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# Mesophotic zone as refuge: acclimation and in-depth proteomic response of yellow gorgonians in the Mediterranean sea

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**Abstract** The intensification of warming-induced mass mortalities in invertebrate populations including in temperate regions is a critical global issue. Mesophotic zones (30–150 m depth) have been suggested as potential refuges from climate change for gorgonian populations, offering hope for reseeded damaged shallow populations. Using a proteomic approach, we investigated the responses and acclimatization ability of the yellow gorgonian *Eunicella cavolini* along an environmental gradient following reciprocal transplantations between shallow (20 m) and mesophotic (70 m) zones. Our findings indicate that yellow gorgonians from mesophotic waters exhibit a greater plasticity when transplanted to shallow waters, compared to shallow gorgonians transplanted to the mesophotic zone at 70 m. Transplanted colonies from

mesophotic to shallow waters showed an increasing level of proteins involved in immune response but displayed no signs of necrosis or apoptosis, highlighting the acclimation potential of mesophotic populations. These results suggest that *Eunicella cavolini* populations may exhibit physiological plasticity in response to future climate change, allowing natural colonization from mesophotic populations. This analysis offers valuable insights into gorgonians' cellular and molecular responses to environmental changes.

**Keywords** Deep sea refugia hypothesis · *Eunicella cavolini* · Global change · Molecular phenotype · Physiological plasticity · Reciprocal transplantations

The research described in the publication complies with relevant national laws implementing the Convention on Biological Diversity and Nagoya Protocol agreements (Nagoya Protocol—APA NOR: TREL2002508S/334 in date of the 3rd August 2020). Benefits from this research accrue from the sharing of our data and results on public databases as described above. Collection permits were issued by the Parc national des calanques, Marseille as part of the DEEPHEART project.

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## Introduction

Marine communities are facing one of the worst periods in their recent history. Human activities, including pollution, habitat modification, and overfishing, have significantly impacted these ecosystems. The situation is further aggravated by climate change, which is causing rising seawater temperatures and extreme climatic events like marine heat waves (MHW, Oliver et al. 2018). MHWs globally impact marine ecosystems (Garrabou et al. 2009; Smith et al. 2023),

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harming various organisms (from corals to fishes) and habitats. The Mediterranean Sea is highly vulnerable to warming and MHWs (Garrabou et al. 2009; Aurelle et al. 2022). With its semi-enclosed temperate warm nature, it undergoes pronounced seasonal stratification and experiences elevated and fluctuating summer temperatures in shallow waters. In recent decades, MHW-associated mass mortality events have significantly impacted marine rocky benthic communities across extensive coastal regions, reaching depths of up to 30 m in the NW Mediterranean. Notable occurrences took place at the end of the summers of 1999, 2003, and 2022, spanning thousands of kilometers (Garrabou et al. 2009, 2022; Grenier et al. 2023).

Several gorgonian species, such as *Paramuricea clavata* and *Eunicella cavolini*, have been impacted by these mortality events (Garrabou et al. 2001, 2009; Linares et al. 2008; Estaque et al. 2023). Gorgonian species, as ecosystem engineers, play vital roles in benthic systems by serving as habitats, nurseries for fishes, and promoting high biodiversity (Enrichetti et al. 2019). Their decline or disappearance has severe consequences for the diversity and functioning of hard-bottom habitats (Enrichetti et al. 2019; Gómez-Gras et al. 2021). However, the impact of environmental stressors on these organisms is not spatially uniform, and certain areas may serve as temporary or long-term climate refuges, partially protected from warming disturbances (Glynn 1996; Bongaerts et al. 2010; Bramanti et al. 2023). Glynn (1996) proposed that mesophotic populations (30–150 m) could serve as climate refuges, with cooler and more stable conditions that are less impacted by thermal stress. This suggests the potential for reseeded shallower zones.

Experimental studies on Mediterranean octocorals have yielded mixed findings regarding thermotolerance levels. Non-symbiotic species like *Corallium rubrum* and *Eunicella cavolini*, with shallow populations (exposed to greater variability and potentially stressful conditions) exhibiting higher thermotolerance than mesophotic populations (up to 40–50 m depth; Haguenaouer et al. 2013; Ledoux et al. 2015; Pivotto et al. 2015). Contrastingly, symbiotic white gorgonian *Eunicella singularis* showed stronger stress signals in shallow populations compared to mesophotic populations (15 vs. 35 m; Ferrier-Pagès et al. 2009), while both populations had similar necrosis threshold temperatures (Pey et al. 2013). Disentangling the respective contribution of plasticity and genetic adaptive capacity in these gorgonian responses would require further investigation. Indeed, studies focusing on genetic structure between depths in Mediterranean octocorals revealed species-specific results. While, *Corallium rubrum* displayed strong patterns of genetic structuring along depth (Ledoux et al. 2010; Costantini et al. 2011), low genetic differentiation was observed between shallow and mesophotic populations of *Eunicella cavolini* (20 vs. 40 m, Pivotto et al. 2015). Displaying a low genetic structuring along depths and

higher thermotolerance, a wide bathymetric distribution from ca. 5 m to more than 100 m (Sini et al. 2015) and being a non-symbiotic gorgonian, *Eunicella cavolini* revealed itself as a great model for studying plasticity of mesophotic and shallow populations in a context of climate change.

Species impacted by climate change often display modifications in their physiology, distributions, and phenology (Hughes 2000). Despite the large number of studies on monitoring mass mortality events (Garrabou et al. 2001, 2009, 2022; Estaque et al. 2023), the molecular and physiological mechanisms underlying this variety of thermotolerance remain poorly understood (but see Pratlong et al. 2015 for red coral). The physiological response to stress is indeed complex and many metabolic pathways and proteins are presumably involved in this process. Recent molecular technologies have extended the definition of the phenotype, as the composite of an organism's observable characteristics, to include measurable molecular characteristics, such as gene expression levels. This corresponds to the molecular phenotype (Ranz and Machado 2006). Transcriptional profiling is widely used to study the response of an organism to an extrinsic or intrinsic stressor, however, targeting only gene expression may be limiting. Indeed, many studies have shown a poor correlation between mRNA and protein levels (Abbott 1999; Mayfield et al. 2016). Proteomics appears as an appropriate approach to gain further insight into the molecular and cellular basis of stress response by directly measuring the abundance of proteins, i.e., the ultimate functional molecules.

We conducted a reciprocal transplant experiment to examine the molecular phenotypic plasticity of mesophotic and shallow gorgonian populations using proteomics. Colonies of the non-symbiotic yellow gorgonians *Eunicella cavolini* were reciprocally transplanted between shallow (20 m depth, experiencing increasing water temperatures during summer) and mesophotic habitats (70 m depth, below the thermocline where temperatures remain stable throughout the year (Bensoussan et al. 2010)). Using a shotgun proteomic approach this study investigated (1) whether colonies from distinct shallow and mesophotic environments exhibit distinct molecular phenotypes (Ranz & Machado 2006)? If local adaptation or acclimation occurs, protein expression profiles of shallow vs mesophotic colonies are expected to diverge; (2) do colonies from these two contrasted environments show different acclimatization capacity? We investigated the molecular phenotype of transplanted colonies compared to colonies of their origin or destination depths. High plasticity will be reflected by an important shift in molecular phenotype between transplants and their controls; and (3) what are the underlying molecular processes involved in local adaptation or acclimation? We investigated the molecular pathways differentially expressed between transplants and controls, and discussed their implication

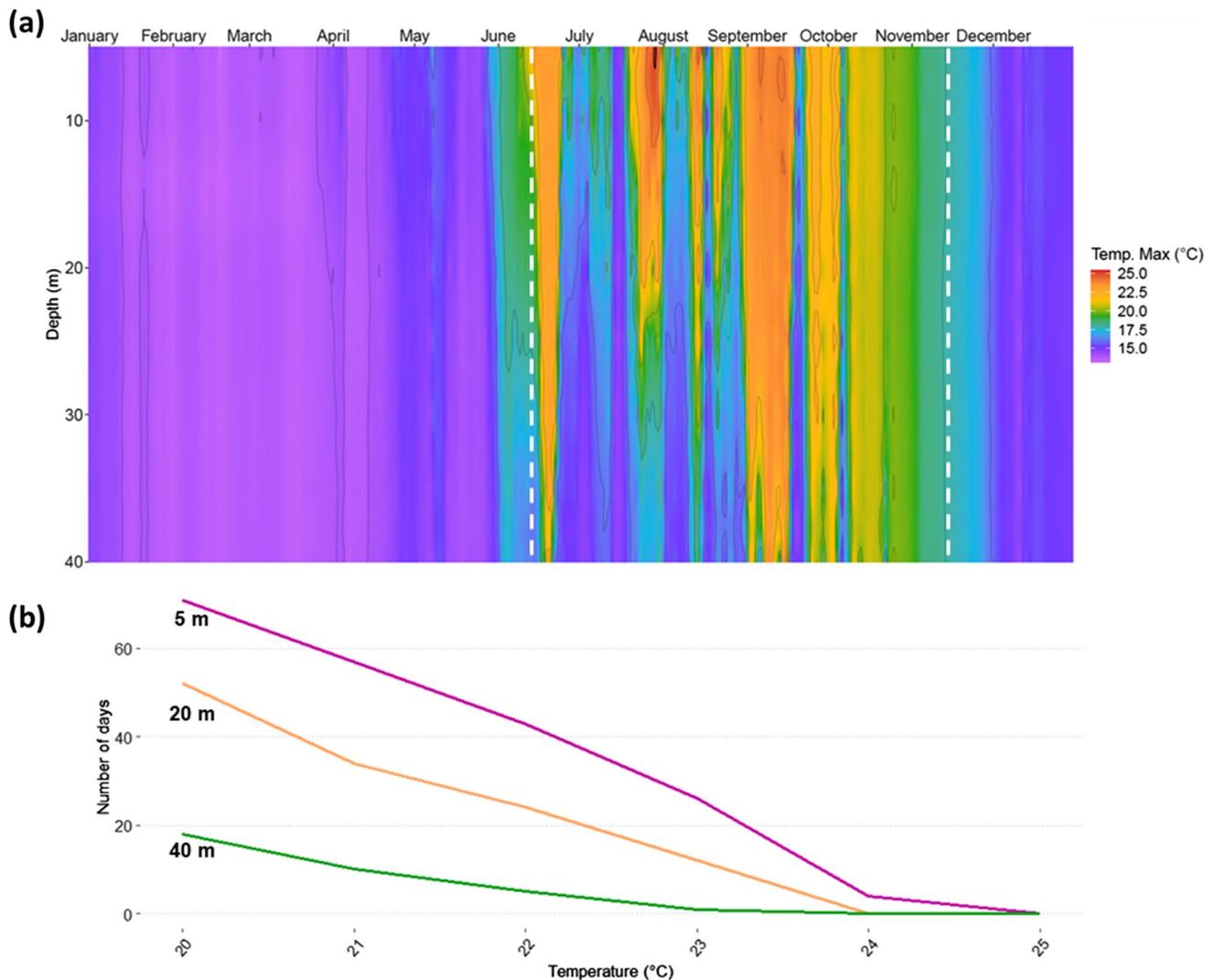
regarding climate change (Reusch 2014) and the deep-sea refuge hypothesis (Glynn 1996).

## Materials and methods

### Contrasted environmental conditions along depth and reciprocal transplant experiment

From late autumn to winter (December–March), seawater temperatures, in the Marseille area, northern Mediterranean Sea, slowly decline, reaching a minimum in March of about

13 °C along the entire water column, before rising slightly until the formation of the thermocline (Fig. 1, Bensoussan et al. 2010). In summer, above this thermocline (~20–30 m depth), strong temperature oscillations may reach 12 °C (Pivotto et al. 2015), and very low nutrient concentrations have been described in open sea (Pasqueron de Fommervault et al. 2015). On the other hand, mesophotic waters (below the thermocline, 30–150 m) display more stable thermal regime (Bensoussan et al. 2010), with potentially higher nutrient concentration but higher-pressure conditions (e.g., 8 bars at 70 m).



**Fig. 1** In situ thermal regime. **a** Time series of daily maximum seawater temperature of the station Riou Sud, located at a distance of 600 m to the transplanting site Imperial du large at Marseille data (provided by T-MedNet.org) (NW Mediterranean Sea) over a year (January 2021–2022). The reciprocal transplantation experiment began mid-June and ended mid-November 2021 (white dotted lines). Black contour represents temperatures exceeding 25 °C. Data were

provided by the regional temperature observation network T-MED-Net, <https://www.t-mednet.org>, site Marseille Riou-sud, Dorian Guillemain, OSU Institut Pytheas UMS 3470. **b** Number of days presenting a temperature over a given value between 20 and 25 °C (daily maximum temperature) at 5 m (purple), 20 m (orange) and 40 m (green) depth along the experiment

A reciprocal transplant experiment was performed from June to November 2021 (spanning over the summer and the beginning of autumn period during which MHW mortality events usually occur) with specimens from two yellow gorgonian populations inhabiting the rocky coast around Marseilles (NW Mediterranean Sea). The water temperature was relatively homogeneous along depths at the moment of the transplantation, and for about two weeks at sampling (Fig. 1). The populations were sampled from shallow and mesophotic waters around the Impérial du Large (43°10'11.5"N 5°23'40.0"E): 20 m (shallow population) and 70 m depth (mesophotic population). Considering the limited dispersal abilities of larval stages in Mediterranean octocorals (Martínez-Quintana et al. 2015; Masmoudi et al. 2016), colonies were sampled at a distance of 20–30 m from each other in order to encompass a wide range of geographic and genetic diversity at each depth. The experiment included four different treatments: two control colonies transplanted at their native depth (Control Shallow ( $C_{20}$ ) and Control Mesophotic ( $C_{70}$ )) and two transplants, transplanted at either 20 m or 70 m (Mesophotic to Shallow ( $T_{70 \rightarrow 20}$ ) and Shallow to Mesophotic ( $T_{20 \rightarrow 70}$ ); Fig. 2). A single colony (identical genotype) provided one fragment control (C) and one fragment transplants (T).

The apical tips (8 cm) of four fragments (two replicates) per colony were randomly sampled via closed-circuit rebreather and fixed underwater on experimental plates (see

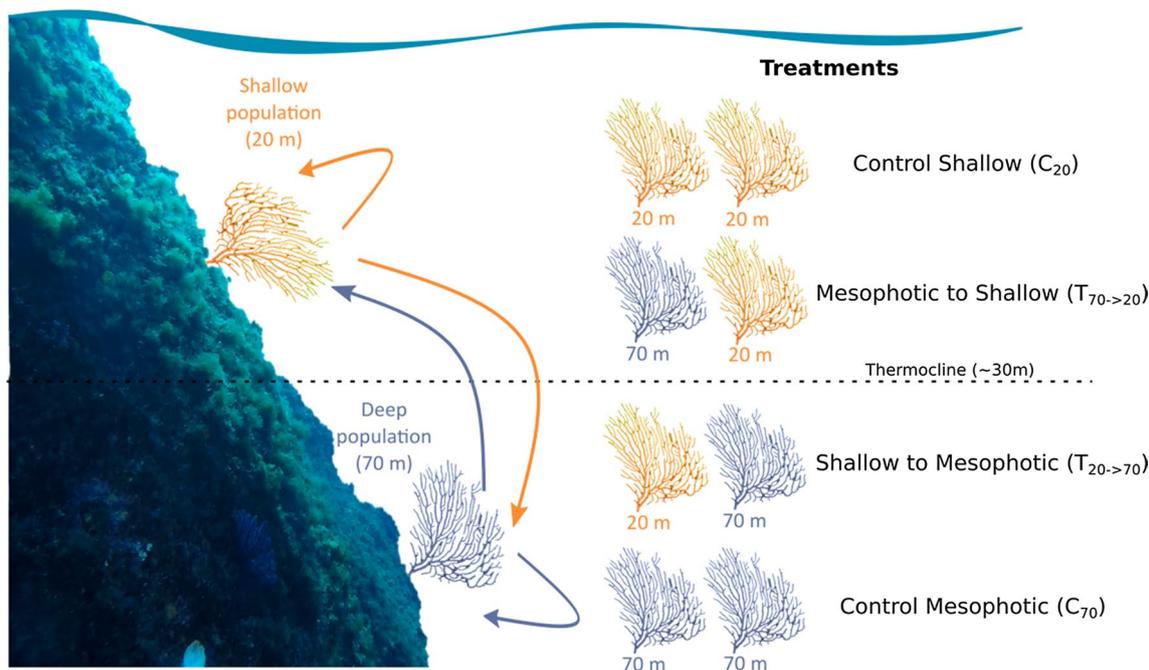
ESM1). Overall, the experiment involved sixteen colonies from two populations (eight shallow and eight mesophotic), shared among eight plates (two plates per treatment). Sampling occurred mid-November (five months post-transplantation). Tissues were removed, frozen immediately in liquid nitrogen, and stored at  $-80^{\circ}\text{C}$  until further analysis.

### Quantitative shotgun-proteomics analysis

Procedures for sample preparation, nanoLC-MS/MS analysis, and mass spectrometry data analysis are detailed in ESM2. Samples were analyzed on a nanoUPLC-system (nano-Acquity, Waters, Milford, MA, USA) coupled to a quadrupole-Orbitrap hybrid mass spectrometer (Q-Exactive HF-X, Thermo Scientific, San Jose, CA, USA). Two samples were excluded from the proteomic analysis due to unsatisfactory protein extraction. Two additional individuals (one  $T_{70 \rightarrow 20}$  and one  $T_{20 \rightarrow 70}$ ) were removed because of a high number of missing values. Altogether, 28 samples were analyzed.

### Protein functional annotation

We used ORSON <https://gitlab.ifremer.fr/bioinfo/workflows/orson> for sequence similarity search (PLAST, Noël et al. 2021), functional prediction using InterProScan (Quevillon



**Fig. 2** Reciprocal transplant design. In June 2021, 16 colonies of *E. cavolini* were reciprocally transplanted between shallow (20 m) and mesophotic zones (70 m). At the end of the experiment (November 2021), 4 treatments were obtained: colony fragments retained at

native depth ( $C_{20}$  and  $C_{70}$ ) and colony fragments transplanted in shallow/mesophotic zones ( $T_{20 \rightarrow 70}$  and  $T_{70 \rightarrow 20}$ ). A single colony provided one control (C) and one transplant (T)

et al. 2005) and Blast2GO to extract GO-terms (Conesa et al. 2005).

### Statistical analysis

Data were filtered to retain proteins present in at least 70% of individuals in each treatment, resulting in a set of 2610 expressed proteins. 1620 missing values (2% of the dataset) were imputed using the random forest method. This method showed strong performance and proved to be the most suitable approach for label-free proteomic studies when the missingness mechanism is not fully understood (Jin et al. 2021). Analyses were performed in R v.4.1.1 (R Core Team 2021).

### Molecular phenotypic plasticity

To investigate the molecular phenotype of the control groups ( $C_{20}$  and  $C_{70}$ ), a discriminant analysis of principal components (DAPC, Jombart et al. 2010) from the ‘adeget’ package was performed on the scaled protein intensities matrix. This analysis retained the first six principal components (PCs) that accounted for 70% of the total variance. The first discriminant function (LD1) served as a measure of molecular phenotype divergence. To quantify plasticity upon transplantation, we projected both transplanted colonies within the same multivariate plan and compared both transplanted treatments to their respective controls. The magnitude of these shifts in mesophotic and shallow gorgonians is proportional to the lengths of the blue and yellow arrows in Fig. 2. These effect sizes were inferred using Markov chain Monte Carlo linear mixed models, with individual genotype specified as random effect and analyzing 1800 samples of parameter estimates to derive  $P$ -values for population-specific differences (‘MCMCglmm’ package).

### Co-expression network and functional enrichment analyzes

#### Gene co-expression network

Using a Weighted Gene Coexpression Network Analysis (WGCNA) (Langfelder and Horvath 2008) on log-transformed proteins abundances matrices, proteins were grouped into modules. The soft threshold for network construction was chosen to ensure that the constructed network closely fit a true biological network state ( $\beta = 6$ ;  $R^2 = 0.91$ ). The default setting of a minimum of 30 proteins per module ensured sufficient protein representation for subsequent functional enrichment analysis. Proteins that did not fall within any modules, indicating low co-expression, were grouped into a separate gray module. Then, we investigated whether module’s eigengenes correlate with

treatment conditions (i.e., Controls:  $C_{20}$  vs.  $C_{70}$ ; Transplants against native depths:  $T_{70 \rightarrow 20}$  vs.  $C_{70}$ ;  $T_{20 \rightarrow 70}$  vs.  $C_{20}$  and Transplants against destination depth:  $T_{70 \rightarrow 20}$  vs.  $C_{20}$ ;  $T_{20 \rightarrow 70}$  vs.  $C_{70}$ ).

### Functional enrichment

Functional enrichment analysis was performed following two complementary methods: (1) for each module that correlated with a treatment, we investigated whether the proteins within belonged to specific molecular pathways (Gene Ontology (GO) terms), and (2) independently of modules we assessed whether proteins displaying high level of GS association with a treatment belonged to specific molecular pathways (GO terms) (Langfelder and Horvath 2008). In both approaches, the “background” for the enrichment analysis was the functionally annotated proteome of *Eunicella cavolini*, which consisted of 20,420 proteins. This subset represents around 40% of the 51,038 predicted proteins (including isoforms and potential protein “fragment”) for this species (see ESM2 for further details about the predicted proteome). This comprehensive background ensures a robust assessment of functional enrichment relative to the entire proteome and is particularly noteworthy given that *E. cavolini* is a non-model species (Heck and Neely 2020). GO term delta rank represents the difference between the mean ranks of the proteins belonging to the specific GO term and the mean ranks of all proteins that the considered GO term do not include. Positive delta ranks indicate an increased tendency, while negative delta ranks indicate a decrease tendency of the GO term considered. It has been tested using (i) Fisher’s exact tests on binary response for membership to the module and ii) using two-tailed Mann–Whitney U test when considering GS. We used the package ‘GO\_MWU’ particularly suitable for non-model organisms ([https://github.com/z0on/GO\\_MWU](https://github.com/z0on/GO_MWU)) (Dixon et al. 2015). Enriched GO terms are displayed in a dendrogram plot. Distances between GO terms reflect the number of shared proteins. Global network visualization was done using Cytoscape V3.9.1 (Shannon et al. 2003) in ClueGO v2.5.9 (Bindea et al. 2009).

### Functional comparison between transplants

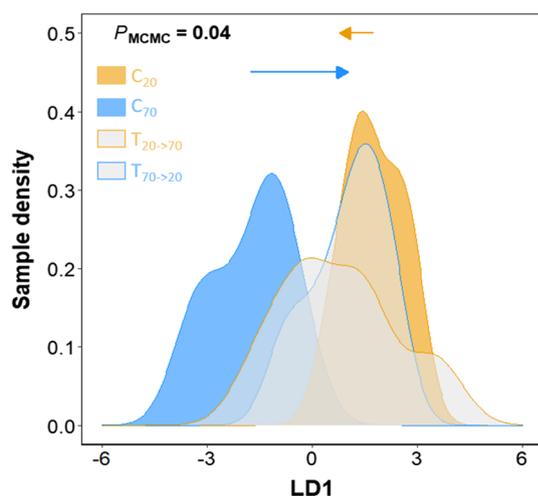
In order to compare the functional response similarity between treatments, their respective GO term delta ranks were plotted against each other. The strength of the relationship indicates the similarity of enrichment. It is important to note that these plots do not represent a formal statistical test since the data points (gene ontology categories) are not independent, as they often include overlapping sets of proteins. Nevertheless, they provide insights into functional similarity or dissimilarity in enrichments.

## Results

At the end of the experiment, no necrosis nor mortality were observed in any of the four treatments (Control Shallow, Control Mesophotic, Mesophotic to Shallow, and Shallow to Mesophotic).

### Transplantation reveals plastic protein expression

Molecular phenotypes between control mesophotic and control shallow gorgonians were well discriminated (low overlap between solid distributions, Fig. 3) by the first eigenvector LD1 explaining 43% of the total variance. The molecular phenotypic shift of the two transplanted treatments were assessed by projecting their respective molecular phenotype within the same multivariate plan (light distributions, Fig. 3). The magnitude of this shift represents a quantitative measure of protein abundance plasticity. Gorgonians transplanted from mesophotic to shallow habitats exhibited a significantly larger molecular phenotypic shift than shallow gorgonians transplanted to mesophotic habitats ( $P_{\text{MCMC}} = 0.04$ , blue arrow). The former resulted in a nearly perfect match with the control Shallow molecular phenotype (light blue, Fig. 3), while the latter mostly remained in between the two controls (light yellow, Fig. 3).



**Fig. 3** Protein expression plasticity in transplanted gorgonians based on DAPC analysis on the scaled matrix of protein intensities (all identified and filtered proteins). The  $x$  axis is the direction along which the difference between control Mesophotic and Shallow gorgonians is maximized (discriminant function which explained 43% of total variance). The curves are density plots of the four treatments. Blue and Yellow indicate gorgonians originating from mesophotic and shallow reefs respectively; solid fills indicate control groups, whereas transparent fills represent transplants. Arrows indicate the extent of protein expression shifts upon transplantation

### Weighted gene co-expression network analyzes

To delve into the underlying molecular mechanisms of *Eunicella cavolini*' plasticity, we performed a weighted gene co-expression network analysis (WGCNA). The analysis assigned all 2,610 log-transformed protein abundances to ten co-expression modules of 31–732 proteins (designated by colors, Fig. 4). Eight module eigengenes displayed significant and strong correlations with treatments (Fig. 4).

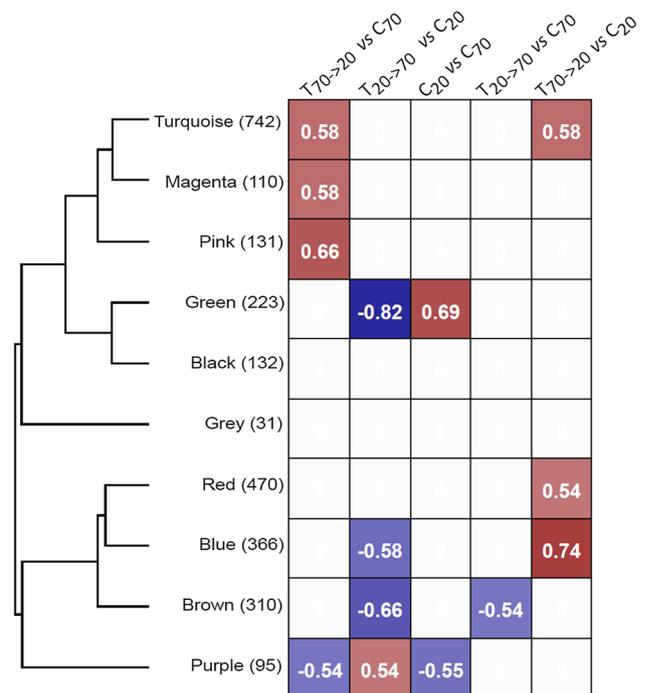
#### Mesophotic versus shallow

The comparison between the two control groups ( $C_{20}$  vs.  $C_{70}$ ) correlated with two modules (green and purple) that did not show any functional enrichment.

#### Transplant versus origin

Four modules (magenta, pink, turquoise and purple) correlated with the comparison  $T_{70 \rightarrow 20}$  versus  $C_{70}$ . However, Gene Ontology (GO) enrichment analysis of proteins in these modules revealed no enriched GO terms.

The opposite transplant  $T_{20 \rightarrow 70}$  versus  $C_{20}$  also showed significant correlation with four modules (green, purple, brown and blue). Among these modules, only the brown



**Fig. 4** Hierarchical clustering dendrogram of module eigengenes and heatmap of Spearman's correlation coefficients between module eigengenes (rows) and treatment (columns). Values with module names indicates the number of proteins belonging to each module

module displayed a significant GO enrichment. It included enrichment of eight GO terms related to metabolism, notably lipid metabolism and catabolism (e.g., *cellular lipid metabolic process* (GO:0044255), *long-chain fatty acid metabolic process* (GO:0001676) and *regulation of cellular catabolic process* (GO:0031331), Fig. 5a), as well as cell organization (e.g., *regulation of cell-substrate junction organization* (GO:0150116), *regulation of cell-matrix organization* (GO:0001952) and *negative regulation of smooth muscle cell proliferation* (GO:0048662), Fig. 5a). Within these eight enriched GO categories, six were under-represented in transplanted colonies compared to their control (z-score < 0, Fig. 5b), while two displayed little to no change (equivalent number of proteins with increased and decreased abundance, white rectangle, Fig. 5b).

#### Transplant versus destination

T<sub>20→70</sub> versus C<sub>70</sub> displayed a significant correlation with the brown module described above. The same response was observed with the T<sub>20→70</sub> versus C<sub>20</sub> comparison displaying a general under-representation of the eight enriched GO categories in the transplanted colonies (ESM5). Finally, T<sub>70→20</sub> versus C<sub>20</sub> revealed positive correlation with three modules (turquoise, blue and red) without any significant functional enrichment.

#### Enrichment with gene significance

GO enrichment analysis based on the Gene Significance of each protein (correlation with a specific treatment) enabled the discovery of pathways that were significantly enriched, regardless of the module to which they were assigned. These results are displayed in Fig. 6.

#### Shallow versus mesophotic

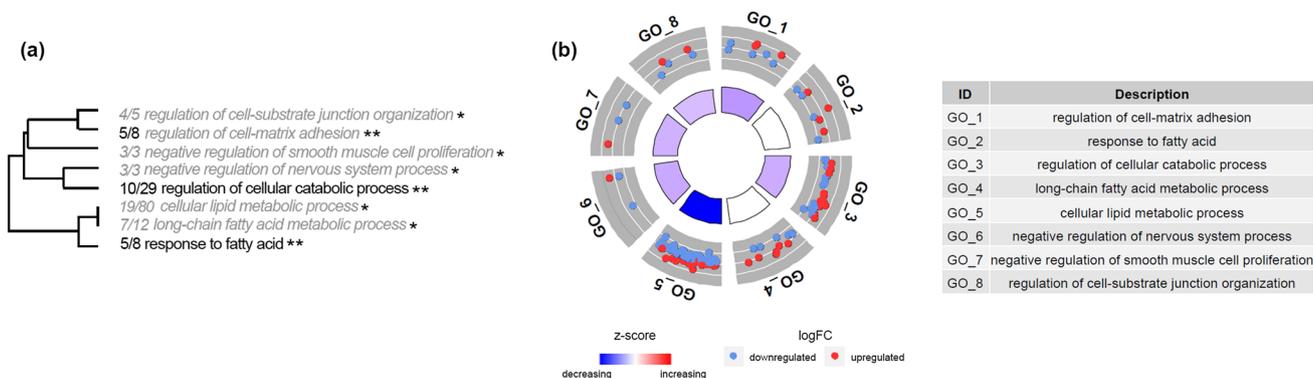
The comparison of the two control treatments (C<sub>20</sub> vs. C<sub>70</sub>) exhibited a significant enrichment in seven GO, mainly related to metabolism and cell structure (*cell part morphogenesis* (GO:0032990), ESM6, Fig. 6). Notably, four out of these seven GO over-represented in C<sub>20</sub>, were similarly found in the comparison between T<sub>70→20</sub> and their controls C<sub>70</sub> (ESM6).

#### Transplant versus origin

T<sub>70→20</sub> vs. C<sub>70</sub> rank-based functional enrichment analyzes based on Gene Significance, highlighted an enrichment in fourteen GO categories, mainly involved in metabolic pathways (e.g., *cellular amide metabolic process* (GO:0043603), *carbohydrate metabolic process* (GO:0005975)) and immune response (e.g., *innate immune response* (GO:0045087), *immune system process* (GO:0002376)) (Figs. 6, 7a). Proteins involved in immune pathways displayed a general decreasing abundance (z-score < 0) while biosynthetic and metabolic GO terms were over-represented (z-score > 0) except “carbohydrate metabolic process” which was under-represented in T<sub>70→20</sub> (Fig. 7c). By opposition, enrichment analysis for T<sub>20→70</sub> vs. C<sub>20</sub> displayed four of the same metabolic and biosynthetic GO terms differentially represented although under-represented (Fig. 7b, d).

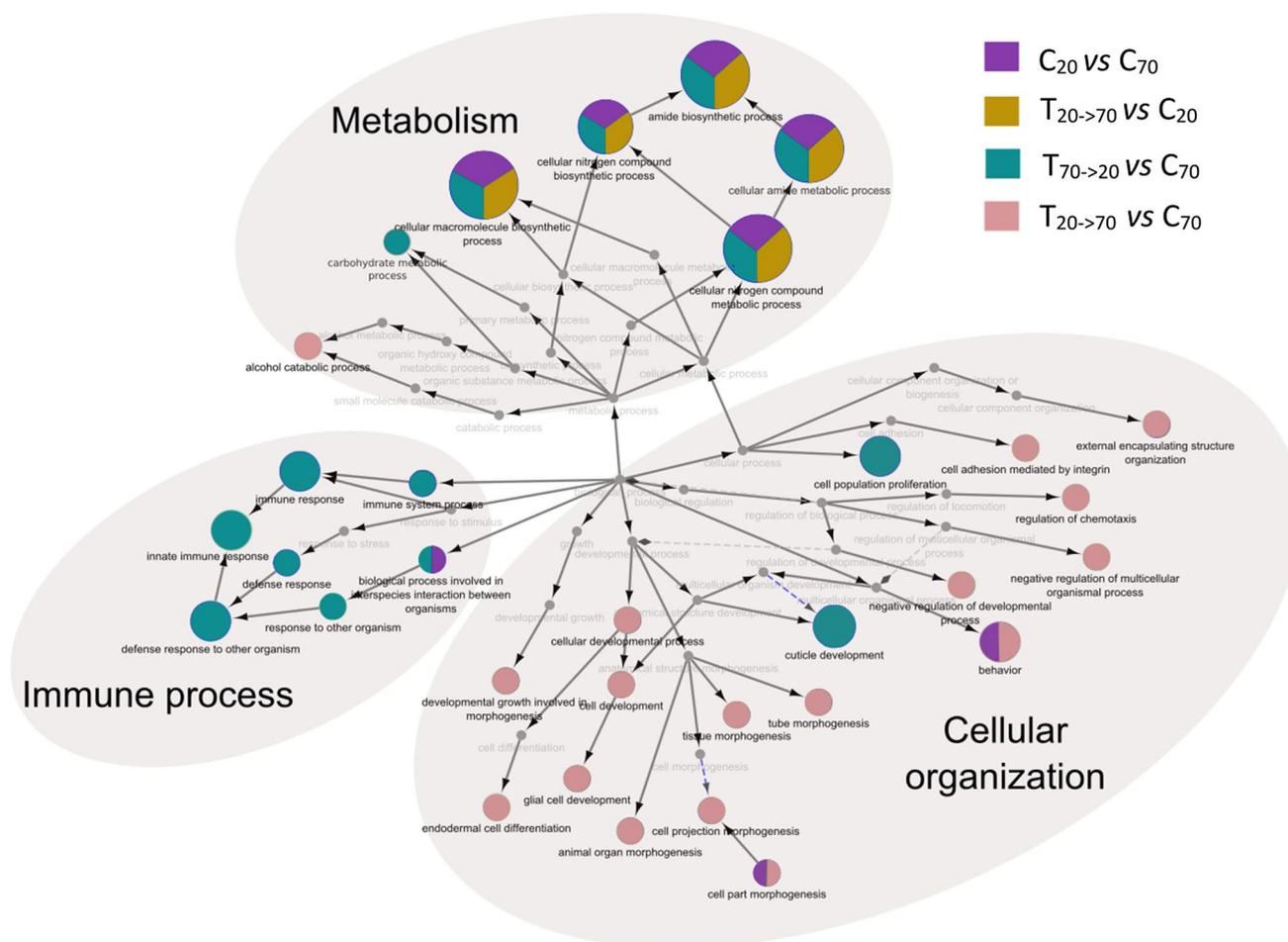
#### Transplant versus destination

While comparison between T<sub>70→20</sub> and C<sub>20</sub> colonies revealed no functional enrichment, the comparison T<sub>20→70</sub> versus C<sub>70</sub> exhibited twenty one enriched GO categories mainly involving cell organization and adhesion pathways (e.g., *cell adhesion mediated by integrin* (GO:0033627), cellular



**Fig. 5** Gene Ontology (GO) enrichment analysis of WGCNA protein in “brown” module for T<sub>20→70</sub> versus C<sub>20</sub>. **a** Hierarchical clustering of enriched biological process gene ontology terms among proteins in the brown module. \*FDR < 0.1, \*\*FDR < 0.05, \*\*\*FDR < 0.01). Fractions indicate the number of proteins that are differentially

regulated. **b** Enrichment analysis of the 8 enriched GO terms. Blue dots show a protein underexpressed in colonies T<sub>20→70</sub> vs C<sub>20</sub>, red dots indicate protein overexpressed. Z-score = (upregulated - downregulated) / √(upregulated + downregulated)



**Fig. 6** ClueGO analysis of biological process significantly enriched ( $FDR < 0.1$ ) in at least one treatment comparison. Node size correspond to the statistical significance (FDR)

developmental process (GO:0048869), *external encapsulating structure organization* (GO:0045229), ESM7, Fig. 6). All enriched categories were under-represented in T<sub>70->20</sub> compared to C<sub>20</sub> (ESM7).

Comparison of the delta-rank values between T<sub>70->20</sub> versus C<sub>70</sub> and T<sub>20->70</sub> versus C<sub>20</sub> revealed a low but significant negative correlation ( $cor = -0.20$ ,  $p < 0.01$ ), highlighting similarities in the processes involved, displaying opposite responses to transplantations.

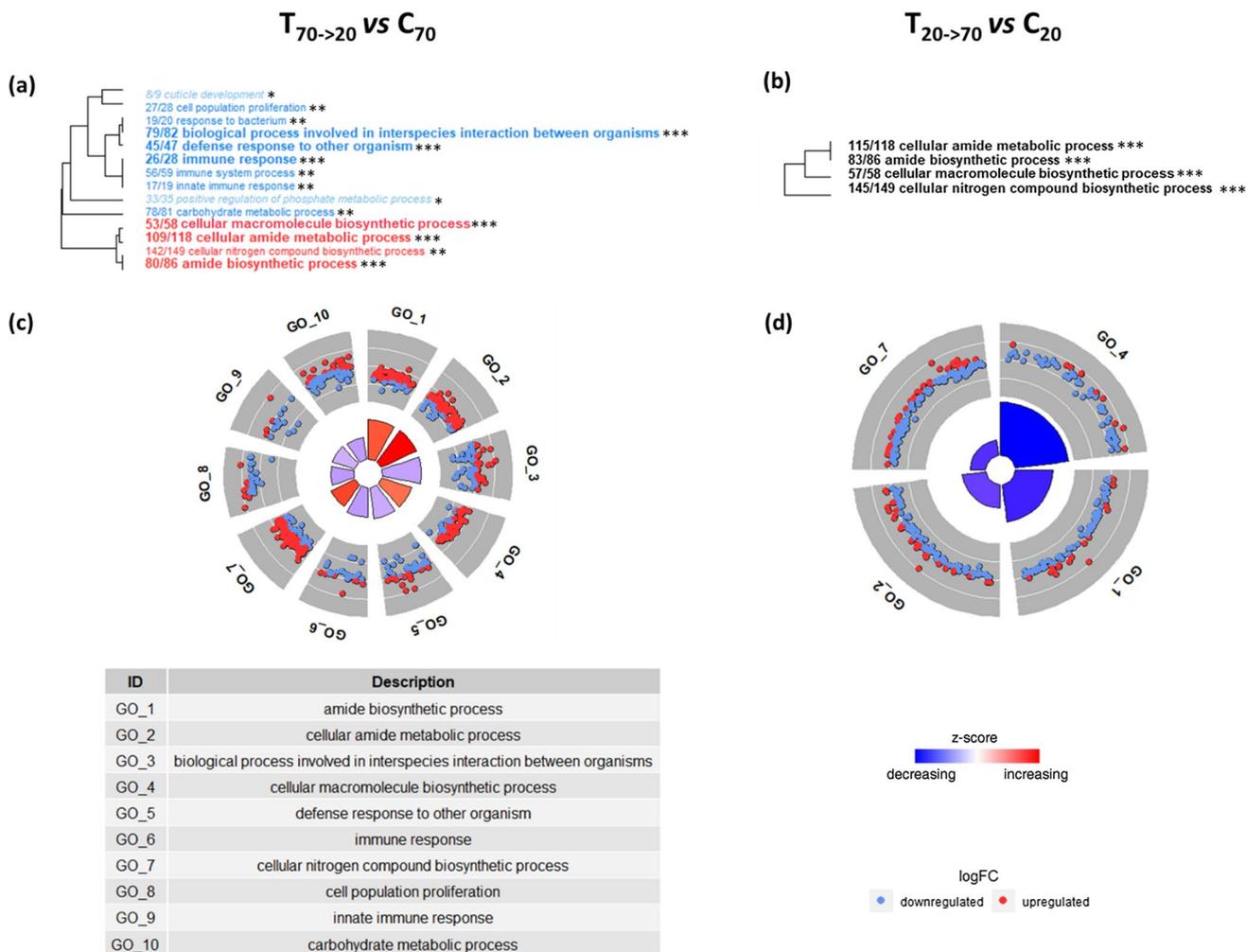
## Discussion

Climate change affects a number of physiological and metabolic changes in cnidarians, as already well-studied in hexacorals (Brener-Raffall et al. 2019; Dixon et al. 2020). Our study is the first to compare the proteomic patterns in temperate octocorals inhabiting contrasting mesophotic and shallow zones. The choice of a cnidarian that does not host algal symbionts (*Symbiodiniaceae*) allowed us to overcome

the effect of algal symbionts on stress response and on adaptation/acclimation to local environment. After transplantation of *E. cavolini* colonies to different depths (i.e., Mesophotic to Shallow compared to Control Mesophotic and Shallow to Mesophotic compared to Control Shallow), we detected physiological responses that involved similar metabolic pathways and specific biological processes depending on the depths of origin or transplantation (albeit they were not similarly regulated). We also highlighted processes that were specifically affected after transplantation in shallow water.

## Differential phenotype between depths

Relying on “Gene Significance” GS, we evidenced functional enrichment in metabolism pathways between colonies from different depths in basal condition (control treatments: C<sub>20</sub> vs. C<sub>70</sub>). Higher temperatures in shallow waters compared to 70 m (Fig. 1) could lead to increase energy metabolism in shallow colonies compared to colonies that



**Fig. 7** Gene Ontology (GO) enrichment analysis using protein Gene Significance. **a** and **b** Hierarchical clustering of enriched biological process gene ontology. \*FDR < 0.1, \*\* FDR < 0.05, \*\*\* FDR < 0.01. Fractions indicate the number of proteins that are differentially regulated. **c** and **d** GO circle plot displaying enrichment analysis for the first 10 GO terms with lowest FDR. Blue dots

showed a protein underexpressed in colonies T<sub>20→70</sub> **c** T<sub>20→70</sub> **d** to their respective control, red dot indicated protein overexpressed. The outer to inner layers of gray circles indicated the relative fold-change of gene expression (from higher to lower). Z-score = (upregulated - downregulated) / √(upregulated + downregulated)

stayed at 70 m. These results highlight that environmental conditions at each depth act on protein regulation. Such modification may reflect local genetic adaptation or acclimation leading to different molecular phenotype. Considering protein regulation as a molecular phenotype, we therefore demonstrated that phenotypes are significantly different in individuals inhabiting different depths. This may provide insights into the underlying molecular processes contributing to the observed variations in the levels of thermotolerance (survival/necrosis) within the same area for *E. cavolini* up to a depth of 40 m (20 m vs. 40 m; Pivotto et al. 2015).

**On the whole-proteome level, are mesophotic colonies more plastic than their shallow counterparts?**

At the whole-proteome level, we observed a substantial plastic convergence of mesophotic colonies when transplanted in shallow waters (Fig. 3). Interestingly, our analysis suggests that gorgonians from mesophotic waters may exhibit a more plastic response to being transplanted into shallow waters, compared to native shallow gorgonians transplanted at 70 m. Although this result should be taken with caution in regard to the large number of protein considered and the rather low number of individuals, it is consistent with functional enrichment (KOG and GO). Altogether it shows that transplants “Mesophotic to Shallow” presented the same molecular phenotype as colonies staying at 20 m (no GO

categories and nor KOG were significantly enriched ESM3 and ESM4), whereas transplants “Shallow to Mesophotic” showed an intermediate phenotype (Fig. 3). Indeed, shallow colonies placed at 70 m fall short of displaying the protein expression of control mesophotic colonies. This difference may be attributed either to a lower phenotypic plasticity or to a lower constraining environmental change. Building on this idea, an additional explanation would be that the five-months duration of our study was not sufficient for these colonies to establish a molecular phenotype similar to control individuals at 70 m. Alternatively, individuals at shallow depths where temperature fluctuations are of higher magnitude during summer (Fig. 1) may be under stronger environmental constraints and therefore display local adaptation. As a consequence, being well adapted to shallow water could constrain their phenotypic plasticity as we observed when transplanted at 70 m. Enrichment analysis of the transplantation to mesophotic waters revealed a general decrease of proteins abundance involved in cell structure and cytoskeleton (compared to control mesophotic treatment). Manual curation of the *E. cavolini* proteome revealed biomineralization “tool-kit” proteins (Drake et al. 2013), including calcium-binding proteins and skeletal organic matrix proteins (i.e., myosin, tubulin, actin etc.). Similarly, Tambutté et al. (2015) suggested that corals may increase levels of skeleton organic matrix proteins to promote calcification under less favorable calcifying conditions (such as higher temperature and lower pH) as it is partially the case in shallower water in the Mediterranean sea. This could explain the decreasing level of proteins involved in calcification for colonies transplanted to a more stable habitat at 70 m. While the identification of cytoskeleton proteins may be influenced by their abundance in eukaryotic cells, our finding aligns with previous works highlighting that cytoskeleton is emerging as a common target of stresses from multiple origin (Tomanek 2014). It can also hypothesize that this under-representation is a physiological acclimation of native shallow colonies confronted to higher pressure condition at 70 m. Reduced abundance of proteins involved in calcification could suggest a decrease in growth rate of these transplanted colonies. Assessing ultimate fitness would help disentangling the mechanism involved and their long-term consequences which call for further research.

Our results lend additional support to an emerging insight that protein expression plasticity may play a substantial role in migrants’ adaptation to novel environments. Kenkel & Matz (2017) subjected mustard hill coral (*Porites astreoides*) to a reciprocal transplant experiment across a temperature gradient, and likewise found transcriptomic convergence of migrants toward residents. A large body of existing studies suggest that increased plasticity occur in temporally or spatially heterogeneous habitats (Baythavong 2011). Our result present an intriguing puzzle as we observe greater proteomic

plasticity in gorgonians from mesophotic population, despite their seemingly more stable habitat. Mesophotic environment still remain poorly studied especially in coastal areas and its local environment may vary in other ways (biotic and abiotic; food, sediment...) potentially affecting molecular phenotypes. Altogether this definitely urges for further investigation of the mesophotic ecosystems (Bramanti et al. 2023).

### Transplantation into non-native habitats reveals static and plastic protein expression

The set of pathways enriched in both transplanted colonies (Mesophotic to Shallow and Shallow to Mesophotic) suggests a common response to transplantation with opposite regulation patterns. While energy metabolism pathways were all over-represented in the colonies Mesophotic to Shallow (vs. Control Mesophotic), those same functions were under-represented in the opposite treatment (Shallow to Mesophotic vs. Control Shallow). As previously suggested, elevated temperatures in shallow waters is expected to upregulate energy metabolism. Notably, this increase did not encompass carbohydrate metabolism as it was under-represented. Accordingly, Tignat-Perrier et al. (2022) described in the same species and a close relative (the red gorgonian *Paramuricea clavata*) a significant reduction of carbohydrates reserves at the end of a seven week of experimental thermal stress (−58% in *P. clavata* and −45% in *E. cavolini*). This under-representation may be amplified by the low nutrient concentrations in shallow water compared to mesophotic waters during summer (Pasqueron de Fommervault et al. 2015). While a high metabolism can lead to elevated levels of Reactive Oxygen Species (ROS) and cellular damage (Lesser 2006), the response to oxidative stress and the apoptotic process remained unaffected in our study unlike previous results reported for *S. pistillata* being transplanted from 60 to 20 m (Malik et al. 2021). Simultaneously, we observed a decrease in the abundance of proteins associated with the calcification process in colonies transplanted to shallow waters in comparison to colonies from the control Mesophotic treatment. Accordingly, a downregulation of genes involved in calcification in colonies from another octocoral *Pinnigorgia flava* exposed to heat stress was previously observed (Vargas et al. 2022).

Colonies transplanted at 70 m displayed an opposite response with a global under-representation in all enriched metabolism pathways. Simultaneously, shallow to mesophotic colonies revealed decreasing level of proteins related to lipid metabolism and transport (compared to their control) in accordance to reduced energy metabolism. Previous studies quantifying respiration responses have highlighted that mesophotic zooxanthellate corals exhibit depressed metabolic rates compared to their shallower conspecifics (Lesser

et al. 2010; Cooper et al. 2011). These findings align with our observation in non-symbiotic octocoral and call for further research to characterize their local abiotic and biotic environment. Characterizing local stressor and positive drivers of growth and maintenance will aid in understanding underlying mechanisms and ultimate fitness consequences of the local environment on the resilience of this sessile species to climate change.

One of the main results of our experiment was a decreasing level of proteins involved in immune response in colonies transplanted from mesophotic to shallow zones. Environmental stressors have already been linked to immunosuppression in other invertebrates such as oysters (Raftos et al. 2014) and patterns of immunosuppression in corals have been observed in zooxanthellae hexacorals during and after bleaching (Pinzón et al. 2015). These immunosuppressive response has been suggested to result from the increase in new diseases and disease prevalence after bleaching (Raftos et al. 2014) and may be induced by increasing pathogens prevalence in close related species during MHW (see Prioux et al. 2023 for an example in *Paramuricea clavata*). However, the absence of necrosis and of typical molecular stress pathways in this present studies (e.g. reduction of ribosomal representation, increased levels of heat shock proteins and antioxidants (Desalvo et al. 2008, 2010; Császár et al. 2009)) leaves the door opens to alternative hypotheses. The absence of common molecular response to stress might be attributed to the timing of sample collection, which occurred considerably after the onset of potential stress responses. Indeed, in our study the proteomic response was assessed five months after reciprocal transplantation and at least two weeks after the water temperature dropped below 21 °C (Fig. 1). This timeframe contrasts with other studies that have examined physiological responses within few days of exposure to stressful conditions. Secondly, the immune system that undergoes suppression may allow to reallocate resources to other metabolic demands (Deerenberg et al. 1997; Demas et al. 1997) such as cytoskeleton modulation, as evidenced by an increasing energy metabolism in this study. This hypothesis posits trade-offs between immune system and other primary functions, suggesting that significant energy savings can be achieved by suppressing the immune system. However, further investigation is needed, particularly focusing on the associate microbiome and its dynamic after transplantation. Alternatively, immunosuppression might occur as the organism's attempt to mitigate autoimmune damage in times of stress (Råberg et al. 1998). In our case, transplantation led to cytoskeleton modifications, potentially altering the self-antigen repertoire and triggering an immune response akin to that observed in tissues damaged by disease. As previously suggested, optimal functioning might involve suppressing immune responses to avoid immunopathology (Bagby et al. 1994). Monitoring

immune function and cytoskeleton on a shorter time scale (e.g., monthly) during the summer would enhance our understanding of the trade-offs and progressive acclimation occurring in this species.

### Implications for gorgonian acclimation to climate change

The molecular shift in mesophotic colonies transplanted to shallow waters (i.e., overall increasing metabolism) suggests capacity for acclimation. This finding demonstrates that the *E. cavolini* populations examined in this study display physiological plasticity in response to environmental stress, at least over the time scale of our study (i.e., five months). Nevertheless, the metabolic remodeling of *E. cavolini* in shallow waters involved an increased abundance of energy metabolism-related proteins. This aligns with the hypothesis that such acclimation is energetically demanding, raising questions about its effectiveness in coping with thermal stress, such as a marine heatwave. A rigorous evaluation of this hypothesis would require direct measurements of respiration rates, energy reserves and ultimate impact on fitness, underscoring the need for further research in this area.

Furthermore, despite immunosuppression, the colonies displayed no signs of necrosis or apoptosis, emphasizing the acclimation capacity of this species. Notably, heat-shock protein homologues (five HSP70, one HSP60, one HSP90 and two HSP10) were detected at both depths, but their abundance did not show significant differences. While this contrasts with short term experimental stress on the Mediterranean red coral (*Coralium rubrum*) where HSPs were involved in stress response (Haguenaer et al. 2013), it also suggests that several months of exposition may be sufficient to recover HSP levels to baseline. Alternatively, these results could be attributed to the absence of massive thermal anomalies in the Marseille area during that specific year (Fig. 1). Seawater temperature did not reach 24 °C at 20 m that summer (Fig. 1b), the critical temperature for two other Mediterranean gorgonian species being 25 °C (*P. clavata* and *C. rubrum*, Ledoux et al. 2015; Garrabou et al. 2022). Additionally, *E. cavolini* did not exhibit necrosis when experimentally reared at 23 °C (~100% of necrosis at 27.5 °C for 36 days; Pivotto et al. 2015). Nevertheless, further research on the physiological signature of organisms presenting necrosis is needed to identify the underlying cellular processes involved.

Overall, our findings suggest a significant capacity of *E. cavolini* to cope with potential stressful conditions, aligning with previous reports (Previati et al. 2010; Tignat-Perrier et al. 2022). However, a recent episode of mass mortality during the summer of 2022 in NW Mediterranean Sea affected gorgonians, resulting in mortality rates of up to 80%

between 0 and 30 m of depth for *P.clavata* and to a lower extent for *E.cavolini* (10–30%) (Estaque et al. 2023). Ongoing proteomic analysis of individual identified as “resistant” vs. “vulnerable” in this region following this mass mortality event will provide insights into the molecular phenotype of necrotic individuals and the potential proteins involved in the differential responses of colonies and populations to thermal stress.

There is currently limited information on genetic connectivity between mesophotic and shallow gorgonian populations (but see Ledoux et al. 2010, Costantini et al. 2011, Haguenaer et al. 2013 for *C.rubrum*), representing a critical gap in understanding the role of mesophotic population in reef resilience. Nevertheless, given the escalating pressures on coral reefs, particularly at shallow depths (< 30–40 m) (Bak et al. 2005; Bramanti et al. 2023), the findings of this study suggest the absence of physiological barrier to recolonization (but see Pivotto et al. 2015 for an experiment on thermotolerance). This reinforces the crucial role of mesophotic ecosystems as a potential source of recruits for their affected shallow counterparts. While our study clearly identified different response patterns between shallow and mesophotic populations, it is important to note that it focuses on a limited geographic area of the Mediterranean Sea. Therefore, there is a need to extend such approaches at a large geographic scale to validate our observations.

## Conclusion

This pioneering study compares proteomic patterns of a temperate octocoral across individuals from diverse environmental conditions. By extending such approaches to an octocoral in a field where hexacorals are predominantly studied, it sheds lights on the potential acclimation of cnidarians to climate change. The observed expression patterns in mesophotic colonies transplanted to shallow waters indicate acclimation and highlight the molecular plasticity of *E. cavolini* populations in responses to environmental challenges. Importantly, this study suggests the absence of physiological barrier hindering natural recolonization from mesophotic colonies. It underscores the significance of mesophotic areas and emphasizes the need for further scientific investigation and careful consideration of these zones in the management plans of protected and exploited areas.

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**Author contributions** QS, BM, JBL, DA and FB designed the study. BM, QS, RH, OB and ABe did the fieldwork. FB, NC, and ABr realized the proteomic preparation and analysis. QS, ABe, NC, AB and FB managed the bioinformatics. ABe, JLL, JMF and QS did the statistical analysis. ABe and QS wrote the manuscript, BM, JLL, JBL, DA and JMF provided critical comments and contributed to the final version of the manuscript.

**Data availability** Raw mass spectrometry proteomics data have been deposited to the ProteomeXchange Consortium via the PRIDE (Perez-Riverol et al. 2019) partner repository with the dataset identifier PXD037261. Metadata, including georeferences in decimal degrees, date of sampling event and unique sample identifier tags that can be matched to the deposited raw mass spectrometry data, are available in Supplementary Material (ESM9).

## Declarations

**Conflict of interest** The authors declare no conflict of interest.

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