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Comparative genomics reveals putative evidence for high-elevation adaptation in the American pika (Ochotona princeps)

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Abstract

High-elevation environments have lower atmospheric oxygen content, reduced temperatures, and higher levels of UV radiation than found at lower elevations. As such, species living at high elevations must overcome these challenges to survive, grow, and reproduce. American pikas (*Ochotona princeps*) are alpine lagomorphs that are habitat specialists typically found at elevations >2,000 m. Previous research has shown putative evidence for high-elevation adaptation; however, investigations to date have been limited to a fraction of the genome. Here, we took a comparative genomics approach to identify putative regions under selection using a chromosomal reference genome assembly for the American pika relative to 8 other mammalian species targeted based on phylogenetic relatedness and (dis)similarity in ecology. We first identified orthologous gene groups across species and then extracted groups containing only American pika genes as well as unclustered pika genes to inform functional enrichment analyses; among these, we found 141 enriched terms with many related to hypoxia, metabolism, mitochondrial function/development, and DNA repair. We identified 15 significantly expanded gene families within the American pika across all orthologous gene groups that displayed functionally enriched terms associated with hypoxia adaptation. We further detected 196 positively selected genes, 41 of which have been associated with putative adaptation to hypoxia, cold tolerance, and response to UV following a literature review. In particular, *OXNAD1, NRDC*, and those genes critical in DNA repair represent important targets for future research to examine their functional implications in the American pika, especially as they may relate to adaptation to rapidly changing environments.

Keywords: comparative genomics; local adaptation; cold tolerance; UV radiation; hypoxia; Lagomorpha

Introduction

The environment in which a species resides can have a profound impact on its evolution (Parsons 2005; Kristensen et al. 2020). Highelevation environments offer a unique combination of challenges that can influence natural selection; these include lower atmospheric oxygen (i.e. hypoxia), reduced ambient temperatures, and increased exposure to DNA-damaging UV radiation relative to lower elevations (Sun et al. 2018). The adaptations to these abiotic factors have been shown in a multitude of species. For example, Qiu et al. (2012) compared the domestic yak (Bos grunniens) genome to that of low-altitude cattle (Bos taurus) and found evidence for functional enrichment in energy metabolism and domains related to hypoxic stress. A comparative genomic investigation coupled with functional assays of Tibetan hot-spring snakes (Thermophis spp.) identified specific amino acid substitutions for proteins involved in DNA damage repair and response to hypoxia among the high-elevation species (Li et al. 2018). Likewise, a transcriptomic analysis of lizards (Phrynocephalus erythrurus) on the Qinghai-Tibetan Plateau (QTP) revealed putative adaptations related to hypoxia, energy metabolism, and responses to UV damage (Yang et al. 2015).

Genome-enabled research into high-elevation systems continues to expand our knowledge of adaptation to extreme environments.

The American pika (Ochotona princeps) is an alpine lagomorph distributed across mountain ranges in the Pacific Northwest (Smith and Weston 1990; Hafner and Smith 2010). They are considered habitat specialists and typically reside in rocky, talus slopes at elevations >2,000 m (Smith and Weston 1990; Millar and Westfall 2010; Smith and Beever 2016). Previous research has provided some evidence for American pika high-elevation adaptation on local/regional scales based on reduced representation genome sequencing (Waterhouse et al. 2018; Schmidt et al. 2021) and transcriptomics (Lemay et al. 2013); however, a comprehensive examination across the American pika genome has not been explored. Furthermore, previous work relied upon older, lowerquality reference assemblies for the American pika; for example, Wang et al. (2020) used OchPri2.0-Ens (Ensembl), which is highly fragmented (193,096 scaffolds; scaffold N50 = 53.58 kb) and poorly annotated (16,006 genes) relative to modern assemblies (Giani et al. 2020; Whibley et al. 2021). The most recent reference genome for the American pika (OchPri4.0; NCBI RefSeq

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Accession: GCF_014633375.1) is significantly improved in both contiguity (9,350 scaffolds; scaffold N50 = 75.8 Mb) and annotation quality (21,186 genes), and is almost entirely (97% of total length) assembled into chromosomes (Sjodin *et al.* 2021). Importantly, the American pika has emerged as a sentinel species for the ecological impacts of climate change in alpine regions due to their acute environmental sensitivity (Beever *et al.* 2003; Galbreath *et al.* 2009; Beever *et al.* 2010, 2011; Wilkening *et al.* 2011; Stewart *et al.* 2015; Schwalm *et al.* 2016; Wilkening and Ray 2016); a thorough examination of climate adaptation within the American pika genome may provide important insights into potential biotic responses to changing environments while representing a valuable resource for guiding future studies.

Here, we investigated signatures of putative adaptation to high-elevation environments in the American pika. Leveraging the newest version of the *O. princeps* genome (Sjodin *et al.* 2021), we compared orthologous genes among the American pika and 8 other mammalian species to estimate phylogenetic relationships, examine functional enrichment in the American pika genome, and detect signatures of positive selection. We then identified putative genomic adaptations to high-elevation environments based on characterized gene functions and a targeted literature review.

Methods and materials Study design

We leveraged the recently published and annotated American pika genome (Sjodin et al. 2021) to identify putative genomic adaptations to high-elevation environments by comparing and contrasting with 8 other paired mammalian species spanning several major taxa across Glires (i.e. lagomorphs and rodents). Each species pair included a habitat generalist and an alpine habitat specialist to also cover a broad ecological range. The habitat specialists were the American pika, long-tailed chinchilla (Chinchilla lanigera), alpine marmot (Marmota marmota marmota), and arctic ground squirrel (Urocitellus parryii), whereas the paired generalists were European rabbit (Oryctolagus cuniculus), common degu (Octodon degus), yellow-bellied marmot (Marmota flaviventris), and 13-lined ground squirrel (Ictidomys tridecemlineatus), respectively. Humans (Homo sapiens) were included as an outgroup. To minimize differences in annotation quality across genomes, we used only those available through the NCBI RefSeq database and annotated using the NCBI Eukaryotic Genome Annotation Pipeline (O'Leary et al. 2016). Coding domain sequences (CDSs) and protein FASTA files were downloaded for each species from NCBI and used for downstream analyses (see Supplementary Table 1 for accession information).

Detection of orthologous gene families and functional enrichment

American pika genes were aligned and functionally annotated against the nonredundant NCBI and SwissProt (Boeckmann *et al.* 2003) protein databases using BLASTP v2.9.0 (Camacho *et al.* 2009) with an *E*-value cut-off of 1e–5. Genes with BLAST hits were then annotated with gene ontology (GO) terms using Blast2GO v5.2.5 (Götz *et al.* 2008). In addition, American pika genes were grouped into protein families and annotated with GO terms using InterProScan v5.50-84.0 (Cock *et al.* 2013; Jones *et al.* 2014) under default settings and merged with the BLAST GO terms in Blast2GO v5.2.5 (Götz *et al.* 2008).

We then identified orthologous gene families between the American pika and the other 8 mammalian species. To reduce redundancy within the dataset, we retained only the longest isoform for each protein within a species; in addition, we removed proteins with fewer than 50 amino acids to minimize false positives during ortholog detection and clustering. Orthologous protein sequences both within and among species were identified first using reciprocal best BLAST hits then clustered into gene families using a Markov Clustering algorithm as implemented in a modified version of OrthoMCL v2.0.9 (Fischer *et al.*, 2011; www. github.com/apetkau/orthomclsoftware-custom). Ortholog detection was automated with the orthomcl-pipeline using default settings (www.github.com/apetkau/orthomcl-pipeline).

We extracted gene families containing only American pika genes and grouped these with unclustered American pika genes to construct a "pika-specific" gene set. We found functionally enriched GO terms among pika-specific genes by means of a hypergeometric test using BiNGO v3.0.4 (Maere *et al.* 2005) as implemented in Cytoscape v3.8.2 (Smoot *et al.* 2011) employing the entire American pika gene set as the reference. Obtained P-values were corrected for multiple testing using the Benjamini-Hochberg false discovery rate, and significantly enriched GO terms were identified with an adjusted $P \le 0.05$. GO terms with similar functions were grouped together based on quantified information content and semantic similarities as calculated in the software GO-Figure! v1.0.1 (Reijnders and Waterhouse 2021).

Phylogenetic reconstruction and estimation of divergence times

To generate an ultrametric tree for downstream analysis, singlecopy orthologs were extracted from the orthologous gene families, defined as those families with a single representative gene from each species. We removed gene families with any sequences shorter than 200 amino acids to minimize spurious alignments and conducted a multiple sequence alignment using MUSCLE v3.8.31 (Edgar 2004a, 2004b) and default parameters. The corresponding CDS alignments were back-translated using PAL2NAL v14 (Suyama et al. 2006). Some CDSs did not contain chromosomal locations as they were predicted based on transcriptomic or other sequencing data in the RefSeq database; gene families containing these unlocalized genes were removed from downstream analysis. We identified homologous gene blocks for the remaining orthologous groups and concatenated them into "supergenes" using Gblocks v0.91b (Talavera and Castresana 2007). We then identified and extracted 4-fold degenerate nucleotide sites (4DTV) using MEGA v10.2.5 (Tamura et al. 2021) and used these sites to reconstruct the phylogeny under the GTR+I+ Γ model as implemented in MrBayes v3.2.6 (Ronquist et al. 2012). We ran 5 independent runs of the Markov chain Monte-Carlo (MCMC) process for 5 million generations with a 1 million generation burn-in each, sampling trees every 100 generations. Convergence was assessed by examining the estimated sample size (ESS) and potential scale reduction factor (PSRF) for each parameter estimate. Convergence was achieved when ESS > 100 and PSRF \approx 1 for all parameters (see Supplementary Table 2 for summary values).

To estimate divergence times, we first separated the concatenated super genes into 3 datasets corresponding to the first, second, and third codon sites. Divergence times were then estimated under a relaxed clock model using MCMCTREE as implemented in PAML v4.9 (Yang 2007). The tree topology was defined using the outputs from the above analysis. The mean substitution rate was estimated using BaseML in PAML v4.9 (Yang 2007). The overall substitution rate prior (rgene_gamma) was set to [1, 8] and the rate drift parameter prior (sigma2_gamma) was

set to [1, 10, 1] following author recommendations (Yang 2007). We used 3 calibration points based on previous studies: the split between Primates and Glires constrained at 61.7–100.5 million years ago (mya; Benton and Donoghue 2007); the split between Rodentia and Lagomorpha constrained at 71.5–94.1 mya (Meredith *et al.* 2011); and the split between Leporidae and Ochotonidae constrained at 47.4–56.9 mya (Meredith *et al.* 2011). We ran the program using 6 million MCMC reps and a burn-in of 2 million iterations. Divergence estimates from 2 independent runs were compared to assess convergence. The topology and divergence estimates were compared with established values in the literature to ensure the appropriateness of using this dataset for downstream analyses.

Identification of expanded and contracted gene families

We identified expanded and contracted gene families along each branch and node from the above phylogeny using CAFE v2.0 (Hahn et al. 2005, 2007; De Bie et al. 2006). We compared the cluster size of each branch with the maximum likelihood cluster size of the ancestral node leading to that branch and identified expanded and contracted gene families as those with smaller or larger ancestral nodes, respectively. We calculated the familywide P-values using a Monte Carlo resampling procedure of each branch and node and calculated the exact P-values for each significant family with $P \leq 0.01$ using the Viterbi method in CAFE v2.0 (Hahn et al. 2005, 2007; De Bie et al. 2006). Significant gene family expansions/contractions were defined as those with family P-values and exact P-values \leq 0.01. We extracted genes from significantly expanded American pika gene families and identified functionally enriched GO terms using the methods described above

Identification of positively selected genes and putative high-elevation adaptation

We identified positively selected genes (PSGs) in the American pika from the previously identified single-copy orthologs following alignment refinement using Gblocks v0.91b (Talavera and Castresana 2007) and a branch-site model using CodeML as implemented in PAML v4.9 (Yang 2007); these steps were automated using a custom shell script "p-codeml" (https://github. com/bsjodin/p-codeml). Refined gene alignments with length <150 bp were removed from downstream analysis to minimize spurious results. The American pika was set as the foreground branch, and all other species were set as background branches. We performed a likelihood ratio test, and resultant P-values were corrected for multiple testing using an FDR test with a Bonferroni correction. Significant PSGs were defined as those with an adjusted $P \leq 0.01$ and contained at least one positively selected site with a posterior probability ≥0.99 based on Bayes Empirical Bayes (BEB) analysis. We identified functionally enriched GO terms among PSGs using the methods described above. Functional descriptions for all PSGs were automatically generated using the Alliance of Genome Resources website (Kishore et al. 2020). To identify PSGs with putative links to high-elevation adaptation, we manually searched each gene on Google Scholar using the following Boolean search term: "gene name" "cold stress" OR "cold response" OR "cold resistance" OR "hypoxia" OR "high altitude" OR "UV damage" OR "climate." Searches were constrained to the first 10 hits, and putatively high-elevation adaptive genes were identified as those with reference support for adaptation to

hypoxia, cold temperatures, and/or UV exposure in any system or organism.

Results

Functional enrichment of pika-specific genes

We retained a mean of 20,098 genes from each species after filtering for downstream analysis, including 18,854 genes from the American pika (see Supplementary Table 3). We found 17,127 orthologous gene families across all species; 25 gene families contained only American pika genes (n = 55 genes), and these were grouped with 881 unclustered American pika genes to construct our pika-specific dataset (total n = 936 genes; see Supplementary Table 3). Of these, 857 genes could be annotated with GO terms. We found 141 functionally enriched GO terms (see Supplementary Table 4), which were grouped into 53 parent terms (Fig. 1). Of these parent terms, we identified 10 with putative links to high-elevation adaptation, including: 2 groups with 4 total terms associated with metabolism [cellular metabolic process (GO:0044237) and fatty acid biosynthetic process (GO:0006633)]; 4 groups containing 8 terms enriched in mitochondrial function/structure [mitochondrial envelope (GO:0005740), mitochondrial respirasome (GO:0005746), mitochondrial membrane (GO:0031966), and mitochondrial outer membrane translocase complex (GO:0005742)]; one group with 5 terms related to cytochrome-c oxidase activity (GO:0004129); and 3 groups with a total of 17 terms associated with DNA repair [positive regulation of DNA repair (GO:0045739), error-free post replication DNA repair (GO:0042275), and DNA double-strand break (DSB) processing (GO:0000729)].

Phylogeny and divergence times from single-copy orthologs

We identified 9,170 single-copy orthologous gene families among all 9 species. Of these, 2,081 groups were removed due to a protein length <50 amino acids and an additional 2,312 groups were removed due to inconsistencies between the protein and CDSs, resulting in a total of 4,777 groups. Gene alignments were refined and concatenated, and 4DTV sites were extracted resulting in 739,038 base "supergenes."

Our recovered topology was consistent with the currently recognized phylogenetic relationships (Gupta and Suggett 2022); each recovered node was supported with a posterior probability of 1.0 (Supplementary Fig. 1). In addition, divergence times for all nodes were largely consistent with previous estimates (Fig. 2). Our divergence estimates indicated the split between Primates and Glires occurred ~87.7 mya (Benton and Donoghue 2007; Meredith et al. 2011) with the split between Rodentia and Lagomorpha occurring shortly after at ~85.7 mya (Benton and Donoghue 2007; Meredith et al. 2011). We estimated the split between Sciurimorpha (marmots and ground squirrels) and Hystricomorpha (chinchilla, degu) to have occurred ~73.0 mya (Montgelard et al. 2008). Chinchillidae and Octodontidae diverged next within Rodentia at ~35.4 mya (Voloch et al. 2013). Ground squirrels and marmots diverged much more recently at \sim 8.1 mya (Giboulet et al. 1997), with within-family divergences occurring at ~5.3 and ~3.6 mya, respectively; these latter values were somewhat earlier than previously estimated divergence times using complete cytochrome b sequences (Harrison et al. 2003). Finally, we estimated that Leporidae and Ochotonidae diverged ~52.3 mya consistent with previous findings (Wang et al. 2020).



Fig. 1. Significantly enriched GO terms for "pika-specific" genes in the American pika genome. Significantly enriched terms were identified using a hypergeometric test using BiNGO v3.0.4 (Maere *et al.* 2005) as implemented in Cytoscape v3.8.2 (Smoot *et al.* 2011). Semantically similar terms were grouped together using GO-Figure! v1.0.1 (Reijnders and Waterhouse 2021). Bolded terms were putatively associated with high-elevation adaptation. BP, biological process; MF, molecular function; CC, cellular component. GO IDs and grouped terms can be found in Supplementary Table 4.



Fig. 2. Divergence time estimates and significantly expanded/contracted gene families across 9 mammalian species. Divergence times were estimated under a relaxed clock model as implemented in the MCMCTREE program of PAML v4.9 (Yang 2007). Branch labels indicate significantly expanded (+ values) and contracted (- values) gene families and were detected using CAFE v2.0 (Hahn *et al.* 2005, 2007; De Bie *et al.* 2006).

Significantly expanded gene families in the American pika

We found 15 significantly expanded gene families in the American pika genome encompassing 88 genes, of which 83 could be annotated with GO terms (Fig. 2; see Supplementary Table 5). The 15 expanded gene families had functions related to immune response (1 family), transcription/translation (4 families), cell proliferation (1 family), catalytic activity (4 families), olfactory/pheromone receptor activity (3 families), oxidoreductase activity (1 family), and nuclear structural components (1 family). We found 18 significantly enriched GO terms (see Supplementary Table 6 in Supplementary) across these gene families related to translation (3 terms), cellular proliferation (5 terms), immune response (2 terms), membrane receptor activity (2 terms), olfactory/pheromone receptor activity (2 terms), oxidoreductase activity (1 term), catalytic activity (2 terms), and biosynthetic activity (1 term).

PSGs with putative links to high-elevation adaptation

We removed 7 single-copy orthologs from the previously identified 4,777 due to short length prior to PSG detection. Of the remaining 4,770 genes, we found 196 PSGs within the American pika genome with at least one positively selected site (BEB \geq 0.99; corrected $P \leq 0.01$; see Supplementary Table 7). One hundred and ninety PSGs were annotated with GO terms; however, we found no significantly enriched GO terms across these genes (see Supplementary Table 8). We identified 41 PSGs with putative implications for adaptation to high-elevation environments, including 16 with putative links to cold tolerance, 23 with links to hypoxia, 7 with links to UV exposure, and another 6 with associations with high-elevation populations in other species (Table 1; n.b., some genes were classified into multiple categories).

Table 1. Positively selected genes (PSGs) in the American pika genome with putative links to high-elevation adaptation.

Gene code	Adaptation/evidence	References
Cold		
AASS	Differentially expressed under cold-stress conditions; may affect amino acid content (in winter turnin rane) due to cold stress	Fang et al. (2021)
CAPSL	Putatively under a selective sweep in mos-	Konorov et al. (2021)
DNAJA2	Upregulated due to cold stress in common	Cossins et al. (2006)
DNAJC13	Involved in cold resistance in Chinese white	Zhang et al. (2021)
EIF4B	Upregulated due to cold stress in Colorado	Govaere et al. (2019)
LOC101526896 (UQCRC2)	Over-expressed in yaks relative to cattle; im- proved energy metabolism due to high-al- titude adaptation	Wen et al. (2019)
LOC101527142 (CRHBP)	Increased expression after exposure to cold in Chinese honeybees	Liu et al. (2011)
NRDC	Critical for thermogenesis and temperature homeostasis in mice/mammals	Hiraoka et al. (2014)
NUP205	Increased expression following cold stress in large vellow croaker	Qian and Xue (2016)
РНКВ	Involved in cold acclimation in fish	Healy and Schulte (2019)
PLA1A	Linked to SNP outlier in cold-resilient cattle breeds	Igoshin et al. (2021); Passamonti et al. (2021)
PSMA6	Under-expressed following chronic cold stress in gilthead sea bream	Sanahuja et al. (2019)
SUGT1	Linked to temperature stress in black rock- fish	Lyu et al. (2018)
TBCD	Associated with outlier SNP linked to tem- perature stress-response in red mullet	Boulanger et al. (2022)
TREH	Plays a key role in cold resistance across nu- merous species	Shi et al. (2016); Bao et al. (2021)
ZNF330	Upregulated in response to cold stress in rainbow trout kidney	Verleih et al. (2015)
Hypoxia		
AASS	Upregulated in mice exposed to oxidative stress	Bertoletto et al. (2012)
ACTR2	Downregulated in human macrophages un- der chronic hypoxia	Fuhrmann et al. (2013)
ADAL BCKDHA	Upregulated with chronic hypoxia Upregulated in hypoxic conditions (in bacte- ria)	Van Linden and Eltzschig (2007) Oliveira et al. (2021)
CUL1 FIF4B	May be linked to hypoxia Increased phosphorylation in liver of paked	Mikus and Zundel (2005) Al-attar et al. (2020)
EIF5B	mole rats following hypoxia Upregulated in response to hypoxia in pri-	Bartoszewski et a . (2019)
GBF1	mary endothelial cells	Pescador et al. (2010): Goodin et al. (2013)
HAUS3	Downregulated under hypoxia in threespine stickleback	Leveelahti et al. (2011)
LOC101527142 (CRHBP)	Upregulated in hypoxic conditions for devel- oping rainbow trout	Fuzzen et al. (2011)
MAT2B	Downregulated under hypoxia in common sole	Mazurais et al. (2014)
MRPL19	Downregulated in hypoxic conditions (in kil- lifish)	Flight et al. (2011)
OXNAD1	Involved in hypoxia response; necessary for hypoxia cell survival	Jensen et al. (2011)
РНКВ	Upregulated in response to hypoxia in rain- bow trout	Léger <i>e</i> t al. (2021)
PNPT1	Downregulated following oxidative stress in obscure pufferfish	Wen et al. (2019)
PSMA6	Functionally enriched in American alligator cardiac tissue following hypoxia; downre- gulated under hypoxic conditions in threespine stickleback	Leveelahti et al. (2011); Alderman et al. (2019)
RNFT1	ER-associated degradation pathway linked to	Hu et al. (2022)
RUVBL1	Linked to CNVs in Chinese indigenous cattle, associated with lower copy numbers in high-altitude populations, linked to hyp- oxic stress	Zhang et al. (2020)

Table 1. (continued)

Gene code	Adaptation/evidence	References
TMEM150C	Correlated with higher lung diffusing capac- ity and gene expression in rats raised at low oxygen levels (simulating high-eleva- tion environment)	Krishnan et al. (2020)
TMTC2	Positively selected and linked to hypoxic ad- aptation in Chinese goats	Tian et al. (2021)
TRIM35	Downregulated under hypoxic conditions in adult channel catfish	Yang et al. (2018)
UTP18	Upregulated under anoxic conditions in yeast	Lee et al. (2016)
ZPLD1	Differentially expressed under varying hyp- oxic conditions in sea cucumber	Zhang et al. (2018)
UV exposure		
DGCR8	Phosphorylated after UV exposure, critical for cellular resistance to UV, repair of DNA damage, recovery of RNA synthesis in both mice and humans	Calses et al. (2017)
DNA2	May be linked to DNA repair following UV damage	Kciuk et al. (2020)
LOC101527142 (CRHBP)	Increased expression after exposure to UV in Chinese honeybees	Liu et al. (2011)
MLH1	Involved with mammalian DNA mismatch repair pathway, could be responding to ionizing radiation	Martin et al. (2010)
RFC4	Critical for DNA repair following UV damage; localizes to UV-stalled replication forks, leads to increased postreplication repair	Pathania et al. (2011)
SERPINB2	Significantly increased expression following UV irradiation, related to DNA repair (ker- atinocytes)	Majoros et al. (2019)
TELO2	Involved in cellular resistance to DNA dam- age, linked to an adaptive microsatellite in <i>Ciona robusta</i>	Chen et al. (2018)
High elevation		
ADAL	Environment-specific alleles associated with elevation in human populations	Gloria-Bottini et al. (2000)
GPR83	linked to an SNP outlier related to elevation in deer mice	Schweizer et al. (2021)
LOC101526896 (UQCRC2)	Over-expressed in yaks relative to cattle; im- proved energy metabolism due to high-al- titude adaptation	Wen et al. (2019)
RUVBL1	Linked to CNVs in Chinese indigenous cattle, associated with lower copy numbers in high-altitude populations	Zhang et al. (2020)
TMTC2	Positively selected for in Tibetan sheep, pos- sibly linked to high-altitude adaptation	Yang et al. (2016)
UTP18	Linked to adaptation to high-elevation envi- ronments in African indigenous chickens	Gheyas et al. (2021)

PSGs were identified from single-copy orthologs shared among 9 mammalian species using a branch-site model as implemented in CodeML in PAML v4.9 (Yang 2007).

Discussion

Life at high elevations

High-elevation environments are characterized by several extreme conditions including lower atmospheric oxygen content (hypoxia), reduced temperatures, and higher levels of UV radiation relative to what is found at lower elevations (Sun *et al.* 2018); each of these present significant challenges to the occupying fauna. Hypoxia reduces oxygen supply to tissues, which can limit aerobic metabolism (Cheviron and Brumfield 2012). A lowered metabolic rate can also lead to a reduction in thermogenesis in endotherms, making these species more susceptible to colder temperatures (Cheviron and Brumfield 2012). High levels of UV radiation pose a different challenge, particularly UV-B radiation, as this radiation can cause increased DNA damage (Wang *et al.* 2014). Species must adapt to these unique challenges in order to survive life at high elevations, often at a genomic level (Cheviron and Brumfield 2012; Qu *et al.* 2020). These genomic adaptations can affect genes responsible for oxygen transport (e.g. heme binding), energy metabolism, and DNA repair (Li *et al.* 2018; Sun *et al.* 2018). Putative adaptations to hypoxia have been found in several species of pika, including the American pika (Lemay *et al.* 2013; Waterhouse *et al.* 2018), Daurian pika (Solari and Hadly 2020), and plateau pika (Zhao *et al.* 2004; Li *et al.* 2009). Wang *et al.* (2020) identified putative adaptations associated with cold-tolerance across all extant pikas (*Ochotona* spp.) and hypothesized these occurred early in their evolutionary history (Wang *et al.* 2020). While these studies provide some insights into adaptation to high-elevation environments for some members of Ochotonidae, our study is the first to examine these questions on a wholegenome scale for the American pika, specifically.

High-elevation adaptation in the American pika

As a first step for our comparative genomic investigation of American pika adaption to high-elevation environments, we reconstructed a phylogeny and estimated divergence times between our focal species and 8 other mammalian species strategically targeted based on the availability of an annotated reference genome, phylogenetic relatedness inferred from previous studies, and (dis)similarity in ecology. Our recovered topology had high nodal support and was consistent with previously estimated relationships (Gupta and Suggett 2022). In addition, our divergence time estimates largely matched previous fossil and molecular estimates for all nodes in the tree (Giboulet *et al.* 1997; Harrison *et al.* 2003; Benton and Donoghue 2007; Montgelard *et al.* 2008; Meredith *et al.* 2011; Voloch *et al.* 2013; Wang *et al.* 2020). Not only are these results consistent with prior hypotheses regarding phylogenetic relationships, but they also provide validation that the orthologs used in these analyses were appropriate for estimating evolutionary relationships among these species.

Using these identified orthologs, we found extensive evidence for putative high-elevation adaptation in the American pika genome. Both the pika-specific genes and expanded gene families showed functional enrichment in GO categories related to the oxidation-reduction process, including cytochrome-c oxidase activity (GO:0004129), heme-copper terminal oxidase activity (GO:0015002), hydrogen ion transmembrane transporter activity (GO:0015078), and 3 terms associated with oxidoreductase activity (GO:0016675, GO:0016676, and GO:0016491; Fig. 1; see Supplementary Tables 4 and 6). Cytochrome-c oxidase activity and child terms of both hydrogen ion transmembrane activity and oxidoreductase activity have been linked to hypoxia adaptation in high-elevation domestic yaks (B. grunniens; Qiu et al. 2012) and Tibetan snakes (Thermophis spp.; Li et al. 2018) located on the QTP. Interestingly, the expanded gene family with oxidoreductase activity contained 6 genes annotated to aflatoxin B1 aldehyde reductase genes, which are predicted to be involved in cellular aldehyde metabolic processes. One of these genes, AKR7A3, has also been associated with temperature and hypoxia in European flounder (Pédron et al. 2017), and both AKR7A2 and AKR7A3 have been linked to an SNP outlier among high-elevation adapted human populations (Foll et al. 2014). We also found evidence for 23 PSGs with various links to survival in hypoxic conditions (Table 1). These genes contribute to the oxidation-reduction process (e.g. OXNAD1), are localized to the mitochondria (e.g. AASS, BCKDHA, MRPL19, PNPT1), or are part of enzymatic and metabolic pathways (e.g. AASS, ADAL, BCKDHA, CUL1, GBE1, MAT2B, PHKB, PNPT1, PSMA6), which are all involved in cellular adaptation to hypoxia (Lee et al. 2020). Two of these PSGs, OXNAD1 and PHKB, were also linked to outlier SNPs detected in a range-wide analysis of adaptation in the American pika (Schmidt et al. unpublished) and could serve as interesting targets for future study. Furthermore, we saw functional enrichment of numerous GO terms related to mitochondrial function and development, as well as metabolic activity (Fig. 1; see Supplementary Tables 4 and 6), providing further evidence for hypoxic adaptation in the American pika. Two of these terms, mitochondrion (GO:0005739) and mitochondrial inner membrane (GO:0005743), have been previously linked to upregulated genes in high-elevation populations of Himalayan pikas (Ochotona royeli; Solari et al. 2018).

Many of the putative hypoxia adaptations we found could also be linked to cold tolerance. American pikas have a high basal metabolic rate relative to their body size, leading to a higher than expected mean body temperature of $\sim 40^{\circ}$ C (MacArthur and Wang 1974). The adaptations which increase metabolic output and/or mitochondrial function could have evolved in the American pika to combat the cold, ambient temperatures (Lemay et al. 2013; Rankin et al. 2017; Waterhouse et al. 2018; Wang et al. 2020). In addition to the above genes, we also found 16 PSGs with putative cold adaptations including those with metabolic functions (e.g. PLA1A, SUGT1, TREH) or localized to the mitochondria (e.g. LOC101526896, NRDC). Of particular interest, NRDC is predicted to be involved in membrane proteolysis and regulation of endopeptidase activity within mitochondria. Experiments with knockout mice found that NRDC-deficient lines were prone to hypothermia and severe cold intolerance, suggesting that NRDC plays an important role in thermogenesis and body temperature homeostasis (Hiraoka et al. 2014). This gene, in particular, represents a promising target for future studies to investigate the effects of various mutations on thermogenesis and cold tolerance in the American pika and other high-elevation mammals.

We further found evidence for adaptation to increased UV exposure in the American pika genome. We identified 16 enriched GO terms in the pika-specific dataset involved in DNA repair, as well as an additional term related to DNA DSB processing (Fig. 1; see Supplementary Table 4). Of the genes annotated with these terms, UBE2V2 plays a role in DNA repair, particularly with respect to DSBs, such as those caused by UV radiation (Hofmann and Pickart 1999; David et al. 2010). This enzyme forms a heterodimer with UBE2N to catalyze the synthesis of "Lys-63"-linked polyubiquitin chains, which are necessary for error-free DNA repair (Hofmann and Pickart 1999; David et al. 2010). We also detected several promising PSGs related to DNA repair and cellular resistance to UV damage (Table 1). Several of these genes, namely DNA2, MLH1, and RFC4, appear to play a critical role in DNA repair following UV-induced DNA damage (Martin et al. 2010; Pathania et al. 2011; Kciuk et al. 2020). DNA2 is involved in the 5' resection of DNA during DSB repair (Kciuk et al. 2020; Zhao et al. 2020), while MLH1 is part of the MutL alpha complex, a key component of the DNA mismatch repair system (Martin et al. 2010). Following UV damage, RFC4 localizes to UV-stalled replication forks and contributes to checkpoint activation, leading to an increase in postreplication repair (Pathania et al. 2011). Other PSGs we found are involved in cellular resistance to UV damage. Phosphorylation of DGCR8 following UV exposure appears to be critical for cellular resistance to UV, as well as for recovery of RNA synthesis in both mice and humans (Calses et al. 2017). TELO2 acts as a regulator of the DNA damage response and is heavily involved in cellular resistance to both ionizing and UV radiation (Hurov et al. 2010; Chen et al. 2018). Collectively, these genes provide promising evidence for adaptation to increased UV exposure in the American pika.

Other environmentally associated adaptations and considerations

While this study focused on putative high-elevation adaptations, we did find evidence for additional adaptations related to environment. We found significant enrichment for olfactory receptor activity among both pika-specific genes as well as expanded gene families in the American pika (see Supplementary Tables 4 and 6). American pikas have 2 types of foraging behavior: grazing (direct consumption) and haying (caching plants for an over-winter food supply; Huntly *et al.* 1986); in addition, American pikas appear to cache higher-quality vegetation rather than the most commonly available (Smith and Erb 2013). Enhanced olfaction could potentially aid American pikas in selecting the appropriate quality of food to best survive the winter months. Related to olfaction, we also saw enrichment of pheromone receptor activity among expanded gene families (see Supplementary Table 6). Unlike other lagomorphs, both male and female American pikas

remain territorial year-round (Boonstra et al. 2022) and are known to use cheek glands to scent mark rocks around their territory to ward off conspecifics (Meaney 1986). This association between olfactory receptor activity and territorial behavior in American pikas represents a promising avenue for future inquiry.

It is important to note that the available American pika genome was constructed from a single individual sampled within Beaverhead-Deerlodge National Forest in southwestern Montana, USA at an elevation of ~2,770 m above sea level. This site is centrally located within the Northern Rocky Mountains lineage of the American pika, which is the largest in terms of area (see Galbreath et al. 2009). The fact that the genome was constructed from a single individual from a single location could mean that observed variation may not be representative of the entire species. However, as we focused this study on coding regions, intraspecific variation should be less pronounced given evolutionary constraints including slower mutation rates. In addition, this genome should be appropriate for detecting high-elevation adaptations within the American pika given the sampling location approaches the upper extent of their contemporary elevational range (Smith and Weston 1990).

Conclusions

Here, we identified and characterized putative adaptation in the American pika genome. We found support across multiple analyses for functional enrichment in categories related to hypoxia, cold tolerance, and DNA repair, and identified numerous PSGs with links to high-elevation adaptation. Although these results do not constitute direct evidence for environmental adaptation, they provide important targets for future studies within the American pika and across other mammalian species. These investigations could include examination of gene expression along elevational gradients, molecular assays in which functional responses are measured, or even correlative approaches of genetic differentiation across varying environmental conditions. Recommended targets include OXNAD1, NRDC, and those genes which are critical in DNA repair, as we found the strongest support for these regions. Altogether, this work provides the first whole-genome examination of high-elevation adaptation in American pikas and will serve as an important reference for future studies related to environmental adaptation and climate change.

Data availability

All genome assemblies and associated data are publicly available in the NCBI database with accession information in Supplementary Table 1 in the Supplementary Tables file. All custom scripts used in this article are available at https://github. com/bsjodin.

Supplemental material is available at G3 online.

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Conflicts of interest

None declared.

Literature cited

- Al-attar R, Childers CL, Nguyen VC, Pamenter ME, Storey KB. Differential protein phosphorylation is responsible for hypoxiainduced regulation of the Akt/mTOR pathway in naked mole rats. Comp Biochem Physiol A Mol Integr Physiol. 2020;242: 110653. doi:10.1016/j.cbpa.2020.110653.
- Alderman SL, Crossley DA, Elsey RM, Gillis TE. Hypoxia-induced reprogramming of the cardiac phenotype in American alligators (Alligator mississippiensis) revealed by quantitative proteomics. Sci Rep. 2019;9(1):8592. doi:10.1038/s41598-019-45023-3.
- Bao J, Wang X, Feng C, Li X, Jiang H. Trehalose metabolism in the Chinese mitten crab Eriocheir sinensis: molecular cloning of trehalase and its expression during temperature stress. Aquaculture Rep. 2021;20:100770. doi:10.1016/j.aqrep.2021.100770.
- Bartoszewski R, Moszyńska A, Serocki M, Cabaj A, Polten A, Ochocka R, Dell'Italia L, Bartoszewska S, Króliczewski J, Dąbrowski M, et al. Primary endothelial cell–specific regulation of hypoxia-inducible factor (HIF)-1 and HIF-2 and their target gene expression profiles during hypoxia. FASEB J. 2019;33(7):7929–7941. doi:10.1096/fj.201802650RR.
- Beever EA, Brussard PF, Berger J. Patterns of apparent extirpation among isolated populations of pikas (Ochotona princeps) in the Great Basin. J Mammal. 2003;84(1):37–54. doi:10.1644/1545-1542(2003)084<0037: POAEAI>2.0.CO;2.
- Beever EA, Ray C, Mote PW, Wilkening JL. Testing alternative models of climate-mediated extirpations. Ecol Appl. 2010;20(1):164–178. doi:10.1890/08–1011.1.
- Beever EA, Ray C, Wilkening JL, Brussard PF, Mote PW. Contemporary climate change alters the pace and drivers of extinction. Global Change Biol. 2011;17(6):2054–2070. doi:10.1111/j.1365–2486.2010. 02389.x.
- Benton MJ, Donoghue PCJ. Paleontological evidence to date the tree of life. Mol Biol Evol. 2007;24(1):26–53. doi:10.1093/molbev/ msl150.
- Bertoletto PR, Teruya R, Chaves JC, Ikejiri AT, Somaio Neto F, Taha MO, Fagundes DJ. Oxidative stress gene expression profile in inbred mouse after small bowel ischemia/reperfusion injury. Transplantation. 2012;94(10S):737.
- Boeckmann B, Bairoch A, Apweiler R, Blatter M-C, Estreicher A, Gasteiger E, Martin MJ, Michoud K, O'Donovan C, Phan I, et al. The SWISS-PROT protein knowledgebase and its supplement TrEMBL in 2003. Nucleic Acids Res. 2003;31(1):365–370. doi:10.1093/nar/ gkg095.
- Boonstra R, Gandhi N, Kraushaar A, Galbreath K. From habitat to hormones: year-around territorial behavior in rock-dwelling but not in forest and grassland lagomorphs and the role of DHEA. Horm Behav. 2022;142:105179. doi:10.1016/j.yhbeh.2022.105179.
- Boulanger E, Benestan L, Guerin P-E, Dalongeville A, Mouillot D, Manel S. Climate differently influences the genomic patterns of two sympatric marine fish species. J Anim Ecol. 2022;91(6): 1180–1195. doi:10.1111/1365–2656.13623.

- Calses PC, Dhillon KK, Tucker N, Chi Y, Huang J, Kawasumi M, Nghiem P, Wang Y, Clurman BE, Jacquemont C, et al. DGCR8 mediates repair of UV-induced DNA damage independently of RNA processing. Cell Rep. 2017;19(1):162–174. doi: 10.1016/j.celrep.2017.03.021.
- Camacho C, Coulouris G, Avagyan V, Ma N, Papadopoulos J, Bealer K, Madden TL. BLAST+: architecture and applications. BMC Bioinformatics. 2009;10:421. doi:10.1186/1471-2105-10-421.
- Chen Y, Shenkar N, Ni P, Lin Y, Li S, Zhan A. Rapid microevolution during recent range expansion to harsh environments. BMC Evol Biol. 2018;18(1):187. doi:10.1186/s12862-018-1311-1.
- Cheviron ZA, Brumfield RT. Genomic insights into adaptation to high-altitude environments. Heredity (Edinb). 2012;108(4): 354–361. doi:10.1038/hdy.2011.85.
- Cock PJA, Grüning BA, Paszkiewicz K, Pritchard L. Galaxy tools and workflows for sequence analysis with applications in molecular plant pathology. PeerJ. 2013;1:e167. doi:10.7717/peerj.167.
- Cossins A, Fraser J, Hughes M, Gracey A. Post-genomic approaches to understanding the mechanisms of environmentally induced phenotypic plasticity. J Exp Biol. 2006;209(Pt 12):2328–2336. doi: 10.1242/jeb.02256.
- David Y, Ziv T, Admon A, Navon A. The E2 ubiquitin-conjugating enzymes direct polyubiquitination to preferred lysines. J Biol Chem. 2010;285(12):8595–8604. doi:10.1074/jbc.M109.089003.
- De Bie T, Cristianini N, Demuth JP, Hahn MW. CAFE: a computational tool for the study of gene family evolution. Bioinformatics. 2006; 22(10):1269–1271. doi:10.1093/bioinformatics/btl097.
- Edgar RC. MUSCLE: multiple sequence alignment with high accuracy and high throughput. Nucleic Acids Res. 2004a;32(5):1792–1797. doi:10.1093/nar/gkh340.
- Edgar RC. MUSCLE: a multiple sequence alignment method with reduced time and space complexity. BMC Bioinformatics. 2004b; 5(1):113. doi:10.1186/1471-2105-5-113.
- Fang Y, Coulter JA, Wu J, Liu L, Li X, Dong Y, Ma L, Pu Y, Sun B, Niu Z, et al. Identification of differentially expressed genes involved in amino acid and lipid accumulation of winter turnip rape (Brassica rapa L.) in response to cold stress. PLoS One. 2021;16(2):e0245494. doi:10.1371/journal.pone.0245494.
- Fischer S, Brunk BP, Chen F, Gao X, Harb OS, Iodice JB, Shanmugam D, Roos DS, Stoeckert CJ. Using OrthoMCL to assign proteins to OrthoMCL-DB groups or to cluster proteomes into new ortholog groups. Curr Protoc Bioinformatics. 2011;Chapter 6:Unit 6.12.1–Unit 6.1219. doi:10.1002/0471250953.bi0612s35.
- Flight PA, Nacci D, Champlin D, Whitehead A, Rand DM. The effects of mitochondrial genotype on hypoxic survival and gene expression in a hybrid population of the killifish, *Fundulus heteroclitus*. Mol Ecol. 2011;20(21):4503–4520. doi:10.1111/j.1365-294X.2011.05290.x.
- Foll M, Gaggiotti OE, Daub JT, Vatsiou A, Excoffier L. Widespread signals of convergent adaptation to high altitude in Asia and America. Am J Hum Genet. 2014;95(4):394–407. doi:10.1101/002816.
- Fuhrmann DC, Wittig I, Heide H, Dehne N, Brüne B. Chronic hypoxia alters mitochondrial composition in human macrophages. Biochim Biophys Acta. 2013;1834(12):2750–2760. doi:10.1016/j.bbapap.2013.09.023.
- Fuzzen MLM, Alderman SL, Bristow EN, Bernier NJ. Ontogeny of the corticotropin-releasing factor system in rainbow trout and differential effects of hypoxia on the endocrine and cellular stress responses during development. Gen Comp Endocrinol. 2011; 170(3):604–612. doi:10.1016/j.ygcen.2010.11.022.
- Galbreath KE, Hafner DJ, Zamudio KR. When cold is better: climatedriven elevation shifts yield complex patterns of diversification and demography in an alpine specialist (American pika, Ochotona princeps). Evolution. 2009;63(11):2848–2863. doi:10.1111/j.1558–5646.2009. 00803.x.

- Gheyas AA, Vallejo-Trujillo A, Kebede A, Lozano-Jaramillo M, Dessie T, Smith J, Hanotte O. Integrated environmental and genomic analysis reveals the drivers of local adaptation in African indigenous chickens. Mol Biol Evol. 2021;38(10):4268–4285. doi: 10.1093/molbev/msab156.
- Giani AM, Gallo GR, Gianfranceschi L, Formenti G. Long walk to genomics: history and current approaches to genome sequencing and assembly. Comput Struct Biotechnol J. 2020;18:9–19. doi: 10.1016/j.csbj.2019.11.002.
- Giboulet O, Chevret P, Ramousse R, Catzeflis F. DNA–DNA hybridization evidence for the recent origin of marmots and ground squirrels (Rodentia: Sciuridae). J Mammal Evol. 1997;4(4):271–284. doi: 10.1023/A:1027326631342. [Mismatch]
- Gloria-Bottini F, Lucarelli P, Lucarini N, Bottini E. Adenosine deaminaseacid phosphatase association and the environment: a study in a continental Italian population. Am J Hum Biol. 2000;12(2):214–220. doi: 10.1002/(SICI)1520–6300(200003/04)12:2<214::AID-AJHB7>3.0.CO; 2–5.
- Goodin JL, Pizarro-Matos JM, Prasad BM, Seiter TJ, Weaver CR, Muza SR, Beidleman BA, Wood JC. Evaluating the molecular basis for acute mountain sickness: hypoxia response gene expression patterns in warfighters and murine populations. Mil Med. 2013; 178(11):1256–1263. doi:10.7205/MILMED-D-13–00185.
- Götz S, García-Gómez JM, Terol J, Williams TD, Nagaraj SH, Nueda MJ, Robles M, Talón M, Dopazo J, Conesa A. High-throughput functional annotation and data mining with the Blast2GO suite. Nucleic Acids Res. 2008;36(10):3420–3435. doi:10.1093/nar/gkn176.
- Govaere L, Morin MD, Frigault JJ, Boquel S, Cohen A, Lamarre SG, Morin P. Transcriptome and proteome analyses to investigate the molecular underpinnings of cold response in the Colorado potato beetle, Leptinotarsa decemlineata. Cryobiology. 2019;88:54–63. doi: 10.1016/j.cryobiol.2019.03.011.
- Gupta RS, Suggett C. Conserved signatures in protein sequences reliably demarcate different clades of Rodents/Glires species and consolidate their evolutionary relationships. Genes. 2022;13(2): 288. doi:10.3390/genes13020288.
- Hafner DJ, Smith AT. Revision of the subspecies of the American pika, *Ochotona princeps* (Lagomorpha: Ochotonidae). J Mammal. 2010;91(2):401–417. doi:10.1644/09-MAMM-A-277.1.
- Hahn MW, Bie TD, Stajich JE, Nguyen C, Cristianini N. Estimating the tempo and mode of gene family evolution from comparative genomic data. Genome Res. 2005;15(8):1153–1160. doi:10.1101/gr.3567505.
- Hahn MW, Demuth JP, Han S-G. Accelerated rate of gene gain and loss in primates. Genetics. 2007;177(3):1941–1949. doi:10.1534/genetics.107.080077.
- Harrison RG, Bogdanowicz SM, Hoffmann RS, Yensen E, Sherman PW. Phylogeny and evolutionary history of the ground squirrels (Rodentia: Marmotinae). J Mamm Evol. 2003;10(3):249–276. doi: 10.1023/B: JOMM.0000015105.96065.f0.
- Healy TM, Schulte PM. Patterns of alternative splicing in response to cold acclimation in fish. J Exp Biol. 2019;222(5):jeb193516. doi: 10.1242/jeb.193516.
- Hiraoka Y, Matsuoka T, Ohno M, Nakamura K, Saijo S, Matsumura S, Nishi K, Sakamoto J, Chen P-M, Inoue K, *et al.* Critical roles of nardilysin in the maintenance of body temperature homoeostasis. Nat Commun. 2014;5(1):3224. doi:10.1038/ncomms4224.
- Hofmann RM, Pickart CM. Noncanonical MMS2-encoded ubiquitinconjugating enzyme functions in assembly of novel polyubiquitin chains for DNA repair. Cell. 1999;96(5):645–653. doi: 10.1016/S0092-8674(00)80575-9.
- Hu Z, Feng J, Song H, Zhou C, Yu Z-L, Yang M-J, Shi P, Guo Y-J, Li Y-R, Zhang T. Mechanisms of heat and hypoxia defense in hard clam:

insights from transcriptome analysis. Aquaculture. 2022;549: 737792. doi:10.1016/j.aquaculture.2021.737792.

- Huntly NJ, Smith AT, Ivins BL. Foraging behavior of the pika (Ochotona princeps), with comparisons of grazing versus haying. J Mammal. 1986;67(1):139–148. doi:10.2307/1381010.
- Hurov KE, Cotta-Ramusino C, Elledge SJ. A genetic screen identifies the Triple T complex required for DNA damage signaling and ATM and ATR stability. Genes Dev. 2010;24(17):1939–1950. doi: 10.1101/gad.1934210.
- Igoshin A, Yudin N, Aitnazarov R, Yurchenko AA, Larkin DM. Wholegenome resequencing points to candidate DNA loci affecting body temperature under cold stress in Siberian cattle populations. Life. 2021;11(9):959. doi:10.3390/life11090959.
- Jensen KS, Binderup T, Jensen KT, Therkelsen I, Borup R, Nilsson E, Multhaupt H, Bouchard C, Quistorff B, Kjaer A, et al. FoxO3A promotes metabolic adaptation to hypoxia by antagonizing Myc function: FoxO3A inhibits Myc to control hypoxic metabolism. EMBO J. 2011;30(22):4554–4570. doi:10.1038/ emboj.2011.323.
- Jones P, Binns D, Chang H-Y, Fraser M, Li W, McAnulla C, McWilliam H, Maslen J, Mitchell A, Nuka G, et al. InterProScan 5: genomescale protein function classification. Bioinformatics. 2014;30(9): 1236–1240. doi:10.1093/bioinformatics/btu031.
- Kciuk M, Marciniak B, Mojzych M, Kontek R. Focus on UV-induced DNA damage and repair: disease relevance and protective strategies. Int J Mol Sci. 2020;21(19):7264. doi:10.3390/ijms21197264.
- Kishore R, Arnaboldi V, Van Slyke CE, Chan J, Nash RS, Urbano JM, Dolan ME, Engel SR, Shimoyama M, Sternberg PW, et al. Automated generation of gene summaries at the Alliance of Genome Resources. Database. 2020;2020:baaa037. doi: 10.1093/database/baaa037.
- Konorov EA, Yurchenko V, Patraman I, Lukashev A, Oyun N. The effects of genetic drift and genomic selection on differentiation and local adaptation of the introduced populations of *Aedes albopictus* in southern Russia. PeerJ. 2021;9:e11776. doi:10.7717/ peerj.11776.
- Krishnan S, Stearman RS, Zeng L, Fisher A, Mickler EA, Rodriguez BH, Simpson ER, Cook T, Slaven JE, Ivan M, et al. Transcriptomic modifications in developmental cardiopulmonary adaptations to chronic hypoxia using a murine model of simulated highaltitude exposure. Am J Physiol Lung Cell Mol Physiol. 2020; 319(3):L456–L470. doi:10.1152/ajplung.00487.2019.
- Kristensen TN, Ketola T, Kronholm I. Adaptation to environmental stress at different timescales. Ann N Y Acad Sci. 2020;1476(1): 5–22. doi:10.1111/nyas.13974.
- Lee BY, Lee J-H, Byun J-H, Woo DK. Whole-genome transcriptional responses to hypoxia in respiration-proficient and respiration-deficient yeasts: implication of the mitochondrial respiratory chain in oxygen-regulated gene expression. J Life Sci. 2016;26(10): 1137–1152. doi:10.5352/JLS.2016.26.10.1137.
- Lee P, Chandel NS, Simon MC. Cellular adaptation to hypoxia through hypoxia inducible factors and beyond. Nat Rev Mol Cell Biol. 2020;21(5):268–283. doi:10.1038/s41580-020-0227-y.
- Léger JAD, Athanasio CG, Zhera A, Chauhan MF, Simmons DBD. Hypoxic responses in Oncorhynchus mykiss involve angiogenesis, lipid, and lactate metabolism, which may be triggered by the cortisol stress response and epigenetic methylation. Comp Biochem Physiol Part D Genomics Proteomics. 2021;39:100860. doi: 10.1016/j.cbd.2021.100860.
- Lemay MA, Henry P, Lamb CT, Robson KM, Russello MA. Novel genomic resources for a climate change sensitive mammal: characterization of the American pika transcriptome. BMC Genomics. 2013;14(1):311. doi:10.1186/1471–2164-14–311.

- Leveelahti L, Leskinen P, Leder EH, Waser W, Nikinmaa M. Responses of threespine stickleback (*Gasterosteus aculeatus*, L) transcriptome to hypoxia. Comp Biochem Physiol Part D Genomics Proteomics. 2011;6(4):370–381. doi:10.1016/j.cbd.2011. 08.001.
- Li H-G, Ren Y-M, Guo S-C, Cheng L, Wang D-P, Yang J, Chang Z-J, Zhao X-Q. The protein level of hypoxia-inducible factor-1α is increased in the plateau pika (*Ochotona curzoniae*) inhabiting high altitudes. J Exp Zool A Ecol Genet Physiol. 2009;311(2):134–141. doi:10.1002/jez.510.
- Li J-T, Gao Y-D, Xie L, Deng C, Shi P, Guan M-L, Huang S, Ren J-L, Wu D-D, Ding L, *et al.* Comparative genomic investigation of highelevation adaptation in ectothermic snakes. Proc Natl Acad Sci USA. 2018;115(33):8406–8411. doi:10.1073/pnas.1805348115.
- Liu L, Yu X, Meng F, Guo X, Xu B. Identification and characterization of a novel corticotropin-releasing hormone-binding protein (CRH-BP) gene from Chinese honeybee (Apis cerana cerana). Arch Insect Biochem Physiol. 2011;78(3):161–175. doi:10.1002/arch.20451.
- Lyu L, Wen H, Li Y, Li J, Zhao J, Zhang S, Song M, Wang X. Deep transcriptomic analysis of black rockfish (*Sebastes schlegelii*) provides new insights on responses to acute temperature stress. Sci Rep. 2018;8(1):9113. doi:10.1038/s41598-018–27013-z.
- MacArthur RA, Wang LCH. Behavioral thermoregulation in the pika Ochotona princeps: a field study using radiotelemetry. Can J Zool. 1974;52(3):353–358. doi:10.1139/z74-042.
- Maere S, Heymans K, Kuiper M. BiNGO: a Cytoscape plugin to assess overrepresentation of gene ontology categories in biological networks. Bioinformatics. 2005;21(16):3448–3449. doi:10.1093/bioin formatics/bti551.
- Majoros H, Ujfaludi Z, Borsos BN, Hudacsek VV, Nagy Z, Coin F, Buzas K, Kovács I, Bíró T, Boros IM, et al. SerpinB2 is involved in cellular response upon UV irradiation. Sci Rep. 2019;9(1):2753. doi:10.1038/s41598-019–39073-w.
- Martin LM, Marples B, Coffey M, Lawler M, Lynch TH, Hollywood D, Marignol L. DNA mismatch repair and the DNA damage response to ionizing radiation: making sense of apparently conflicting data. Cancer Treat Rev. 2010;36(7):518–527. doi:10.1016/j.ctrv. 2010.03.008.
- Mazurais D, Ferraresso S, Gatta PP, Desbruyères E, Severe A, Corporeau C, Claireaux G, Bargelloni L, Zambonino-Infante J-L. Identification of hypoxia-regulated genes in the liver of common sole (Solea solea) fed different dietary lipid contents. Mar Biotechnol (NY). 2014;16(3):277–288. doi:10.1007/s10126-01 3–9545-9.
- Meaney CA. Scent-marking in pikas (Ochotona princeps): Test of a breeding-facilitation hypothesis. In: D Duvall, D Müller-Schwarze, RM Silverstein, editors. Chemical Signals in Vertebrates 4. Boston (MA): Springer US; 1986. p. 571–577 [accessed 2022 Aug 23]. http://link.springer.com/10.1007/978-1-4613-2235-1_45.
- Meredith RW, Janečka JE, Gatesy J, Ryder OA, Fisher CA, Teeling EC, Goodbla A, Eizirik E, Simão TLL, Stadler T, et al. Impacts of the Cretaceous terrestrial revolution and KPg extinction on mammal diversification. Science. 2011;334(6055):521–524.
- Mikus P, Zundel W. COPing with hypoxia. Semin Cell Dev Biol. 2005; 16(4–5):462–473. doi:10.1016/j.semcdb.2005.03.002.
- Millar CI, Westfall RD. Distribution and climatic relationships of the American pika (Ochotona princeps) in the Sierra Nevada and Western Great Basin, U.S.A.; periglacial landforms as refugia in warming climates. Arct Antarct Alp Res. 2010;42(1):76–88. doi: 10.1657/1938–4246-42.1.76.
- Montgelard C, Forty E, Arnal V, Matthee CA. Suprafamilial relationships among Rodentia and the phylogenetic effect of removing

fast-evolving nucleotides in mitochondrial, exon and intron fragments. BMC Evol Biol. 2008;8:321. doi:10.1186/1471-2148-8-321.

- O'Leary NA, Wright MW, Brister JR, Ciufo S, Haddad D, McVeigh R, Rajput B, Robbertse B, Smith-White B, Ako-Adjei D, *et al.* Reference sequence (RefSeq) database at NCBI: current status, taxonomic expansion, and functional annotation. Nucleic Acids Res. 2016;44(D1):D733-745. doi:10.1093/nar/gkv1189.
- Oliveira LN, Lima PdS, Araújo DS, Portis IG, Santos Júnior AdCd, Coelho ASG, de Sousa MV, Ricart CAO, Fontes W, Soares CdA iTRAQ-based proteomic analysis of *Paracoccidioides brasiliensis* in response to hypoxia. Microbiol Res. 2021;247:126730. doi: 10.1016/j.micres.2021.126730.
- Parsons PA. Environments and evolution: interactions between stress, resource inadequacy and energetic efficiency. Biol Rev Camb Philos Soc. 2005;80(4):589–610. doi:10.1017/S146479310 5006822.
- Passamonti MM, Somenzi E, Barbato M, Chillemi G, Colli L, Joost S, Milanesi M, Negrini R, Santini M, Vajana E, et al. The quest for genes involved in adaptation to climate change in ruminant livestock. Animals. 2021;11(10):2833. doi:10.3390/ani11102833.
- Pathania S, Nguyen J, Hill SJ, Scully R, Adelmant GO, Marto JA, Feunteun J, Livingston DM. BRCA1 is required for postreplication repair after UV-induced DNA damage. Mol Cell. 2011;44(2): 235–251. doi:10.1016/j.molcel.2011.09.002.
- Pédron N, Artigaud S, Infante J-LZ, Le Bayon N, Charrier G, Pichereau V, Laroche J. Proteomic responses of European flounder to temperature and hypoxia as interacting stressors: differential sensitivities of populations. Sci Total Environ. 2017;586:890–899. doi: 10.1016/j.scitotenv.2017.02.068.
- Pescador N, Villar D, Cifuentes D, Garcia-Rocha M, Ortiz-Barahona A, Vazquez S, Ordoñez A, Cuevas Y, Saez-Morales D, Garcia-Bermejo ML, et al. Hypoxia promotes glycogen accumulation through hypoxia inducible factor (HIF)-mediated induction of glycogen synthase 1. PLoS One. 2010;5(3):e9644. doi:10.1371/journal.pone.0009644.
- Qian B, Xue L. Liver transcriptome sequencing and de novo annotation of the large yellow croaker (*Larimichthy crocea*) under heat and cold stress. Mar Genomics. 2016;25:95–102. doi:10.1016/ j.margen.2015.12.001.
- Qiu Q, Zhang G, Ma T, Qian W, Wang J, Ye Z, Cao C, Hu Q, Kim J, Larkin DM, *et al*. The yak genome and adaptation to life at high altitude. Nat Genet. 2012;44(8):946–949. doi:10.1038/ng.2343.
- Qu Y, Chen C, Xiong Y, She H, Zhang YE, Cheng Y, DuBay S, Li D, Ericson PGP, Hao Y, *et al.* Rapid phenotypic evolution with shallow genomic differentiation during early stages of high elevation adaptation in Eurasian tree sparrows. Natl Sci Rev. 2020;7(1): 113–127. doi:10.1093/nsr/nwz138.
- Rankin AM, Galbreath KE, Teeter KC. Signatures of adaptive molecular evolution in American pikas (*Ochotona princeps*). J Mammal. 2017;98(4):1156–1167. doi:10.1093/jmammal/gyx059.
- Reijnders MJMF, Waterhouse RM. Summary visualizations of gene ontology terms with GO-Figure!. Front Bioinform. 2021;1(638255): 1–8.
- Ronquist F, Teslenko M, van der Mark P, Ayres DL, Darling A, Höhna S, Larget B, Liu L, Suchard MA, Huelsenbeck JP. MrBayes 3.2: efficient Bayesian phylogenetic inference and model choice across a large model space. Syst Biol. 2012;61(3):539–542. doi:10.1093/sysbio/sys029.
- Sanahuja I, Fernández-Alacid L, Sánchez-Nuño S, Ordóñez-Grande B, Ibarz A. Chronic cold stress alters the skin mucus interactome in a temperate fish model. Front Physiol. 2019;9:1916–1918. doi: 10.3389/fphys.2018.01916.

- Schmidt DA, Waterhouse MD, Sjodin BMF, Russello MA. Genomewide analysis reveals associations between climate and regional patterns of adaptive divergence and dispersal in American pikas. Heredity (Edinb). 2021;127(5):443–454. doi:10.1038/s41437-02 1–00472-3.
- Schwalm D, Epps CW, Rodhouse TJ, Monahan WB, Castillo JA, Ray C, Jeffress MR. Habitat availability and gene flow influence diverging local population trajectories under scenarios of climate change: a place-based approach. Glob Chang Biol. 2016;22(4):1572–1584. doi:10.1111/gcb.13189.
- Schweizer RM, Jones MR, Bradburd GS, Storz JF, Senner NR, Wolf C, Cheviron ZA. Broad concordance in the spatial distribution of adaptive and neutral genetic variation across an elevational gradient in deer mice. Mol Biol Evol. 2021;38(10):4286–4300. doi: 10.1093/molbev/msab161.
- Shi Z, Liu X, Xu Q, Qin Z, Wang S, Zhang F, Wang S, Tang B. Two novel soluble trehalase genes cloned from *Harmonia axyridis* and regulation of the enzyme in a rapid changing temperature. Comp Biochem Physiol B Biochem Mol Biol. 2016;198:10–18. doi: 10.1016/j.cbpb.2016.03.002.
- Sjodin BMF, Galbreath KE, Lanier HC, Russello MA. Chromosomelevel reference genome assembly for the American pika (Ochotona princeps). J Hered. 2021;112(6):549–557. doi:10.1093/jhered/esab031.
- Smith AT, Beever E. Ochotona princeps. International Union for Conservation of Nature the IUCN Red List of Threatened Species. 2016;2016:e.T41267A45184315. doi:10.2305/IUCN.UK.2016-3.RLTS. T41267A45184315.en.
- Smith AT, Weston ML. Ochotona princeps. Mammalian Species. 1990;(352):1. doi:10.2307/3504319.
- Smith JA, Erb LP. Patterns of selective caching behavior of a generalist herbivore, the American pika (Ochotona princeps). Arct Antarct Alp Res. 2013;45(3):396–403. doi:10.1657/1938–4246-45.3.396.
- Smoot ME, Ono K, Ruscheinski J, Wang P-L, Ideker T. Cytoscape 2.8: new features for data integration and network visualization. Bioinformatics. 2011;27(3):431–432. doi:10.1093/bioinformatics/ btg675.
- Solari KA, Hadly EA. Experimental study of hypoxia-induced changes in gene expression in an Asian pika, Ochotona dauurica. PLoS One. 2020;15(10):e0240435. doi:10.1371/journal.pone.024 0435.
- Solari KA, Ramakrishnan U, Hadly EA. Gene expression is implicated in the ability of pikas to occupy Himalayan elevational gradient. PLoS One. 2018;13(12):e0207936. doi:10.1371/journal.pone.0207 936.
- Stewart JAE, Perrine JD, Nichols LB, Thorne JH, Millar CI, Goehring KE, Massing CP, Wright DH. Revisiting the past to foretell the future: summer temperature and habitat area predict pika extirpations in California. J Biogeogr. 2015;42(5):880–890. doi:10.1111/jbi. 12466.
- Sun Y-B, Fu T-T, Jin J-Q, Murphy RW, Hillis DM, Zhang Y-P, Che J. Species groups distributed across elevational gradients reveal convergent and continuous genetic adaptation to high elevations. Proc Natl Acad Sci U S A. 2018;115(45):E10634–E10641. doi: 10.1073/pnas.1813593115.
- Suyama M, Torrents D, Bork P. PAL2NAL: robust conversion of protein sequence alignments into the corresponding codon alignments. Nucleic Acids Res. 2006;34(Web Server issue): W609–W612. doi:10.1093/nar/gkl315.
- Talavera G, Castresana J. Improvement of phylogenies after removing divergent and ambiguously aligned blocks from protein sequence alignments. Syst Biol. 2007;56(4):564–577. doi: 10.1080/10635150701472164.

- Tamura K, Stecher G, Kumar S. MEGA11: molecular evolutionary genetics analysis version 11. Mol Biol Evol. 2021;38(7):3022–3027. doi:10.1093/molbev/msab120.
- Tian D, Zhou B, Han B, Liu S, Tian F, Qi D, Zhao K. Deep genome sequencing provides potential novel insights into plateau adaptations in domestication of goats to extreme environments. In Review. 2021 [accessed 2022 Mar 9]. https://www.researchs quare.com/article/rs-453887/v1.
- Van Linden A, Eltzschig HK. Role of pulmonary adenosine during hypoxia: extracellular generation, signaling and metabolism by surface adenosine deaminase/CD26. Expert Opin Biol Ther. 2007; 7(9):1437–1447. doi:10.1517/14712598.7.9.1437.
- Verleih M, Borchel A, Krasnov A, Rebl A, Korytář T, Kühn C, Goldammer T. Impact of thermal stress on kidney-specific gene expression in farmed regional and imported rainbow trout. Mar Biotechnol (NY). 2015;17(5):576–592. doi:10.1007/s10126-0 15–9640-1.
- Voloch CM, Vilela JF, Loss-Oliveira L, Schrago CG. Phylogeny and chronology of the major lineages of New World hystricognath rodents: insights on the biogeography of the Eocene/Oligocene arrival of mammals in South America. BMC Res Notes. 2013;6(1): 160. doi:10.1186/1756-0500-6–160.
- Wang Q-W, Hidema J, Hikosaka K. Is UV-induced DNA damage greater at higher elevation? Am J Bot. 2014;101(5):796–802. doi:10. 3732/ajb.1400010.
- Wang X, Liang D, Jin W, Tang M, Liu S, Zhang P. Out of Tibet: genomic perspectives on the evolutionary history of extant pikas. Mol Biol Evol. 2020;37(6):1577–1592. doi:10.1093/molbev/msaa026.
- Waterhouse MD, Erb LP, Beever EA, Russello MA. Adaptive population divergence and directional gene flow across steep elevational gradients in a climate-sensitive mammal. Mol Ecol. 2018;27(11): 2512–2528. doi:10.1111/mec.14701.
- Wen W, Zhao Z, Li R, Guan J, Zhou Z, Luo X, Suman SP, Sun Q. Skeletal muscle proteome analysis provides insights on high altitude adaptation of yaks. Mol Biol Rep. 2019;46(3):2857–2866. doi: 10.1007/s11033-019–04732-8.
- Wen X, Zhang X, Hu Y, Xu J, Wang T, Yin S. iTRAQ-based quantitative proteomic analysis of *Takifugu fasciatus* liver in response to low-temperature stress. J Proteomics. 2019;201:27–36. doi: 10.1016/j.jprot.2019.04.004.
- Whibley A, Kelley JL, Narum SR. The changing face of genome assemblies: guidance on achieving high-quality reference genomes. Mol Ecol Resour. 2021;21(3):641–652. doi:10.1111/1755-0998. 13312.
- Wilkening JL, Ray C. Characterizing predictors of survival in the American pika (Ochotona princeps). J Mammal. 2016;97(5): 1366–1375. doi:10.1093/jmammal/gyw097.

- Wilkening JL, Ray C, Beever EA, Brussard PF. Modeling contemporary range retraction in Great Basin pikas (Ochotona princeps) using data on microclimate and microhabitat. Quat Int. 2011;235(1–2): 77–88. doi:10.1016/j.quaint.2010.05.004.
- Yang J, Li W-R, Lv F-H, He S-G, Tian S-L, Peng W-F, Sun Y-W, Zhao Y-X, Tu X-L, Zhang M, et al. Whole-genome sequencing of native sheep provides insights into rapid adaptations to extreme environments. Mol Biol Evol. 2016;33(10):2576–2592. doi:10.1093/molbev/msw129.
- Yang Y, Fu Q, Wang X, Liu Y, Zeng Q, Li Y, Gao S, Bao L, Liu S, Gao D, et al. Comparative transcriptome analysis of the swimbladder reveals expression signatures in response to low oxygen stress in channel catfish, Ictalurus punctatus. Physiol Genomics. 2018;50(8): 636–647. doi:10.1152/physiolgenomics.00125.2017.
- Yang Y, Wang L, Han J, Tang X, Ma M, Wang K, Zhang X, Ren Q, Chen Q, Qiu Q. Comparative transcriptomic analysis revealed adaptation mechanism of *Phrynocephalus erythrurus*, the highest altitude lizard living in the Qinghai-Tibet Plateau. BMC Evol Biol. 2015; 15(1):101. doi:10.1186/s12862-015-0371-8.
- Yang Z. PAML 4: phylogenetic analysis by maximum likelihood. Mol Biol Evol. 2007;24(8):1586–1591. doi:10.1093/molbev/msm088.
- Zhang H-P, Liu W, An J-Q, Yang P, Guo L-H, Li Y-Q, Lv J, Yu S-H. Transcriptome analyses and weighted gene coexpression network analysis reveal key pathways and genes involved in the rapid cold resistance of the Chinese white wax scale insect. Arch Insect Biochem Physiol. 2021;107(1):e21781. doi:10.1002/arch. 21781.
- Zhang L, Feng Q, Ding K, Sun L, Huo D, Fang Y, Zhang T, Yang H. Genome-wide analysis of gene expression profile in the respiratory tree of sea cucumber (*Apostichopus japonicus*) in response to hypoxia conditions. J Marine Biol Assoc United Kingdom. 2018; 98(8):2039–2048. doi:10.1017/S002531541700162X.
- Zhang Y, Hu Y, Wang X, Jiang Q, Zhao H, Wang J, Ju Z, Yang L, Gao Y, Wei X, et al. Population structure, and selection signatures underlying high-altitude adaptation inferred from genome-wide copy number variations in Chinese indigenous cattle. Front Genet. 2020;10:1404–1412. doi:10.3389/fgene.2019.01404
- Zhao F, Kim W, Kloeber JA, Lou Z. DNA end resection and its role in DNA replication and DSB repair choice in mammalian cells. Exp Mol Med. 2020;52(10):1705–1714. doi:10.1038/s12276-020–0 0519-1.
- Zhao TB, Ning HX, Zhu SS, Sun P, Xu SX, Chang ZJ, Zhao XQ. Cloning of hypoxia-inducible factor 1α cDNA from a high hypoxia tolerant mammal—plateau pika (*Ochotona curzoniae*). Biochem Biophys Res Commun. 2004;316(2):565–572. doi:10.1016/j.bbrc.2004.0 2.087.

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