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## Complexities of gene expression patterns in natural populations of an extremophile fish (*Poecilia mexicana*, Poeciliidae)

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### Abstract

Variation in gene expression can provide insights into organismal responses to environmental stress and physiological mechanisms mediating adaptation to habitats with contrasting environmental conditions. We performed an RNA-sequencing experiment to quantify gene expression patterns in fish adapted to habitats with different combinations of environmental stressors, including the presence of toxic hydrogen sulphide (H<sub>2</sub>S) and the absence of light in caves. We specifically asked how gene expression varies among populations living in different habitats, whether population differences were consistent among organs, and whether there is evidence for shared expression responses in populations exposed to the same stressors. We

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#### DATA ACCESSIBILITY

Raw reads of gill ( $N=14$ ), liver ( $N=16$ ) and brain ( $N=11$ ) transcriptomes of *P. mexicana* are archived in the NCBI Short Read Archive (SRA; study accession ID: PRJNA369434). The *P. mexicana* reference genome was obtained from NCBI GenBank (Accession no: LMXC00000000.1) along with the mitochondrial reference sequences (Accession no: KC992991). Scripts for all analyses performed are located at <https://github.com/jokelley/cave-molly-transcriptomes>.

#### AUTHOR CONTRIBUTIONS

C.N.P. and M.T. designed the study. C.N.P., L.A.R. and M.T. conducted fieldwork. C.N.P., M.-C.Y., A.S. and J.L.K. conducted laboratory work. C.N.P., A.P.B., J.L.K. and M.T. conducted the analysis. M.S., W.C.W. and C.B. provided some reagents and analytical tools. C.N.P. and M.T. wrote the manuscript, and all authors contributed substantially to revisions.

#### SUPPORTING INFORMATION

Additional Supporting Information may be found online in the supporting information tab for this article.

analysed organ-specific transcriptome-wide data from four ecotypes of *Poecilia mexicana* (nonsulphidic surface, sulphidic surface, nonsulphidic cave and sulphidic cave). The majority of variation in gene expression was correlated with organ type, and the presence of specific environmental stressors elicited unique expression differences among organs. Shared patterns of gene expression between populations exposed to the same environmental stressors increased with levels of organismal organization (from transcript to gene to physiological pathway). In addition, shared patterns of gene expression were more common between populations from sulphidic than populations from cave habitats, potentially indicating that physiochemical stressors with clear biochemical consequences can constrain the diversity of adaptive solutions that mitigate their adverse effects. Overall, our analyses provided insights into transcriptional variation in a unique system, in which adaptation to H<sub>2</sub>S and darkness coincide. Functional annotations of differentially expressed genes provide a springboard for investigating physiological mechanisms putatively underlying adaptation to extreme environments.

### Keywords

caves; extreme environments; hydrogen sulphide; local adaptation; poeciliidae; transcriptomes

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## 1 | INTRODUCTION

High-throughput sequencing technologies have transformed the quantification of genome-wide gene expression patterns in natural systems (Wang, Gerstein, & Snyder, 2009). While studies of gene expression cannot identify causal loci underlying adaptation, transcriptional variation between organisms exposed to contrasting environmental conditions can provide important clues about genes and physiological pathways contributing to plastic or adaptive responses to novel environments (e.g., Cheviron, Whitehead, & Brumfield, 2008; Guo et al., 2016; López-Maury, Marguerat, & Bähler, 2008; Morris et al., 2014). Studies often focus on systems where evolutionarily replicated lineages are exposed to the same environmental conditions, which allows for the identification of shared and unique (i.e., lineage-specific) gene expression responses (Kelley et al., 2016; Whitehead, Pilcher, Champlin, & Nacci, 2012). Shared differentially expressed genes among lineages exposed to the same environmental conditions represent prime candidates for loci and physiological pathways that may be modulated during acclimation or adaptation (Whitehead, 2012). However, the degree to which gene expression patterns are shared among lineages exposed to the same environmental conditions may be structured hierarchically across levels of organismal organization, with shared responses increasing at higher levels of organization. Such patterns have been well established by studies that illuminate the genetic basis of phenotypic convergence, which may be caused by the same mutation, different mutations in the same gene, mutations in different genes of the same developmental pathway, or genes in different developmental pathways (see Manceau, Domingues, Linnen, Rosenblum, & Hoekstra, 2010; Elmer & Meyer, 2011; Rosenblum, Parent, & Brandt, 2014 for reviews). Analogously, organismal and evolutionary gene expression responses to a common environmental stressor may be mediated by the differential expression of the same transcript, different transcripts derived from the same gene, different genes in the same physiological pathway, or genes in different physiological pathways. It remains largely unknown what factors determine how

shared expression responses are distributed across hierarchical levels, but the effects of specific sources of selection, phylogenetic history, demography, and genetic constraints have all been implicated as potential candidates (Rosenblum et al., 2014). Addressing this question requires integrative data analysis that explicitly considers the functional links among transcripts in genome-wide expression studies.

Another key challenge in the analysis of gene expression data from natural systems is that gene expression is notoriously plastic over short periods of time and in response to diverse endogenous and exogenous stimuli (Baji & Poyatos, 2012; Lehner, 2010). At the same time, selective regimes even among apparently discrete habitat types are often multifarious (Holmstrup et al., 2010; Kaeuffer, Peichel, Bolnick, & Hendry, 2012). Nonetheless, we know relatively little about genome-wide expression responses in natural systems where closely related populations are exposed to multiple sources of selection that occur in different combinations. Organismal responses to multiple environmental cues may be additive such that their combined effects represent the sum of the effects of individual stressors (Folt, Chen, Moore, & Burnaford, 1999). Alternatively, multiple stressors may cause synergistic (responses greater than the sum of individual stressors) and antagonistic effects (responses smaller than the sum of individual stressors; Folt et al., 1999; Altshuler et al., 2011). Interactive effects and trade-offs that underlie nonadditive responses hamper our ability to identify shared gene expression patterns that may be indicative of adaptation and to predict organismal responses to environmental stress when multiple sources of selection coincide (Kopec et al., 2011; Shu, Kang, Yang, & Kaminski, 2003).

Understanding variation in gene expression in response to multiple stressors is also complicated by organ-specific responses. While single stressors with broad, systemic effects (e.g., thermal stress) may elicit relatively consistent expression responses across different organs (Akashi, Cádiz Díaz, Shigenobu, Makino, & Kawata, 2016), exposure to many physiochemical stressors—and especially combinations of different stressors—likely causes idiosyncratic patterns of gene expression that vary substantially among organs, tissues and even cell types (Bailey et al., 2013; Birnbaum et al., 2003; Bos, Pulliainen, Sundström, & Freitak, 2016). For example, expression responses to hypoxia exposure vary due to differences in the metabolic requirements among organs (Gracey, Troll, & Somero, 2001; Whitehead & Crawford, 2005). Disentangling the effects of multiple stressors on gene expression should therefore involve the analysis of multiple organs, which can also inform our understanding of how organ-specific expression changes relate to potential functional consequences and patterns of local adaptation (Oleksiak, Churchill, & Crawford, 2002).

Here, we characterized gene expression variation in a system of extremophile fish that includes populations exposed to different combinations of environmental stressors. We asked whether the analysis of gene expression patterns in multiple organs (gill, liver and brain) and at multiple levels of organization (transcript, gene and physiological pathway) affects inferences about the putative functional consequences of expression variation. *Poecilia mexicana* (Poeciliidae) is a small live-bearing fish that has colonized sulphide springs and caves in Mexico's Cueva del Azufre system, giving rise to a unique group of closely related populations living in geographically proximate habitat types with vastly different environmental conditions (nonsulphidic surface streams, sulphidic surface streams, a

nonsulphidic cave, and a sulphidic cave; see Figure 1; Parzefall, 2001; Tobler et al., 2008). Sulphidic habitats are characterized by high concentrations of hydrogen sulphide (H<sub>2</sub>S), a potent respiratory toxicant that binds to cytochrome c oxidase in the respiratory chain, effectively halting aerobic ATP production (Bagarinao, 1992; Cooper & Brown, 2008). Caves are characterized by the absence of light, which has direct effects on organismal function (e.g., sensory biology and circadian rhythms; Poulson & White, 1969; Langecker, 2000; Niemiller & Soares, 2015). Both H<sub>2</sub>S and permanent darkness also shape the biotic environment, affecting resource availability as well as competition and predation regimes (Hüppop, 2000; Roach, Tobler, & Winemiller, 2011). Previous studies have indicated that populations of *P. mexicana* exposed to specific combinations of H<sub>2</sub>S and darkness are locally adapted, exhibiting phenotypic differences in behavioural (Parzefall, 2001), sensory (Tobler, Coleman, Perkins, & Rosenthal, 2010), physiological (Passow, Greenway, Arias-Rodriguez, Jeyasingh, & Tobler, 2015), morphological (Tobler et al., 2008) and life-history (Riesch, Plath, Schlupp, & Marsh-Matthews, 2010) characteristics. In addition, microsatellite analyses have indicated significant genetic differentiation and low rates of gene flow among populations in different habitat types (Plath et al., 2010), and reproductive isolation is in part mediated by natural and sexual selection against nonadapted migrants (Riesch, Plath, & Schlupp, 2011; Tobler, 2009; Tobler, Riesch, Tobler, Schulz-Mirbach, & Plath, 2009).

We performed transcriptome analyses on three different organs and populations exposed to all combinations of the presence and absence of H<sub>2</sub>S and light. We focused analyses on gills, liver and brain, because there are *a priori* expectations about the roles of these organs in adaptation to the environmental conditions encountered in the Cueva del Azufre system. Gills are an important organ involved in the maintenance of homeostasis in fish (Evans & Claiborne, 2006; Evans et al., 2011), and since they exhibit a high surface area directly suspended in the water, they provide an important access point for H<sub>2</sub>S exposure (Tobler, Passow, Greenway, Kelley, & Shaw, 2016). The liver plays roles in detoxification and the modulation of energy metabolism (Dorman et al., 2002; Green, Takahashi, & Bass, 2008), and both processes are relevant in the context of H<sub>2</sub>S and cave adaptation (Aspiras, Rohner, Martineau, Borowsky, & Clifford, 2015; Bagarinao & Vetter, 1990). Finally, the brain has previously been shown to play a role in adaptation to perpetual darkness (Langecker, 2000; Poulson, 2001), and H<sub>2</sub>S can have neurotoxic effects (Kombian, Warenyca, Mele, & Reiffenstein, 1988). In addition, brain morphology has been shown to vary among populations of *Poecilia* in the Cueva del Azufre system (Eifert et al., 2015). Analysing gene expression variation across habitats and organs, we specifically addressed the following questions: (i) How does gene expression vary among organs and populations living in different habitat types? We predicted significant differences in gene expression among fish from different habitat types, reflecting their exposure to starkly different environmental conditions. Considering that H<sub>2</sub>S impacts the function of mitochondria and can therefore have systemic effects (Li, Rose, & Moore, 2011), gene expression differences between sulphidic and nonsulphidic populations were expected to be relatively consistent across all organs. In contrast, we expected idiosyncratic, organ-specific gene expression differences between populations from cave and surface habitats. (ii) Is there evidence for shared expression responses in populations exposed to the same environmental conditions (presence of H<sub>2</sub>S or absence of light), and how do shared responses vary among hierarchical levels of





& Durbin, 2009) and then estimated transcript abundance with eXpress (Roberts & Pachter, 2013). Transcripts with very low expression (less than two counts per million in at least three samples) were removed from further analyses. To describe multivariate variation in gene expression, we conducted a weighted gene coexpression network analysis on the top 10,000 expressed genes in the R package WGCNA (Langfelder & Horvath, 2008), as described in Oldham, Horvath, and Geschwind (2006). Before constructing the networks, we used the variance-stabilizing transformation function in the DESEQ2 package in R (Love, Huber, & Anders, 2014), which transforms data normalized for library size to a  $\log_2$ -scale (Anders & Huber, 2010), and set the soft threshold (i.e., power) to 3, which was the lowest value that optimized topology (Langfelder & Horvath, 2008). WGCNA quantifies correlations between the top 10,000 expressed genes using Pearson correlations, which are converted into measures of connection strength between the genes. Genes with similar connection strengths to other genes (i.e., high topological overlap) are identified and clustered together into modules. Once modules were identified, we constructed a consensus dendrogram based on the most significant modules and tested for associations between individual modules and predictor variables (organ, individual, population of origin, presence of H<sub>2</sub>S in natural habitat, absence of light in natural habitat) using Pearson correlation as implemented in WGCNA. Complementary to the weighted coexpression network analysis, we also conducted multidimensional scaling (MDS) of the top 10,000 expressed genes using *plotMDS* in the limma package in R. We analysed MDS scores with a multivariate analysis of variance (MANOVA) with “organ” and “population” as predictor variables. *F*-values were approximated using Wilks’ lambda and effect sizes by use of partial eta-squared ( $\eta_p^2$ ). To visualize potential differences in gene expression patterns among populations, we also conducted separate MDS for each organ.

To quantify differential gene expression among populations, we treated the ancestral, nonsulphidic surface population as a control and conducted pairwise comparisons with each of the populations inhabiting an extreme environment (sulphidic surface, nonsulphidic cave and sulphidic cave). Pairwise comparisons were conducted separately for each organ using the *exactTest* function in the Bioconductor package edgeR (Robinson, McCarthy, & Smyth, 2010; Robinson & Oshlack, 2010). The false discovery rate was set to .05. These analyses provided a list of up- and downregulated transcripts for each extremophile population and organ as compared to the ancestral nonsulphidic surface population.

## 2.5 | Testing for organ-specific responses

We assessed whether gene expression responses to the same sources of selection were quantitatively and qualitatively consistent across organs or whether there are idiosyncratic, organ-specific responses. To do so, we first tested whether the number of differentially expressed transcripts varied among organs using analysis of variance (ANOVA). We included direction of differential expression (i.e., up- or downregulated), population and organ as independent variables. Furthermore, we tested whether the biological processes putatively associated with differentially expressed genes in each habitat were consistent among organs. To do so, we first performed a pathway enrichment analysis for each organ and population using the *enrichPathway* function from the ReactomePA package in R (Yu & He, 2016) to identify the enriched pathways (*p*-value cut-off .05). We then implemented the

*compareCluster* function in the CLUSTERPRO-FILER package in R (Yu, Wang, Han, & He, 2012), which calculates and compares enriched functional categories of each gene cluster among organs of the same population ( $p$ -value cut-off .05). Using gene ratios (proportion of genes enriched in each category) and adjusted  $p$ -values, we constructed a dot plot in R to visualize variation among organs of the same population. Finally, we implemented the *rcorr* function in the HMISC package in R to compute a matrix of Pearson's  $r$  rank correlation coefficients ( $r$ ) and significance levels ( $p$ -value) based on the gene ratios in the enriched pathways to evaluate the consistency of responses among all organ pairs (gill vs. liver, gill vs. brain and brain vs. liver).

## 2.6 | Identifying shared expression responses in H<sub>2</sub>S and cave environments

We tested for shared expression responses to H<sub>2</sub>S and perpetual darkness by comparing differentially expressed genes between the sulphidic surface and sulphidic cave populations (shared responses to H<sub>2</sub>S), as well as between the nonsulphidic and the sulphidic cave populations (shared responses to darkness). Because theory predicts that the degree of shared responses should be a function of the level of biological organization (see Introduction), we quantified shared responses at the level of the transcript (transcript ID based on our reference transcriptome), gene (same BLAST hit in SwissProt) and function (same GO terms in biological processes associated with the BLAST hit). The number of shared and unique up- and downregulated transcripts, genes and functions was quantified by generating Venn diagrams with the *vennCounts* and *vennDiagram* functions in the package LIMMA in R (see Fig. S1 for the cave populations and Fig. S2 for the populations from sulphidic habitats). The distribution of values in these Venn diagrams was then summarized for quantitative analysis using the Jaccard index, which was calculated as the size of the intersection between two samples (number of responses in the intersection of the Venn diagrams) divided by size of the union between two samples (total number of responses, unique and shared, in the Venn diagrams) (Krebs, 1999; Pfenninger et al., 2015). Jaccard indices ( $\log_{10}$ -square-root-transformed) were analysed using ANOVA. We included expression direction (i.e., up- and downregulated), environmental factor (i.e., H<sub>2</sub>S and darkness), organization level and organ as independent variables.

## 2.7 | Biological functions associated with differentially expressed genes

We assessed the biological functions of differentially expressed genes to explore potential functional consequences associated with adaptation to H<sub>2</sub>S and perpetual darkness. To do so, we conducted a GO term enrichment analysis ( $p$ -value cut-off .001) as implemented in GOrilla (Eden, Navon, Steinfeld, Lipson, & Yakhini, 2009). Enrichment analyses were conducted separately for each population and organ.

# 3 | RESULTS

## 3.1 | Reference transcriptome

We obtained 133,785,284 reads for gill tissues (14 individuals in final data set), 95,374,496 reads for brain tissues (11 individuals in final data set) and 136,779,442 reads for liver tissues (16 individuals in final data set; see Table S2 for details). Due to low coverage, we excluded five brain and two gill samples. Mapping against the reference genome resulted in



a total of 63,590 unique transcripts from 38,764 unique loci (see Table S3 for additional summary statistics). The total length of the merged transcriptome was 225,876,000 bp, with an N50 of 5,290 bp. BLAST against the human SwissProt database resulted in matches for 48,242 transcripts (75.9% of transcripts; see Table S4) corresponding to 14,005 unique SwissProt entries, 13,504 of which were associated with Gene Ontology (GO) terms.

### 3.2 | Organ-specific gene expression

Weighted gene coexpression network analysis revealed five modules of coexpressed transcripts (Fig. S3). Organ identity was significantly correlated with all modules, while none of the other predictor variables (presence or absence of H<sub>2</sub>S, presence or absence of light, population and individual) exhibited any significant associations (Figure 2a; Table 1). This general pattern was also evident by visualizing the MDS results on the full data set, which indicated a clear separation of different organs in multivariate space (Fig. S4). Multivariate analyses of variance using MDS scores as the dependent variables confirmed the strong effect of organ on gene expression patterns ( $F_{5,56} = 3516.07$ ,  $p < .001$ ,  $\eta_p^2 = .996$ ) and also indicated a significant interaction between organ type and population of origin ( $F_{12,56} = 2.01$ ,  $p = .040$ ,  $\eta_p^2 = .301$ ). Population as a main factor had no significant effect ( $F_{6,56} = 1.021$ ,  $p = .421$ ,  $\eta_p^2 = .099$ ). Gene expression consequently varied substantially among organs, while effects of environmental conditions were comparatively subtle. Hence, we analysed among population variation in gene expression separately for each organ. Visualization of MDS on each organ indicated significant differences in gene expression patterns among populations from different habitat types (Figure 2b–d).

Comparing the number of differentially expressed genes among populations from the different extreme habitats (relative to the ancestral, nonsulphidic surface population) indicated that organ and the interaction between organ and habitat type explained the majority of variation (Table 2). In the two sulphidic habitats, the number of differentially expressed genes was the highest in the gills (Figure 3). In the nonsulphidic cave, however, the number of differentially expressed genes was greatest in the liver and lower in the brain and gills (Figure 3).

We also found significant differences in the enrichment of physiological pathways associated with differentially expressed genes across organs (Fig. S5). Overall, positive correlations in the enrichment of functional classes across organs were relatively rare, indicating that the nature of differentially expressed genes is organ-specific. Among the few exceptions were similar functional responses in upregulated transcripts between brain and liver in the nonsulphidic cave, upregulated transcripts between brain and gill in the sulphidic surface habitat, upregulated transcripts between liver and gills in the sulphidic cave and downregulated transcripts between brain and liver in the sulphidic cave. When detected, correlations in the functional responses between organs were primarily driven by genes associated with metabolism and metabolism of lipids and lipoproteins (Fig. S5).

### 3.3 | Shared expression responses in H<sub>2</sub>S and cave environments

By comparing differentially expressed transcripts between populations, we identified shared responses to H<sub>2</sub>S-rich and cave environments. The extent of shared responses was a function of interactive effects between environmental factors, organs and the level of biological organization (Table 3). As predicted, the number of shared responses generally increased with level of biological organization (Figure 4a). However, the amount of shared responses at each level of organization and the magnitude of increase from one level to the next significantly differed between environmental factors. In cave environments, there were very few shared differentially expressed transcripts and only about 20% of GO terms associated with differentially expressed genes were shared between populations (Fig. S1). In contrast, shared responses were much higher between sulphidic environments at each level of organization, with about 40% of GO terms associated with differentially expressed genes appearing in both sulphidic populations (Fig. S2). Population differences in the sulphidic and cave-adapted fish were also evident among organs (Figure 4b). While there were no differences in the degree of shared responses among organs in the two cave populations, shared responses were significantly more prevalent in gills between the two sulphidic populations as compared to the brain and liver.

### 3.4 | Biological functions associated with differentially expressed genes

To identify functional changes potentially associated with adaptation to the different environmental conditions, we conducted a GO term enrichment analysis for up- and downregulated genes for each tissue and population (Table S5). For brevity, we only discuss enriched terms that are shared between both sulphidic or both cave habitats.

While no GO terms were enriched across all organs in the two sulphidic habitats (Table S6), several genes associated with H<sub>2</sub>S detoxification and sulphur metabolism were consistently upregulated in the gills (Table S6A). This included terms associated with sulphur (GO:0044272, GO:0006790) and glutathione metabolism (GO:0006749). In addition, upregulated genes in the gills of sulphidic populations were enriched in terms associated with oxidative stress responses (GO:0006979). Downregulated genes in the gills were predominately associated with the transport of ions and other molecules (GO:0030001, GO:0006814, GO:0006811 and associated terms; Table S6B). In the livers of sulphidic populations, downregulated genes were disproportionately associated with metabolism of lipids and fatty acids (GO:0035337, GO:0006631, GO:003583 and associated terms; Table S6B). In the brains of sulphidic populations, upregulated genes were enriched for processes associated with energy metabolism and ATP production (GO:0006096, GO:00016051, GO:00006757; Table S6A). Downregulated genes in the brain were associated with the organization of the extracellular matrix and DNA integration (GO:0030198, GO:0015074).

No GO terms were significantly enriched in all organs of the two cave populations. In the gills, up- and downregulated genes were primarily involved in ion transport and the regulation of pH (Table S6C, D). In the livers of the two cave populations, we found no shared enrichment in upregulated genes, and downregulated genes were associated with responses to chemicals and the regulation of biological quality and protein secretion (GO:

0042221, GO:0065008 and associated terms; Table S6D). There was no consistent enrichment in any GO term for the brains of the two cave populations (Table S6C,D).

## 4 | DISCUSSION

Transcriptome analyses among closely related fish populations in proximate but environmentally distinct habitat types uncovered significant variation in gene expression. Gene expression variation was primarily correlated with organ type, and the number and function of differentially expressed genes in each habitat type was also organ-specific. As predicted by theory, shared responses between the two sulphidic and the two cave habitats increased with the level of biological organization, from relatively few shared patterns at the level of differentially expressed transcripts to higher levels of overlap in physiological pathways associated with differentially expressed transcripts. However, shared responses at any level of organization were much more pronounced in the H<sub>2</sub>S-rich habitats than the cave habitats, highlighting that H<sub>2</sub>S impacts gene regulation in a more predictable manner than the absence of light. Our analyses provided insights into transcriptional variation in a unique system with coinciding sources of selection, and functional annotation of differentially expressed genes provides a springboard for investigating physiological mechanisms putatively underlying adaptation to extreme environments.

### 4.1 | Expression variation among organs and environments

Considering different organs are fulfilling vastly different functions despite being composed of cells with the same genome, it was not surprising that the majority of variation in gene expression was observed among organ types. However, the gene expression responses to the presence of H<sub>2</sub>S and to the absence of light in caves also significantly varied among organs, both in terms of the number of genes that were differentially expressed and their function (Figure 3 and Fig. S5). So, even though H<sub>2</sub>S-rich and cave environments are often assumed to exert strong selection (Niemi & Soares, 2015; Tobler et al., 2016), and H<sub>2</sub>S has specific and well-documented biochemical and physiological effects (Olson, 2012), the consequences of exposure to these environments are not systemic and uniform but specific to particular organs. In the nonsulphidic cave for example, the majority of differentially expressed genes occurred in the liver (Figure 3), and the enrichment in Reactome pathways differed among organs (especially gills vs. liver and brain; Fig. S5). In both sulphidic habitats, differentially expressed genes were mostly concentrated in the gills (Figure 3), which are directly exposed to environmental H<sub>2</sub>S (Tobler et al., 2016). Furthermore, genes associated with H<sub>2</sub>S detoxification and the metabolic processing of sulphur were primarily differentially expressed in the gills but not the brain or the liver. This may suggest that the bulk of H<sub>2</sub>S is detoxified peripherally in the gills (rather than the liver as in other vertebrates; Dorman et al., 2002), potentially shielding internal organs from the toxic effects. Some organisms exposed to H<sub>2</sub>S in marine environments have also been hypothesized to sequester sulphide peripherally in external mucosa in order to minimize toxic effects (Goffredi, Jones, Erhlich, Springer, & Vrijenhoek, 2008; Oeschger & Vetter, 1992). In addition, modification of the integumentary system may be common during exposure to environmental stressors in general (Ao et al., 2015; Micallef et al., 2012).

Our results indicate that the choice of tissue substantially affects inferences about gene expression variation in nature. Many studies still focus on the analysis of single organs (Narum & Campbell, 2015; Wang et al., 2014), whole organisms (Gross et al., 2013) or lack formal analyses of how gene expression varies among organs (Hinaux et al., 2013; Uyhelji, Cheng, & Besansky, 2016). This is not necessarily problematic when *a priori* hypotheses are being tested, but a focus on single organs may also lead to skewed or misleading results that affect our inferences about organismal responses to environmental variation. The advent of single-cell sequencing (Gawad, Koh, & Quake, 2016)—which is now commonly applied in the biomedical sciences—will provide increasing resolution to understand the nature of organismal responses to environmental stressors in the future.

Our analyses also indicated that gene expression responses in populations exposed to multiple stressors are not the mere sum of the responses to individual stressors. Although the sulphidic cave population (exposed to H<sub>2</sub>S and darkness) had the highest total number of differentially expressed genes, the number of differentially expressed genes in the gills was higher in the sulphidic surface population, and the number of differentially expressed genes in the liver was higher in the nonsulphidic cave population (Figure 3). In addition, only a subset of responses in the sulphidic cave were actually shared with the sulphidic surface and the nonsulphidic cave population (see below) such that the functional overlap of responses was lower than what a comparison of mere numbers implied. This result highlights that there are likely interactive, nonadditive effects between H<sub>2</sub>S exposure and living in a cave environment. Such interactions have also been documented in experimental studies that manipulated exposure to multiple physiochemical stressors (Garcia-Reyero et al., 2012; Maes et al., 2013; Yang et al., 2007) and will complicate our ability to predict organismal responses along complex environmental gradients.

#### 4.2 | Shared responses and the predictability of gene expression in different environments

The number of shared responses between the two sulphidic and the two cave populations increased with levels of biological organization (from transcript to gene to function; Figure 4a). This was particularly evident in the two cave populations that did not share a single differentially expressed transcript in some organs, yet differentially expressed genes shared about 20% of their functional attributes (GO terms). The increase in shared responses with level of organization is predicted by theory (Elmer & Meyer, 2011; Manceau et al., 2010; Rosenblum et al., 2014), and it has been documented in a variety of studies that investigated patterns of molecular evolution or the genetic basis of convergent trait evolution (Linnen, Kingsley, Jensen, & Hoekstra, 2009; Rosenblum, Römpler, Schöneberg, & Hoekstra, 2010; Shapiro et al., 2004). Hierarchical structuring in the context of gene expression is less explored both conceptually and empirically (but see Fong, Joyce, & Palsson, 2005; Mallarino, Linden, Linnen, & Hoekstra, 2017). However, expression changes of different transcripts or genes may lead to equivalent organismal performance (see Arnold, 1983; Losos, 2011; Wainwright, Alfaro, Bolnick, & Hulsey, 2005 for analogous concepts involving different levels of organismal integration), just like different mutations in the same gene or mutations in different genes can lead to equivalent phenotypic changes (e.g., Chen, DeVries, & Cheng, 1997; Hoekstra, Hirschmann, Bunday, Insel, & Crossland, 2006; Wilkens & Strecker, 2003). The key—but largely unexplored—difference is that differential gene

expression may occur plastically over short periods of time, opening the possibility that individuals can embark on different solutions to cope with an environmental stressor (Koolhaas, 2008; Schulte, 2014). From a transcriptome perspective, future research needs to address how plastic and evolved changes in gene regulation affect our inferences about the hierarchical structuring of responses to specific environmental stressors.

The proportion of shared responses was also significantly higher between the two sulphidic than the two cave habitats. This was particularly evident at the levels of transcripts and genes (>20% of responses shared between sulphidic habitats, <3% of responses shared between cave habitats), but substantial differences were also observed at a functional level (37% vs. 20%). There are three non-mutually exclusive hypotheses about the mechanisms that could be driving this pattern. (i) The number of shared differentially expressed genes may be a function of phylogenetic relatedness; that is, shared responses may have been higher between the two sulphidic populations, because they are more closely related (Rohlf, Harrigan, & Nielsen, 2013). To test this, we identified single nucleotide polymorphisms (SNPs) in our data set and analysed the relationship among populations (see supplementary material for details). The results indicated that the three extremophile populations were closely related, and unlike analyses based on microsatellites (e.g., Plath et al., 2010), there was no evidence for significant population structure in the coding portion of the genome (Fig. S6). Nonetheless, inference of population splits indicated that the two cave populations were more closely related to each other than to the sulphidic surface population (Fig. S7). Hence, phylogenetic history alone is unlikely to explain the low level of shared responses between the two cave populations. (ii) Our classification of habitats into discrete types may be an oversimplification of complex ecological gradients (see Kaeuffer et al., 2012). Besides the presence of H<sub>2</sub>S and the absence of light, there are likely additional sources of selection in the nonsulphidic cave that we have not considered and may have shaped the distinct patterns of gene expression. For example, despite their proximity, the two caves differ in ambient temperature, the ionic composition of the water (other than the presence of H<sub>2</sub>S) and the availability of trophic resources (see Tobler & Plath, 2011 for a review). (iii) Some sources of selection may elicit more predictable evolutionary responses than others. At least in the organs investigated here, the presence of H<sub>2</sub>S—unlike the absence of light—has clear-cut molecular targets (e.g., cytochrome c oxidase in the respiratory chain and haemoglobin) that affect specific physiological functions (e.g., energy metabolism, oxygen transport and oxidative stress; Li et al., 2011; Olson, 2012; Tobler et al., 2016). H<sub>2</sub>S's direct interaction with specific proteins could constrain the diversity of adaptive solutions that mitigate the toxic effects, ultimately leading to more predictable outcomes in gene expression variation in replicated populations. Indeed, previous studies have found that sulphide spring populations exhibit positive selection on and differential expression of genes associated with highly conserved pathways involved in H<sub>2</sub>S toxicity and detoxification (Kelley et al., 2016; Pfenninger et al., 2014, 2015). Furthermore, the notion that H<sub>2</sub>S elicits more predictable organismal responses is supported by the level of shared responses between populations being disproportionately high in the gills, which are directly exposed to environmental H<sub>2</sub>S (Tobler et al., 2016). Physiochemical stressors with clear molecular targets eliciting predictable patterns of genetic evolution have also been documented in other organisms, such as killifish adapted to anthropogenic pollutants (Reid et al., 2016), insects adapted to

secondary plant metabolites (Dobler, Dalla, Wagschal, & Agrawal, 2012) and poison frogs adapted to their own skin toxins (Tarvin, Santos, O'Connell, Zakon, & Cannatella, 2016).

### 4.3 | Potential mechanisms mediating adaptation to extreme environments

Functional annotations of differentially expressed genes provided insights about potential regulatory and physiological mechanisms mediating adaptation to sulphidic and cave environments. Populations in sulphidic environments upregulated key enzymes involved in enzymatic H<sub>2</sub>S detoxification, including multiple components of the sulphide: quinone oxidoreductase and the glutathione pathways (Hildebrandt & Grieshaber, 2008; Jackson, Melideo, & Jorns, 2012). In addition, we found evidence for upregulation of genes associated with the toxic effects of H<sub>2</sub>S. Specifically, H<sub>2</sub>S negatively affects aerobic ATP production and creates oxidative stress through the interruption of the mitochondrial respiratory chain (Cooper & Brown, 2008; Eghbal, Pennefather, & O'Brien, 2004), and genes associated with energy metabolism, anaerobic ATP production and oxidative stress responses were consistently upregulated. Enrichment analysis also indicated downregulation of ion transporters in the gills, genes associated with lipid and fatty acid metabolism in the liver and extra-cellular matrix components in the brain. Since the sulphidic surface and cave habitats also differ from normal surface streams in a variety other aspects of the environment (e.g., salinity, pH and oxygen concentrations; Tobler & Plath, 2011), some of the documented gene expression changes may have arisen in response to these correlated environmental variables. Future studies will need to address the potential functional consequences of these expression changes and test how they actually affect organismal performance in sulphidic environments.

There were only a few shared enriched GO terms in the two cave populations. Changes in the expression of ion transporters and the regulation of pH were likely driven by variation in water chemistry and not sources of selection that are typically associated with cave environments, although some ion channels have been associated with the development of pigmentation (Bellono, Escobar, Lefkovith, Marks, & Oancea, 2014), and both cave populations exhibit significant reductions of pigmentation in the skin (Joachim, Riesch, Jeffery, & Schlupp, 2013). Despite the lack of shared responses, it is important to note that there was evidence for significant enrichment in each cave population for several functions typically associated with cave adaptation. This includes genes associated with energy and lipid metabolism that could be related to resource scarcity in caves (Hüppop, 2000), with regulation of circadian rhythms that are likely related to the absence of light (Beale et al., 2013; Koilraj, Sharma, Marimuthu, & Chandrashekar, 2000) and with neuronal development and axon guidance that may be related to changes in the brain anatomy of cavefish (Eifert et al., 2015). While the high proportion of shared responses between the two sulphidic habitats facilitated the identification of potential physiological pathways contributing to adaptation to H<sub>2</sub>S, the largely unique expression patterns in the two caves make inferences about the molecular underpinnings of adaptation to perpetually dark habitats much less straightforward. This is somewhat surprising because evolution in caves is typically associated with strong patterns of convergent phenotypic evolution (Jeffery, 2009; Porter & Crandall, 2003), and regressive evolution of pigmentation in cavefish is even caused by convergent molecular modifications (Protas et al., 2006). Perhaps, other organs

not investigated here (e.g., eyes and skin) exhibit a higher degree of shared gene expression differences between the two cave populations.

## 5 | CONCLUSIONS

Overall, this study has documented significant variation in gene expression among spatially proximate and genetically closely related populations. Gene expression varied among populations in an organ-specific manner, suggesting that regulatory changes are likely important in coping with the environmental stressors present in this system (see Fay & Wittkopp, 2008; Romero, Ruvinsky, & Gilad, 2012). In addition, shared gene expression responses in H<sub>2</sub>S-rich and cave habitats increase significantly with level of organismal organization, which indicates that alternative transcriptional responses—albeit often in the same physiological pathways—mediate organismal responses to life in different environments. A key question remaining is whether the transcriptional variation among populations is a consequence of population-specific, plastic induction of gene expression in response to ambient environmental conditions, or whether there are evolved changes in gene regulation. Laboratory experiments using two of the extremophile populations studied here (nonsulphidic and sulphidic surface) have indicated that both plastic and evolved changes in gene regulation contribute to gene expression variation in natural habitats (Passow et al., unpublished data). Future studies will need to address how plasticity and evolution shape gene expression in the cave populations and identify potential regulatory mutations that could contribute to transcriptional variation among populations. Considering the rampant variation in functional traits among closely related populations, the fish of the Cueva del Azufre system provide a unique opportunity to study the genetic basis of complex phenotypic variation in nature, including patterns of gene expression. Accordingly, future studies should focus on identifying mechanisms linking genomic variation to phenotypes and organismal function (Barrett & Hoekstra, 2011; Storz & Wheat, 2010).

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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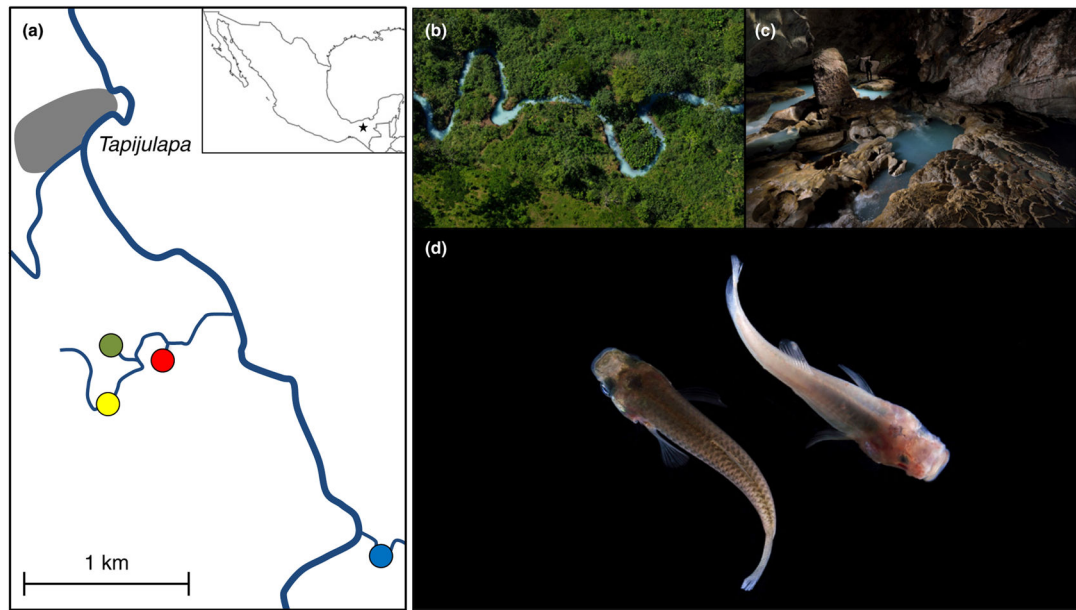
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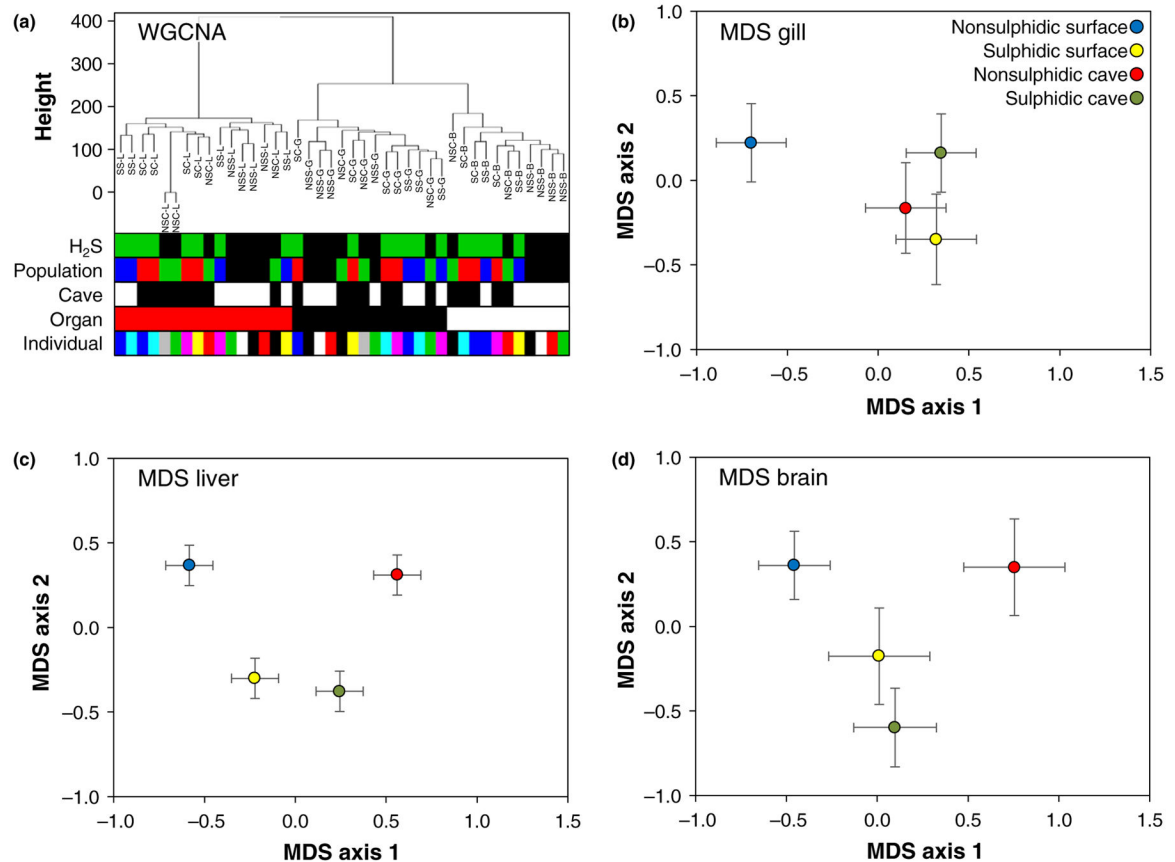
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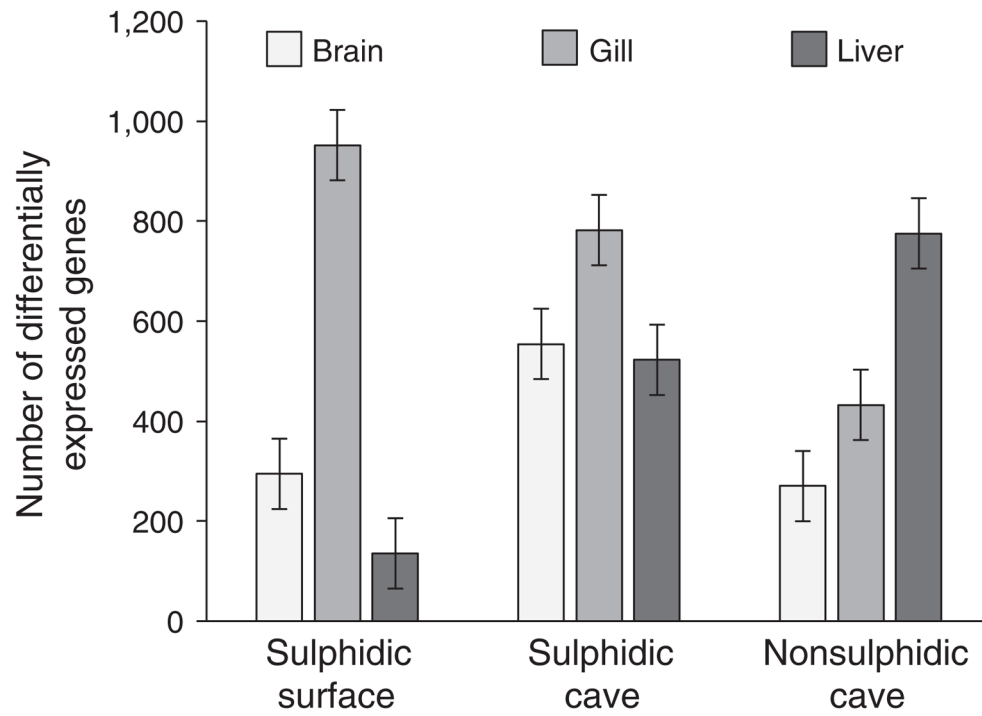


**FIGURE 1.**

(a) Overview of the study area near the village of Tapijulapa, Tabasco, Mexico. Depicted are the four focal populations: nonsulphidic surface (blue), sulphidic surface (yellow), nonsulphidic cave (red) and sulphidic cave (green). The insert indicates the study region within Mexico. (b) The sulphidic surface stream and (c) the sulphidic cave in which fish were collected for this study. (d) Phenotypic differences are evident between fish from the sulphidic surface (left) and the sulphidic cave habitat (right). Photographs are courtesy of Robbie Shone (<http://www.shonephotography.com>) [Colour figure can be viewed at [wileyonlinelibrary.com](http://wileyonlinelibrary.com)]

**FIGURE 2.**

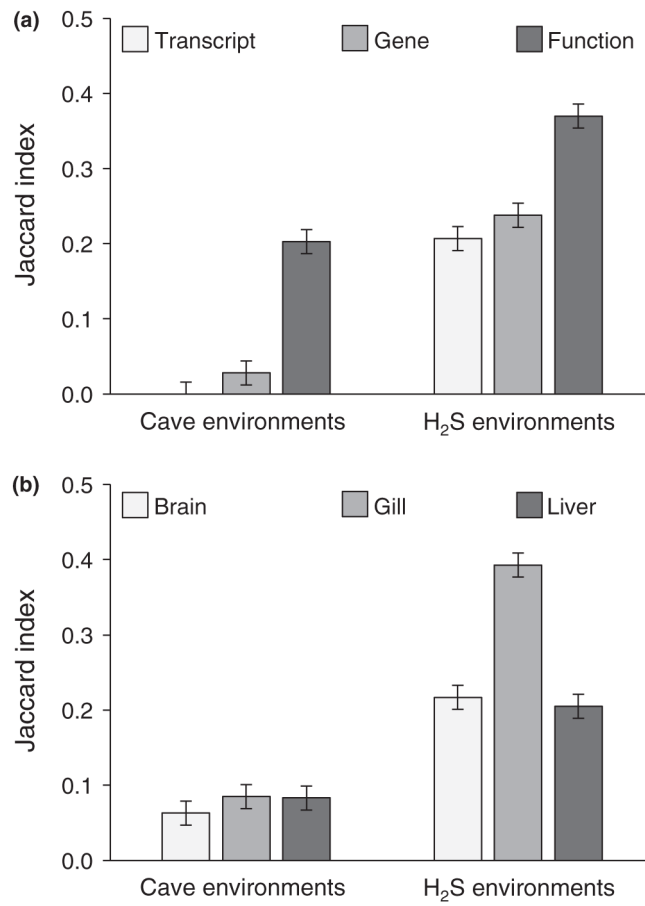
(a) Results of the weighted gene coexpression network analysis (WGCNA) indicated that gene expression variation among samples was primarily driven by organ type (see Table 1). (b–d) MDS on each organ separately revealed significant differences in gene expression patterns among fish from different habitat types. MDS plots depict mean scores along axes 1 and 2 ( $\pm$  standard error). Data from different habitat types are colour-coded as indicated in the legend in panel (b) [Colour figure can be viewed at [wileyonlinelibrary.com](http://wileyonlinelibrary.com)]



**FIGURE 3.**

The number (estimated marginal means  $\pm$  standard error) of differentially expressed genes (up and downregulated) among populations and organs. Estimated marginal means were derived from the ANOVA model in Table 2





**FIGURE 4.**

The proportion (estimated marginal mean of Jaccard index  $\pm$  standard error) of shared differences (a) across populations and levels of biological organization and (b) across populations and organs. Estimated marginal means were derived from the ANOVA model in Table 3

Results of the weighted gene coexpression network analysis. Correlation between module eigenvalues and predictor variables indicated that organ type was the best predictor of coexpressed genes

**TABLE 1**

Cluster ID	Individual	Organ	Population	Cave	H <sub>2</sub> S
1	0.110 (0.5)	<b>0.820 (6e-11)</b>	0.098 (0.5)	-0.008 (1.0)	0.037 (0.8)
2	-0.045 (0.8)	<b>-0.540 (3e-4)</b>	-0.043 (0.8)	-0.059 (0.7)	-0.054 (0.7)
3	-0.069 (0.7)	<b>0.410 (0.008)</b>	-0.058 (0.7)	0.110 (0.5)	-0.014 (0.9)
4	-0.120 (0.4)	<b>-0.990 (5e-39)</b>	-0.110 (0.5)	-0.052 (0.7)	-0.071 (0.7)
5	-0.092 (0.6)	<b>-0.520 (5e-4)</b>	-0.080 (0.6)	-0.002 (1.0)	-0.033 (0.8)

Each row corresponds to a module of coexpressed genes (see Fig. S3 for visualization), and we report Pearson's correlation coefficients and *p*-values (in parentheses) between each module and predictor variables. Significant effects (*p* < .05) are highlighted in bold font.

**TABLE 2**

Results of analyses of variance (ANOVA) comparing the number of differentially expressed genes among habitat types (sulphidic surface, nonsulphidic cave, sulphidic cave), organs (gills, liver, brain) and expression direction (up vs. downregulated)

<b>Term</b>	<b><i>df</i></b>	<b><i>F</i></b>	<b><i>p</i></b>	<b><math>\eta_p^2</math></b>
Habitat type	2	4.3	.101	.682
Organ	<b>2</b>	<b>19.5</b>	<b>.009</b>	<b>.907</b>
Expression direction	1	0.1	.724	.035
Habitat × Expression direction	2	0.8	.501	.292
Organ × Expression direction	2	1.6	.313	.441
Habitat × Organ	<b>4</b>	<b>18.0</b>	<b>.008</b>	<b>.947</b>

The number of differentially expressed genes varied among organs, but in a habitat-specific manner (see Figure 3). Effect sizes were estimated with partial eta-squared ( $\eta_p^2$ ), and significant effects ( $p < .05$ ) are high-lighted in bold font.

**TABLE 3**

Results of analyses of variance (ANOVA) comparing the proportions of shared responses (Jaccard index) among environmental factors (sulphidic vs. cave environments), organs (gills, liver, brain), expression direction (up vs. downregulated) and level of organismal organization (transcript, gene, gene function)

Term	<i>df</i>	<i>F</i>	<i>p</i>	$\eta_p^2$
Expression direction	1	0.3	.619	.016
Environmental factor	<b>1</b>	<b>450.4</b>	<b>&lt;.001</b>	<b>.966</b>
Level of organization	<b>2</b>	<b>152.7</b>	<b>&lt;.001</b>	<b>.950</b>
Organ	<b>2</b>	<b>24.4</b>	<b>&lt;.001</b>	<b>.753</b>
Expression direction × Environmental factor	1	2.0	.178	.111
Expression direction × Level of organization	2	0.7	.489	.086
Expression direction × Organ	2	2.3	.128	.227
Environmental factor × Level of organization	<b>2</b>	<b>27.7</b>	<b>&lt;.001</b>	<b>.776</b>
Environmental factor × Organ	<b>2</b>	<b>15.2</b>	<b>&lt;.001</b>	<b>.655</b>
Level of organization × Organ	4	0.5	.711	.118

The amount of shared responses increased with level of organization, but shared responses were higher for sulphidic than for cave populations (Figure 4a). In addition, the amount of shared responses also varied between sulphidic and cave populations in an organ-specific manner (Figure 4b). Effect sizes were estimated with partial eta-squared ( $\eta_p^2$ ), and significant effects ( $p < .05$ ) are highlighted in bold font.