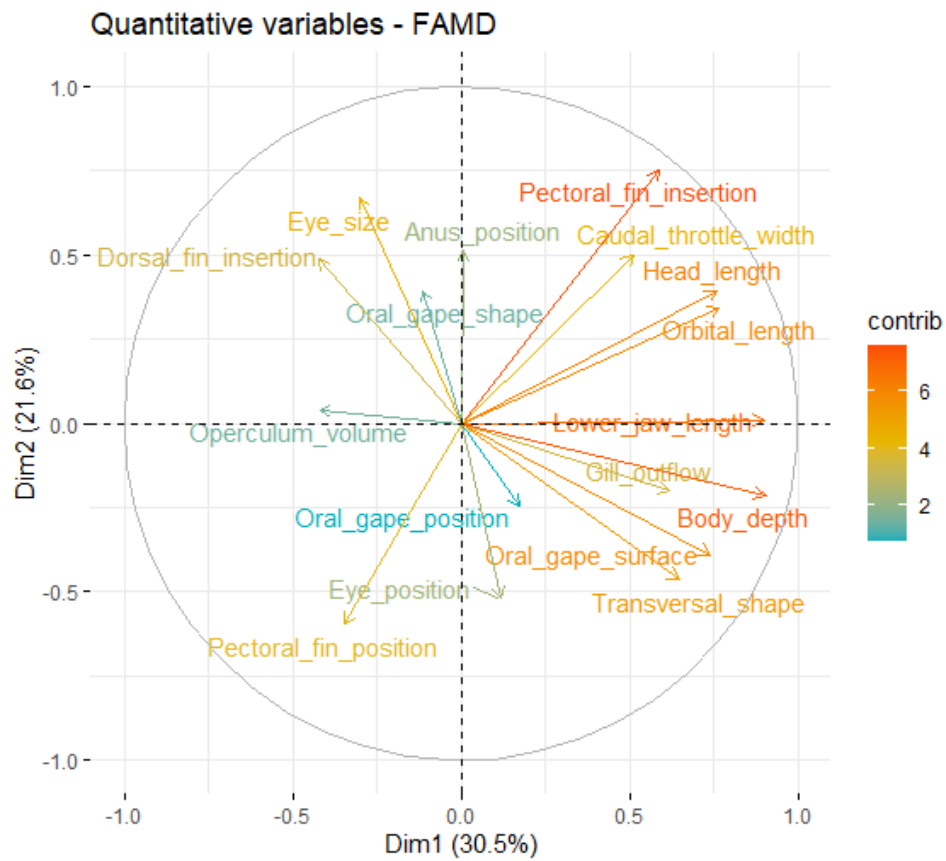


Figure A.7: Correlation circle of axis 1 and 2. The "contrib" variable refers to the representativity of the variable on the axis. The higher the value is, the more the corresponding variable contributes to the axis.

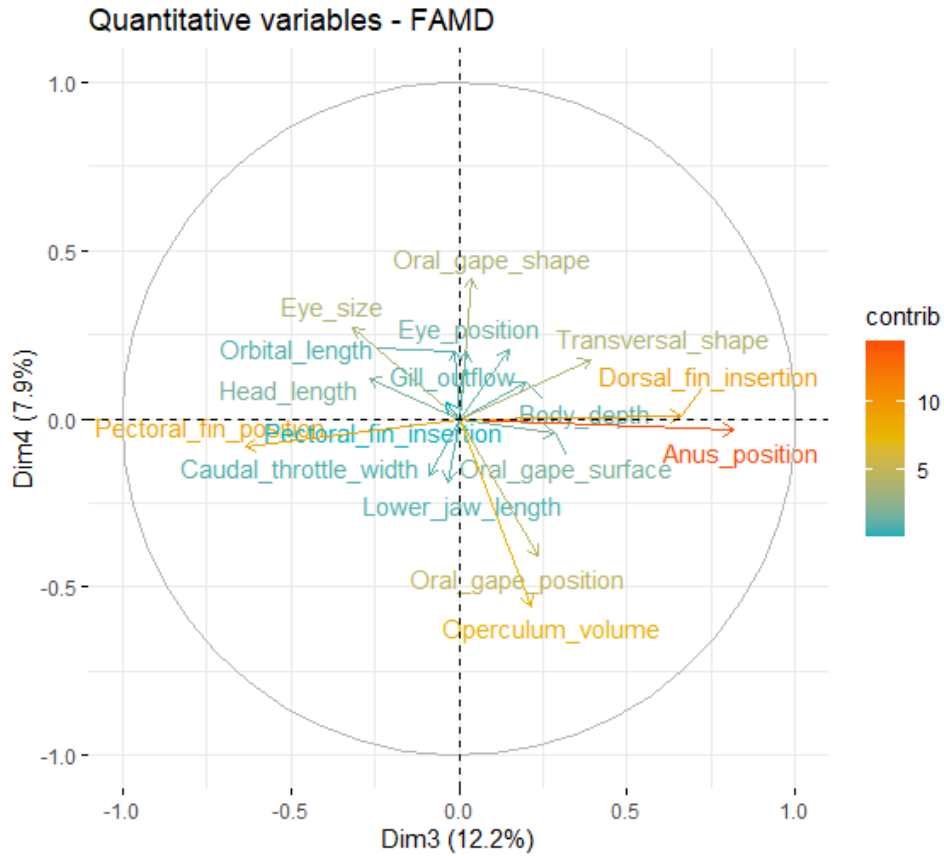


Figure A.8: Correlation circle of axis 3 and 4. The "contrib" variable refers to the representativity of the variable on the axis. The higher the value is, the more the corresponding variable contributes to the axis.

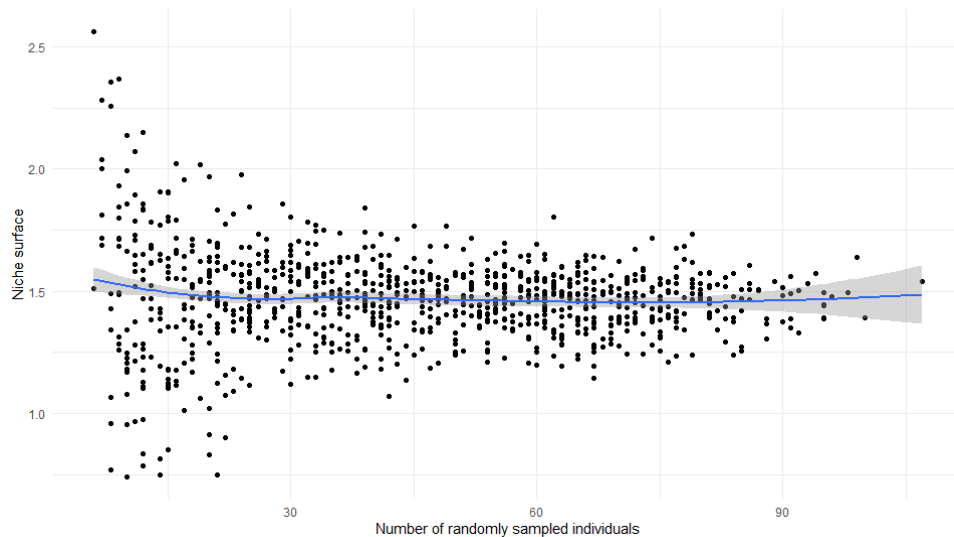


Figure A.9: Bootstrapped average niche area estimation for increasing sample size for *A. risso*. Here, 5 to 100 individuals were randomly sampled, 1000 times. For each iteration, niche area is computed and represent a point.



## Abstract

The deep ocean is the largest biome of the Earth, yet, these extrem ecosystems remain mostly unknown, with only 0.001% of it having been investigated. At the interface between nutrients-rich continental waters to impoverished deep-sea waters, are found submarine canyons. Being highly heterogeneous, these habitats appears to be "biodiversity hotspots" and support many ecological services. Species and communities living in such habitat are understudied and very little is known on resource partitioning supporting co-existence of species and functioning of deep sea ecosystems. In this study, our objectives was to characterise functional diversity through morphology, of 11 common species of Bay of Biscay's canyons, and to measure the degree of overlap bewteen functional niches. Our results revealed significant differences in functional niches between species and in functional traits for species with relatively close niches. Ecological data being scarce on studied species, this work confirms that functional analyses is adapted to deep-sea fishes and that it give informations on the main functions performed by species. Finally, our results supports the hypothesis of high functional diversity in deep-sea ecosystems, promoting co-existence of species du to high resource partitioning. The present work is a first attempt to compare the morpho-functional characteristics and niche partitioning in the deep-sea fish assemblages from the canyons of Bay of Biscay.

Key words: Functional diversity, niche overlap, functional traits, resource partitioning, deep-sea fishes, Bay of Biscay, canyons.

## Résumé

Les eaux profondes constituent le plus grand biome de la Terre, pourtant, ces écosystèmes extrêmes restent pour la plupart inconnus, seuls 0,001% d'entre eux ayant été étudiés. À l'interface entre les eaux continentales riches en nutriments et les eaux profondes appauvries, on trouve les canyons sous-marins. Très hétérogènes, ces habitats apparaissent comme des "points chauds de la biodiversité" et assurent de nombreux services écologiques. Les espèces et les communautés vivant dans ces habitats sont peu étudiées et l'on sait très peu de choses sur le partage des ressources favorisant la coexistence des espèces et le fonctionnement des écosystèmes d'eaux profondes. Dans cette étude, nos objectifs étaient de caractériser la diversité fonctionnelle, à travers la morphologie, de 11 espèces communes des canyons du Golfe de Gascogne, et de mesurer le degré de chevauchement entre les niches fonctionnelles. Nos résultats ont révélé des différences significatives dans les niches fonctionnelles entre les espèces et dans les traits fonctionnels pour les espèces ayant des niches relativement proches. Les données écologiques étant rares sur les espèces étudiées, ce travail confirme que l'analyse fonctionnelle est adaptée aux poissons d'eaux profondes et qu'elle donne des informations sur les principales fonctions remplies par les espèces. Enfin, nos résultats soutiennent l'hypothèse d'une grande diversité fonctionnelle dans les écosystèmes d'eaux profondes, favorisant la coexistence des espèces grâce à un partage élevé des ressources. Le présent travail est le première se proposant de comparer les caractéristiques morpho-fonctionnelles et le partage de niche des assemblages de poissons des canyons du Golfe de Gascogne.

Mots clés : Diversité fonctionnelle, chevauchement de niche, traits fonctionnels, partitionnement des ressources, poissons d'eau profonde, Golfe de Gascogne, canyons.