1	Threatened salmon rely on a rare life history strategy in a warming
2	landscape
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23 Abstract

24 Rare phenotypes and behaviors within a population are often overlooked, yet they may 25 serve a heightened role for species imperiled by rapid warming. In threatened spring-run 26 Chinook salmon spawning at the southern edge of the species range, we show late-migrating 27 juveniles are critical to cohort success in years characterized by droughts and ocean heatwaves. 28 Late migrants rely on cool over-summer river temperatures, increasingly rare due to the 29 combined effects of warming and impassable dams. Despite the dominance of late migrants, 30 other strategies played an important role in many years. Our results suggest that further loss of 31 phenotypic diversity will have critical impacts on population persistence in a warming climate. 32 Predicted thermally suitable river conditions for late migrants will shrink rapidly in the future, 33 and will be largely relegated above impassable dams. Reconnecting diverse habitat mosaics to 34 support phenotypic diversity will be integral to the long term persistence of this species.

35 Main text

Climate change is arguably the greatest emerging threat to global biodiversity and ecosystem functioning in this period of unprecedented change^{1,2}. To track changing climate regimes, many species have shifted their phenology³, distribution^{4,5}, and abundances⁶. While there has been considerable attention given to predicting species and community-level phenological responses to climate change^{7,8}, far less attention has been given to understanding how the loss of within population variation and rare phenotypes might modulate population resilience to future climate forcings^{9,10}.

Phenotypic diversity is one way for populations to buffer themselves against natural or
anthropogenic perturbations¹¹⁻¹³. Plasticity in migratory timing may be particularly important
for species that migrate between freshwater and marine environments to forage and spawn, as
their ability to respond to adverse ambient conditions is constrained by the stream network,
leaving fewer options for lateral movements compared with terrestrial or marine species¹⁴⁻¹⁷.
Furthermore, in many cases, anthropogenic land use changes, such as hydropower dams and

49 irrigation diversions, have restricted access to high elevation habitats that would have
50 otherwise provided thermal refugia¹⁸⁻²⁰.

51 Salmonids exhibit extensive phenotypic plasticity, which could enhance population 52 stability against disturbances by spreading risk across time and space (portfolio effect 53 concept^{12,21,22}). However, multiple concurrent environmental forcings could weaken this portfolio effect and challenge species resilience to future climate change²³. In particular, the 54 55 combination of warming and habitat contraction, caused by dam construction, has resulted in 56 large population declines and erosion of salmon life history diversity, particularly for runs that 57 rely on cooler high elevation habitats^{24,18,25,26}. To understand how life history diversity may 58 influence salmon resilience to climate change, we tracked the relative contribution of different 59 juvenile migratory strategies in California's Chinook salmon (Oncorhynchus tshawytscha) 60 populations that spawn in a heavily modified environment at the southern edge of the species' native range²⁷. These salmon serve as a model system for early indication of the challenges 61 62 faced by cold-water fishes when access to thermal refugia has been drastically reduced²⁸.

63 While juvenile salmonids at higher latitudes often spend multiple years in freshwater before emigrating to the ocean^{27,29}, today, most salmon in the California Central Valley 64 65 emigrate in their first winter and spring before river temperatures become too warm. An 66 exception is found among spring-run Chinook salmon that used to dominate the region before the construction of impassable dams²⁴. Two populations still have access to high elevation 67 68 reaches, and exhibit a now rare phenotype where juveniles remain in the river over-summer before emigrating the following fall³⁰. This late-migrating phenotype relies on access to cool 69 70 water for the entire rearing period and is therefore most likely to be negatively impacted by 71 warming temperatures and impaired access to high elevation reaches. Here, we used strontium 72 isotope ratios (⁸⁷Sr/⁸⁶Sr) and daily depositional chronology in otoliths (calcium carbonate 73 structures, part of the fish's hearing and balance system) to reconstruct the juvenile emigration 74 patterns and growth rates of returning (i.e., successful) adult spring-run Chinook salmon, and to 75 estimate the contribution of different migration strategies to the reproductive population across environmental extremes. Specifically, ⁸⁷Sr/⁸⁶Sr vary among California Central Valley 76

77 rivers, producing distinct and reproducible geographic markers across the landscape that are 78 permanently recorded in the daily otolith layers, thus allowing reconstruction of the juvenile 79 life histories of 123 adults that returned to Mill and Deer Creeks (two geographically close 80 watersheds with genetically similar spring-run populations³¹; Fig. 1a) between 2007 and 2018 (Supplementary Table 1). Some of these cohorts experienced severe droughts and warm ocean 81 82 conditions (Supplementary Table 2) revealing potential mechanisms involved in the expression 83 and success of alternative life history strategies. We also investigated how predicted future 84 river temperatures will affect the availability of suitable rearing habitat and the long-term 85 viability of the late-migrating phenotype. In summary, we show how climate change may 86 truncate salmon life history diversity, and how the loss of the late-migrant phenotype could 87 negatively affect the long-term resilience of threatened spring-run Chinook salmon populations.

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89 The importance of rare phenotypes and life history diversity

90 Otolith isotope profiles revealed three distinct juvenile life-history types (hereafter 91 referred to as "early", "intermediate" and "late" migrants; Fig. 1b-d, Supplementary Fig. 1), 92 concordant with the three emigration modes observed in the juvenile trapping data (Fig. 2a). 93 The three life-history types were characterized by significant differences in the age and size at 94 which the fish exited the natal tributary (Fig. 1b-d, 2b, Supplementary Fig. 2c, 2e). Despite 95 leaving the natal stream considerably smaller, early migrants entered the ocean at a similar size 96 and age to intermediate migrants, after rearing for multiple months in non-natal freshwater 97 habitats (i.e., Sacramento River and Delta). Late migrants emigrated to the ocean significantly 98 later and larger than the other two phenotypes (Fig. 2c, Supplementary Fig. 2d, 2f), having 99 reared in the natal stream over the summer (mean natal rearing period = $194 \text{ days} \pm 32 \text{ days}$ 100 SD). Late migrants may thus experience very different freshwater, estuarine and nearshore 101 marine conditions, potentially resulting in differential feeding, growth and survival 102 opportunities^{32,33}.

While late migrants were the rarest phenotype (10%) observed in juvenile monitoring
traps³⁴, they represented the majority (60%) of the returning adults averaged across years (Fig.
2a, 2b). Conversely, on average, 26% of juveniles and 19% of surviving adults were represented

106 by intermediate migrants that reared in natal rivers for 84 days \pm 27 days SD. Early migrants, 107 that reared in natal rivers for 15 days ± 14 days SD, were the dominant phenotype observed in 108 juvenile monitoring (64%), yet their contribution to the adult returns was suppressed (only 109 21%). Importantly, the contribution rate of each life history type varied considerably among 110 years (Fig. 3). Half of the return years (2007, 2008, 2013) were represented by similar 111 contributions of each life history type, and their most likely emigration years (2004 & 2005, 112 2005 & 2006, 2009 & 2010) were generally wetter. In contrast, the late migrants that left 113 freshwater in the fall during multi-year droughts and ocean heatwaves (returning 2012, 2014, 114 2018) were functionally the only strategy to survive to adulthood (100%, 77%, and 97% of late 115 migrants observed respectively, Fig. 3; Supplementary Table 2).

116 Although variability in juvenile growth rates was observed, likely related to a 117 combination of fine-scale habitat heterogeneity and individual ontogeny, some clear trends 118 emerged from the otolith increment analysis. First, early-life freshwater growth rates were 119 inversely correlated with emigration timing, with faster growing individuals tending to leave the 120 natal tributary earlier, and slower growing individuals remaining for longer before migrating 121 downstream (Fig. 4a and Supplementary Fig. 3). Second, cumulative growth over the first 15 122 days was significantly faster for early migrants (37 μ m ± 11 μ m SD) compared to late migrants 123 (30 μ m ± 8 μ m SD) but not different between early and intermediate migrants (32 μ m ± 7 μ m 124 SD; Fig. 4b). It is interesting to note that the fastest growth rates were typically observed 125 among the juveniles that left the natal stream earliest (within 15 days after emergence; open 126 circle dots in Fig. 4a), and thus also reared in non-natal habitats. Those results are consistent 127 with previous studies showing differential salmon juvenile growth rates and sizes across multiple migratory pathways^{29,35}. 128

129 Thermally suitable habitat in a warming climate

Temperature strongly influences salmonid physiology, growth and survival³⁶. Thus,
 populations with access to diverse water temperatures during incubation and natal rearing are
 predicted to exhibit increased phenotypic and phenological diversity³⁷. To support late
 migrants, stream temperatures need to remain suitably cool (temperature below ~15°C³⁸) over

134 the summer to accommodate the extended rearing period. Mill and Deer Creek watersheds, 135 along with upstream reaches of the Battle and Clear Creeks, are among the few accessible and 136 populated spring-run streams in the system that still provide suitable rearing temperatures to 137 support all three phenotypes (Fig. 5 top panels). In accessible stream reaches where spring-run 138 Chinook were historically present but are now extirpated, only the Stanislaus River has 139 temperatures that could support the late migrating phenotype. Adult spring-run Chinook 140 (based on return timing) have recently been observed in the Stanislaus River suggesting this 141 habitat has the potential to support recolonization thus contributing to the reintroduction 142 efforts in the San Joaquin Basin³⁹. Importantly, increases in spring and summer stream 143 temperatures by 2040 (Extended Data Fig. 1) and 2080 (Fig.5 bottom panels) are predicted to 144 further contract the amount of thermally suitable rearing habitat, especially along the 145 downstream reaches of spring-run streams and the mainstem Sacramento River. Without 146 intervention, late-migrants may only have access to 76 km of suitable summer rearing habitat 147 by 2080, less than half (44%) of the accessible suitable habitat during our study period (i.e., 148 2005-2015; Supplementary Table 3). Providing access above dams on the Sacramento, Feather, 149 Yuba, American, and Tuolumne Rivers (Fig. 5) would approximately triple summer rearing 150 habitat under 2080 climate conditions (76km without access, 201km with access;

151 Supplementary Table 3).

152 **Discussion**

153 Here, using archived otolith tissues, we reveal how a diversity of growth rates and 154 behaviors expressed during early life stages can shape population dynamics and resilience via 155 within-population portfolio effects. This underscores why it is essential that conservation 156 strategies developed for the recovery of vulnerable species support both rare and common 157 phenotypes. The phenotypic diversity expressed by California Central Valley spring-run Chinook 158 salmon has thus far enabled these populations to persist despite habitat loss and degradation 159 along their migratory corridor, warming temperatures, and an increasingly volatile 160 Mediterranean climate^{24,40}. We show for the first time that the late-migrating strategy is the 161 life-support for these populations during current periods of extreme warming. Therefore,

162 conservation priorities should focus on supporting this rare and climate-adapted behavior, 163 particularly given that climatic extremes such as extended droughts and marine heatwaves are predicted to increase in frequency and severity in the future^{41,42}. Late migrants experience very 164 165 different selective pressures to the other migratory phenotypes, during both their freshwater 166 and ocean phases. For example, entering the ocean in a different season at a larger size 167 potentially reduces intraspecific competition and risk of mismatch with peak prey production during early ocean residence, a critical period for cohort success⁴³. However, by rearing over 168 169 summer in freshwater late migrants forgo growth opportunities that early and intermediate 170 migrants experience by feeding earlier in the more productive ocean. This within-population 171 phenotypic diversity is thus critical to spreading risk and ensuring that at least some fraction of 172 the population is successful under differing environmental conditions.

173 For salmon and other species impacted by habitat contraction, restoring and maintaining a 174 diverse mosaic of habitats and thermal refugia across the freshwater landscape will be critical 175 to support life history diversity and long term persistence²². For spring-run Chinook salmon, 176 predicted stream temperatures under our climate change scenarios demonstrate the necessity 177 for maintaining and expanding thermally suitable rearing habitat in order to support diverse 178 growth rates and a broad spread of emigration timings. Juvenile salmon in the Central Valley 179 are known to experience high mortality rates during their seaward migration in the spring particularly during droughts^{44,45}. This is further evidenced by the poor representation of early 180 181 and intermediate migrants in the adult returns in 2012, 2014 and 2018, which were all 182 characterized by hot and dry emigration conditions. Late migrants have evolved a drought-183 resilient strategy of leaving in the fall when the migratory corridor is cooler, but they must be 184 able to survive the heat of the spring and summer in headwater habitats for this to be a viable 185 strategy. Improving access to cold water refugia through habitat restoration, targeted water 186 management below dams, and/or reintroductions to high elevation habitats above impassable 187 dams, might be vital for preserving the late migrant life-history type now and under future climate scenarios^{46,47}. While the predicted amount of summer rearing habitat above dams may 188 be modest under 2080 conditions (125km; Supplementary Table S3), this reliable cold water 189 190 could play a disproportionate role in preventing extirpation during multi-year droughts. In

addition, improving growth and survival conditions for early and intermediate migrants along
degraded migratory corridors could be instrumental to bolster productivity and resilience,
particularly in wetter years when earlier migrants play an important role in population success.

194 Salmonid species are renowned for their extensive migratory plasticity, with 195 anadromous forms spending a few months to many years in freshwater⁴⁸. While phenotypic 196 trait diversity in salmon species is often discussed in the context of genetic differentiation and microevolution^{49,50}, the life history diversity observed in these genetically similar spring-run 197 populations³¹ highlights the important interaction between physiology and environmental 198 199 variability in the expression of divergent juvenile emigration strategies⁵¹. Although physiological plasticity can increase species' resilience to climate change⁵², it is unclear whether salmonids 200 201 can adapt their thermal tolerances quickly enough to keep pace with predicted rates of 202 warming. This is particularly problematic for populations at lower latitudes⁵³ and those facing 203 additional stressors (e.g., contaminant loads, limited food) that further contract their thermal 204 window by affecting their metabolic performance⁵⁴. As environmental conditions continue to 205 shift rapidly with climate change, maximizing habitat options across the landscape to enhance 206 adaptive capacity and support climate-resilient behaviors may be crucial to prevent extinction 207 events within salmonids and other thermally vulnerable species^{23,52,55}.

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209 Methods

210 **1. Otolith** ⁸⁷Sr/⁸⁶Sr analysis

Otoliths were prepared at UC Davis per established techniques⁵⁶. The otoliths' sagittal
plane (see Fig 3. in Woodson et al.³²) was sectioned on both sides using 600 and 1500 grit
wet/dry sandpaper to expose the primordia and surrounding microstructure. The surface
achieved a further fine polish using 3µm and 1 µm Al₂O₃ lapping films. Finished samples were
mounted to a 1cm square glass pedestal using Gorilla Glue[™]. The otoliths' dorsal side was
photographed in 20x magnification using a Qimaging digital camera (MicroPublisher 5.0 RTV)
mounted to a Olympus BX60 microscope. Following imaging otoliths were analyzed for

218 strontium isotopes at the UC Davis Interdisciplinary Center for Inductively-Coupled Plasma 219 Mass Spectrometry by laser ablation on their Multi Collector Inductively Coupled Mass 220 Spectrometer. We used the otolith strontium isotope methods described in Barnett-Johnson et 221 al.^{57,58} to reconstruct juvenile freshwater habitat-use and migration histories. In brief, the strontium isotope ratio (⁸⁷Sr/⁸⁶Sr) of freshwater habitats (the "isoscape") varies as a function of 222 rock geology and weathering patterns⁵⁹, and because there is no biological fractionation of 223 224 strontium isotopes, the otoliths faithfully record the signature of the surrounding water and 225 dietary sources. Strontium isotopes are a particularly powerful tool in the California Central 226 Valley, because the spatial heterogeneity in rock types results in significant differences in 227 isotope signatures among most of the salmon-bearing watersheds. Consequently, variations in 228 ⁸⁷Sr/⁸⁶Sr and strontium concentration across Central Valley watersheds has proven useful for determining population of origin^{58,60} and reconstructing juvenile rearing and migration 229 behavior^{44,61}. 230

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2. Movement reconstruction

233 Otolith radius was used as a proxy for fish size at natal and freshwater exit (see Supplementary Information section 2.2). The otolith radius for each ⁸⁷Sr/⁸⁶Sr measurement was 234 235 estimated by measuring the distance from the otolith core to the center of each laser pit along a standardized 90° axis⁵⁶. Strontium isotope profiles representing changes in ⁸⁷Sr/⁸⁶Sr values as a 236 function of otolith distance from the core were created for each otolith. Specific location ⁸⁷Sr/⁸⁶Sr 237 238 threshold values were used to identify the movement of Central Valley spring-run Chinook 239 juveniles from one rearing region to the other. These values come from a Central Valley isoscape 240 database⁶¹. We considered four distinct regions in this study: Natal tributary (i.e., Mill and Deer 241 Creeks), Sacramento River, Sacramento-San Joaquin Delta (hereafter "Delta"), and San Francisco-San Pablo Bay (hereafter "Bay") & Ocean. We used changes in ⁸⁷Sr/⁸⁶Sr along the otolith transect 242 243 to identify two key habitat shifts to reconstruct the size at which individuals exited (1) the natal 244 tributary, and (2) freshwater (exit location is Chipps Island, river kilometer 73). Otolith radius at natal exit was calculated by linearly interpolating between otolith distances at the ⁸⁷Sr/⁸⁶Sr 245

246 measurements on either side of the upper Sacramento River (point of Mill and Deer Creek exit 247 and Sacramento River entry) strontium threshold value. We used the lowest ⁸⁷Sr/⁸⁶Sr value found 248 for the upper Sacramento River region in the Central Valley isoscape database. If for a given fish this threshold was never crossed (i.e., ⁸⁷Sr/⁸⁶Sr values are all above the threshold), we 249 250 determined it by visually identifying the closest point to the Mill/Deer Creek habitat ⁸⁷Sr/⁸⁶Sr 251 threshold value in the strontium profiles. This could happen if a fish migrated quickly after emergence to the Sacramento River, which is characterized by higher ⁸⁷Sr/⁸⁶Sr values than the 252 253 natal tributary. Similarly, otolith radius for freshwater exit was calculated by linearly interpolating between otolith distances at the ⁸⁷Sr/⁸⁶Sr measurements on either side of the Chipps Island (point 254 of Delta exit and Bay entry) strontium threshold value. Finally, the Sacramento River at Freeport 255 256 ⁸⁷Sr/⁸⁶Sr value threshold was used to identify the migration of spring-run juveniles from the 257 mainstem Sacramento River to the Delta.

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3. Clustering analysis

We conducted a clustering analysis⁶² on the strontium profiles obtained from the otolith 260 261 microchemistry analysis to investigate whether we could statistically identify groups of fish 262 exhibiting similar juvenile rearing strategies among Mill and Deer Creek populations. Strontium 263 profiles were considered as smooth curves or functions sampled at a finite subset of some 264 interval (here the distance from the otolith core); the statistical methods for analyzing such data are described as "Functional Data Analysis" (FDA; see Ramsay and Silverman⁶³ for an 265 266 overview of FDA). With FDA methods each profile is modeled in an infinite functional space 267 rather than considered as a discrete vector in a multidimensional space (as modeled in 268 multivariate data analysis). The clustering analysis performed in this paper included the 269 following steps:

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 A smoothing spline was fitted to each profile to predict continuous ⁸⁷Sr/⁸⁶Sr values for otolith radius distances between 0 and 1000 μm (using the *smooth.spline* function in R⁶⁴). This allows us to obtain a smooth version of the profiles for any

273		distance from the otolith core to 1000 μm so that a direct comparison of all Mill and
274		Deer Creek strontium profiles of different lengths can be achieved.
275	2)	Each smoothed profile was then transformed into a functional data object (i.e.,
276		decomposed in terms of linear combinations of known basis functions), using a B-
277		splines basis (using the <i>fda</i> package in R ⁶³).
278	3)	A functional principal component analysis (FPCA) was performed on those functional
279		objects (using <i>fda</i> package in R). This allowed us to identify the principal modes of
280		variation of the functional dataset, and reduce data dimensions which has been
281		shown to help for clustering pattern recognition and processing time ⁶² .
282	4)	We used a model-based clustering method, where the data were represented by a
283		series of Gaussian Mixture Models (GMM) for which each point (i.e., each profile)
284		was associated with a probability of belonging to each potential cluster ⁶⁵ . The
285		mixture model parameters were estimated using the Expectation-Maximization (EM)
286		algorithm.

- The Bayesian Information Criterion (BIC) was used to select the best model with the
 optimal number of clusters (using *mclust* package in R⁶⁶).
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4. Early-life growth rate estimation

291 To estimate habitat-specific juvenile growth rates we measured the otolith increment 292 widths using Image Pro Premier 9.0 (Media Cybernetics) in each isotopically distinct habitat 293 region⁵⁶. Each otolith reading was assigned a score of "certainty" on a scale of 1-5, with 1 = 294 unusable, 2 = hard to read the majority of increments, 3 = hard to read some of the increments, 295 4 = easy read, and 5 = perfect publication quality. This index is a combination of the reader's 296 confidence in the accuracy of the increment placement and the quality or readability of the image 297 (i.e., how likely it is that another reader would get the exact same increment width 298 measurements). Otoliths with poor readability (with a score of 3 or lower) were eliminated from 299 the analysis. A total of 86 otoliths were used for growth rate estimations.

5. Central Valley spring-run streams temperature suitability mapping

301 To explore why Deer and Mill Creeks may exhibit multiple juvenile life histories and how life 302 history expression may change with climate change, we compared current and future thermal 303 conditions along every current and historical spring-run stream. Temperature was obtained from a mean monthly stream temperature model²⁰. In brief, FitzGerald et al.²⁰ employed a 304 305 spatial stream temperature model to predict mean monthly stream temperature for nearly 306 every river km in the western U.S. In the Central Valley, the test sample r^2 was 0.813 and the 307 mean absolute prediction error (MAPE) was 1.024°C. We first clipped this stream temperature 308 dataset with the current and historical Central Valley spring-run distributions⁶⁷. In general, the 309 distribution and stream networks matched, but a few reaches with spring-run did not have 310 stream temperature. We averaged the monthly temperature at each stream segment from 311 2005-2015, representing our study period. In the Central Valley, stream temperatures are predicted to increase by 0.6°C by 2040 and 1.0°C by 2080⁶⁸, so we applied these deltas to the 312 313 temperature dataset.

314 We then examined stream temperature suitability for juveniles rearing in May and August 315 of 2005-2015, 2040, and 2080. We focused on months when temperature stress is most likely 316 to impact rearing success for early and intermediate migrants (May) and late migrants (August). 317 A river reach was defined as suitable when it provided optimal temperature for spring run 318 juvenile growth. Here we used a fixed temperature threshold of 15°C because temperatures 319 greater than ~15°C result in decreased growth rates and increased mortality rates, yet we 320 acknowledge that there is likely some variation in this threshold according to local water 321 quality, food availability, and the life stage considered^{54,69}.

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323 Data Availability

- 324 The datasets generated and used for the otolith strontium isotope and early-life freshwater
- 325 growth analyses, and to produce Figs 1-4 & S1-S3 are available on GitHub at
- 326 <u>https://github.com/floracordoleani/MillDeerOtolithPaper</u>⁷⁰. The stream temperature and
- 327 spring-run Chinook spatial distribution shapefiles generated for the juvenile spring-run Chinook
- 328 thermal habitat suitability assessment and used in Figs 5 & S4 are available on DRYAD at
- 329 <u>https://doi.org/10.5061/dryad.bk3j9kdc9⁷¹</u>.

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331 Code Availability

The code for the otolith strontium isotope and early life growth analyses is posted on GitHub at
 https://github.com/floracordoleani/MillDeerOtolithPaper.

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355 Author Contributions

FC, CCP, PKW, AMS and RCJ conceived the study. FC led data collection and analyses. FC, CP, AMS,
AMF, PKW, AM, and RCJ contributed to data analyses and manuscript writing. GEW, CCP, and

358	PKW conducted the otolith microchemistry and microstructure analyses. AMF performed the
359	temperature prediction modelling and AM performed the clustering analysis.
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383 Figure 1. Spring-run Chinook salmon life history diversity. Left panel: map of historical and current 384 distribution of California Central Valley spring-run Chinook salmon, with the two Lassen tributary 385 populations in this study highlighted in dark blue. Delta = Sacramento-San Joaquin River Delta, Bay = 386 estuary between Suisun and San Francisco Bays, and Chipps Island = freshwater exit location. Right 387 panel: Otolith strontium isotope profiles (grey lines) separated into early, intermediate and late 388 migrants. Life-history types were classified using cluster analyses based on otolith isotope-by-radius data 389 for all years combined (see Methods and Supplementary Information section 1.2). A representative 390 profile from each cluster (± 2SD) is shown in bold. The first part of the profile (0 to ~200µm; represented 391 by a grey rectangle) corresponds to the incubation period when the fry is nourished by the maternal yolk 392 in the gravel. 393

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Figure 3. Migrant sizes and life history diversity across years. (a) Otolith radius (proxy for juvenile fish size) distributions for each adult return year (RY) and its most likely juvenile emigration years (EY, shown in parenthesis) at natal and freshwater exit, showing interannual differences in the size distribution of the juvenile emigrants that survived to adulthood. Density distributions are standardized by year. (b) Contributions of each life-history type to the adults returns. In multiple years, late emigrating juveniles comprised the majority of returning adults.





Figure 4. Early-life salmon growth across life history types. (a) Fish daily otolith increment width (a proxy for fish growth rate) averaged over the first 15 days after emergence and plotted against the otolith increment number (a proxy for age in days) at natal exit, for each life history type. Filled circles show individuals that were still in their natal tributary at day 15, and used for the early-life growth analysis, while open circles represent individuals that had left their natal tributary before day 15 and reared elsewhere. A linear regression is represented by the black line, with the grey shade showing the 95% confidence interval. Even excluding the fast-growing individuals (open circles), there is a negative

- 423 relationship (R^2 and p-value) between age at natal exit and initial growth rates. (b) Boxplot comparing 424 cumulative increment width at day 15 (a proxy for somatic growth achieved in the first 15 days), 425 between the three migratory phenotypes. Only fish that spent at least 15 days in the natal stream were 426 included. The horizontal line in each box represents the median value, lower and upper hinges of the 427 boxes correspond to the 25th and 75th percentiles. The upper whiskers extend from the hinge to the 428 largest value no further than 1.5*interquartile range (IQR) from the hinge. The lower whisker extends 429 from the hinge to the smallest value, 1.5*IQR of the hinge, at most. The black dots are the actual 430 measurements. Boxes not sharing the same letter are significantly different (Tukey test with significance
- 431 level α = 0.05, DF = 75).





433 Figure 5. Central Valley habitat suitability mapping under current and future climate conditions.

434 Rearing temperature suitability (temperature < 15°C³⁸) in accessible (orange lines) and inaccessible (i.e.,

435 blocked by impassable dam; blue lines) river reaches in the California Central Valley, focusing on months 436 when temperature stress is most likely to impact rearing success for early and intermediate migrants 437 (May; left panels) and late migrants (August; right panels). We examined suitability (defined as 438 temperature < 15°C, see Methods) during our study period (top panels) and under a future climate 439 change scenario (2080, bottom panels). The inset maps highlight our study streams (Mill and Deer 440 Creeks) and nearby spring-run streams. Major current and historical spring-run streams are labeled, with 441 extirpated populations in blue font, and populations at low risk of extirpation⁷² in bold. The gray lines 442 represent reaches that are thermally unsuitable for rearing (mean monthly temperature > 15°C). The 443 black lines represent reaches where temperatures could not be predicted reliably (e.g., reservoirs). See 444 Methods for details on temperature mapping.

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