Warming alters energetic structure and function but not resilience of soil food webs

Benjamin Schwarz^{1,2}, Andrew D. Barnes^{3,4,5*}, Madhav P. Thakur^{3,4}, Ulrich Brose^{1,3}, Marcel Ciobanu⁶, Peter B. Reich^{7,8}, Roy L. Rich^{7,9}, Benjamin Rosenbaum^{1,3}, Artur Stefanski⁷ and Nico Eisenhauer^{3,4}

Climatewarmingispredicted to alter the structure, stability, and functioning of food webs¹⁻⁵. Yet, despite the importance of soil food webs for energy and nutrient turnover in terrestrial ecosystems, the effects of warming on these food webs-particularly in combination with other global change drivers—are largely unknown. Here, we present results from two complementary field experiments that test the interactive effects of warming with forest canopy disturbance and drought on energy flux in boreal-temperate ecotonal forest soil food webs. The first experiment applied a simultaneous above- and belowground warming treatment (ambient, +1.7 °C, +3.4 °C) to closedcanopy and recently clear-cut forest, simulating common forest disturbance⁶. The second experiment crossed warming with a summer drought treatment (-40% rainfall) in the clear-cut habitats. We show that warming reduces energy flux to microbes, while forest canopy disturbance and drought facilitates warming-induced increases in energy flux to higher trophic levels and exacerbates the reduction in energy flux to microbes, respectively. Contrary to expectations, we find no change in whole-network resilience to perturbations, but significant losses in ecosystem functioning. Warming thus interacts with forest disturbance and drought, shaping the energetic structure of soil food webs and threatening the provisioning of multiple ecosystem functions in boreal-temperate ecotonal forests.

Climate warming modifies consumer–resource interactions^{5,7,8}, and as a consequence alters food web structure and the flux of energy and matter through ecosystems^{1–4}. The energetic organization of food webs affects their stability^{9–11} and the provisioning of ecosystem functions¹², as energy fluxes among trophic groups describe the ecosystem functions carried out by each consumer. In accordance with the temperature dependence of metabolism^{13,14}, energy flux through food webs should increase with warming as energetic demands increase. It is also likely that variation in the responses of different trophic groups to warming², due to taxon-specific metabolic scaling with temperature¹⁴ or warming-induced mismatches of energy demand and consumption^{7,15}, for example, could reorganize the biomass structure of food webs^{1,4}. Thus, warming-induced declines in the biomass of certain trophic groups could decrease the absolute energy fluxes to these groups, although the

energy flux per unit biomass may increase with warming. Other global change drivers acting in concert with climate warming may further influence energy flux. For example, recent studies have shown that drought and land-use intensification reduce energy flux through food webs^{12,16,17}. Accounting for possible interactions with other global change drivers may therefore advance our understanding of the effects of warming on food web structure and the provisioning of multiple ecosystem functions.

In terrestrial ecosystems, most of the energy supplied by primary production directly enters the soil and fuels belowground food webs¹⁸. These food webs provide key ecosystem functions described by the flux of energy among trophic levels^{19,20}, such as the mineralization of nutrients and the sequestration of carbon, which fundamentally affect all terrestrial organisms and regulate soil carbon-climate feedbacks²¹. Despite the crucial importance of soil food webs, our knowledge of how climate warming and its interactions with other global change drivers impacts structure, stability and functioning of whole soil food webs is still limited. Warming and drought in microcosms were reported to increase the consumption rates of predators, thereby reducing microbial-feeding prey and increasing fungal-driven decomposition²². Other studies have found that warming restructures the community composition of soil microbes²³, soil microarthropods²⁴, and nematodes²⁵, which potentially impacts the provisioning of ecosystem functions and the stability of these communities as determined by their energetic structure¹⁰. However, longer-term warming experiments have shown such responses to vary over time, probably due to adaptation or compositional shifts towards better adapted species^{23,26}. Furthermore, other global change drivers such as drought and land use¹⁶ were shown to shape the influence of climate change on soil food webs.

Here, we test how warming alters energy flux through soil food webs in boreal–temperate ecotonal forest and how these effects interact with forest canopy disturbance and summer drought. We hypothesized that energy flux in soil food webs would increase with warming due to the positive temperature–metabolism relationship^{13,14}, but that this increase would be strongly counteracted in treatments crossed with forest disturbance and drought due to losses of species richness and biomass^{12,17}. Additionally, we expected that warming-induced increases in energy flux would yield higher interaction strengths at

¹Institute of Ecology, Friedrich-Schiller-University Jena, Jena, Germany. ²Biometry and Environmental System Analysis, Albert-Ludwigs-University Freiburg, Freiburg, Germany. ³German Centre for Integrative Biodiversity Research (iDiv) Halle-Jena-Leipzig, Leipzig, Germany. ⁴Institute of Biology, Leipzig University, Leipzig, Germany. ⁵Institute of Landscape Ecology, University of Muenster, Muenster, Germany. ⁶Institute of Biological Research, Branch of the National Institute of Research and Development for Biological Sciences, Cluj-Napoca, Romania. ⁷Department of Forest Resources, University of Minnesota, Minneapolis, MN, USA. ⁸Hawkesbury Institute for the Environment, Western Sydney University, Penrith, New South Wales, Australia. ⁹Smithsonian Environmental Research Center, Edgewater, MD, USA. Andrew D. Barnes and Nico Eisenhauer jointly supervised this work. *e-mail: andrew.barnes@idiv.de

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different trophic levels, resulting in reduced whole-network resilience to perturbations^{9,10,11}, with drought and forest disturbance further exacerbating lowered network resilience. Taken together, we expected that the overall energetic structure of the soil food webs would be affected by the combined global change treatments, resulting in potential decreases in both ecosystem functions^{12,20} and the resilience of whole networks to further perturbations.

To test our hypotheses, we performed two complementary field experiments, each replicated at two sites in northern Minnesota, United States⁶. The first experiment applied a simultaneous aboveand belowground warming treatment (ambient, +1.7 °C, +3.4 °C), both in 40- to 60-year-old forest stands and in recently clear-cut habitats with planted tree seedlings of eleven species (see Methods). We sampled the soil in both habitat types after two years of warming to investigate the effect of warming in combination with forest canopy disturbance. The second experiment crossed the warming treatment in the clear-cut habitats with a summer drought treatment, and was sampled after seven years of warming and four years of summer drought.

Soil food webs were assessed by measuring free-living soil nematodes, microarthropods, microbial biomass carbon (C), and basal respiration. We aggregated nematode and microarthropod taxa into feeding guilds based on the literature, and assembled these as well as microbes into a functional group-level food web^{20,27}. We calculated community metabolism for each trophic group using metabolic rates for soil animals derived from scaling relationships of body mass, soil temperature, and phylogeny¹⁴ along with measured microbial basal respiration. Accounting for taxon-specific assimilation efficiencies from the literature^{20,27,28} and food web structure, we calculated the energy flux necessary to support the energetic demands of each feeding guild¹² (see Methods for details). These energy fluxes describe the resource uptake of each trophic group in the food web and, consequently, represent functions carried out by these groups. For example, the energy flux to herbivores serves as a measure of herbivory, while the energy fluxes to microbes and detritivores should be directly related to total decomposition rates in the soil²⁰. To test this theoretical assumption, we correlated the calculated energy fluxes to microbes and detritivores with data on the measured decomposition of a standardized cellulose-based substrate in the field²⁹ (see Methods). We found a significant positive relationship between the combined energy fluxes to microbes and detritivores and the removal rate of cellulose ($r^2 = 0.16$, P value = 0.009; Supplementary Fig. 8), supporting the claim that the energy fluxes to specific trophic groups describe their respective ecosystem functions.

We summed up energy fluxes within the food web to obtain a community-level measure of energy flux as well as per trophic group (microbes, detritivores, herbivores, predators). We calculated the relative contribution of each of these groups to the total community energy flux and also differentiated microbes from total fauna. To analyse the stability of food webs, we calculated interaction strengths between the feeding guilds based on energy fluxes and constructed Jacobian matrices. Stability was assessed as the resilience of the whole network to a small perturbation by determining the minimum intraspecific interaction strength (that is, the diagonal values of the Jacobian matrix) needed such that all eigenvalues (calculated from the matrix of interaction strengths) have negative real parts³⁰ (see Methods for details).

Warming altered the amount and distribution of energy flux in the soil food web in both experiments, with varying responses to warming among different consumer groups (Fig. 1, Supplementary Figs. 3 and 6). As expected, however, forest canopy disturbance and summer drought were important in determining the strength of warming effects on the energetic structure of soil food webs. In the first experiment, warming reduced energy flux to microbes in both undisturbed and disturbed canopy habitats (Fig. 2a, Table 1), contrary to our first hypothesis. In disturbed canopy habitats, microbial mass-specific respiration even declined in response to warming (Supplementary Fig. 4, Supplementary Table 1). This may be related to warming-induced decreases in soil moisture (Supplementary Fig. 1), which is a known limiting factor for soil microbial communities¹⁶ (Supplementary Fig. 5). Faunal biomass and energy fluxes were generally greater in disturbed than in undisturbed canopy habitats (Figs. 1a and 2a, Table 1, and Supplementary Fig. 4), whereby a marginally significant interaction of warming and canopy disturbance suggests that warming increased faunal fluxes in disturbed canopy habitats (Fig. 2a, Table 1). Similarly, warming increased flux to detritivores, especially in disturbed canopy habitats (Fig. 1a, Table 1), indicating differences between both habitats in their faunal communities and how these respond to warming.

Warming also had contrasting effects on energy flux to predators in both habitat types, with a reduction by 30% in undisturbed canopy habitats and an increase by 110% in disturbed canopy habitats (Fig. 1a, Table 1). Predators may not completely meet their increasing energetic demands under warming, as metabolic rates increase faster with temperature than their feeding rates7,15. In disturbed canopy habitats, the absence of negative warming effects on predators indicates that predators could meet their increasing energetic demands under warming, which was probably facilitated by the considerably higher prey densities in these habitats (Fig. 1, Table 1). These results suggest that warming could have contrasting effects on food web stability among habitat types. In undisturbed canopy habitats, consumer starvation may reduce top-down pressure and thus stabilize population dynamics7. In contrast, the increase in energy fluxes at higher trophic levels compared with lower levels, as found in the disturbed canopy habitats, is predicted to reduce food web stability^{9,11}. Surprisingly, however, our analyses revealed that in both habitat types warming-induced alterations in the energetic structure of soil food webs had no effect on their resilience to perturbations (Fig. 3a, Table 1). This is probably due to simultaneous shifts in the energy fluxes to different trophic groups and opposing trends in consumer densities compared with their metabolic rates. That is, self-damping due to increased metabolic demands in consumers can minimize the destabilizing effects that result from greater energy fluxes to higher trophic levels.

While warming seemed to decrease energy flux through the whole soil food web by 12% in both disturbed and undisturbed forest canopy habitats, this trend was not significant (Fig. 2a, Table 1). In undisturbed canopy sites, warming also did not affect the relative contribution of the four trophic groups to the energy flux of the whole food web (Fig. 2a, Table 1), indicating that in habitats with intact canopies, warming might have relatively modest effects on ecosystem functions driven by the soil food web. In contrast, warming in disturbed-canopy habitats shifted the relative contribution of all trophic groups except herbivores, with a decrease in the contribution of fauna (from 7% to 16%) to the energy flux of the whole food web (Fig. 2a, Table 1).

In the second experiment, summer drought clearly altered the response of microbes to warming. In plots with ambient rainfall, warming had no effect on microbial biomass and energy flux, whereas in plots subjected to drought both measures were severely reduced by warming (Figs. 1b and 2b, Table 2). The emerging negative warming effect on microbial mass-specific respiration in the first experiment was considerably pronounced after seven years of warming, with drought further reducing microbial mass-specific respiration (Supplementary Fig. 7, Supplementary Table 4). Thus, warming probably affected the microbial community indirectly via decreasing soil moisture, which was negatively impacted by warming and drought (Supplementary Fig. 1).

In line with our hypothesis, warming significantly increased faunal-driven energy fluxes, especially to detritivores (Figs. 1b and 2b,

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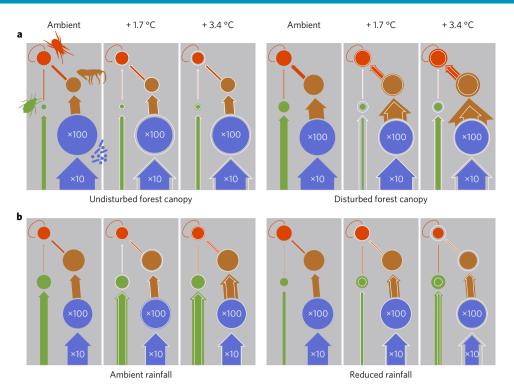
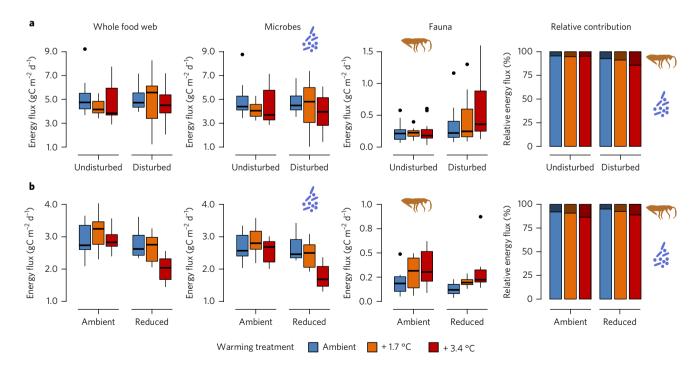
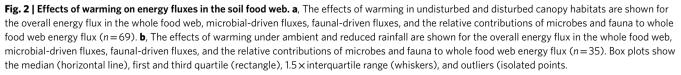


Fig. 1 [Effects of warming on soil food web structure. a, The effects of warming and forest canopy disturbance on energy flux (arrow width) and biomass C (circle area) distribution among microbes (blue), herbivores (green), detritivores (brown), and predators (red) are shown after two years of warming (first experiment, n = 69). Microbial energy flux and biomass are displayed with only 10% and 1% of their actual size. Within treatment combinations, white baselines indicate the circle and arrow sizes in the respective ambient temperature treatment. **b**, The effects of warming and summer drought on energy flux and biomass distribution in the soil food web are shown after seven years of warming and four years of summer drought (second experiment, n = 35).

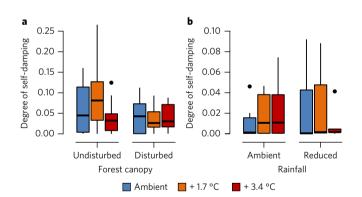




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	Transformation	W	Warming			Canopy			Warming × canopy		
		χ ²	df	P value	χ²	df	P value	χ²	df	P value	
Energy flux (gC m⁻	⁻² d ⁻¹)										
Whole food web	$\log_{10}(x)$	2.757	1	0.097	0.062	1	0.803	0.102	1	0.749	
Microbes	$\log_{10}(x)$	5.020	1	0.025	0.426	1	0.514	0.734	1	0.392	
Fauna	$\log_{10}(x)$	2.138	1	0.144	10.554	1	0.001	3.380	1	0.066	
Detritivores	$\log_{10}(x)$	4.230	1	0.040	12.267	1	<0.001	3.769	1	0.052	
Predators	$\log_{10}(x)$	1.658	1	0.198	5.152	1	0.023	4.995	1	0.025	
Herbivores	$\log_{10}(x + 0.01)$	0.790	1	0.374	1.125	1	0.289	0.219	1	0.640	
Biomass (gC m ⁻²)											
Whole food web	$\log_{10}(x)$	4.564	1	0.033	1.796	1	0.180	0.015	1	0.901	
Microbes	$\log_{10}(x)$	3.372	1	0.066	1.913	1	0.167	0.027	1	0.871	
Fauna	$\log_{10}(x)$	0.360	1	0.548	24.650	1	<0.001	1.441	1	0.230	
Detritivores	$\log_{10}(x)$	2.009	1	0.156	24.515	1	<0.001	0.184	1	0.668	
Predators	$\log_{10}(x)$	0.157	1	0.692	6.689	1	0.010	3.433	1	0.064	
Herbivores	$\log_{10}(x+1)$	3.811	1	0.051	2.023	1	0.160	0.106	1	0.745	
Relative energy flu	ıx (proportion)										
Microbes	logit(x)	6.726	1	0.010	8.817	1	0.003	5.230	1	0.022	
Detritivores	logit(x)	10.249	1	0.001	12.918	1	<0.001	5.665	1	0.017	
Predators	logit(x)	4.582	1	0.032	4.485	1	0.034	6.594	1	0.010	
Herbivores	logit(x + 0.001)	1.615	1	0.204	0.756	1	0.385	0.279	1	0.597	
Resilience to pertu	ırbations										
Whole food web		0.816	1	0.366	3.082	1	0.079	0.369	1	0.544	

The significance of fixed effects was obtained by Wald χ^2 tests. Significant effects (P < 0.05) are reported in bold. For models with significant (P < 0.05) and marginally significant (P < 0.1) interaction terms we performed post-hoc Tukey's HSD tests that are reported in Supplementary Table 2.



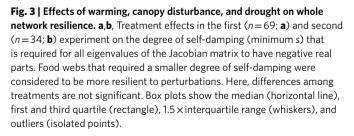


Table 2), indicating increased decomposition is carried out by soil detritivore fauna after seven years of warming. Drought, however, had no effect on either faunal biomasses or faunal energy fluxes (Fig. 1, Table 2). Whole-food-web energy flux was also not affected by warming in plots with ambient rainfall, but was reduced by warming under summer drought (Fig. 2b, Table 2). Warminginduced shifts in the relative contribution of microbes and fauna to whole-food-web energy flux were consistent after seven years of warming and under drought conditions (Fig. 2b, Table 2), confirming results of the first experiment. In disturbed canopy habitats, warming thus increased the energy transfer from microbes to higher trophic levels in both experiments (Fig. 1, Tables 1, 2), suggesting that detritivores became more efficient in consuming microbes at higher temperatures. This is supported by a soil microcosm experiment, which revealed that the feeding rates of fungal feeders increase with warming and thereby reduce fungal biomass²². Thus, it is likely that the elevated feeding rates of detritivores in warmed plots had negative effects on microbial biomass with potentially negative consequences for decomposition processes. As in the first experiment, the energetic restructuring of the soil food webs seemed to have surprisingly little influence on whole-network resilience to perturbations, even under combined warming and drought treatments (Fig. 3b, Table 2).

Our results reveal that energy flux at the whole-network level was only slightly affected by warming, yet the varying effects on different trophic groups clearly modified the interplay of different ecosystem functions, such as herbivory, decomposition, and predation. These soil functions are crucial for the growth and regeneration of forests and the carbon dynamics of these ecosystems. While our results suggest that the structure and functioning of soil food webs in intact boreal-temperate ecotonal forests may be relatively well buffered against climate warming, canopy disturbance is likely to increase the susceptibility of these food webs to warming, which may be even further amplified under drought conditions. Surprisingly, the food webs in warmed soils exhibited a similar resilience to those of colder soils, even when subjected to forest disturbance and drought. Despite the restructuring of these food webs in response to multiple global change drivers, we suspect that compensatory dynamics of different

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Table 2 | Results of linear mixed effects models for the warming × drought experiment

	Transformation	Warming			Drought			Warming imes drought		
		χ ²	df	P value	χ²	df	P value	χ²	df	P value
Energy flux (gC m⁻	² d ⁻¹)									
Whole food web	$\log_{10}(x)$	5.622	1	0.018	15.438	1	<0.001	7.892	1	0.005
Microbes	$\log_{10}(x)$	12.400	1	<0.001	11.927	1	0.001	8.455	1	0.004
Fauna	$\log_{10}(x)$	9.054	1	0.003	1.016	1	0.313	0.593	1	0.441
Detritivores	$\log_{10}(x)$	8.935	1	0.003	0.111	1	0.739	0.055	1	0.814
Predators	$\log_{10}(x)$	1.249	1	0.264	1.208	1	0.272	0.038	1	0.846
Herbivores	$\log_{10}(x)$	2.814	1	0.093	0.162	1	0.688	1.355	1	0.244
Biomass (gC m ⁻²)										
Whole food web	$\log_{10}(x)$	0.811	1	0.368	0.164	1	0.686	6.048	1	0.014
Microbes	$\log_{10}(x)$	0.872	1	0.351	0.164	1	0.685	6.088	1	0.014
Fauna	$\log_{10}(x)$	1.421	1	0.233	0.191	1	0.662	0.200	1	0.654
Detritivores	$\log_{10}(x)$	0.001	1	0.979	1.039	1	0.308	0.583	1	0.445
Predators	$\log_{10}(x)$	0.059	1	0.808	0.000	1	0.984	0.032	1	0.857
Herbivores	$\log_{10}(x)$	0.762	1	0.383	0.054	1	0.817	6.177	1	0.013
Relative energy flu	x (proportion)									
Microbes	logit(x)	11.359	1	0.001	0.277	1	0.599	1.104	1	0.293
Detritivores	logit(x)	15.457	1	<0.001	0.676	1	0.411	1.147	1	0.284
Predators	logit(x)	1.074	1	0.300	1.025	1	0.311	0.013	1	0.910
Herbivores	logit(x)	2.545	1	0.111	0.095	1	0.758	1.297	1	0.255
Resilience to pertu	rbations									
Whole food web		0.098	1	0.754	0.685	1	0.408	1.299	1	0.254

Significance of fixed effects was obtained by Wald χ^2 tests. Significant effects (P < 0.05) are reported in bold. For models with significant (P < 0.05) and marginally significant (P < 0.1) interaction terms we performed post-hoc Tuckey's HSD tests that are reported in Supplementary Table 6.

functional groups may have dampened the effects of global change on food web resilience at the whole-network level. Our results raise new questions about whether the observed shifts in energy fluxes towards higher trophic levels might affect the temporal stability of specific functional groups. In this vein, future investigation of the temporal stability of specific consumer nodes in food webs that are subjected to similar global change scenarios are needed to shed further light on the resilience of ecological networks and their ecosystem functions in boreal forest soil food webs.

Methods

Methods, including statements of data availability and any associated accession codes and references, are available at https://doi.org/10.1038/s41558-017-0002-z.

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Author contributions

B.S., A.D.B., M.P.T and N.E. designed the study. P.B.R. designed and co-ordinated the B4WarmED experiment. R.L.R. and A.S. designed and implemented the warming and rainfall manipulation system. B.S., M.C., A.S. and N.E. carried out the field and laboratory work. B.S. analysed the data with inputs from A.D.B, M.P.T. and N.E. B.S., A.D.B., M.P.T. and N.E. jointly wrote the first draft, and all other authors contributed substantially to the manuscript.

Competing interests

The authors declare no competing financial interests.

Additional information

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Methods

Field site and experimental design. The Boreal Forest Warming at an Ecotone in Danger (B4WarmED) experiment is located at the ecotone between boreal and temperate forests in northern Minnesota, United States, at two field sites: the Cloquet Forestry Center, Cloquet (46° 40′ 46″ N, 92° 31′ 12″ W, 382 m above sea level, 4.5 °C mean annual air temperature (MAT), 807 mm mean annual precipitation) and ~150 km further north, the Hubachek Wilderness Research Center, Ely (47° 56′ 46″ N, 91°45′ 29″ W, 415 m above sea level, 3.0 °C MAT, 722 mm mean annual precipitation)⁶. The soil at Cloquet is a Typic Dystrudept and at Ely it is a Lithic Udorthent¹¹, whereas the soil texture at both sites is classified as sandy loam.

Since 2009, a three-level warming treatment (ambient, ± 1.7 °C, ± 3.4 °C) was applied in 40–60- year-old mixed aspen–birch–fir forest habitats with intactcanopy (~5–10% of full sunlight) and in disturbed-canopy (recently clear-cut, ~80% of full sunlight) habitats at both sites. The initial experimental design was a 2 (site) × 2 (canopy disturbance) × 3 (warming treatment) factorial, with six replicates (two per block), resulting in a total of 72 circular plots with a diameter of 3 m. In 2012, rain shelters were added to half of the plots in disturbed-canopy habitats to simulate summer drought (~40% less rainfall in June–September), resulting in a 2 (site) × 2 (drought treatment) × 3 (warming treatment) factorial design with 3 replicates (1 per block).

Within each plot, 121 seedlings of eleven tree species (*Abies balsamea*, *Acer rubrum*, *A. saccharum*, *Betula papyrifera*, *Picea glauca*, *Pinus banksiana*, *Pinus strobus*, *Populus tremuloides*, *Quercus macrocarpa*, *Quercus rubra*, and *Rhamnus cathartica*) were planted into the occurring understory plant vegetation in 2008. In 2012, all disturbed-canopy plots were harvested and re-planted according to the original planting scheme. Above- and belowground warming was accomplished for on average 8 months per year through the use of 6–8 ceramic heating elements (Mor-Electric, model FTE-1000) and heating cables (Danfoss GX, Devi A/B) buried at 10 cm depth⁶. Simulated drought was accomplished by manually stretching rain shelters over the plots in advance of rain events, which effectively reduced rainfall by about 40% each year. Air temperature and soil temperature at 10 cm depth, as well as soil volumetric water content, were constantly logged⁶.

Soil sampling. Soil for extracting nematodes and analysing soil microbial biomass C and basal respiration was sampled by taking three soil cores (2 cm in diameter, 7 cm deep) per plot in August 2010 and four soil cores (2 cm in diameter, 7 cm deep) per plot in August 2015. The soil was pooled at the plot level, homogenized, and stored in plastic bags at 4 °C until further processing. The soil was sieved through a 2 mm mesh and subdivided for measurements of microbial biomass C and basal respiration and extraction of nematodes. The subsample for microbial measurements was frozen until further processing and the subsample for nematode extraction was immediately processed. For soil mesofauna extraction, one soil core was taken from each experimental plot (7 cm in diameter, 7 cm deep in August 2010; 4.8 cm in diameter, 7 cm deep in August 2015).

Soil bulk density was measured separately for 0–5 cm depth and for 5–10 cm depth at three locations in each block in 2008 (outside of treatment plots). Three cores (5 cm in diameter) per location were sampled and the dry mass of each was determined. The volume of the soil removed was determined by filling a flexible plastic bag placed in the soil hole with a known volume of water. From this, we calculated a mean bulk density of the upper 7 cm of soil for each block.

Microbial measurements. Soil microbial basal respiration and biomass C were determined by using an O2-microcompensation apparatus32. The microbial respiratory response was measured at hourly intervals for 24 h. Basal respiration (μ l O₂h⁻¹g⁻¹(dry weight; d.w.)) was determined without the addition of substrate and was measured as mean of the O2 consumption rates of hours 14-24 after the start of the measurements. Substrate-induced respiration was determined from the respiratory response to D-glucose³³, whereas the mean of the lowest three readings within the first 10h was taken as maximum initial respiratory response (MIRR; $\mu l ~O_2 h^{-1} g^{-1}$ soil d.w.). From this, microbial biomass ($\mu g ~C ~g^{-1}$ soil d.w.) was calculated as 38×MIRR (ref. 34). Oxygen consumption rates with and without addition of substrate were measured at a standard lab temperature of 20 °C in 2010. In 2015, we measured substrate-induced respiration at 20 °C and basal respiration at the mean temperature of the respective warming treatment in the sampling month (17.2 °C, 18.9°C, and 20.6°C, respectively). To standardize units between microbial and soil animal data, we used soil bulk density data to express soil microbial respiration and biomass as values per m², allowing for direct comparisons between these groups.

Soil nematodes. Soil nematodes were extracted from approximately 10g of fresh soil in 2010 and 25g of fresh soil in 2015 using a modified Baermann method³⁵. Nematodes were preserved in 4% formaldehyde, and individuals were counted and identified to family (juveniles) or genus (adults and most of the juveniles) level wherever possible. In 2010, ca. 46% of nematode identifications could only be done to the subclass level. At least 100 individuals (if available in the sample) were randomly identified following the method used in a previous study³⁶. Nematode taxa were then assigned to trophic groups as bacterial feeding, fungal feeding, plant feeding, predators, and omnivores^{37,38}. We assessed taxon-specific data on nematode fresh body mass from the Nemaplex database (http://plpnemweb. ucdavis.edu/nemaplex/Ecology/nematode_weights.htm, Supplementary Table 6).

Mean fresh body masses for subclasses were calculated as the mean of the fresh body masses of families within their respective subclasses that were also present in samples collected in 2015. Nematode numbers were related to grams of soil (d.w.) and subsequently transformed to densities per m^2 by using soil bulk density data. We converted mean nematode fresh masses into mean C dry masses assuming a dry matter content of $25\%^{39}$ and a C content of 50% of the dry matter⁴⁰. On the basis of the densities per m^2 and mean C dry masses, we estimated the biomass of the five nematode feeding guilds per m^2 .

Soil mesofauna. The soil mesofauna was extracted from intact soil cores by gradually heating the soil cores for seven days from 25 °C up to 50 °C (ref. ⁴¹). Extracted animals were preserved in ethanol (70%), counted (abundance per m²), and assigned to a taxonomic group, as done in previous works^{42,43}. Animals were identified mainly to the level of orders and families (see Supplementary Table 7 for list of identified taxa).

Sampling and extraction methods were targeted to assess soil mesofauna⁴⁴. We therefore excluded taxa from analyses for which sampling and extraction methods were inadequate or were not tightly connected to the soil food web (such as Annelida, Chilopoda, Coleoptera, Diplopoda, adult Diptera, Gastropoda, Hymenoptera, and Isopoda). Body lengths of mesofauna were determined to the nearest 0.01 mm using an ocular micrometer mounted in a dissecting microscope. We measured the body lengths of all individuals sampled in 2015 (Supplementary Table 7b). However, it was not possible to directly assess the body lengths of soil mesofauna sampled in 2010. Thus, we assessed a mean body length per taxon (Supplementary Table 7a) based on animals that were collected in 2012 and 2015 from the same experiment.

We used length-mass regressions from the literature (Supplementary Table 8) to convert body lengths into body masses. We calculated the biomass per taxonomic group and the biomass of the total community at the plot level by multiplying mean body masses by densities (2010) and by summing together individual body masses (2015). We expressed biomasses as dry masses of C per m². For most taxonomic groups, we assessed dry masses using length-mass regressions. The dry masses of Acari were assumed to be 43.1% of the fresh mass⁴⁵. Collembola fresh masses were converted into dry masses using an equation given in a previous study⁴⁶. The C content of the dry masses of Acari and Collembola was set to be 48%⁴⁷, and for other groups we assumed a dry mass C content of 50%⁴⁸.

Construction of the food web. Using published feeding relationships in the soil food web^{30,27,40}, micro- and mesofauna groups were lumped into nine feeding guilds: herbivorous nematodes, bacterivorous nematodes, fungivorous nematodes, predatory metades, herbivorous mesofauna, detrivorous mesofauna, Oribatida, predatory mites, and predatory mesofauna, from which the food web was constructed (Supplementary Fig. 2).

Nematode taxa were classified as either herbivorous, bacterivorous, fungivorous, or predatory^{37,88}. Predatory nematodes were assumed to feed on all other nematode groups^{37,40}. Taxa typically designated as omnivorous nematodes, which mainly feed on bacteria, fungi, and microfauna^{37,49,50}, were proportionately assigned to bacterivorous, fungivorous, and predatory nematodes according to the assumption that their diet consists of 25% bacteria, 25% fungi, and 50% other nematodes.

Aphidina, Ciccadina, Coccina, Heteroptera nymphs, and Thysanoptera were classified as herbivorous mesofauna. Detritivorous mesofauna comprised microbivorous mites, all Collembola, which generally are treated as microbial (fungal) feeders^{40,49}, as well as Diptera larvae, Pauropoda, and Protura⁵¹. Adult Oribatida, although being mainly microbial feeders, were treated as a separate feeding guild, as they are relatively resistant to predation due to their strong sclerotization^{40,52}. It was assumed that only 25% of adult Oribatida are subjected to predation. All mesostigmatid mites (mainly Gamasina), as well as Bdellidae, Cunaxidae, Rhagidiidae, and 50% of other Eupodoidea were assumed to be predators feeding on all nematode groups, microbivorous mesofauna, and Oribatida⁵³⁻⁵⁵. Astigmatic and prostigmatic mites not designated as predators were assumed to be microbivorous^{40,54}. For the first experiment (2010), astigmatic and prostigmatic mites were not further identified. As particular prostigmatic mites contain many predators, it was assumed that these groups consist of 75% microbivores and 25% predators54. Araneae, Pseudoscorpionida, and Diplura were assumed to prey on herbivorous mesofauna, detrivorous mesofauna, Oribatida, and predatory mites⁵⁶ and were thus classified as predatory mesofauna. Symphyla are omnivorous, feeding on a variety of resources⁵¹, but mainly on animal prey⁵ Assuming that their diet consists of 20% plant material, 20% microbes, and 60% animal prey, they were proportionately assigned to herbivorous mesofauna, detritivorous mesofauna, and predatory mesofauna, respectively.

Calculation of metabolic rates. We calculated mean metabolic rates for each identified animal taxon in 2010, while we calculated mean metabolic rates for each identified nematode taxon and individual metabolic rates for all arthropod individuals sampled in 2015. The calculations were based on fresh body masses, temperature, and, if possible, phylogeny¹⁴ using the formula

$$\ln I = \ln i_o + a \times \ln M - \frac{E}{kT}$$

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where *I* is the metabolic rate, *a* is the allometric exponent, *M* is the fresh body mass, *E* is the activation energy, $k_{\rm B}$ is the Boltzmann constant, *T* is the temperature, and i_0 is a normalization factor^{12,14}. For i_0 , *a*, and *E*, taxon-specific values were used, if available; otherwise, general parameters^{12,14} were used (Supplementary Table 10). This yielded metabolic rates expressed in Jh⁻¹. Using the conversion factor 1 ml $O_2 = 20.1$ J (ref. ⁵⁷), we converted microbial basal respiration from μ l O_2 h⁻¹ to Jh⁻¹. Subsequently, all metabolic rates were expressed as W m⁻².

Calculation of energy fluxes. For energy flux calculations we assumed a steady state, which means that the energy flux to a feeding guild in the food web exactly balances the energy losses of that feeding guild due to metabolism and predation. We calculated the energy flux to each feeding guild in the food web as

$$F = \frac{1}{\rho} \times (X + L),$$

where *F* is the total flux of energy into the feeding guild, *e* is the specific assimilation efficiency^{20,27,28}, *X* is the summed metabolic rates of all individuals within the feeding guild, and *L* is the energy loss to predation¹². To account for potential variations in microbial assimilation efficiency, we used microbial mass-specific respiration as an estimate of the inverse microbial efficiency⁵⁸ and rescaled the values to vary between 0.35 and 0.45. The difference of these values from one was taken as microbial assimilation efficiency, which accordingly varied in the range from 0.55 to 0.65, as was suggested in the literature²⁸.

We started by calculating the energy flux to the top predators in the food web, for which energy loss to predation was assumed to be zero. We proceeded downwards to the guilds with the lowest trophic position, where the loss to predation of these lower feeding guilds was synonymous with energy fluxes to their consumer feeding guilds. We assumed that polyphagous feeding guilds consumed their resources according to the relative numerical abundance of the resources. Predatory mites feed on microarthropods and nematodes, which differ substantially in their densities. We thus applied density-dependent feeding only within these groups and assumed that predatory mites consume these groups based on their relative biomass and a 2:1 preference of microarthropods over nematodes27. Symphyla were assumed to feed on all trophic levels. We assumed that they constantly derive 20% of their energy from plant material, 20% from microbes, and 60% from animal prey. We assumed that Symphyla consume mesofauna and nematodes depending on the relative biomass of these groups and that within these groups they consume prey guilds on the basis of their density. For energy flux calculations, Symphyla were treated as an independent feeding guild. For further analyses, however, energy flux to Symphyla were lumped with fluxes to detritivorous, herbivorous, and predatory mesofauna according to the abovementioned composition of their diet. Adult Oribatida are relatively resistant to predation and, thus, only 25% of their density was used to weight the energy flux to predator guilds. We assumed all detritivorous and microbivorous feeding guilds to derive their energy from the microbial biomass pool.

Energy fluxes were summed up per trophic level (microbes, detritivores, predators, herbivores), and we differentiated microbes from total fauna. Finally, total energy flux was calculated by summing up all fluxes within the food web. In addition, the relative contributions of the different trophic levels, and of microbes and total fauna to total energy flux were calculated. Energy fluxes were expressed as $gCm^{-2}d^{-1}$ using a published conversion factor⁵⁹ of 1 gC = 46 kJ.

Bait-lamina tests. During the second experiment in 2015, bait-lamina tests^{29,60,61} were conducted in all plots in disturbed canopy habitats to regularly (approximately every two weeks) assess the decomposition of a standardized cellulose-based substrate under field conditions. We used bait-lamina strips—16 cm long PVC strips with 16 holes of 2 mm in diameter—and filled their holes with a substrate consisting of 65% cellulose (micro granular), 15% agar (pulverized), 10% loess, and 10% wheat bran (finely ground and sieved). In each plot, six strips were vertically inserted into the soil (to a depth of ~10 cm; at a distance of >2 cm), and after two weeks, decomposer activity was assessed by counting the number of holes where the substrate was completely removed or perforated. Empty holes were scored as 1, whereas holes containing perforated substrate were scored as 0.5. The summed scores per strip were averaged on the plot-level for further analyses. To relate these data to energy fluxes based on soil food web data recorded in August 2015, we used the mean of two bait-lamina

Assessment of network resilience. On the basis of the energy fluxes among feeding guilds, we calculated the interaction strengths and constructed Jacobian matrices to analyse food web stability. The strength of the effect of resource *i* on consumer *j* was taken as $a_{ij} = e_{jM_i}^{E_{ij}}$, where e_j is the assimilation efficiency of consumer *j*, F_{ij} is the energy flux from resource *i* to consumer *j*, and M_i is the biomass of resource *i*. The strength of the effect of consumer *j* was taken as $a_{ij} = -\frac{E_{ij}}{M_j}$, where M_j is the biomass of consumer *j*. Diagonal elements of the Jacobian matrix corresponded to the strength of the effect of population *i* on population *i* (intraguild interaction strength) and was taken as $a_{ii} = -\frac{S_{ij}}{M_i}$.

where X_i is the metabolism of feeding guild *i*, M_i is the biomass of feeding guild *i*, and *s* is a free parameter (but identical for all feeding guilds *i*) between 0 and 1. Increasing *s* generally decreases the real parts of the eigenvalues of the Jacobian matrix, whereas the matrix is considered stable when all eigenvalues have negative real parts. The stability of a food web was assessed by determining the minimum intraspecific interaction strength (the minimum *s*) required for all eigenvalues of the Jacobian matrix to have negative real parts, whereby food webs that required less intraspecific interaction strength (smaller *s*) to achieve negative real parts were considered more stable^{30,62}.

Statistical analyses. Across both experiments (in 2010 and 2015), we tested the effects of treatment on a range of response variables: energy flux, biomass, and metabolism for the whole food web, the microbes, and the total fauna, as well as separately for the three faunal trophic groups (detritivores, predators, herbivores); mass-specific metabolism of microbes, detritivores, predators, and herbivores; the relative contributions of these groups to whole food web energy flux; and the degree of self-damping as a measure of inverse network resilience. To test for treatment effects on all response variables, linear mixed effects models with Gaussian error and the restricted estimates maximum likelihood method (REML) were fitted with block nested in site as random factors, using the "nlme" package in R 3.1.3 (http:// www.R-project.org). For the first experiment, warming (numeric variable), canopy disturbance (categorical variable), and their interaction were analysed as fixed effects. In the same way, warming (numeric variable), summer drought (categorical variable), and their interaction were used as fixed effects in the second experiment. We obtained chi-square values using Type II Wald chi-square tests63 implemented in the car package in R 3.1.3. To meet the assumptions of normality and ensure homogeneity of variance, the logit-transformation implemented in the car package was used for response variables from proportion data, while all other response variables except the degree of self-damping were log10-transformed. To transform variables containing zeros, the constant 10^{-k} was added to the respective variables, where k was a positive integer that was chosen separately for each variable to best meet model assumptions. All response variables were standardized as established in a previous study64 using the arm package, to be able to compare the effects of predictor variables on different response variables. We also standardized numeric predictor variables to reduce multicollinearity. To interpret models with significant interaction terms, post-hoc Tukey's HSD tests were performed using the multcomp package65 in R 3.1.3.

In the first experiment, additional mixed effects models were fitted with soil moisture as a co-variable of the treatment variables to test whether microbial measures were affected by water availability. As effects of soil moisture may vary depending on different treatments, initial models also included all possible interactions between soil moisture and the treatment variables as fixed effects. Subsequently, best-fit models were selected on the basis of the AIC in a stepwise backward selection procedure eliminating interaction terms but not main effects. For the model selection procedure, models were fitted using maximum likelihood estimation. The best-fit model was tested using REML method⁶⁶.

To test the theoretical assumption that energy fluxes describe ecosystem functions, we correlated the calculated energy fluxes to microbes and detritivores with the mean decomposition of a standardized cellulose-based substrate in August 2015. We used ranged major axis regression as implemented in the *lmodel2* package in R 3.1.3.

Data availability. The data supporting the findings of this study are available within the article and Supplementary Information (see Supplementary Data 1–4).

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