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Temperature Modifies Consumer-Resource Interaction Strength Through Its Effects on Biological Rates and Body Mass

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Temperature is the most significant environmental gradient at the global scale, impacting the distributions of species and their ecological interactions. It is now established that temperature affects several biological rates and body mass, and can, in turn, alter interaction strength. Latitudinal variation in the strength of interactions has been observed for trophic and competitive interactions and many studies support that biotic interactions are more intense at low latitudes. Nevertheless, the mechanisms underlying the temperature dependence of trophic regulation, the effect of consumers on their preys, remain unclear. The aim of our study is to get better insights on the effects of temperature on trophic regulation. We used a consumer-resource model and considered that organisms’ biological rates present a unimodal thermal response and that body mass decreases with temperature. We compared three measures of interaction strength: per capita, per population and net interaction strength. Our results demonstrate that the effect of temperature on interaction strength is contingent upon which species’ biological rates are temperature dependent. When all biological rates are temperature dependent, the thermal response of interaction strength is hump-shaped following the scaling of search rate, whilst it is monotonically decreasing when only mortality rates vary with temperature. Finally, we show that temperature can indirectly impact trophic interaction strength through the temperature-size rule. A decrease in organisms’ body size due to temperature induces a decrease in per capita and per population interaction strength and tend to decrease net interaction strength, depending on which trophic level follows the temperature-size rule. Our analysis gives an overview of how temperature, through various effects, may impact different measures of interaction strength.

Keywords: consumer-resource, interaction strength, temperature, metabolic theory, body mass, temperature-size rule

1. INTRODUCTION

Temperature can strongly affect food-web structure and interaction strength (Beveridge et al., 2010; Rodríguez-Castañeda, 2013). Understanding its impact on trophic regulation is vital for predicting the consequences of climate change on communities and ecosystems stability. The strength of consumer-resource interactions is expected to vary along large-scale...
Temperature affects individuals’ life-history (reproduction, development and survival) and foraging traits (search rates and handling times) (Savage et al., 2004; Englund et al., 2011). It has long been established that, in addition to body mass, temperature affects biochemical reaction rates, metabolic rates, and nearly all other biological activities (Gillooly et al., 2001; Brown et al., 2004; Savage et al., 2004). However, the temperature dependence of some biological rates may vary from one species to another. For instance, the temperature dependence of search rates varies according to foraging strategies. For sit-and-wait predators, it may not be dependent upon temperature (Sentis et al., 2017b), while it can be temperature dependent for predators that actively search for prey. Temperature changes can also induce reductions in body mass for many organisms, including diatoms (Montagnes and Franklin, 2001), phyto- and zooplankton, and fishes (Daufresne et al., 2009; Gardner et al., 2011). Within the range of physiologically tolerable temperatures for ectothermic organisms, individual body mass is expected to decrease with warming according to the temperature-size rule (TSR) (Atkinson, 1994). This phenotypically plastic response can be explained by the fact that adult size is a combination of individual growth rate (increase in weight per time) and development rate (increase in life stage per time). Because development rates are more sensitive to temperature (i.e., increase faster with warming) than are growth rates (Forster et al., 2011; Gardner et al., 2011; Zuo et al., 2012), individuals reared at warmer temperatures typically reach a maturity at a smaller size than those reared at colder temperatures (Atkinson, 1994; Zuo et al., 2012). Reduced body mass has been considered as the third universal ecological response to global warming (Daufresne et al., 2009). Body mass is a key aspect of community structure as it strongly determines life history rates and the strength of interaction between species (Pawar et al., 2016). As body mass affects biological rates and foraging traits, temperature can, through the TSR, indirectly impact consumer-resource dynamics (Osmond et al., 2017; Sentis et al., 2017a). Integrating these different effects of temperature into a general framework is thus essential to predict its effect on interaction strength (Osmond et al., 2017; Sentis et al., 2017a).

Even though many theoretical studies analyze the effect of temperature on the dynamics of food chains, most of them focus on how temperature impacts stability (oscillations and predator persistence) (Vasseur and McCann, 2005; Gilbert et al., 2014; Amarasekare, 2015) via its effect on biological rates only. These studies neglect indirect effects of temperature on food webs via the TSR and do not explicitly consider interaction strength. Sentis et al. (2017a) and Osmond et al. (2017), in contrast, study the effect of warming on interaction strength through its effects on biological rates and body mass. However, they consider conditions under which organisms remain below their optimal and only one interaction strength measure [the dynamic index (Berlow et al., 1999) or net interaction strength, called \( B_{CR} \) in Osmond et al. (2017)]. Yet it is known that some tropical ectotherm species already experience stressful body temperatures impacting their physical performance (Huys et al., 2009). Understanding the dynamics of species interaction under a sufficiently consequent temperature range is essential to tackle the effects of climate change on communities. To bridge these gaps we consider temperatures above optima but also different interaction strength measures.

Although the concept of interaction strength seems intuitive, many definitions have been used (Laska and Wootton, 1998; Berlow et al., 2004). Generally speaking, interaction strength is a measure of the magnitude of the effect of a species on the growth rate of another (Laska and Wootton, 1998). However, theoreticians and empiricists measure interaction strength in different ways (Laska and Wootton, 1998); and, even within theoretical and empirical studies, there are discrepancies in the way it is quantified. Berlow et al. (2004) enumerated a set of interaction strength measures that include for instance elements of the community matrix, biomass flux, maximum consumption rate or perturbation effects on population abundance. Field experiments have shown that the removal of species from ecosystems can highly impact species communities (Paine, 1980, 1992). Various indices of net interaction strength have thus been derived from removal experiments and describe how a focal species impacts the abundance of other species in the community. These experiments are however limited because their results can vary with experimental duration, with the density of the focal species and with the species composition of the community (Wootton and Emmerson, 2005). Several indices have also been used for the analysis of theoretical models. Many studies use...
per capita effect of a species on the growth rate of another one because it is defined without reference to the equilibrium state, explicit in many models and because many other measures can be derived from it (Laska and Wootton, 1998; Wootton and Emmerson, 2005; Novak and Wootton, 2010). Commonly used interaction strength indices relate to various food web properties and dynamics therefore may lead to misleading conclusions (Berlow et al., 2004). For instance, a strong interaction strength measured from the community matrix does not always coincide with a strong effect of species removal (Berlow et al., 2004). There is then a need to clarify the haziness around how temperature impacts different interaction strength measures, to help bridge the gap between theory and experiments.

Hence, while most studies focus on one interaction strength measure at a time, we investigate here, how temperature affects three aspects of interaction strength. We aim at decomposing the different mechanisms that may influence the effect of temperature on trophic regulation in a linear food chain. We develop a nutrient explicit tri-trophic model of consumers and resources to tackle the joint effects of temperature on interaction strength and compared three different commonly used theoretical and experimental measures of interaction strength: per capita, per population and net (i.e., log response ratio) interaction strength. We derive predictions of how the temperature dependence of species’ biological rates impacts the relationship between temperature and these measures of interaction strength. Finally, we examine how temperature indirectly affects interaction strength through decreasing organisms’ body mass.

2. MODELING FRAMEWORK

2.1. Consumer-Resource Model

The model is nutrient explicit and describes the dynamics of a three level linear food chain (see Figure 1). The nutrient (N) is assimilated by an autotrophic primary producer (P), itself eaten by a herbivore (H) which is consumed by a carnivorous top-predator (C). The dynamics are given by:

\[
\frac{dN}{dt} = I - dN - \mu NP \\
\frac{dP}{dt} = q\mu NP - a_{PH}PH - (z_P + b_P)P \\
\frac{dH}{dt} = e_{PH}a_{PH}PH - a_{HC}HC - (z_H + b_H)H \\
\frac{dC}{dt} = e_{HC}a_{HC}HC - (z_C + b_C)C
\]

where \( N \) is the nutrient concentration and \( P, H \) and \( C \) the total biomasses of primary producer, herbivore and carnivore, respectively. Temperature and body mass dependencies of parameters are omitted for clarity of the representation. Nutrients are continuously added and leached out of the system at rates \( I \) and \( d \), respectively. \( \mu \) is the primary producer growth rate and \( q \) the carbon-to-nitrogen ratio. Some biomass is lost due to respiration and mortality at rates \( z_i \) and \( b_i \), respectively.

for the different compartments \( i \). \( a_{ij} \) is the mass-specific search rate and \( e_{ij} \) is the conversion efficiency of resource \( i \) to consumer \( j \) biomass. We consider a Type-I functional response as a first approximation in order to track equilibrium densities. \( b_i \) is a constant mortality rate to account for various processes that do not depend upon temperature, such as dilution, sedimentation or natural disturbances. Similarly, \( e_{ij} \) does not vary with body mass and temperature (O’Connor et al., 2011; Dell et al., 2014; Pawar, 2015). Conversely, biomass production rate \( \mu \), biomass loss rate \( z_i \) and search rate \( a_{ij} \) may all vary with body mass and temperature.

2.2. Body Mass and Thermal Dependence of Biological Rates

Following the “Metabolic Theory of Ecology,” we used the Boltzmann-Arrhenius model from chemical reaction kinetics to
describe the rise of several biological rates with temperature (Gillooly et al., 2001; Brown et al., 2004; Savage et al., 2004). Many biological rates also decline at high temperatures, often due to changes in enzyme kinetics (Johnson and Lewin, 1946), and therefore we also consider the Johnson-Lewin function. Hence, according to the Boltzmann-Arrhenius-Johnson-Lewin model (BAJL model here after), the scaling of a metabolic (or a biological) rate, \( r_i \), with average adult body mass \( m_i \) and body temperature \( T \), in Kelvin, is given by:

\[
r_i(T, m_i) = r_0 m_i^\beta e^{-\frac{E}{kT} l(T)}
\]

where \( r_0 \) is a rate-dependent constant and \( \beta \) the allometric scaling exponent. \( E \) is the activation energy in eV (electronvolts) of the rising response and \( E_D \) the average energy constant at which proteins denature, therefore controlling the rate of decline beyond \( T_{opt} \), the temperature at which rate \( r \) is maximal. Finally, \( k \) is the Boltzmann constant (8.617 \times 10^{-5} \text{eV.K}^{-1}) . The thermal response of biological rates according to Equation 2 is illustrated in Figure 2. We take the average values of activation energy \( E \) from Dell et al. (2011) for a given trophic level and a given biological rate. As few data are available for the deactivation energy \( E_D \), we consider the average value across all trophic levels and biological rates (Dell et al., 2011). The growth rate \( \mu \) and the search rate \( a_{ij} \) vary with temperature and body mass according to Equation 2. However, the biomass loss rate \( z_i \) follows an exponential increase with temperature, as described by the first part of Equation 2 when \( l(T) = 1 \). Biological rates and body temperature are assumed to be uniform within species. Parameters are summarized in Table 1.

### 2.3. Temperature-Size Rule

We use the estimates of temperature-size response slopes from Forster and Hirst (2012) (see also Sentis et al., 2017a) to simulate the temperature dependence of body mass according to the following equation:

\[
m_i = cm_{i293} e^{(T-293.15)}
\]

where \( c \) is the conversion of dry mass into wet mass, \( m_{i293} \) is the dry mass of species \( i \) at 293.15 K and \( T \) is temperature. \( s \) quantifies the sign and magnitude of the TS response and is determined by the percentage change in body mass per degree (originally in Celsius in Forster and Hirst (2012), we converted from Kelvin): \( PCM = (e^s - 1) \times 100 \). TS response slopes vary between ecosystem types but we consider only the mean TS response for aquatic organisms (the average response for freshwater and marine metazoa), which is negative. The reference body masses are measured at 293.15 K, in our case body masses therefore decrease for temperatures above 293.15 K (Forster and Hirst, 2012):

\[
PCM = -3.90 - 0.53\log_{10}(m_{i293})
\]

From this TS response slope, we investigate three possible scenarios where either (1) only the carnivores, (2) herbivores and carnivores and (3) all species follow a TS response, in addition to the case with no TSR at all. We chose these scenarios because, according to Forster and Hirst (2012), in aquatic environments, increases in species’ sizes cause the temperature-size response to become increasingly negative.

### 2.4. Measuring Interaction Strength

The strength of ecological interactions can be assessed through several ways. We consider here three different interaction strength (IS hereafter) measures (Berlow et al., 2004). Per capita IS, \( IS_{pC} \), measures the direct and instantaneous effect of a consumer individual \( j \) on the growth rate of a resource individual \( i \); it equals search rate, \( a_{ij} \), in our model (Figure 2, Equation 2). This measure is commonly used in theoretical studies because it is defined without reference to the equilibrium state (Laska and Wootton, 1998; Wootton and Emmerson, 2005; Novak and Wootton, 2010), contrary to other measures, which typically include equilibrium densities. The second IS measure we consider is per population IS, \( IS_{pp} \), which is the direct long term effect of the population of consumer \( j \) on the growth rate of the resource \( i \) at equilibrium and is equal to \( IS_{pp}J^* = a_{ij}J^* \),
where $I^*$ is the equilibrium density of consumer $j$. This index also corresponds to the coefficient of the Jacobian matrix, that describes the dynamics of species at equilibrium, in our model. It has been commonly used in ecology to quantify interaction strength (May, 1974) and is reviewed in Montoya et al. (2009). Finally, net IS, $IS_{net}$, is the net long term effect of the population of consumers $j$ on the equilibrium density of the resource $i$ and is equal to the (log) ratio of resource equilibrium densities, $I^*_i$, in absence $I^*_j$ and in presence $I_{j}^*$ of the consumer, $\log(I^*_i/I_{j}^*)$. This definition of IS is typically used in experimental removal studies (Paine, 1980; Laska and Wootton, 1998; Berlow et al., 2004).

We assess interactions between the three trophic levels. We thus consider the direct effect of herbivores on primary producers in absence of carnivores, $IS^{H-P}$; the direct effect of carnivores on herbivores, $IS^{C-H}$; and, for $IS_{net}$, the indirect effect of carnivores on primary producers, $IS^{C-P}$, as carnivores can indirectly impact primary producers by reducing herbivore density when feeding on them. In the following analyses, we focus on $IS_{pp}$ and $IS_{net}$ which are analytically derived as they are dependent upon equilibrium biomasses. We compare their thermal responses with the one of $IS_{pc}$ which is given by Equation 2. Equilibrium densities, $I^*$ for species $i$, are obtained by solving the system of differential equations (Equation 1) when $dI_i/dt = 0$. We first investigate how temperature directly affects IS. We then look at the effect of varying the temperature dependence of biological rates (by alternately fixing model parameters at their optimal value) and temperature independent mortality rates. Finally we explore how the indirect effect of temperature through decreasing body mass affects IS. Note that, for brevity, we mainly illustrate our results for the interaction between carnivores and herbivores.

### 3. RESULTS

#### 3.1. Thermal Dependence of Biological Rates

When all parameters are temperature dependent, the relationship between temperature and consumer-resource IS follows the shape of Equation 2. Because of the definition of the search rate $a_{ij}$, $IS_{pc}$ (which is equal to search rate in our model) follows

| Symbol | Description | Dimension | Value |
|--------|-------------|-----------|-------|
| $d$    | Dilution rate | Time$^{-1}$ | 0.8   |
| $q$    | Carbone-to-nitrogen ratio | - | 6     |
| $\alpha_H$ | Herbivore conversion efficiency | - | 0.45  |
| $\alpha_C$ | Carnivore conversion efficiency | - | 0.85  |
| $l$    | Nutrient input | mol.N.volume$^{-1}$.Time$^{-1}$ | 12    |
| $b_l$  | $T^*$ independent biomass loss rate | Time$^{-1}$ | 0.4   |
| $m_p$  | Primary producer body-mass | mg | 1     |
| $m_h$  | Herbivore body-mass | mg | 1.10$^2$ |
| $m_c$  | Carnivore body-mass | mg | 1.10$^4$ |
| $c$    | Dry to wet mass conversion constant | - | 6.5   |
| $T$    | Temperature $T^*$ | Kelvin | 285–315 |
| $T_{opt}$ | Optimal temperature | Kelvin | 298   |
| $k$    | Boltzmann constant | eV$^{-1}$ | 8.617.10$^{-5}$ |
| $a_i$  | Consumer-resource search rate | Volume.time$^{-1}$ | (Equation 2) |
| $z_i$  | $T^*$ dependent biomass loss rate | Time$^{-1}$ | (Equation 2) |
| $\mu_i$ | Primary producer growth rate | Time$^{-1}$ | (Equation 2) |
| $\beta_a$ | Allometric scaling exponent for $a$ | - | 0.25  |
| $\beta_z\mu$ | Allometric scaling exponent for $z$ & $\mu$ | - | -0.25 |
| $E_{a_H}$ | Activation energy for $a_H$ | eV (electronvolt) | 0.8   |
| $E_{a_C}$ | Activation energy for $a_C$ | eV (electronvolt) | 0.74  |
| $E_{z_H}$ | Activation energy for $z_H$ | eV (electronvolt) | 0.55  |
| $E_{z_C}$ | Activation energy for $z_C$ | eV (electronvolt) | 0.43  |
| $E_{\mu}$ | Activation energy for $\mu$ | eV (electronvolt) | 0.53  |
| $E$    | De-activation energy | eV (electronvolt) | 1.15  |
| $a_{qH}$ | Scaling constant for $a_H$ | - | 5.10$^{13}$ |
| $a_{qC}$ | Scaling constant for $a_C$ | - | 3.10$^{12}$ |
| $z_{pH}$ | Scaling constant for $z_H$ | - | 2.10$^8$ |
| $z_{pc}$ | Scaling constant for $z_C$ | - | 4.10$^6$ |
| $z_{cC}$ | Scaling constant for $c_C$ | - | 1.5.10$^{12}$ |
| $\mu_0$ | Scaling constant for $\mu$ | - | 3.10$^8$ |

References: *Stern and Elser (2002), Yodzis and Innes (1992), Peters and Peters (1986), Rall et al. (2012), Savage et al. (2004), Dell et al. (2011).*
The relationship of IS to temperature varies significantly according to which parameter varies with temperature (Figure 3). The thermal response of IS can be hump-shaped, U-shaped or decrease with temperature. It is then determined by the temperature dependence of the biological rates that are expressed in the IS measures’ formulas, which are based on equilibrium biomasses (see Table S1 and Figure S2). In our model, mortality rate increases with temperature whilst growth and search rates follow a hump-shaped relation with temperature. These differences in the shape of the thermal responses of biological rates show in the thermal responses of IS measures. When only mortality rates \( z_i \) vary with temperature, intraspecific competition increases leading to a decrease in population biomass \( i \) at equilibrium, but also to an increase in equilibrium biomass of the resource of species \( i \) (if any). Equilibrium biomasses influence \( IS_{pp} \) and \( IS_{net} \), which in turn decrease with increasing temperature. The intrinsic growth rate varies with temperature because of its effect on both mortality and consumption rates. The equilibrium biomass of a consumer species \( i \) decreases with mortality rate \( z_i \), while the equilibrium biomass of its resource does increase because of lower regulation.

The change of equilibrium with increasing temperature of both consumer and resource therefore influences both \( IS_{pp} \) and \( IS_{net} \).

Figure 3 shows the effects of temperature on two interaction strength measures: interaction strength per population, \( IS_{pp} \), and net interaction strength, \( IS_{net} \). Each column corresponds to different interactions between consumers and resources: H-P stands for the interaction between herbivores and primary producers in absence of carnivores, C-H for the interaction between carnivores and herbivores and C-P for the indirect interaction between carnivores and primary producers. (Note that to facilitate the comparison between those different interactions, we represented here the inverse of \( IS^{C-P}_{C} \). Hence, for all interactions, a hump-shaped relationship means that IS first increases with temperature and a U-shaped relationship means that IS first decreases with temperature.) Each row corresponds to a different scenario of thermal dependence of parameters. Parameters that vary with temperature are specified on the left of the plot (e.g., second row: only \( z_p \), the primary producer mortality rate, varies with temperature, other parameters being fixed). When the subscript is not indicated, biological rates of every trophic levels vary with temperature (e.g., 5th row: \( z \), mortality rates of primary producers, herbivores and carnivores vary with temperature). When the trophic level is indicated (P, H and/or C), the parameters of the given trophic level(s) vary with temperature (e.g., 9th row: primary producer parameters, \( \mu \) and \( z_p \), vary with temperature). Hence for the last row (PHC), all parameters vary with temperature. Fixed parameters are set at their optimal value. (A) Qualitative representation of the shape of the thermal response of IS measures for different scenarios of parameters temperature dependence (as in Figure 2). The shapes of the thermal dependence of interaction strength are color coded; see color key, dark blue: hump-shaped, light blue: U-shaped, light green: decrease and gray: no temperature dependence. (In the last case, gray cells, there is no effect of temperature because all parameters are fixed for those interactions. Indeed, here the interactions between primary producers and herbivores are independent of carnivore’s biological rates). (B) Thermal sensitivity of interaction strength for different scenarios of parameters temperature dependence, quantified as the standard deviation of interaction strength measures (color coded, see color key).
U-shaped relationship) but can also be determined by mortality rates (decrease with temperature) according to IS measures. The variation in the shape of IS thermal responses is more important for $I_{S_{net}}$ than for $I_{S_{pp}}$, which can be explained by the fact that $I_{S_{net}}$ is equal to the ratio of equilibrium biomasses of resources and consumers.

The shapes of the thermal responses of IS measures are qualitatively described in Figure 3A. However, the magnitude of the temperature effect, as well as the strength of the interaction, varies from one scenario of parameter temperature dependence to another. We find that the occurrence of temperature-independent rates can alter the thermal sensitivity of $I_{S_{pp}}$ and $I_{S_{net}}$ (Figure 3B), which is highly variable from one IS measure to another, and according to which rate is fixed. It tends to increase with the number of rates that are temperature dependent and is stronger for $I_{S_{net}}$. The equilibrium biomass of a given trophic level is dependent upon equilibrium biomasses of other trophic levels (Table S1). These interactions between parameters and trophic levels in equilibrium biomasses can in turn lead to an increase in the temperature sensitivity of $I_{S_{pp}}$ and $I_{S_{net}}$. We further investigate the response of IS between carnivores and herbivores, and its thermal dependence, to a change in temperature-independent biomass loss rate (Figure 4). The shape of the thermal response of both IS measures remains hump-shaped whatever the value of biomass loss rate. However, increasing biomass loss rate $b_i$ decreases both IS measures and shifts the temperature at which IS is maximal toward higher temperatures, mainly for $I_{S_{net}}$. Increasing mortality rate $b_i$ diminishes carnivore equilibrium biomass, which in turn lead to a decrease in $I_{S_{pp}}$. Increasing mortality rate $b_i$ also decreases herbivore equilibrium biomass in absence of carnivores but increases its equilibrium biomass in presence of carnivores, resulting in a decrease in $I_{S_{net}}$ (see Table S1 and Figure S3).

3.2. Temperature-Size Rule

Temperature, through its effect on body mass, can indirectly induce changes in IS (for the interaction between carnivores and herbivores in Figure 5). The TSR does not alter the shape of the thermal response of IS, which remains hump-shaped for all TS scenarios. According to Equation 4, the temperature of reference is 293.15 K. Organisms are larger for temperatures under 293.15 K and smaller for temperatures above 293.15 K. Hence IS values with and without TSR are equal at 293.15 K (lines are crossing at 293.15 K on Figure 5). However, below and above this temperature of reference, IS can either decrease or increase with the TSR. We also observe a shift in the temperature at which IS is maximal.

$I_{S_{pp}}$ (Equation 2, Figure S1) and $I_{S_{pp}}$ (Figure 5A) both increase for temperature below 293.15 K (increase in body mass) and decrease for temperature above 293.15 K (decrease in body mass). These IS measures then directly depend on species body mass. $I_{S_{pp}}$ gradually becomes lower as more trophic levels experience a decrease in body mass (Figure 5A). $I_{S_{net}}$ declines with decreasing carnivore body mass regardless of whether or not herbivore body mass also decreases (Figure 5B). However, when the three trophic levels follow the TSR, $I_{S_{net}}$ increases with reduced body mass compared to the case with no TSR effect. This is due to the fact that a reduction in body mass can affect equilibrium biomasses of the different trophic levels in distinct ways. The equilibrium biomass of herbivores increases in both the presence and absence of carnivores when the three trophic levels follow the TSR (Figure S2), which results in an increase of $I_{S_{net}}$. Hence, the indirect effect of temperature through altering body mass does not qualitatively affect the relationship between temperature and IS except for a shift of the location of the maximal IS. However, it changes the relative strength of the interactions.

**FIGURE 4** Effect of temperature (in Kelvin) on, (A), interaction strength per population, $I_{S_{pp}}^{C-H}$, and, (B), net interaction strength, $I_{S_{net}}^{C-H}$, between carnivores C and herbivores H. The relationship between temperature and both interaction strength measures is hump-shaped and follows the thermal dependence function of search rate (or per capita interaction strength) and growth rate (Figure 2). Varying the mortality rate, from 0.2 to 2.8 time$^{-1}$, changes the magnitude of the temperature effect, the relative strength of interaction and shifts the temperature at which interaction strength is maximal.
4. DISCUSSION

There is no consensus about the effect of temperature on trophic regulation, as studies are often based on different assumptions, models or measures of interaction strength (IS). It is known that temperature directly influences the physiology of organisms by changing their biological rates (Gillooly et al., 2001; Brown et al., 2004; Savage et al., 2004) and inducing a change in body mass (Forster and Hirst, 2012). These effects then propagate to the population- and community-level. The comparison of IS measures allows us to reveal three main mechanisms by which temperature affects trophic regulation: (i) temperature directly affects metabolic rates and body mass, which in turn induces changes in biological rates and in the rate at which individuals consume their resource (and in $B_{pc}$). As a result, (ii) population sizes at equilibrium become temperature dependent, which in turn influences $IS_{pp}$, the total effect of consumers on resource populations. Moreover, (iii) the effect of temperature propagates between trophic levels meaning that interactions between parameters (or trophic levels) that are temperature dependent may make more sensitive $IS_{pp}$ and $IS_{net}$ to temperature changes. We thus support the widely believed hypothesis that temperature has an effect on trophic interaction strength, but we also show that this effect can vary in direction, magnitude and location of its peak.

More precisely, in our analyses, the relationship between temperature and interaction strength follows the scaling relationship between search rates and temperature when all compartments respond to temperature. This result is obvious for a linear functional response but nonetheless underlines parameters that need to be better documented empirically. Sensitivity of the different IS measures to temperature increases when all parameters are temperature dependent. A precise definition of IS is therefore essential to link multiple experimental and theoretical studies. Yet many indices have been used, making it difficult to compare outcomes from different studies (Wootton and Emmerson, 2005). The coherence in the thermal response of the different IS measures considered here demonstrates that different indices can behave similarly to an increase in temperature.

When all parameters are temperature dependent, IS thus increases with temperature up to a certain threshold above which it decreases. Our result is consistent with previous studies that experimentally manipulated the presence of predators and measured either net IS (log ratio of prey biomass in absence/presence of predators) (Barton et al., 2009; Kratina et al., 2012; Shurin et al., 2012; Gray et al., 2015) or per capita IS (ratio of predation rate and resource density) (Sentis et al., 2014). Sentis et al. (2014) theoretically and experimentally measured omnivory strength, computed as the number of resources and consumers eaten. Their model predict that omnivory strength increases with temperature but rapidly decreases at extreme temperatures due to the hump-shaped thermal response of search rate. However, they did not experimentally measure this decrease at extreme temperatures because their warmest temperature was 30°C. On a narrow range of temperature, Osmond et al. (2017) also found that net IS monotonically increases with temperature. Hence, most experimental studies found that temperature increases IS but few of them detailed the different rates that are temperature dependent. Our results also show that IS decreases at higher temperatures, in agreement with Sentis et al. (2014). These authors suggest that the effect of temperature on interaction strength is mediated by its effect on predator foraging activities. Temperature, through increasing search rate, promote predation of resources. However, at higher temperatures, search rate decreases and so does IS. It is therefore critical to characterize the thermal response of search rates and other biological rates over a large range of conditions to catch this peak. Yet few data or theories exist for the decline in individuals rate performance at higher temperatures (Dell et al., 2011) as the...
majority of studies concentrates on the rising part of biological rates responses to temperature. The decreasing phase has raised less attention, partly because organisms usually live within their physiological temperature range (PTR), and partly because a majority of experiments perform a marginal warming relative to current conditions (Sentis et al., 2014).

We also find that the relationship between temperature and IS can differ according to which biological rates are temperature dependent. Thermal sensitivity of IS when multiple rates are affected by temperature appears stronger than the sum of individual effects, suggesting interactions and synergies between trophic levels are taking place (Figure 3B). Indeed, effects of temperature propagate through the entire food chain, from primary producers at the bottom to carnivores at the top and conversely. For instance, when only the primary producer mortality rate $z_p$ varies with temperature, the interactions between carnivores and herbivores, e.g $IS^{C-H}_P$, still vary with temperature. This arises because $z_p$ influences the equilibrium concentration of the nutrient, which in turn influences the equilibrium biomass of the primary producers, and so does the equilibrium biomass of the carnivores (Table S1), all together impacting $IS^{C-H}_P$. Similarly, when only the carnivore mortality rate $z_c$ varies with temperature, $IS^{C-P}_H$, which is the ratio of primary producers biomass in absence and in presence of carnivores, still varies with temperature (Figure 3B). $z_c$ influences the equilibrium biomass of herbivores and subsequently the equilibrium biomass and concentration of primary producers and nutrients. The same reasoning applies for herbivore parameters. Hence, even though some parameters are not directly involved in IS measures, they can indirectly influence IS through the interdependence of equilibrium biomasses across trophic levels.

There is usually coherence in the thermal response of IS when multiple parameters from different trophic levels vary together. For instance, when mortality rates of all trophic levels vary with temperature (search rates and growth rates are fixed), the relationship between IS and temperature is no longer hump-shaped but instead exponential (Figure 3A). Similarly, when consumption rates of all trophic levels vary together, the thermal response of IS is unimodal. When multiple rates are temperature dependent, the thermal response of IS is also usually stronger than when a single parameter varies (Figure 3B). For instance, when the mortality rate $z$ of the three trophic levels vary with temperature, the thermal sensitivity of $IS_{PP}$ and $IS_{net}$ is stronger than when the mortality rate of a single trophic level is temperature dependent. There may be however interactive effects that can lead in some cases to surprising IS thermal responses. We find this situation for instance when only the search rate of herbivore $a_{PHI}$ varies with temperature. In that case, the equilibrium biomass of herbivores in presence of carnivores is then temperature independent but the equilibrium biomass of herbivores in absence of carnivores is U-shaped (Figure 3A), resulting in a U-shaped thermal response for $IS^{C-H}_{net}$. All in all, this variation in the thermal response of IS indicates that there are multiple pathways by which temperature may affect IS.

Knowledge of which rates are influenced by temperature, and how, is therefore critical to document (Dell et al., 2011; Englund et al., 2011; Huey and Kingsolver, 2011; Vucic-Pestic et al., 2011; Burnside et al., 2014; Amarasekare, 2015). It will also be important to better measure activation energies for each rate since some parameters are more sensitive than others. It has been shown for instance that search rate can have a steeper temperature response than maximal intake rate or handling time (Englund et al., 2011; Sentis et al., 2014), and that it can be temperature independent for sit-and-wait predators (Sentis et al., 2017b). However, even when search rate (i.e., $IS_{PP}$) is fixed, $IS_{net}$ can vary with temperature. This result is in agreement with previous experimental studies (Sentis et al., 2017b) and emphasize the importance of considering different IS measures. Temperature sensitivity can also vary across trophic levels. Climate sensitivity is assumed to increase with trophic levels (Voigt et al., 2003), possibly due to the fact that respiration increases faster than photosynthesis with warming (Pawar et al., 2015). On the other hand, upper trophic levels are often endotherms which can control their body temperature to a certain extent. According to our results, differences in the thermal sensitivity of species can in turn alter the shape of the thermal response of interaction strength but also its sensitivity. We also find that the thermal sensitivity of IS can be contingent on parameters that are not temperature dependent, such as mortality rates, that can magnify thermal responses. Mortality can increase via many other mechanisms than temperature. Natural disturbances or dilution, for instance, can affect mortality rates and in turn species biomasses leading to a change in the strength of their interactions. Hence, we show that, in addition to temperature, other factors can impact trophic regulation and, more importantly, magnify the temperature effect, without altering the shape of its thermal response.

Finally, we investigated the effect of a shift in body mass due to temperature on IS. Warming is assumed to have a negative effect on ectothermic organisms’ body mass due to the temperature-size rule (Ashton et al., 2000). Despite body mass being a key determinant of trophic interactions (Brose et al., 2006; Sentis et al., 2017a), the ecological consequences of such phenotypic responses remain largely unexplored. Here we show that the unimodality of the relationship between temperature and interaction strength (for the case where all parameters vary with temperature) holds even when body mass decreases with temperature. However, per population interaction strength decreases with decreasing body mass whilst net interaction strength tends to either increase or decrease depending on which trophic levels follow the TSR. Osmond et al. (2017) found that the TSR had little effect on net IS but increases the stability of the interaction. While they considered symmetric TS responses between resources and consumers, we demonstrated, in agreement with (Sentis et al., 2017a) that heterogeneous TS responses across trophic levels lead to different responses of IS. By altering resource and consumer body mass ratios, TS responses may alter IS. Increasing body mass ratio is expected to increase the relative rate of consumption per unit consumer biomass which decreases IS and stabilizes the food chain (Sentis et al., 2017a). We indeed find that when carnivores’ body mass
decreases, thus decreasing body mass ratio between carnivores and herbivores, the effect of carnivores on herbivores (\(I^S\)) is lower. The indirect effect of temperature through body mass can then be opposite to its direct effect (which increases interaction strength under the PTR). Nevertheless, we also found that TS responses can further enhance the direct effect of warming on IS. We demonstrate that TS responses can impact IS in various directions depending on TS scenarios, consistent with Sentis et al. (2017a), but also show that these responses can vary from one measure of IS to another. This also raises the point that experiment duration is essential to accurately measure IS: experiments that are too short to observe a decrease in body mass could lead to under or overestimation of IS.

In summary, we find that temperature has numerous effects on IS. Presently, studies investigating how temperature influences ecosystem functioning mainly focus on only one effect of climate change at a time (Yvon-Durocher and Allen, 2012). Our results show that developing a framework that integrates the diverse effects of temperature on species' interactions is key to understand food web dynamics. Hence, through a simple model, we show that the impact of temperature on IS can be complex but that different measures of IS behave similarly with warming. Our approach however did not account for thermal adaptation of the species, which can reduce the physiological responses of organisms to warming. Furthermore, we considered a simple trophic chain, whereas a food-web approach would be relevant to investigate how various effects of temperature affect more complex communities. Hence, our analysis provides insights on various outcomes arising from communities under warming and demonstrates the importance of considering diverse effects of temperature.

**DATA AVAILABILITY**

Data have not been archived because this article does not contain data. Codes are available to download on https://github.com/Azenor/Temp_effect_trophic_interaction.

**AUTHOR CONTRIBUTIONS**

AB and DG conceived and developed the models. AB conducted the modeling work and wrote the first draft of the manuscript. All authors discussed the results and substantially revised the manuscript.

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**SUPPLEMENTARY MATERIAL**

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fevo.2019.00045/full#supplementary-material

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