

Warming indirectly simplifies food webs through effects on apex predators

Received: 21 February 2023

Accepted: 6 September 2023

Published online: 5 October 2023

 Check for updates

Eoin J. O’Gorman¹✉, Lei Zhao²✉, Rebecca L. Kordas³, Steve Dudgeon⁴ & Guy Woodward³✉

Warming alters ecosystems through direct physiological effects on organisms and indirect effects via biotic interactions, but their relative impacts in the wild are unknown due to the difficulty in warming natural environments. Here we bridge this gap by embedding manipulative field experiments within a natural stream temperature gradient to test whether warming and apex fish predators have interactive effects on freshwater ecosystems. Fish exerted cascading effects on algal production and microbial decomposition via both green and brown pathways in the food web, but only under warming. Neither temperature nor the presence of fish altered food web structure alone, but connectance and mean trophic level declined as consumer species were lost when both drivers acted together. A mechanistic model indicates that this temperature-induced trophic cascade is determined primarily by altered interactions, which cautions against extrapolating the impacts of warming from reductionist approaches that do not consider the wider food web.

Controlled experiments in artificial conditions have been crucial for identifying first principles and fundamental constraints that have underpinned theory about the ecological effects of warming^{1–4}, but they need to be treated with caution when extrapolating to more complex multi-species systems in the wild. For example, single-species laboratory experiments have repeatedly shown a consistent temperature dependence of growth and metabolism, supporting thermodynamic models such as from the Metabolic Theory of Ecology^{5,6}. Laboratory experiments with consumer–resource pairs have similarly revealed a systematic thermal scaling of feeding rates⁷, which are central to predictive models of warming impacts on population dynamics⁸. However, both approaches preclude the potential for warming to alter interactions indirectly through the food web, such as via stronger top-down control leading to the cascading effects seen more recently in some outdoor mesocosm experiments^{1–3,9–11}. This can alter the relative importance of green (algal) and brown (detrital) pathways of energy flow¹², which may erode the stability of the food web¹³. Even for mesocosms, however, the synthetic arenas used and the constraints on community

assembly processes, combined with the small-scale and short-term duration of warming (relative to the timescale of climate change) limit the validity of extrapolating to natural systems.

One fruitful avenue of research that can tackle these shortcomings involves embedding manipulative experiments within natural long-term and large-scale temperature gradients that span multiple generations across entire food webs^{14,15}. Such conditions are rare in the field, but where they exist, such as in geothermal ecosystems, established communities that have been exposed to intergenerational warming gradients can be manipulated in situ. This provides a powerful means by which some of the common confounds and limitations of observational and experimental studies may be disentangled. We employed this approach in geothermal streams in Hengill Valley, Iceland (Supplementary Fig. 1a,b), which contains numerous small streams of different temperature but similar physical and chemical properties^{16–18}, providing a tractable model system for combining experimental and observational gradient approaches. Brown trout are the only predatory fish in the system, and they become progressively

¹School of Life Sciences, University of Essex, Colchester, UK. ²Beijing Key Laboratory of Biodiversity and Organic Farming, College of Resources and Environmental Sciences, China Agricultural University, Beijing, China. ³Georgina Mace Centre for the Living Planet, Department of Life Sciences, Imperial College London, Ascot, Berkshire, UK. ⁴Department of Biology, California State University, Northridge, CA, USA. ✉e-mail: e.ogorman@essex.ac.uk; lei.zhao@cau.edu.cn; guy.woodward@imperial.ac.uk

Table 1 | Hypotheses under investigation

Hypothesis	(a)	(b)	(c)	(d)
	Invertebrate biomass	Algal biomass	Decomposition rates	Food web complexity
H1: Higher temperatures will lead to...	↑	↑	↑	↓
H2: Presence of large apex predators will lead to...	↓	↑	↓	↓
H3: Higher temperatures and apex predators will lead to...	↓↓	↑↑	↓↓	↓↓

Here we test hypotheses related to the main and interactive effects of temperature and apex fish predators on community biomass, decomposition rates and food web structure. Note that H3 emerges from the expectation that warming will strengthen apex predator impacts, rather than additive effects of H1 and H2. Decomposition rates may include both microbial and invertebrate-mediated decomposition.

Table 2 | Statistical output from linear mixed effects models

Response variable	Temperature		Fish		Temperature × Fish	
	F	P	F	P	F	P
Δ invertebrate biomass	0.652	0.465	4.640	0.040	12.06	0.002
Δ diatom biomass	0.444	0.542	3.139	0.092	6.971	0.016
Δ chlorophyll concentration	0.015	0.909	5.088	0.032	7.045	0.013
Microbial decomposition	2.112	0.220	2.189	0.158	6.760	0.019
Invertebrate decomposition	3.013	0.158	1.397	0.255	0.323	0.578
Δ connectance	4.097	0.113	0.536	0.472	4.653	0.043
Δ mean trophic level	0.011	0.920	0.824	0.374	5.603	0.028
Δ consumer–resource ratio	0.398	0.562	0.119	0.734	4.471	0.047

F and P values are shown for the main effects of temperature category (warm/cold) and fish manipulation (presence/absence) and the interactive effect of these two explanatory variables (Temperature × Fish) on each of the response variables in the experiment.

larger and more abundant in the warmer streams¹⁹. This seemingly unexpected finding challenged the general prediction that warming favours the small²⁰, but was explained by the greater production of the warmer environment, fuelled by increased nutrient supply¹⁸. Our previous work has also revealed strong thermal dependencies of community biomass, food web structure and ecosystem functioning^{16–19,21}, but manipulative experiments are needed as the next logical step to disentangle the relative importance of direct temperature effects on physiology from indirect food-web effects. This is particularly important given the likelihood for warming to reduce predator-free space²², increasing the potential for top-down control on lower trophic levels¹¹, which could ultimately lead to simpler communities^{22,23}.

In this Article, we constructed a set of fenced enclosures to create paired ‘Fish’ and ‘No fish’ treatment reaches in three cold and three warm streams in the catchment (Supplementary Fig. 1c,d). We measured changes in community biomass, decomposition rate and food web properties over the course of a 5 week experiment to test hypotheses about temperature and top-down control (Table 1). Specifically, we hypothesized (H1) that warming would increase community biomass and decomposition rates during the experiment via direct physiological responses (for example, accelerated growth and metabolism), but would simplify the food web by pushing some species beyond their thermal optima. We also hypothesized (H2) that stronger top-down control by the presence of apex fish predators would trigger trophic cascades (that is, reduced invertebrate biomass, but increased algal biomass), suppress decomposition rates due to lower detritivore biomass, and simplify food web structure due to loss of species and trophic links. Finally, we hypothesized (H3) that higher temperatures would accentuate the effects of apex predators by strengthening the cascading effects, weakening decomposition rates and simplifying the food web even further.

Results and discussion

We found no main effects of temperature on invertebrate or algal biomass (in contrast to H1a,b), but invertebrate biomass was strongly

suppressed by the fish (supporting H2a), particularly in the warm streams (supporting H3a; Table 2, Fig. 1a and Supplementary Fig. 2). This reduction in biomass was driven largely by suppression of the abundant snail, *Radix balthica* (Supplementary Table 1 and Supplementary Fig. 3a), which is the largest invertebrate in the system and a common prey of brown trout^{19,24}. Previous experiments in the Hengill system have shown that *R. balthica* exerts strong top-down control on benthic algae, especially in warmer streams where it dominates the herbivore assemblage¹⁷. Thus, their suppression here released algae from grazing pressure, increasing diatom biomass and total chlorophyll (supporting H2b), particularly in the ‘Warm–Fish’ treatment (supporting H3b; Table 2, Fig. 1b, Supplementary Fig. 2 and Supplementary Fig. 4). Similar cascading effects have been described for warming experiments in some simple laboratory aquaria and outdoor mesocosms^{1,9–11}, but never before for complex systems in the wild. Further taxon-specific findings are described in Supplementary Discussion.

Decomposition in freshwater ecosystems is carried out by invertebrate detritivores that directly consume dead organic matter (for example, worms and fly larvae) and microbes that decompose it externally (for example, bacteria and fungi). We found no significant main or interactive effects of temperature and fish presence on invertebrate-mediated decomposition rate (in contrast to H1–3c; Table 2 and Supplementary Fig. 2), even though decomposition rates appeared to be generally higher in the warmer streams (Fig. 2a). This may be driven by the low biomass of invertebrate detritivores due to the absence of leaf litter in the streams, which are instead dominated by algal biofilms and grazing invertebrates¹⁶—a classic case of the green pathway dominating in stream ecosystems that lack riparian vegetation. Intriguingly, microbial decomposition was slower when fish were present in the warm streams (in support of H3c; Table 2, Fig. 2b and Supplementary Fig. 2), despite these taxa being less directly linked to fish in the food web than the larger detritivores. These decomposers could not have been directly affected by fish or invertebrates because the fine mesh of the litter bags excluded larger consumers. Nutrients stimulate microbial decomposition^{25,26}, however, and since our study

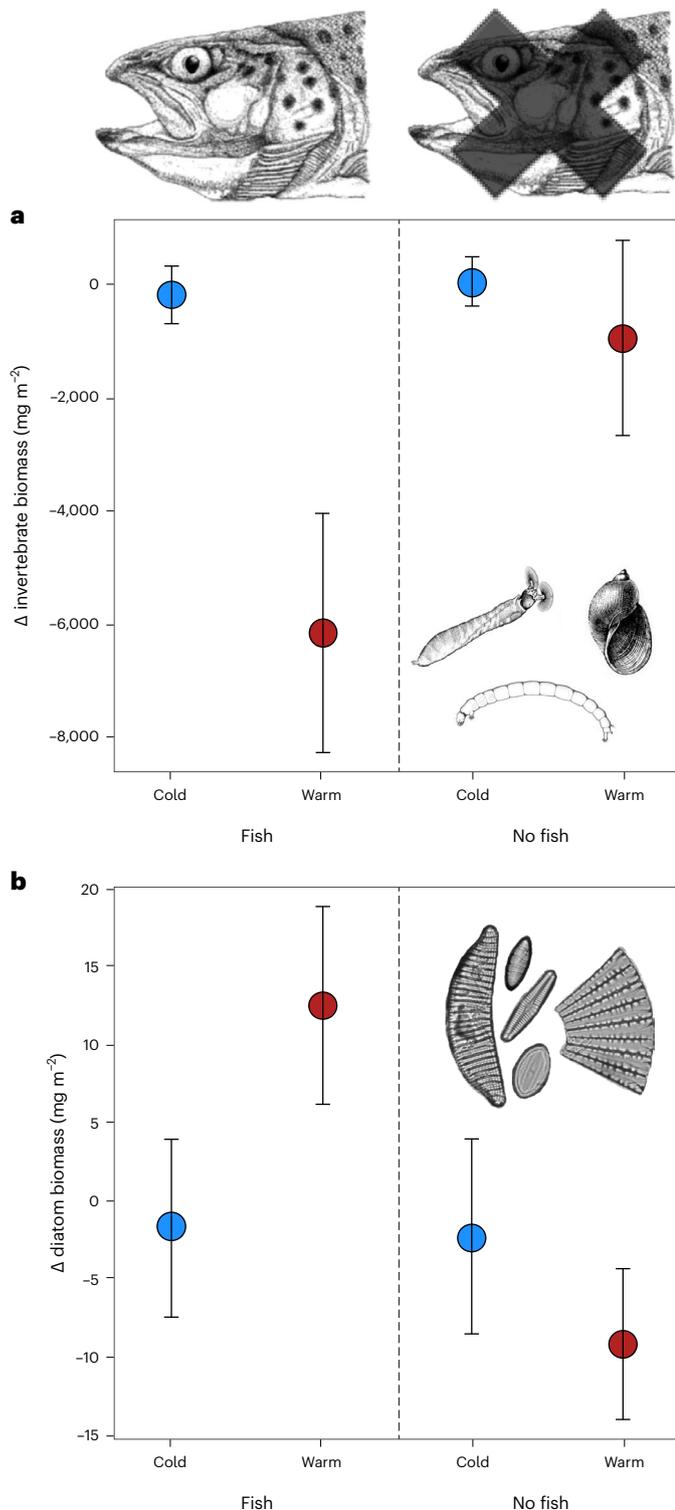


Fig. 1 | Temperature-induced trophic cascade. a,b, There was a reduction in the biomass of invertebrates over the course of the experiment ($n = 60$ biologically independent samples) (a) and a corresponding increase in the total biomass of diatoms ($n = 56$ biologically independent samples), but only in the presence of fish in the warm streams (b). Bars are mean \pm standard error; for statistical comparisons between treatments, see Table 2; for a visualization of biomasses in each treatment before and after the experimental manipulation, see Supplementary Fig. 5.

streams are nitrogen limited¹⁶, the suppression of invertebrates and their excretion products in the ‘Warm–Fish’ treatment (Fig. 1a) may have been sufficient to reduce microbial activity. This new hypothesis is

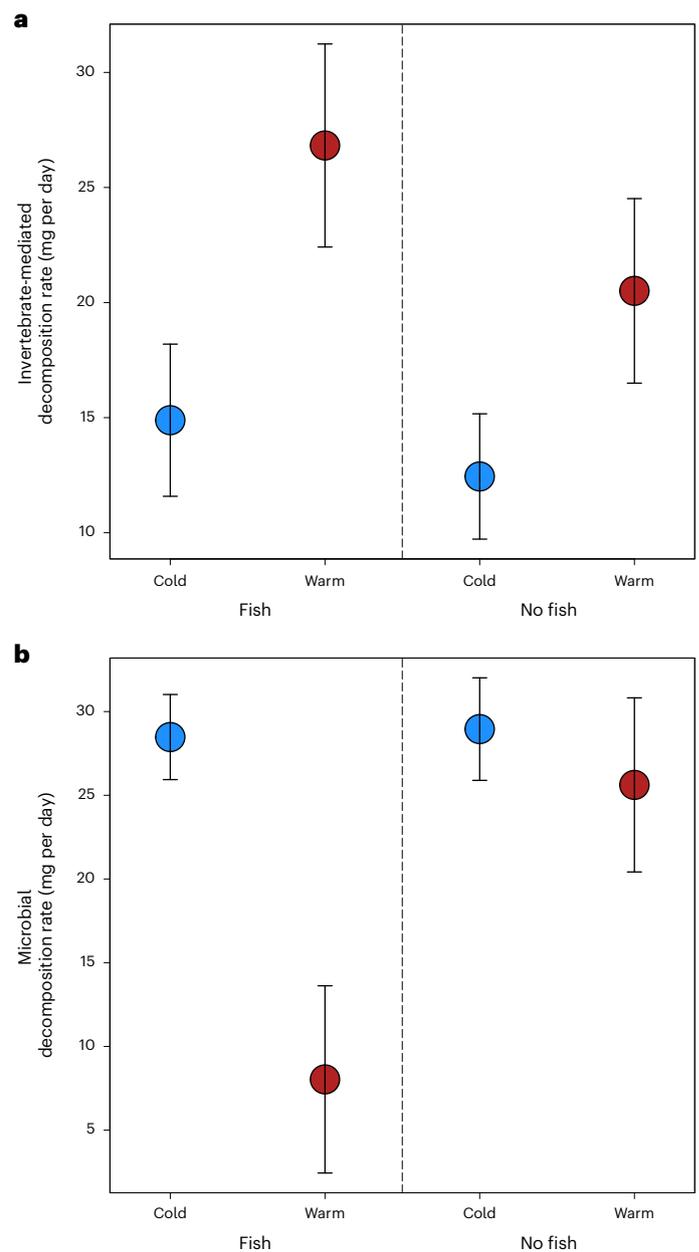


Fig. 2 | Ecosystem process rates in the experiment. a,b, There was no effect of temperature or the fish manipulation on invertebrate-mediated decomposition rate (a), but microbial decomposition rate was suppressed in the presence of fish in the warm streams ($n = 36$ biologically independent samples in both cases) (b). Bars are mean \pm standard error; for statistical comparisons between treatments, see Table 2.

supported by structural equation modelling (SEM), which highlighted the positive effect of invertebrates on microbial decomposition (Supplementary Fig. 2), and warrants new experiments to test the underlying mechanisms. Note that diatom biomass increased when microbial decomposition decreased, suggesting potential competition between algae and bacteria, but there was no support from SEM for this mechanism (Supplementary Fig. 2).

Temperature and apex predators had no main effects on food web structure (in contrast to H1–2d; Table 2), but food webs were less connected and had a lower mean trophic level when fish were present in the warm streams (supporting H3d; Table 2, Fig. 3a and Supplementary Fig. 2). These patterns echo the major changes in biomass and microbial

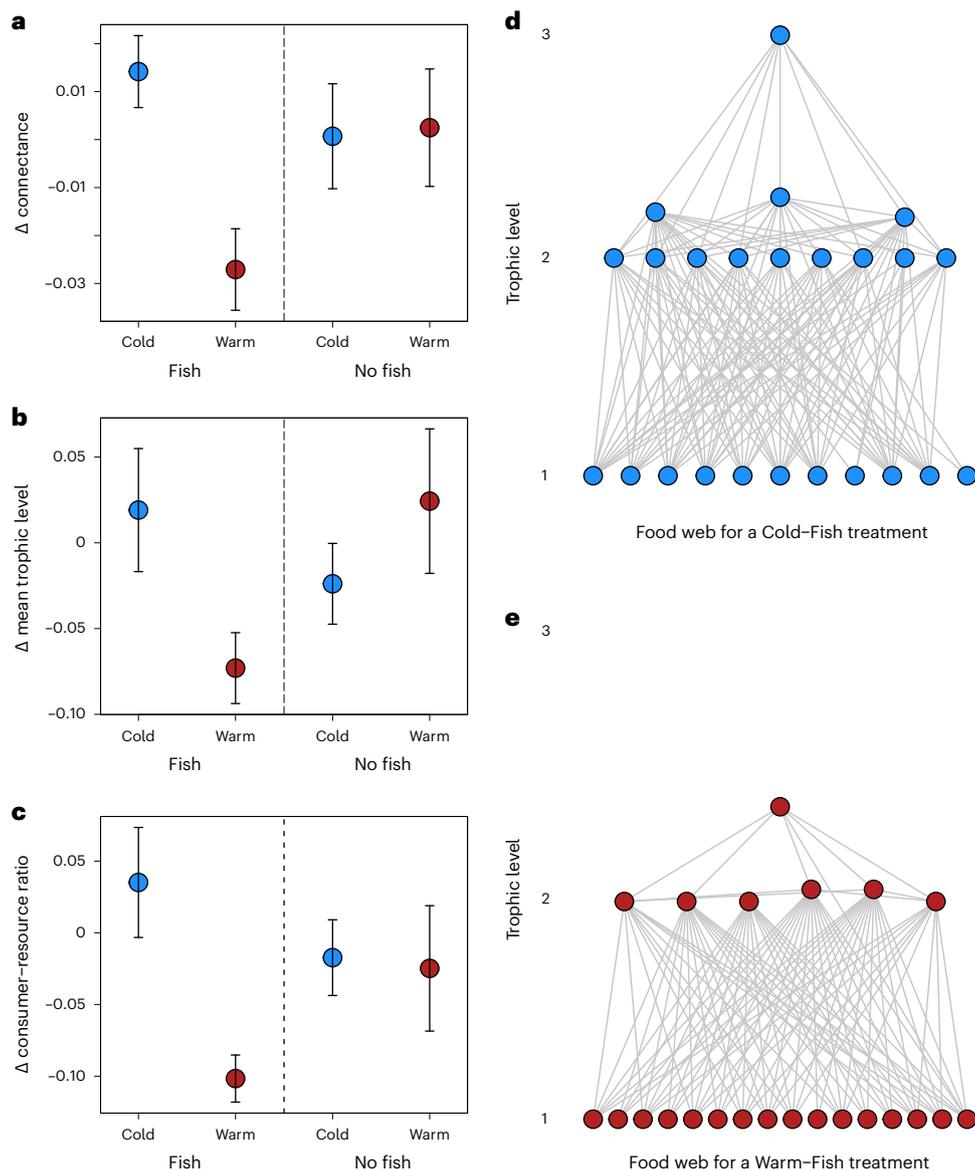


Fig. 3 | Changes in food web structure during the experiment. **a–c**, There was a reduction in connectance (**a**), mean trophic level (**b**) and the ratio of consumer species richness to resource species richness (**c**) during the experiment in the presence of fish in the warm streams ($n = 52$ biologically independent samples in each case). Bars are mean \pm standard error; for statistical comparisons

between treatments, see Table 2. **d,e**, Food webs are visualized for a ‘Cold-Fish’ treatment (**d**) and a ‘Warm-Fish’ treatment (**e**). For a visualization of food web metrics in each treatment before and after the experimental manipulation, see Supplementary Fig. 6; for a key to the taxonomic composition of each food web, see Supplementary Fig. 7.

decomposition described above, that is, these different metrics were all modified in the presence of fish in the warm streams. Lower connectance is indicative of a food web that is less resistant to invasion²⁷ and less robust to biodiversity loss²⁸, while a reduction in mean trophic level is a classic indicator of predator collapse²⁹. The latter response is also indicative of a reduction in vertical diversity, that is, loss of trophic levels³⁰, which can result in secondary extinctions and reduced ecosystem functioning^{31,32}. This provides a potentially novel ecological mechanism to explain the cascading effects in the ‘Warm-Fish’ treatment, whereby reduced omnivorous interactions and intraguild predation could help magnify the top-down control exerted by the apex predator³⁰. Indeed, the key driver of the food web changes was a reduced ratio of consumers to resources due to a disproportionate loss of omnivorous invertebrate species in the ‘Warm-Fish’ treatment (Table 2 and Fig. 3c–e). This tendency for trout to feed higher in the food web in warmer streams is reflected by previous stable isotope

work in the system showing a higher $\delta^{15}\text{N}$ signature (relative to primary consumers) as stream temperature increases¹⁹. SEM also revealed the importance of slower microbial decomposition in the presence of fish in the warm streams for decreasing connectance, suggesting that bottom-up (and not just top-down) processes could be simplifying the food web.

To determine the underlying mechanisms driving this temperature-induced trophic cascade, we developed a bioenergetic model describing the dynamics of algal and invertebrate biomass in the presence and absence of fish (Methods). We parameterized the model with data from independent experiments conducted in the system on the growth rate of algae and the consumption rates of invertebrates and fish (Supplementary Methods). The model qualitatively reproduces the decline in invertebrate biomass and increase in algal biomass with warming in the presence of fish (Fig. 4a,c). A sensitivity analysis revealed that parameters associated with consumption

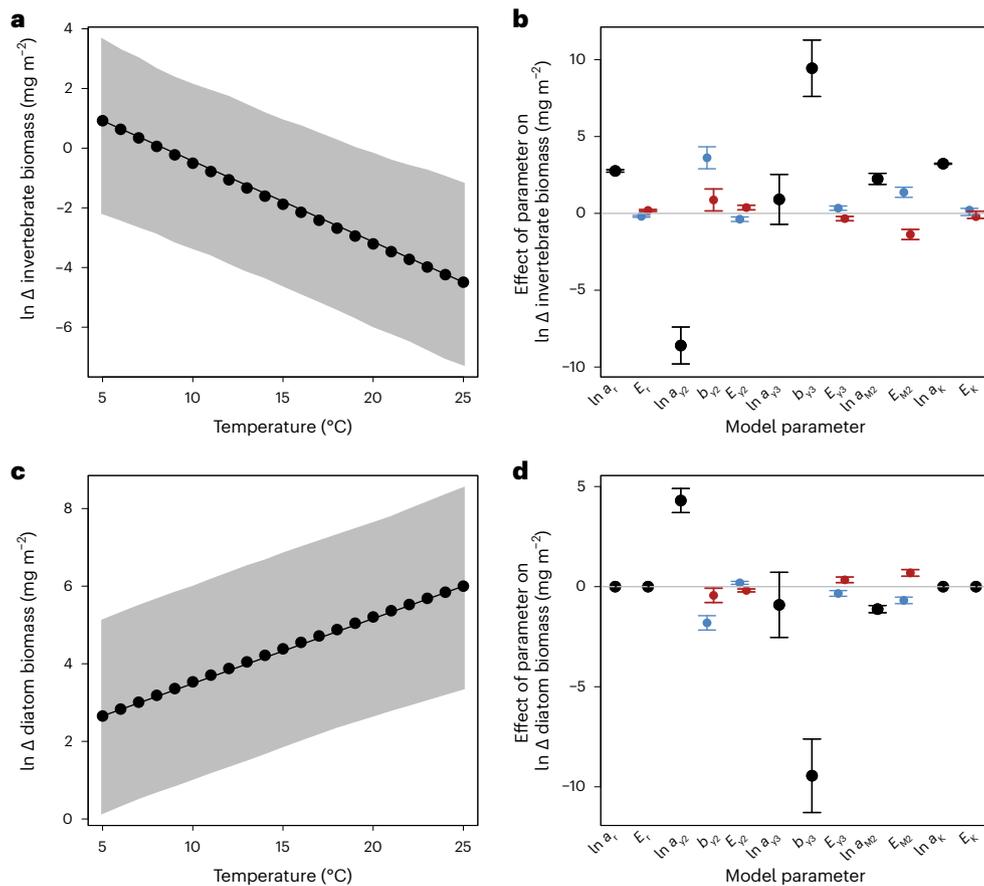


Fig. 4 | Biomass dynamics from a bioenergetic model. **a, c**, There was a reduction in biomass of invertebrates (**a**) and an increase in the biomass of diatoms (**c**) with warming in the presence, compared with the absence, of fish. This result qualitatively reproduces the temperature-induced trophic cascade shown in Fig. 1. Black points are the mean and grey areas indicate the 95% confidence bands from the Monte-Carlo simulations. **b, d**, Effects of different model parameters on the change in biomass of invertebrates (**b**) and diatoms (**d**) are also shown, with positive and negative values indicating an increase or decrease in the biomass change relative to the original model, respectively. Parameters shown in black

only affect the magnitude of the trophic cascade (that is, the intercept), while parameters shown in blue and red affect its thermal sensitivity (that is, the slope), and thus values are shown for the average temperature of the cold and warm streams, respectively. Parameters associated with the consumption rate of invertebrates ($\ln a_{22}$) and fish (b_{32}) had the largest effect on the magnitude of the trophic cascade, while parameters associated with the consumption rate and size of invertebrates ($\ln a_{22}$ and E_{M2}) had the largest effect on its thermal sensitivity. Bars are mean \pm 95% confidence intervals. Note that we log-transformed the change in invertebrate biomass (ΔB_2) as $-\ln(-\Delta B_2)$ since it is always negative.

rates of the invertebrates and fish determined the strength of the trophic cascade, rather than those associated with direct physiological responses to warming, such as metabolism and growth rate (Fig. 4b,d and Supplementary Figs. 8 and 9). This is one of the first field-model integrations to support the observation that biotic interactions are a stronger mediator of warming impacts on populations than direct physiological changes³³, though stronger interactions could of course be driven by higher metabolic rates in a warmer environment.

The impacts of warming on natural systems are clearly mediated by the food web and cannot therefore be simply predicted from reductionist approaches that do not take account of indirect effects through multi-species food chains. Multi-trophic micro- and mesocosm experiments still have a crucial role to play in understanding short-term, transient responses of ecological communities to warming, but their findings should be integrated with long-term experiments or space-for-time substitutions that incorporate adaptive responses. Trophic cascades are likely to be especially prevalent under warming in ecosystems dominated by single apex predators²², but less so when there is a diverse predator assemblage with greater scope for antagonistic interactions to dampen the consumptive effects on lower trophic levels^{31,34}. The simplification of food web structure that we observed due to fish in the warm streams was driven by the loss of larger

invertebrates, which tend to be less abundant than smaller organisms and are thus more vulnerable to increased consumption rates³⁵. Larger species also tend to have more generalist diets³⁵, suggesting that their loss may lead more broadly to shorter food chains and simpler interaction networks.

Local context can play a key role in determining the outcome of warming, with a recent meta-analysis of controlled experiments showing that warming only strengthens top-down control in colder regions, with opposite effects in warmer areas³⁶. Our results add weight to this idea and should thus be more relevant for cold, high-latitude ecosystems like our Icelandic study site. In our case, the focal apex predator, brown trout, has scope for increased performance over the temperature range under investigation^{19,37}. Warming is more likely to impair the physiology of apex predators closer to their thermal limits, leading to weaker top-down control or even local extinction. Indeed, experiments in tropical tank bromeliads have shown little evidence for interactive effects of warming and apex predators on community structure and ecosystem functioning^{38–40}. Instead, there were only main effects of top predator loss on community structure^{38,39} and stability⁴⁰. More multi-trophic warming experiments in other regions are thus needed to determine whether direct physiological effects may override indirect food web effects at lower latitudes³³.

The absence of any significant main effects of temperature indicates that its direct effects on organismal physiology were insufficient to cause shifts in community biomass, decomposition rates or food web structure over the 5 week duration of the experiment. This may be partly driven by the potential for organisms in the warmer streams to have experienced multi-generational exposure to higher temperatures (that is, the streams have been geothermally heated for many decades, maybe even centuries), and thus exhibit thermal adaptation. Experimental warming or cooling of streams would be needed to overcome this and other limitations of the space-for-time substitution approach. Nevertheless, similar experiments manipulating temperature and apex predators in tropical tank bromeliads showed no direct effects of temperature on community structure^{38,39} or stability⁴⁰, suggesting similar patterns for more transient responses to warming. Notwithstanding the usual caveats that can be applied to field experiments in terms of their scale and complexity (Supplementary Discussion), the lack of direct temperature effects warns against making overly simplistic extrapolations from observational data or reductionist laboratory experiments. These approaches have their merit, but they also need to be placed in the context of the real world if we are to understand and predict future responses to warming. The dearth of field experiments that can plug this gap remains a cause for concern, given how indirect effects through the food web can override temperature responses at the lower organisational levels that we have focused on so far. It is thus critical to consider the trophic structure of natural communities to anticipate future warming impacts, and network-based approaches should be incorporated more broadly into conservation and biomonitoring science to meet that goal⁴¹.

Methods

Experimental design

The study was conducted in the Hengill valley, Iceland (64° 03' N, 21° 18' W), which has been intensively studied over the past decade^{16–19,21,42,43}. The region consists of numerous spring-fed streams that occur within 1.5 km of each other and have similar physical and chemical properties, yet vary in mean annual temperature from 5 °C to 20 °C due to indirect heating of groundwater through the bedrock^{16–18,44}. The system thus acts as a space-for-time substitution to study eco-evolutionary responses of natural ecosystems at the end-point of warming, but precludes transient responses that could occur during the warming process. Nevertheless, a whole stream warming experiment from the system showed that changes in community composition along the stream temperature gradient are similar to actual warming of a stream⁴⁵.

A field experiment was carried out in six geothermally heated streams in Hengill Valley. A split-plot experimental design was employed, with two levels of temperature (cold and warm) as the main plot crossed with two levels of a fish manipulation (presence and absence of brown trout, *Salmo trutta*) as the subplots within each of the main plots, for a total of four treatments with three replicates of each (Supplementary Fig. 1a). There were three streams in each temperature category (Supplementary Fig. 1b), yielding a mean temperature (\pm standard deviation, s.d.) over the course of the experiment of 6.8 ± 1.4 °C for the cold streams and 13.5 ± 2.4 °C for the warm streams.

Fish were manipulated by constructing three fences in each stream from metal rebar and extruded plastic netting (10 mm mesh), with each fence separated by a 15 m reach (Supplementary Fig. 1c,d). The average width of the streams in the experiment was 1.5 m, equating to enclosure sizes of approximately 22.5 m². While the mesh size controlled the presence or absence of fish in the experiment, it permitted drifting invertebrates to pass through the fences, which could have led to some upstream (that is, non-treatment) biomass influencing each of the reaches. However, this is a natural process in flowing waters and must be considered a source of unavoidable 'background noise' to the experimental treatments.

Electrofishing was carried out on 20 August 2012 to remove any pre-existing brown trout from the experiment, with at least three passes performed on every reach. Ten fish were removed from one of the warm streams (IS6), and six were removed from one of the cold streams (IS14). Fish have also been recorded in IS3 (warm) and IS13 (cold) in past sampling of the system, but never in IS9 (warm) or IS11 (cold)^{17–19}. Fish for use in the experiment were electrofished from another stream in the system, IS12, which had an intermediate temperature to the experimental streams (10.5 °C; Fig. 1b). While this precludes adaptive responses of fish to the temperature treatments over the longer term and thus equates more to shorter term, transient responses to temperature, it was a necessary compromise since fish were not already present in every experimental stream in the system. A total of 42 fish with a mean \pm s.d. fork length of 17.5 ± 3.3 cm were captured on 22 August and distributed evenly among the 'Fish' reaches in the six streams (that is, seven fish per stream). The experimental density of -0.3 m⁻² was chosen to match typical densities of brown trout in the catchment^{18,19}. Note that the 'Fish' reaches were always established downstream of the 'No fish' reaches to minimize the chances of fish kairomones eliciting anti-predator behaviour among benthic invertebrates in those treatments^{46,47}.

An electrofishing survey was conducted on 7 September after heavy rainfall to ensure that the experimental treatments were still intact. No brown trout were found in any of the 'No fish' reaches, although some fish were missing from the 'Fish' reaches in each of the other streams. To restore the experimental densities, two new fish from IS12 were added to IS3, 6, 11 and 14, while three fish were added to IS9 and 13. The experiment was terminated after exactly 5 weeks on 26 September. Electrofishing was again performed, with no brown trout found in any of the 'No fish' reaches and five, six, three, five, four and six fish recovered from IS3, 6, 9, 11, 13 and 14, respectively. These fish were returned to the stream from which they were originally captured (IS12).

Sampling

Invertebrates and benthic algae were sampled on 21 August and 25 September, that is, the day before the fish were added to the experiment at the beginning and the day before they were removed from the experiment at the end. Invertebrates were collected by taking five Surber samples (14 \times 13.5 cm quadrat; 250 μ m mesh) per experimental reach and preserving them in 70% ethanol. Benthic algae were sampled by taking two scrapes of a 2.3 \times 3.5 cm micro-quadrat from each of five rocks per reach. We preserved one scrape in stream water with 2% Lugol's solution for later identification of diatoms. We preserved the second scrape in 96% ethanol, immediately storing it in a black plastic bag, which was placed in a dark fridge at 4 °C upon returning to the lab. Chlorophyll pigments were allowed to extract for an 18 h period before analysis on a DR5000 Hach-Lange spectrophotometer following established methodologies, including a correction for phaeophytin⁴⁸.

We quantified decomposition in the experiment using coarse mesh (5 mm) and fine mesh (250 μ m mesh) litter bags. We placed 3.00 g of dried grass (*Carex* spp.) into each bag before sealing them. Note that there are no trees at our study site, so grass represents the major allochthonous input to the streams¹⁶. Three metal rebars were hammered 20 cm into the sediment in each experimental reach, with one coarse and one fine mesh litter bag attached near the base of each rebar with a cable tie. The litter bags were placed in the streams on 22 August and collected on 26 September. The grass was removed from each litter bag, dried at 80 °C for 48 h, and weighed. Litter breakdown rates (mg per day) were calculated as the initial minus final weight of grass in the litter bags divided by the duration of the experiment (35 days). Microbial decomposition was taken as the breakdown rate in the fine mesh bags, while invertebrate decomposition was the difference between the breakdown rate in each pair of coarse and fine mesh bags.

Biomass estimation

Invertebrates and diatoms were identified to species level in line with previous studies from the Hengill system^{17,18}. The biomass (mg m^{-2}) of each species was estimated as mean body mass multiplied by total abundance. The abundance of every invertebrate species was enumerated using a CETI Vari Zoom 10 stereo microscope and scaled by Surber quadrat area (m^{-2}). Photographs of every individual identified were taken with a CETI 1.3 megapixel digital USB camera at 80–800 \times magnification and one linear dimension was measured in ImageJ⁴⁹ ($n = 11,053$ individuals from 31 species). Published length–weight relationships were used to estimate dry body mass (mg) from the linear measurements¹⁸.

Diatom frustules were cleared of organic matter with 65% nitric acid, dried, and mounted on slides with naphrax. Abundances were estimated by counting the number of individuals of each species along a 15×0.1 mm transect of each slide, ensuring a transect contained at least 150 individuals. The sample dilution, transect area and micro-quadrat area were used to calculate the abundance of each species (m^{-2}). Photographs of every individual diatom were taken with the above camera mounted on a CETI Magnum-B phase contrast microscope at 1,000 \times magnification. Two linear dimensions were measured in ImageJ⁴⁹ ($n = 25,248$ individuals from 64 species). Every diatom species was assigned a shape, and cell biovolume (μm^3) was calculated according to associated formulae⁵⁰. Cell carbon content was estimated from published cell volume to cell carbon relationships⁵¹ and converted to dry mass (mg) assuming an average carbon by dry weight content of 19% per cell⁵².

Food web construction

We aimed to construct five localized food webs for each experimental reach by pairing the list of invertebrate species from each Surber sample with the list of diatom species from the nearest rock scrape. Food webs were constructed from an established database of 49,324 gut content observations from the Hengill streams, supplemented with literature-based feeding links when yield-effort curves revealed the diet of consumers to be incomplete²¹. Fifty-eight per cent of feeding links were directly observed in each specific stream, 35% of links were inferred from direct observations in other streams in the Hengill system, and just 7% of links were inferred from the literature. A food web link was only included in the current study if both species were found in the paired Surber and rock scrape samples. This procedure ensured that temperature could alter the dietary preferences of the consumers, rather than solely inferring diet from the presence or absence of potential prey. Nevertheless, there was no comparison of invertebrate diets in the presence and absence of brown trout, precluding the possibility that behavioural factors such as fear of predation could have altered their diets. Localized food webs were analysed using the ‘cheddar’ package in R 3.5.0 (ref. 53). We computed the following metrics: species richness (S), link richness (L), linkage density (L/S), directed connectance (L/S^2), mean trophic level (using the ‘ShortWeightedTrophicLevel’ function⁵³) and the ratio of consumers to resources (that is, the number of consumer species divided by the number of resource species).

Statistical analysis

To account for background changes through time in the experiment, we subtracted the mean value of each response variable across the replicates (that is, Surber samples, rock scrapes and litter bags) in an experimental reach at the start of the experiment from the value of that response variable in each replicate in the same experimental reach at the end of the experiment. Thus, if the change in a response variable over the course of the experiment was significantly greater in one treatment compared with another, that difference would be due to the treatment and not natural processes such as growth, migration and death.

We analysed the change in all our response variables over the course of the experiment with linear mixed effects models (‘lme’ function in the ‘nlme’ package of R), where temperature (warm, cold) and fish (presence, absence) were the explanatory variables, and fish treatment within stream identity was a random effect. This random structure accounts for the spatial autocorrelation of the replicates within the ‘Fish’ and ‘No fish’ reaches in each stream. The percentage variation explained by the random effects in each model are given in Supplementary Table 2. To deal with heterogeneity in our model residuals, we compared four different variance structures for each model: (1) setting ‘weights = NULL’ in the ‘lme’ function, that is, assuming homogeneity of variance; (2) setting ‘weights = varIdent(form = ~1 | temperature)’; (3) setting ‘weights = varIdent(form = ~1 | fish)’; and (4) setting ‘weights = varIdent(form = ~1 | temperature * fish)’. The latter three arguments implement different variances per stratum for (2) temperature category, (3) the fish manipulation and (4) each temperature by fish combination⁵⁴. We chose the model with the lowest Akaike Information Criterion to decide the best variance structure for each response variable⁵⁴.

Bioenergetic model

We constructed a bioenergetic population dynamical model (following ref. 18) to simulate the change in biomass of the two main trophic groups in our experiment: diatoms (B_1) and invertebrates (B_2). Fish (B_3) were considered as a third group in the model that consumed invertebrates, but their biomass was maintained as a constant across all streams ($B_3 = 28,582 \text{ mg m}^{-2}$) to reflect the average biomass of fish added to each stream in the experiment. The changes in biomasses (mg m^{-2}) of the two groups through time were modelled as follows:

$$\frac{dB_1}{dt} = rB_1\left(1 - \frac{B_1}{K}\right) - y_2B_1B_2 \quad (1)$$

$$\frac{dB_2}{dt} = e_2y_2B_1B_2 - x_2B_2 - y_3B_2B_3 \quad (2)$$

Here r is the maximum mass-specific growth rate of diatoms (per day); K is their carrying capacity (mg m^{-2}); x_2 is the metabolic rate of invertebrates (per day); y_2 and y_3 represent the consumption rates of invertebrates and fish, respectively (m^{-2} per day); and $e_2 = 0.45$ is the assimilation efficiency when invertebrates consume diatoms⁵⁵. For modelling the dynamics in the absence of fish, equation (1) remains the same, but equation (2) changes to:

$$\frac{dB_2}{dt} = e_2y_2B_1B_2 - x_2B_2 \quad (3)$$

Equilibrium analysis

We directly calculated the equilibrium biomasses, which were the model-predicted biomasses of the trophic groups at model equilibrium (that is, the steady state of the dynamical system). Considering that the equilibrium biomasses of the two groups were always positive in the experiment, and solving for $\frac{dB_1}{dt} = \frac{dB_2}{dt} = 0$, we obtain a meaningful equilibrium point for the system with fish:

$$\begin{cases} B_1^* = \frac{x_2 + y_3B_3}{e_2y_2} \\ B_2^* = \frac{r}{y_2}\left(1 - \frac{B_1^*}{K}\right) = \frac{r}{y_2}\left(1 - \frac{x_2 + y_3B_3}{e_2y_2K}\right) \end{cases} \quad (4)$$

The equilibrium point without fish is:

$$\begin{cases} B_1^\# = \frac{x_2}{e_2y_2} \\ B_2^\# = \frac{r}{y_2}\left(1 - \frac{B_1^\#}{K}\right) = \frac{r}{y_2}\left(1 - \frac{x_2}{e_2y_2K}\right) \end{cases} \quad (5)$$

We prove both of these equilibrium points are stable in Supplementary Methods, which means the dynamical systems would converge to the equilibrium biomasses we calculated. The difference in biomass between the systems with and without fish is:

$$\begin{cases} \Delta B_1 = B_1^* - B_1^\# = \frac{y_3 B_3}{e_2 y_2} \\ \Delta B_2 = B_2^* - B_2^\# = -\frac{r y_3 B_3}{e_2 y_2^2 k} \end{cases} \quad (6)$$

Model parameterization

We parameterized equation (6) using growth rate data from an algal tile colonization experiment, carrying capacity estimated from a previous study¹⁸, and consumption rate experiments on invertebrates and fish, all conducted in the Hengill system (for more details, see Supplementary Methods). Note that metabolic rate cancels out when subtracting equation (5) from equation (4) and so does not contribute to the change in biomass of invertebrates or diatoms due to fish. Based on our algal tile colonization experiment, growth rate scales with temperature as follows:

$$r = a_r e^{E_r(T-T_0)/kTT_0} \quad (7)$$

where a_r is the growth rate at T_0 ($12^\circ\text{C} = 285.15$ Kelvin, that is, the average temperature of the experimental streams), E_r is the activation energy describing the Arrhenius increase in growth rate, k is the Boltzmann constant (8.618×10^{-5} eV per Kelvin) and T is stream temperature (for parameter values, see Supplementary Table 3). Based on our previous work¹⁸, carrying capacity scales with temperature as follows:

$$K = a_K e^{E_K(T-T_0)/kTT_0} \quad (8)$$

where a_K is the carrying capacity at T_0 and E_r is the activation energy describing the Arrhenius increase in carrying capacity (for parameter values, see Supplementary Methods). Finally, based on our feeding rate experiments and the Metabolic Theory of Ecology^{17,51}, consumption rate scales with body mass and temperature as follows:

$$y_i = a_{y_i} M_i^{b_{y_i}} e^{E_{y_i}(T-T_0)/kTT_0}, i = 2 \text{ or } 3 \quad (9)$$

where a_{y_i} is the consumption rate at T_0 , b_{y_i} is the allometric exponent, E_{y_i} is the activation energy describing the Arrhenius increase in consumption rate, and M_i is the mean body mass of trophic group i (for parameter values, see Supplementary Table 4). We considered $M_3 = 61,246$ mg as the average body mass of fish added to the experimental streams. M_2 increases with temperature in the system¹⁸, so we estimated the mean body mass of invertebrates at each temperature as:

$$M_2 = a_{M_2} e^{E_{M_2}(T-T_0)/kTT_0} \quad (10)$$

where a_{M_2} is the body mass of invertebrates at T_0 and E_{M_2} is the activation energy describing the Arrhenius increase in body mass (for parameter values, see Supplementary Table 5).

The statistical models performed on the data from each experiment provide a mean and s.d. of the estimate for each parameter. Thus, we ran Monte-Carlo simulations by randomly sampling 1,000 estimates of each parameter from normal distributions with the same mean and s.d. to get the mean and 95% confidence intervals of the equilibrium biomasses for invertebrates and diatoms.

Sensitivity analysis

We quantified the contribution of each model parameter to the cascading effect of fish on invertebrates and diatoms by individually altering each parameter within the 95% confidence intervals estimated from our experiments. Substituting equations (7)–(10) into equation (6) gives:

$$\begin{cases} \Delta B_1 = \frac{B_3}{e_2} \frac{a_{y_3} M_3^{b_{y_3}}}{a_{y_2} a_{M_2}^{b_{y_2}}} e^{(E_{y_3} - E_{y_2} - b_{y_2} E_{M_2})(T-T_0)/kTT_0} \\ \Delta B_2 = -\frac{B_3}{e_2} \frac{A_r a_{y_3} M_3^{b_{y_3}}}{a_K a_{y_2}^2 a_{M_2}^{b_{y_2}}} e^{(E_r + E_{y_3} - 2E_{y_2} - 2b_{y_2} E_{M_2} - E_K)(T-T_0)/kTT_0} \end{cases} \quad (11)$$

We defined the cascading effect of fish on diatoms as $\ln(\Delta B_1)$ and on invertebrates as $-\ln(-\Delta B_2)$, since ΔB_2 is always negative. The term $(T - T_0)/kTT_0$ exhibits an approximately linear relationship with $T - 12^\circ\text{C}$ within the experimental temperature range, thus we substituted the term $0.1399 \times (T - 12)$ for $(T - T_0)/kTT_0$ in equation (11) to keep the intercept of the model fixed to 12°C , that is, the average stream temperature in the experiments (Supplementary Fig. 10). The cascading effect of fish would change linearly with temperature according to the \ln -transformed version of equation (11). The intercept measures the cascading effect at 12°C and the slope measures how the cascading effect would change for every 1°C increase in temperature. Some parameters directly contribute to the magnitude of the cascading effect (that is, altering only the intercept of the equations), while others influence the thermal sensitivity of the cascading effect (that is, altering the slope of the equations).

In equation (11), the directionality of the temperature-induced trophic cascade is governed by two key terms. (1) The effect of warming and presence of fish on invertebrates is governed by $E_r + E_{y_3} - 2 \times E_{y_2} - 2 \times b_{y_2} E_{M_2} - E_K$. If this value is high and positive, the change in invertebrate biomass in the presence compared with the absence of fish declines with warming, whereas if this value is high and negative, the change in invertebrate biomass increases with warming. Increasing E_{y_2} , E_{M_2} and E_K or decreasing E_r and E_{y_3} may thus alter the trend from a negative effect of warming on invertebrates in the presence of fish to a positive effect. (2) Similarly, the effect of warming and presence of fish on diatoms is governed by $E_{y_3} - E_{y_2} - b_{y_2} E_{M_2}$. If this value is high and positive, the change in diatom biomass in the presence compared with the absence of fish increases with warming, whereas if this value is high and negative, the change in diatom biomass decreases with warming. Increasing E_{y_2} and E_{M_2} or decreasing E_{y_3} may thus alter the trend from a positive effect of warming on invertebrates in the presence of fish to a negative effect.

To assess the effect of each parameter in the model on the cascading effect of the fish, we increased each parameter by 10% in turn and then calculated ΔB_1 and ΔB_2 following equation (11) (denoted as $\Delta B'_1$ and $\Delta B'_2$, respectively). We quantified the impact of the parameter as the difference in the cascading effect before and after the parameter changed:

$$\begin{cases} \ln(\Delta B'_1) - \ln(\Delta B_1) = \ln\left(\frac{\Delta B'_1}{\Delta B_1}\right) \\ -\ln(-\Delta B'_2) - [-\ln(-\Delta B_2)] = \ln\left(\frac{\Delta B'_2}{\Delta B_2}\right) \end{cases} \quad (12)$$

This is the log transformation of the ratio of $\Delta B_{1,2}$ after increasing the parameter by 10% over $\Delta B_{1,2}$ before the change. A positive value of the impact indicates the value of ΔB_1 would increase as the parameter increases, or become less negative as the parameter increases in the case of ΔB_2 .

Reporting summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

Data availability

The data that support the findings of this study are available from the University of Essex Research Data Repository at <https://doi.org/10.5526/ERDR-00000186>.

Code availability

The R code that supports the findings of this study is available from the University of Essex Research Data Repository at <https://doi.org/10.5526/ERDR-00000186>.

References

- O'Connor, M. I., Piehler, M. F., Leech, D. M., Anton, A. & Bruno, J. F. Warming and resource availability shift food web structure and metabolism. *PLoS Biol.* **7**, e1000178 (2009).
- Petchey, O. L., McPhearson, P. T., Casey, T. M. & Morin, P. J. Environmental warming alters food-web structure and ecosystem function. *Nature* **402**, 69–72 (1999).
- Shurin, J. B., Clasen, J. L., Greig, H. S., Kratina, P. & Thompson, P. L. Warming shifts top-down and bottom-up control of pond food web structure and function. *Philos. Trans. R. Soc. B* **367**, 3008–3017 (2012).
- Yvon-Durocher, G., Jones, J. I., Trimmer, M., Woodward, G. & Montoya, J. M. Warming alters the metabolic balance of ecosystems. *Philos. Trans. R. Soc. B* **365**, 2117–2126 (2010).
- Gillooly, J. F., Brown, J. H., West, G. B., Savage, V. M. & Charnov, E. L. Effects of size and temperature on metabolic rate. *Science* **293**, 2248–2251 (2001).
- Savage, V. M., Gillooly, J. F., Brown, J. H., West, G. B. & Charnov, E. L. Effects of body size and temperature on population growth. *Am. Nat.* **163**, 429–441 (2004).
- Rall, B. C. et al. Universal temperature and body-mass scaling of feeding rates. *Philos. Trans. R. Soc. B* **367**, 2923–2934 (2012).
- Vasseur, D. A. & McCann, K. S. A mechanistic approach for modeling temperature-dependent consumer–resource dynamics. *Am. Nat.* **166**, 184–198 (2005).
- Kishi, D., Murakami, M., Nakano, S. & Maekawa, K. Water temperature determines strength of top-down control in a stream food web. *Freshw. Biol.* **50**, 1315–1322 (2005).
- Kratina, P., Greig, H. S., Thompson, P. L., Carvalho-Pereira, T. S. & Shurin, J. B. Warming modifies trophic cascades and eutrophication in experimental freshwater communities. *Ecology* **93**, 1421–1430 (2012).
- Barton, B. T., Beckerman, A. P. & Schmitz, O. J. Climate warming strengthens indirect interactions in an old-field food web. *Ecology* **90**, 2346–2351 (2009).
- Woodward, G., Papanioui, G., Edwards, F. & Lauridsen, R. B. Trophic trickles and cascades in a complex food web: impacts of a keystone predator on stream community structure and ecosystem processes. *Oikos* **117**, 683–692 (2008).
- Rooney, N., McCann, K., Gellner, G. & Moore, J. C. Structural asymmetry and the stability of diverse food webs. *Nature* **442**, 265–269 (2006).
- Dunne, J. A., Harte, J. & Taylor, K. J. Subalpine meadow flowering phenology responses to climate change: integrating experimental and gradient methods. *Ecol. Monogr.* **73**, 69–86 (2003).
- O’Gorman, E. J. et al. Climate change and geothermal ecosystems: natural laboratories, sentinel systems, and future refugia. *Glob. Change Biol.* **20**, 3291–3299 (2014).
- Friberg, N. et al. Relationships between structure and function in streams contrasting in temperature. *Freshw. Biol.* **54**, 2051–2068 (2009).
- O’Gorman, E. J. et al. Impacts of warming on the structure and function of aquatic communities: individual- to ecosystem-level responses. *Adv. Ecol. Res.* **47**, 81–176 (2012).
- O’Gorman, E. J. et al. Unexpected changes in community size structure in a natural warming experiment. *Nat. Clim. Change* **7**, 659–666 (2017).
- O’Gorman, E. J. et al. Temperature effects on fish production across a natural thermal gradient. *Glob. Change Biol.* **22**, 3206–3220 (2016).
- Daufresne, M., Lengfellner, K. & Sommer, U. Global warming benefits the small in aquatic ecosystems. *Proc. Natl Acad. Sci. USA* **106**, 12788–12793 (2009).
- O’Gorman, E. J. et al. A simple model predicts how warming simplifies wild food webs. *Nat. Clim. Change* **9**, 611–616 (2019).
- Harley, C. D. Climate change, keystone predation, and biodiversity loss. *Science* **334**, 1124–1127 (2011).
- Barton, B. T. & Schmitz, O. J. Experimental warming transforms multiple predator effects in a grassland food web. *Ecol. Lett.* **12**, 1317–1325 (2009).
- Steingrímsson, S. Ó. & Gíslason, G. M. Body size, diet and growth of landlocked brown trout, *Salmo trutta*, in the subarctic River Laxá, north-east Iceland. *Environ. Biol. Fishes* **63**, 417–426 (2002).
- Beard, K. H., Vogt, K. A. & Kulmatiski, A. Top-down effects of a terrestrial frog on forest nutrient dynamics. *Oecologia* **133**, 583–593 (2002).
- Sin, H., Beard, K. H. & Pitt, W. C. An invasive frog, *Eleutherodactylus coqui*, increases new leaf production and leaf litter decomposition rates through nutrient cycling in Hawaii. *Biol. Invasions* **10**, 335–345 (2008).
- Smith-Ramesh, L. M., Moore, A. C. & Schmitz, O. J. Global synthesis suggests that food web connectance correlates to invasion resistance. *Glob. Change Biol.* **23**, 465–473 (2017).
- Gilbert, A. J. Connectance indicates the robustness of food webs when subjected to species loss. *Ecol. Indic.* **9**, 72–80 (2009).
- Branch, T. A. et al. The trophic fingerprint of marine fisheries. *Nature* **468**, 431 (2010).
- Duffy, J. E. et al. The functional role of biodiversity in ecosystems: incorporating trophic complexity. *Ecol. Lett.* **10**, 522–538 (2007).
- O’Gorman, E. J. Multitrophic diversity sustains ecological complexity by dampening top-down control of a shallow marine benthic food web. *Ecology* **102**, e03274 (2021).
- Srivastava, D. S. & Bell, T. Reducing horizontal and vertical diversity in a foodweb triggers extinctions and impacts functions. *Ecol. Lett.* **12**, 1016–1028 (2009).
- Ockendon, N. et al. Mechanisms underpinning climatic impacts on natural populations: altered species interactions are more important than direct effects. *Glob. Change Biol.* **20**, 2221–2229 (2014).
- Finke, D. L. & Denno, R. F. Predator diversity dampens trophic cascades. *Nature* **429**, 407–410 (2004).
- Woodward, G. et al. Body size in ecological networks. *Trends Ecol. Evol.* **20**, 402–409 (2005).
- Marino, N. D. A. C., Romero, G. Q. & Farjalla, V. F. Geographical and experimental contexts modulate the effect of warming on top-down control: a meta-analysis. *Ecol. Lett.* **21**, 455–466 (2018).
- Elliott, J. & Elliott, J. Temperature requirements of Atlantic salmon *Salmo salar*, brown trout *Salmo trutta* and Arctic charr *Salvelinus alpinus*: predicting the effects of climate change. *J. Fish Biol.* **77**, 1793–1817 (2010).
- Antiqueira, P. A. P. et al. Warming and top predator loss drive direct and indirect effects on multiple trophic groups within and across ecosystems. *J. Anim. Ecol.* **91**, 428–442 (2022).
- Antiqueira, P. A. P., Petchey, O. L. & Romero, G. Q. Warming and top predator loss drive ecosystem multifunctionality. *Ecol. Lett.* **21**, 72–82 (2018).
- Rezende, F. et al. Trophic downgrading decreases species asynchrony and community stability regardless of climate warming. *Ecol. Lett.* **24**, 2660–2673 (2021).
- Gray, C. et al. Ecological networks: the missing links in biomonitoring science. *J. Appl. Ecol.* **51**, 1444–1449 (2014).
- Woodward, G. et al. Sentinel systems on the razor’s edge: effects of warming on Arctic geothermal stream ecosystems. *Glob. Change Biol.* **16**, 1979–1991 (2010).
- Demars, B. O. L. et al. Temperature and the metabolic balance of streams. *Freshw. Biol.* **56**, 1106–1121 (2011).
- Kordas, B., Pawar, S., Kontopoulou, D. G., Woodward, G. & O’Gorman, E. J. Metabolic plasticity can amplify ecosystem responses to warming. *Nat. Commun.* **13**, 2161 (2022).

45. Nelson, D. et al. Experimental whole-stream warming alters community size structure. *Glob. Change Biol.* **23**, 2618–2628 (2017).
46. Pestana, J. L., Loureiro, S., Baird, D. J. & Soares, A. M. Fear and loathing in the benthos: responses of aquatic insect larvae to the pesticide imidacloprid in the presence of chemical signals of predation risk. *Aquat. Toxicol.* **93**, 138–149 (2009).
47. Schäffer, M., Winkelmann, C., Hellmann, C. & Benndorf, J. Reduced drift activity of two benthic invertebrate species is mediated by infochemicals of benthic fish. *Aquat. Ecol.* **47**, 99–107 (2013).
48. Steinman, A. D., Lamberti, G. A., Leavitt, P. R. & Uzarski, D. G. in *Methods in Stream Ecology* Vol. 1 3rd edn (eds Hauer, F. R. & Lamberti, G. A.) 223–241 (Elsevier, 2017).
49. Abramoff, M. D., Magalhaes, P. J. & Ram, S. J. Image processing with ImageJ. *Biophotonics Int.* **11**, 36–42 (2004).
50. Sun, J. & Liu, D. Geometric models for calculating cell biovolume and surface area for phytoplankton. *J. Plankton Res.* **25**, 1331–1346 (2003).
51. Rocha, O. & Duncan, A. The relationship between cell carbon and cell volume in freshwater algal species used in zooplanktonic studies. *J. Plankton Res.* **7**, 279–294 (1985).
52. Sicko-Goad, L. M., Schelske, C. L. & Stoermer, E. F. Estimation of intracellular carbon and silica content of diatoms from natural assemblages using morphometric techniques. *Limnol. Oceanogr.* **29**, 1170–1178 (1984).
53. Hudson, L. N. et al. Cheddar: analysis and visualisation of ecological communities in R. *Methods Ecol. Evol.* **4**, 99–104 (2013).
54. Zuur, A. F. et al. in *Mixed Effects Models and Extensions in Ecology with R* (eds Zuur, A. F. et al.) 101–142 (Springer, 2009).
55. Yodzis, P. & Innes, S. Body size and consumer–resource dynamics. *Am. Nat.* **139**, 1151–1175 (1992).

Acknowledgements

We thank G. Jenkins, Ó. McLaughlin, B. Gallo, K. Fußmann, B. Rall and L. Johansson for field assistance, G. Már Gíslason, J. S. Ólafsson, and Sigríður Ásgeirsdóttir for providing research support and facilities, and D. McElroy for the advice on statistical analysis. We acknowledge funding from NERC (NE/L011840/1 (E.J.O.), NE/M020843/1 (G.W., E.J.O. and R.L.K.)), the Royal Society (RG140601 (E.J.O.)), the British Ecological Society (4009-4884 (E.J.O.)) and NSF (PRFB 1401656 (R.L.K.)).

Author contributions

E.J.O. and G.W. were responsible for funding application, research design and planning. E.J.O. collected the data. E.J.O., R.L.K. and S.D. analysed the data. L.Z. conducted the modelling work. All authors wrote the paper.

Competing interests

The authors declare no competing interests.

Additional information

Supplementary information The online version contains supplementary material available at <https://doi.org/10.1038/s41559-023-02216-4>.

Correspondence and requests for materials should be addressed to Eoin J. O’Gorman, Lei Zhao or Guy Woodward.

Peer review information *Nature Ecology & Evolution* thanks Tyler Tunney, Pablo Antikeira and the other, anonymous, reviewer(s) for their contribution to the peer review of this work.

Reprints and permissions information is available at www.nature.com/reprints.

Publisher’s note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article’s Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article’s Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit <http://creativecommons.org/licenses/by/4.0/>.

© The Author(s) 2023

Reporting Summary

Nature Portfolio wishes to improve the reproducibility of the work that we publish. This form provides structure for consistency and transparency in reporting. For further information on Nature Portfolio policies, see our [Editorial Policies](#) and the [Editorial Policy Checklist](#).

Statistics

For all statistical analyses, confirm that the following items are present in the figure legend, table legend, main text, or Methods section.

n/a Confirmed

- The exact sample size (n) for each experimental group/condition, given as a discrete number and unit of measurement
- A statement on whether measurements were taken from distinct samples or whether the same sample was measured repeatedly
- The statistical test(s) used AND whether they are one- or two-sided
Only common tests should be described solely by name; describe more complex techniques in the Methods section.
- A description of all covariates tested
- A description of any assumptions or corrections, such as tests of normality and adjustment for multiple comparisons
- A full description of the statistical parameters including central tendency (e.g. means) or other basic estimates (e.g. regression coefficient) AND variation (e.g. standard deviation) or associated estimates of uncertainty (e.g. confidence intervals)
- For null hypothesis testing, the test statistic (e.g. F , t , r) with confidence intervals, effect sizes, degrees of freedom and P value noted
Give P values as exact values whenever suitable.
- For Bayesian analysis, information on the choice of priors and Markov chain Monte Carlo settings
- For hierarchical and complex designs, identification of the appropriate level for tests and full reporting of outcomes
- Estimates of effect sizes (e.g. Cohen's d , Pearson's r), indicating how they were calculated

Our web collection on [statistics for biologists](#) contains articles on many of the points above.

Software and code

Policy information about [availability of computer code](#)

Data collection

Data analysis

For manuscripts utilizing custom algorithms or software that are central to the research but not yet described in published literature, software must be made available to editors and reviewers. We strongly encourage code deposition in a community repository (e.g. GitHub). See the Nature Portfolio [guidelines for submitting code & software](#) for further information.

Data

Policy information about [availability of data](#)

All manuscripts must include a [data availability statement](#). This statement should provide the following information, where applicable:

- Accession codes, unique identifiers, or web links for publicly available datasets
- A description of any restrictions on data availability
- For clinical datasets or third party data, please ensure that the statement adheres to our [policy](#)

Research involving human participants, their data, or biological material

Policy information about studies with [human participants or human data](#). See also policy information about [sex, gender \(identity/presentation\), and sexual orientation](#) and [race, ethnicity and racism](#).

Reporting on sex and gender

Reporting on race, ethnicity, or other socially relevant groupings

Population characteristics

Recruitment

Ethics oversight

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Field-specific reporting

Please select the one below that is the best fit for your research. If you are not sure, read the appropriate sections before making your selection.

Life sciences Behavioural & social sciences Ecological, evolutionary & environmental sciences

For a reference copy of the document with all sections, see nature.com/documents/nr-reporting-summary-flat.pdf

Ecological, evolutionary & environmental sciences study design

All studies must disclose on these points even when the disclosure is negative.

Study description

A field experiment was carried out in six geothermally heated streams in the Hengill valley, Iceland. A split-plot experimental design was employed, with two levels of temperature (cold and warm) as the main plot crossed with two levels of a fish manipulation (presence and absence of brown trout, *Salmo trutta*) as the subplots within each of the main plots, for a total of 4 treatments with three replicates of each. There were three streams in each temperature category, yielding a mean temperature (\pm standard deviation, SD) over the course of the experiment of 6.8 ± 1.4 °C for the cold streams and 13.5 ± 2.4 °C for the warm streams. Fish were manipulated by constructing three fences in each stream from metal rebar and extruded plastic netting (10 mm mesh), with each fence separated by a 15 m reach. The average width of the streams in the experiment was 1.5 m, equating to enclosure sizes of approximately 22.5 m².

Research sample

Invertebrates and benthic algae were sampled on the day before the fish were added to the experiment at the beginning and the day before they were removed from the experiment at the end (five weeks later). Invertebrates were collected by taking five Surber samples (14 × 13.5 cm quadrat; 250 µm mesh) per experimental reach and preserving them in 70% ethanol. Benthic algae were sampled by taking two scrapes of a 2.3 × 3.5 cm micro-quadrat from each of five rocks per reach. We preserved one scrape in stream water with 2% Lugol's solution for later identification of diatoms. We preserved the second scrape in 96% ethanol, immediately storing it in a black plastic bag, which was placed in a dark fridge at 4 °C upon returning to the lab. Chlorophyll pigments were allowed to extract for an 18-hour period before analysis on a DR5000 Hach-Lange spectrophotometer following established methodologies, including a correction for phaeophytin. We quantified decomposition in the experiment using coarse mesh (5 mm) and fine mesh (250 µm mesh) litter bags. We placed 3.00 g of dried grass (*Carex* spp.) into each bag before sealing them. Three metal rebars were hammered 20 cm into the sediment in each experimental reach, with one coarse and one fine mesh litter bag attached near the base of each rebar with a cable tie. The litter bags were placed in the streams on 22nd August and collected on 26th September. The grass was removed from each litter bag, dried at 80 °C for 48 hours, and weighed. Litter breakdown rates [mg day⁻¹] were calculated as the initial minus final weight of grass in the litter bags divided by the duration of the experiment (35 days). Microbial decomposition was taken as the breakdown rate in the fine mesh bags, while invertebrate decomposition was the difference between the breakdown rate in each pair of coarse and fine mesh bags.

Sampling strategy

The number of samples from each treatment reach was based on sample sizes used in previous studies in the Hengill system, which used yield-effort curves to verify the adequacy of sample size, e.g. O'Gorman et al. 2012 *Advances in Ecological Research*, 47, 81-176.

Data collection

The samples were processed by Eoin O'Gorman and members of his research group, with O'Gorman collating and screening all the datasets into Excel files for subsequent statistical analysis.

Timing and spatial scale

The experiment was conducted from 22nd August to 26th September 2012 in six geothermally heated streams in the Hengill valley, Iceland. There were two treatment reaches in each stream measuring approximately 15 m in length with an average width of 1.5 m, equating to enclosure sizes of approximately 22.5 m². Samples were collected at the beginning and end of the experiment to account for background changes through time. Here, we subtracted the mean value of each response variable across the technical replicates (i.e. Surber samples, rock scrapes, litter bags) in an experimental reach at the start of the experiment from the value of that response variable in each technical replicate in the same experimental reach at the end of the experiment. Thus, if the change in a response variable over the course of the experiment was significantly greater in one treatment compared to another, that difference would be due to the treatment and not natural processes such as growth, migration, and death. Fences were cleared of

organic material every 2-3 days and an electrofishing survey was conducted on 7th September after heavy rainfall to ensure that the experimental treatments were still intact, but the experiment was otherwise unperturbed during this time.

Data exclusions

Reproducibility

Randomization

Blinding

Did the study involve field work? Yes No

Field work, collection and transport

Field conditions

Location

Access & import/export

Disturbance

Reporting for specific materials, systems and methods

We require information from authors about some types of materials, experimental systems and methods used in many studies. Here, indicate whether each material, system or method listed is relevant to your study. If you are not sure if a list item applies to your research, read the appropriate section before selecting a response.

Materials & experimental systems

n/a Involved in the study

Antibodies

Eukaryotic cell lines

Palaeontology and archaeology

Animals and other organisms

Clinical data

Dual use research of concern

Plants

Methods

n/a Involved in the study

ChIP-seq

Flow cytometry

MRI-based neuroimaging

Animals and other research organisms

Policy information about [studies involving animals](#); [ARRIVE guidelines](#) recommended for reporting animal research, and [Sex and Gender in Research](#)

Laboratory animals

Wild animals

Reporting on sex

Sex of the fish or invertebrates was not considered in the study design because it was not deemed relevant to addressing the hypotheses under investigation.

Field-collected samples

No live organisms were collected at the end of the experiment and so no laboratory housing was needed. Collection and processing of preserved samples is described above in the "Research sample" section.

Ethics oversight

Electrofishing and handling of brown trout in the experiment was performed in collaboration with the Marine and Freshwater Research Institute under their ethical guidelines, permits, and regulations.

Note that full information on the approval of the study protocol must also be provided in the manuscript.