### RESEARCH



## Universal ontogenetic growth without fitted parameters: implications for life history invariants and population growth

Andrés Escala<sup>1</sup>

Received: 3 May 2022 / Accepted: 12 July 2023 / Published online: 9 August 2023 © The Author(s) 2023

#### Abstract

Since the work of von Bertalanffy (Q Rev Boil 32:217–231, 1957), several models have been proposed that relate the ontogenetic scaling of energy assimilation and metabolism to growth, which are able to describe ontogenetic growth trajectories for living organisms and collapse them onto a single universal curve (West et al. in Nature 413:628–631, 2001; Barnayar et al. in Nature 420:626, 2002). Nevertheless, all these ontogenetic growth models critically depend on fitting parameters and on the allometric scaling of the metabolic rate. Using a new metabolic rate relation (Escala in Theor Ecol 12(4):415–425, 2019) applied to a Bertalanffy-type ontogenetic growth equation, we find that ontogenetic growth can also be described by a universal growth curve for all studied species, but without the aid of any fitting parameters (i.e., no fitting procedure is performed on individual growth curves). We find that the inverse of the heart frequency  $f_H$ , rescaled by the ratio of the specific energies for biomass creation and metabolism, defines the characteristic timescale for ontogenetic growth. Moreover, our model also predicts a generation time and lifespan that explain the origin of several "Life History Invariants" (Charnov in Oxford University Press, Oxford, 1993) and predict that the Malthusian parameter should be inversely proportional to both the generation time and lifespan, in agreement with the data in the literature (Duncan et al. in Ecology 88:324–333 2007; Dillingham et al. in Paper 535, 2016; Hatton et al. in PNAS 116(43):21616-21622 2019). In our formalism, several critical timescales and rates (lifespan, generation time, and intrinsic population growth rate) are all proportional to the heart frequency  $f_H$ , and thus, their allometric scaling relations come directly from the allometry of the heart frequency, which is typically  $f_H \propto M^{-0.25}$  under basal conditions.

**Keywords** Ontogeny · Metabolism · Bioenergetics · Life history · Population growth

### Introduction

Metabolism and growth are two fundamental aspects of living organisms, and thus, it is somewhat natural to try to understand the connections between these two processes. von Bertalanffy (1957) studied ontogenetic growth curves in order to establish connections between metabolism and growth, showing that individual growth curves in living organisms can be reproduced from models of metabolic energy allocation. Although several subsequent growth models (Reiss 1989; West et al. 2001; Ricklefs 2003; Hou et al. 2008) differ significantly on the details of their derivations, they share the same mathematical form of von Bertalanffy

(1957), which basically links patterns of assimilation and growth to the (allometric) scaling of the metabolic rate. In particular, West et al. (2001) proposed a general quantitative model based on the allocation of metabolic energy and showed that individual growth curves can be collapsed onto a single universal curve that describes the growth in all the studied species.

Nevertheless, Banavar et al. (2002) later illustrated that the universal growth curve arises from general considerations of energy conservation that are independent of the specific allometric model used by West et al. (2001). In particular, Banavar et al. (2002) showed that the data do not distinguish between specific exponents in the scaling relationship between metabolic rate and mass, with exponents of 2/3 and 3/4 in the metabolic relation fitting equally well. This scaling collapse onto a universal curve, which occurs when some dimensionless quantities are properly defined, is also equivalent to asserting that a single self-similar solution is able to successfully fit all



Andrés Escala andres.escala@aya.yale.edu

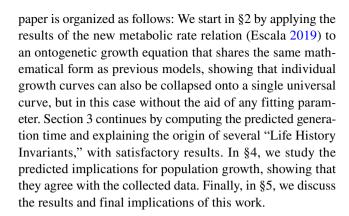
Departamento de Astronomía, Universidad de Chile, Casilla 36-D, Santiago, Chile

the ontogenetic growth curves. Since the universal curve arises from general considerations, it is desirable to find an independent test of the assumptions behind the models that defines the key dimensionless quantities that can discriminate between the different models for ontogenetic growth.

In general, all ontogenetic growth models critically depend on the metabolic rate, specifically, on the allometric scaling, the exact slope of which is still matter of debate (White Craig et al. 2007). Moreover, allometric descriptions for the metabolic rate like Kleiber (1932) do not fulfill the mathematical property of dimensional homogeneity, that requires to be expressed in a general form that remain true when the size of units is changed, which is a minimal requirement for any meaningful law of nature (Bridgman 1922). Recently, the empirical metabolic rate relation was corrected in order to fulfill dimensional homogeneity (Escala 2019), and a new metabolic rate (B) formula was proposed:  $B = \epsilon(T) \eta_O f_H M$ , where M is the body mass,  $f_H$  is a (characteristic) heart frequency,  $\eta_{O_2}$  is a specific  $O_2$  absorption factor for different exercising conditions (basal, maximal, etc.), and  $\epsilon(T) = \epsilon_0 e^{-E_a/kT}$  is a temperature correction inspired by the Arrhenius formula (Gillooly et al. 2001), in which E<sub>a</sub> is the activation energy and k is the Boltzmann constant.

Compared to Kleiber's original formulation (Kleiber 1932), B =  $B_0(M/M_0)^{3/4}$ , and Rubner's surface rule of proportionality to 2/3, this new metabolic rate relation has the heart frequency  $f_H$  as the controlling variable (a marker of metabolic rate); its advantage is that it is a unique metabolic rate equation for different classes of animals and different exercising conditions that is valid for both basal and maximal metabolic rates, in agreement with empirical data in the literature (Escala 2019). Moreover, using this new metabolic rate relation, departures from 3/4 scaling in the metabolic rate can be explained by variability in the allometric scaling of  $f_H$ , even for big deviations from 3/4 scaling such as some invertebrates, where heart frequencies scales as M<sup>-0.41</sup> (in spiders; Carrel and Heathcote 1976) and the metabolic rate scaling is thus predicted by the factor  $f_H$  M to be  $M^{-0.59}$ , being the same slope measured in the metabolic rate of spiders (Anderson 1970, 1974). This also holds for exercise conditions, where the maximal metabolic rate is proportional to M<sup>0.85</sup> (Savage et al. 2004), which slope can be again predicted by f<sub>H</sub> M since heart frequencies f<sub>H</sub> are observed to scales as M<sup>-0.15</sup> (under maximal exercise conditions; Weibel et al. 2004; Weibel and Hoppeler 2005). In addition, Escala (2022) showed that this new metabolic rate relation can be directly linked to the total energy consumed in a lifespan, so it is able to explain the origin of variations in the "rate of living' theory (Speakman 2005; Ramsey et al. 2000).

In this paper, we explore the implications of this new metabolic relation for ontogenetic growth models, with a focus on independently testing key quantities in our formulation to enable discrimination between previous models. The



### **Ontogenetic growth model**

Since different assumptions about energy allocation lead to the same general equation (von Bertalanffy 1957; Reiss 1989; West et al. 2001; Ricklefs 2003; Hou et al. 2008), we will follow the notation in the mass-energy conservation model described in Moses et al. (2008), which revisited the ontogenetic growth model of West et al. (2001), because we will compare our results to theirs, using their parameter estimations. The conservation of energy for the allocation of metabolic energy during growth between the maintenance of existing tissue and the production of new biomass can be expressed as  $E_m \frac{dm}{dt} = B - B_m m$  (Moses et al. 2008), where B is the metabolic rate (in J/s or W),  $E_m$  (in J/g) is the energy required to create a unit of biomass, and  $B_m$  (in W/g) is the metabolic rate required to maintain an existing unit of biomass.

For the corrected metabolic rate relation, we will restrict ourselves to basal (resting) conditions and neglect temperature variations because ontogenetic growth happens over long periods of time during which such variations might tend to cancel each other out (in wild conditions). Under such conditions, we have the constant factor  $\epsilon(T) \, \eta_{O_2} \approx 10^{-4.313} \, mlO_2 g^{-1} \approx 10^{-3} \, J/g \equiv E_{2019}$  (converting 1 ltr  $O_2$ =20.1 kJ; Schmidt-Nielsen 1984), where  $E_{2019}$  is a constant that comes from the best fitted value for the corrected metabolic relation (Eq. 8 of Escala 2019). Therefore, the metabolic rate formula is simply given by  $E_{2019} \, f_H \, m$  (Escala 2019), and assuming that the heart frequency scales with body mass m as  $E_1 = E_0 \, m^{-\alpha}$ , (mass-)energy conservation can be expressed as

$$\frac{dm}{dt} = am^{1-\alpha} - bm, (1)$$

where  $a = E_{2019} f_0/E_m$  and  $b = B_m/E_m$ . The general solution of Eq. 1 is a classical sigmoidal curve, the general form of which was given by von Bertalanffy (1957; Eq. 6). Noting also that for an initial (birth) mass  $m_0$  and final (asymptotic) mass M, the condition dm/dt = 0 (at m = M) in Eq. 1 is equivalent to  $a/b = M^{\alpha}$ , the solution to Eq. 1 can be written as



$$\left(\frac{m}{M}\right)^{\alpha} = 1 - \left[1 - \left(\frac{m_0}{M}\right)^{\alpha}\right] \times \exp\left(-\frac{at}{\alpha^{-1}M^{\alpha}}\right). \tag{2}$$

This solution is equivalent to the one found by Banavar et al. (2002), and for the special case of  $\alpha = 1/4$ , it has the solution given in West et al. (2001) (their Eq. 5). The solution given by Eq. 2 can be rewritten as  $r = 1 - e^{-\tau}$ , which is the same universal growth curve found in West et al. (2001) and Banavar et al. (2002), but in our case, it uses the following variable change:

$$\mathbf{r} \equiv \left(\frac{m}{M}\right)^{\alpha} \; ; \; \tau \equiv \frac{E_{2019}}{E_{m}} \frac{f_{H} t}{\alpha^{-1}} - \ln\left[1 - \left(\frac{m_{0}}{M}\right)^{\alpha}\right] \; , \tag{3}$$

where we also replace a  $=E_{2019}f_0/E_m$  in Eq. 2 (in the definition of  $\tau$ ), and thus,  $\mathrm{f}_H=f_0M^{-\alpha}$  is (henceforth) the heart frequency when the animal reaches the final (asymptotic) mass M. For the particular case of  $\alpha=1/3$ , r also corresponds to the fractional size ( $\mathrm{r}=(m/M)^{1/3}=l/L$ ), leading to the classical Bertalanffy growth equation,  $\mathrm{l}(\tau)=L(1-e^{-\tau})$ , which has been successfully applied in the fishery industry (Beverton and Holt 1959; Charnov 2008). In this case, we can explicitly express (in terms of physical quantities) the Bertalanffy growth coefficient as  $\mathrm{K}\equiv \tau/t=\frac{E_{2019}}{E_m}\frac{f_H}{\alpha^{-1}}$  (from Eq. 3 for  $\mathrm{m}_0=0$ ).

The advantage of this formulation compared to previous ones is that now the dimensionless time  $\tau$  is expressed exclusively in terms of quantities that are well defined, with either clear physical (specific energies  $E_{2019}$  and  $E_m$ ) or biological (heart frequency  $f_H$ , body mass M, etc.) meanings, and therefore, the dimensionless variables defined in Eq. 3 are now written in a physically transparent form, without the aid of any fitting parameters. This contrasts, for example, with the parameter a (present in Eqs. 1 and 2 but not in the universal growth curve defined by Eq. 3) that is critical in the procedure of fitting the growth curves in von Bertalanffy (1957), West et al. (2001), Banavar et al. (2002), etc. and in the definition of their dimensionless variables, which has an obscure meaning considering its fractal dimensionality of  $[mass^{\alpha}]/[time]$  and is thus not associable to any physical quantity. This fitting parameter a is not present in the final growth curve solution found in our formulation,  $r = 1 - e^{-\tau}$ , for the variables defined in Eq. 3. It is notable that in this formulation for  $\tau$ , the inverse of the heart frequency  $f_H^{-1}$  defines the characteristic timescale for ontogenetic growth,  $t_{growth} \equiv f_H^{-1} \frac{E_m}{E_{2019}}$ , which is rescaled by the ratio of the specific energies of biomass creation  $(E_m)$  and (basal) metabolism  $(E_{2019})$ .

Banavar et al. (2002) showed that the ontogenetic growth curves do not distinguish between exponents of 2/3 and 3/4 (= 1 -  $\alpha$ ) in the mass scaling of the metabolic rate relation, as both are equally good fits to the current data and are consistent with a universal curve  $r = 1 - e^{-\tau}$  for ontogenetic

growth. Therefore, only for consistency, we will assume  $\alpha = 1/4$ , since we will compare our formulation against data using the fitting parameters from West et al. (2001), which assumes this  $\alpha$  value.

The universal growth curve  $r = 1 - e^{-\tau}$ , for the  $\tau$  defined in Eq. 3 (with  $\alpha = 1/4$ ), is mathematically identical to the solution found in West et al. (2001) (their Eq. 5) when

$$t_{growth}^{-1} \equiv \frac{E_{2019}}{E_m} f_H = \frac{a}{M^{1/4}}$$
 (4)

is fulfilled, and therefore, it should equally well fit the individual growth curves for the species studied in West et al. (2001) if their measured heart frequencies  $f_H$  and estimated specific energies  $(E_{2019}, E_m)$  fulfill the condition given by Eq. 4 for the parameter a and final mass M found in the fitting procedure of the growth curves in West et al. (2001). In order to test whether the condition in Eq. 4 is fulfilled in nature, we collected estimations for the energy required to create a unit of biomass E<sub>m</sub> (Moses et al. 2008, taking averages when multiple estimations are available) and measurements of heart frequencies  $f_H$  for the species studied in West et al. (2001) in order to supplement them with the fitting parameters a, birth mass m<sub>0</sub> and final mass M that best fit the growth curves studied in West et al. (2001). A summary of all the quantities (with the individual references for  $f_{\mu}$ ) are listed in Table 1.

Figure 1 displays the relation given by Eq. 4 between the variables a, M,  $E_m$  and  $f_H$  as a function of the final body mass M. In the 7 orders of magnitude in body mass M variations, the relation has a slope consistent with zero  $(\propto M^{-0.05})$ , and there is only 0.22 dex in scatter, where 1 dex on a log scale refers to an order of magnitude, comparable to the scatter in the metabolic rate relation found in Escala 2019), confirming that the condition in Eq. 4 is fulfilled. This implies that for the specific dimensionless variables defined in Eq. 3, the universal curve  $(r = 1 - e^{-\tau})$ will describe the (different) individual growth curves as well as the models in West et al. (2001) and Banavar et al. (2002). This is found without performing any fitting procedure on individual growth curves; instead, it is derived from the mathematical equivalence between our universal growth curve (r =  $1 - e^{-\tau}$ , for the  $\tau$  defined in Eq. 3) and West et al. (2001)'s solution when Eq. 4 is fulfilled. In other words, for the same universal solution, our formalism replaces the fitting parameters in West et al. (2001), such as a, which involves obscure units  $[g^{1/4}/day]$  and is thus not easily associable to a known physical quantity, by well-defined energies  $(E_{2019} \text{ and } E_m)$  and frequency  $(f_H)$ , which are also determined independently rather than by fitting animal growth curves (as in West et al. 2001; Banavar et al. 2002, etc.).

Moreover, the different species shown in Fig. 1 are scattered around the predicted value of  $E_{2019}$  (=  $10^{-3} Jg^{-1}$ ;



Table 1 Table 1

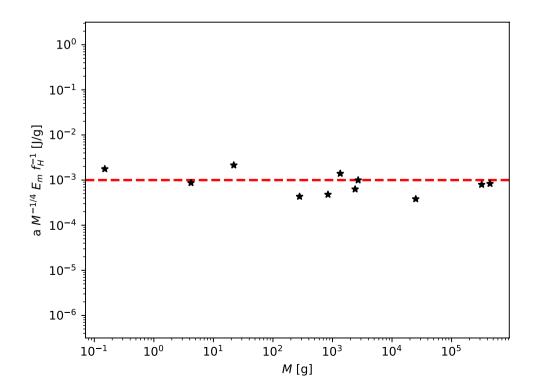
Species	a [g <sup>1/4</sup> /day]	m <sub>0</sub> [kg]	M [kg]	$E_m$ [J/g]	f <sub>H</sub> [#/min]	
		West et al. (2001)		Moses et al. (2008)	(Reference)	
Cow	0.28	33.3	442	6950	63 (Kovacs et al. 2015)	
Pig	0.31	0.90	320	6150	70 (Harris 2009)	
Rabbit	0.36	0.12	1.35	6100	180 (Detweiler and Erickson 2004)	
Guinea pig	0.21	0.005	0.840	4900	277 (Weibel et al. 2004)	
Rat	0.23	0.008	0.280	4350	393 (Weibel et al. 2004)	
Shrew	0.83	0.0003	0.0042	1800	835 (Jurgens et al. 1996)	
Heron	1.56	0.003	2.7	1400	211 (Machida and Aohagi 2001)	
Robin	1.9	0.001	0.022	2000	570 (Welty and Baptista 1988)	
Cod	0.017	0.0001	25	13000	32 (Wardle and Kanwisher 1973)	
Salmon	0.026	0.00001	2.4	7300	30 (Clark and Farrell 2011)	
Guppy	0.10	0.000008	0.00015	1900	120 (Unpublished data)	

Escala 2019) denoted by the red dashed line, and therefore, Fig. 1 can be considered a third independent estimation of  $E_{2019}$  (in addition to those of Escala 2019, 2022), supporting the predictability of the formalism presented and showing a characteristic feature of the physical sciences: fewer (and more universal) constants that have consistent measurements in multiple contexts. Finally, Fig. 1 strongly supports the idea that the inverse of the heart frequency  $f_H^{-1}$ , rescaled by the ratio of the competing specific energies (biomass creation  $E_m$  versus metabolism  $E_{2019}$ ), defines the characteristic timescale for ontogenetic growth  $t_{growth} = f_H^{-1} \frac{E_m}{E_{2019}}$ .

### Generation time and the origin of some life history invariants

The success of the formulation given by Eq. 3, supported by Fig. 1, motivates us to study its implications, and for that reason, it is interesting to look at the predicted generation time  $t_{gen}$ , which is the time period required for a young organism to grow to its final size and thus mature to reproductive age. The generation time  $t_{gen}$  can be straightforwardly determined from the  $\tau$  defined in Eq. 3, making it possible to arrive at the following relation:

Fig. 1 The relation between the variables a, M,  $E_m$  and  $f_H$ , as a function of the final body mass M, showing that it does not vary systematically with M. as predicted by Eq. 4. The different species marked with black stars are scattered around the predicted value of E2019, which is denoted by the red dashed line. The best-fitted slope is  $\frac{a}{M^{1/4}} \frac{E_m}{f_H} \propto M^{-0.05}$ , which is consistent with a zero slope against body mass M. The parameters a and M, taken from West et al. (2001), are determined to best fit the individual growth curves of the different species. In contrast, the parameters  $E_{2019}$ ,  $E_m$  and  $f_H$  that define t<sub>growth</sub> in our formulation are determined independently (see the references in Table 1) from any procedure of fitting to individual growth curves, such as the one in West et al. (2001)





$$\mathbf{t}_{gen} = \left(\tau^* + ln\left[1 - \left(\frac{m_0}{M}\right)^{\alpha}\right]\right) \frac{E_m}{E_{2019}} \frac{\alpha^{-1}}{f_H} \propto f_H^{-1}, \tag{5}$$

where  $\tau^*$  is the approximate dimensionless time value for reaching adult mass (same for all species) in the universal growth curve. Equation 5 gives a generation time that is explicitly dependent on the heart frequency  $f_H$ , where the allometric scaling of the heart frequency under basal conditions ( $f_H \propto M^{-0.25}$ ; Brody 1945; Calder 1968) gives the well known mass scaling for the generation time ( $t_{gen} \propto M^{0.25}$ ; Bonner 1965). Nevertheless, since most biological rates and times scale as  $M^{-1/4}$  and  $M^{1/4}$  (Savage et al. 2004; Burger et al. 2021), an interesting possible test is to study allometric variations of  $t_{gen}$  in large outliers of 1/4 scaling such as spiders (Anderson 1970, 1974), (White Craig et al. 2007) to test whether they vary as  $f_H$ , as predicted by Eq. 5. Another interesting possibility is to directly test the predicted inverse correlation between  $t_{gen}$  and  $f_H$ .

One of the advantages of having a generation time that is explicitly dependent on the heart frequency  $f_H$  is that it can be directly linked (Escala 2019, 2022) to the total lifespan  $t_{life}$  using the empirical relation of the total number of heartbeats  $(N_b)$  in a lifetime  $t_{life} = N_b/f_H$  found to be valid in mammals (Levine 1997; Cook et. al 2006). Escala (2022) generalized this relation for all types of living organisms using the proportionality between heart and respiration frequencies,  $f_H = k f_{resp}$  (Schmidt-Nielsen 1984); then, the empirical relation with lifetime can be rewritten so that it is also valid for a total number  $N_r (= N_b/k)$  of "respiration" cycles":  $t_{life} = N_b/f_H = N_b/kf_{resp} = N_r/f_{resp}$ . Escala (2022) also used this relation to predict the total lifespan energy consumed in living organisms, with satisfactory results if an approximately constant total number  $N_{r} \sim 10^{8}$  of respiration cycles per lifetime is required in all living organisms, which further supports the generalization. Combining this relation for a fixed number of respiration cycles per lifetime with Eq. 5, we obtain:

$$G \equiv \frac{t_{gen}}{t_{life}} = \left(\tau^* + ln \left[1 - \left(\frac{m_0}{M}\right)^{\alpha}\right]\right) \frac{E_m \alpha^{-1}}{E_{2019} N_b} \approx \frac{E_m}{k} \frac{4 \, \tau^*}{E_{2019} N_r}, \tag{6}$$

where we also approximate  $m_0 \ll M$  (in agreement with the species listed in Table 1), neglecting minor changes due to the weakly varying logarithm. Equation 6 directly relates the generation time and lifespan, two quantities that are known to correlate (de Magalhaes et al. 2007) with their respective energies (per unit mass) to create biomass  $(E_m)$  and sustain lifespan  $(N_bE_{2019})$ , by only assuming (mass-)energy conservation (Eq. 1) and the invariant  $N_r$  (= 1.62  $10^8$  respiration cycles per lifetime; Escala 2022) as a critical link between the two timescales.

Equation 6 can be directly compared to the data compiled by Charnov and Berrigan (1990), which summarized

published data for the ratio  $t_{adult}/t_{gen}$  in different animal groups, where  $t_{adult} = t_{life} - t_{gen}$  is the adult lifespan, noting that this definition is related to the G ratio as  $t_{gen}/t_{life} = (1 + t_{adult}/t_{gen})^{-1}$ . Additionally, we note that in Charnov and Berrigan (1990), lifespans are estimated from the inverse of (instantaneous) mortality rates, being effectively field lifespans and not maximum ones; thus, for comparison with Eq. 6, a correcting factor of 2.5 must be included (McCoy and Gillooly 2008), namely,  $G^{min} = t_{gen}/t_{life}^{max} = (2.5(1 + t_{adult}/t_{gen}))^{-1}$ .

Table 2 summarizes the estimations of G<sup>min</sup> using the data compiled in Charnov and Berrigan (1990) and compares them with the predicted values from Eq. 6, using estimates of  $E_m$  for taxonomic groups (average of juvenile estimates; Moses et al. 2008), k values for such groups (Schmidt-Nielsen 1984: Escala 2022) and a dimensionless time  $\tau^* \sim 5$ . the approximate value to reach adult mass in the universal growth curve (i.e., the flat part of the curve in Fig. 2 of West et al. 2001). Overall, we find that the values predicted from Eq. 6 are consistent with the empirically determined ones, as can be seen in Table 2. This is in addition to the consideration that each taxonomic group of birds, mammals, and fishes includes species with up to an order of magnitude difference in  $E_m$  values (i.e., cod vs guppy fish in Table 1) and not necessarily the same species studied in Charnov and Berrigan (1990). Therefore, it is even more relevant that the relative G<sup>min</sup> trends (between birds, mammals, and fish) observed in Charnov and Berrigan (1990) are successfully predicted by the ratio  $\frac{E_m}{l}$ .

Equation 6 shows that the invariant relation between lifespan and age at maturity that is valid within taxonomic groups, as observed by Charnov and Berrigan (1990), might come directly from the existence of another invariant: the approximately constant total number  $N_r \sim 10^8$  of respiration cycles per lifetime. This ratio  $t_{adult}/t_{gen}$  is indeed one of the studied dimensionless life-history invariants (Calder 1984; Charnov 1993), which has sometimes been criticized as spurious by being a form of "regressing X on X," where X is a random number (Nee et al. 2005). In this work, the generation and lifespan timescales are quantities derived independently, giving a quantitative prediction of an approximately invariant ratio within taxonomic groups, including interspecific variations, that comes from the basic energetics of respiration and

 Table 2
 Table 2

Animal Group	$E_m$ [J/g]	k	Predicted from Eq. 6	$\mathbf{G}^{min} = \frac{\mathbf{t}_{\mathrm{gen}}}{\mathbf{t}_{\mathrm{life}}^{\mathrm{max}}}$
Birds	4050	9	0.06	0.11
Mammals	5800	4.5	0.16	0.17
Fish	7400	3	0.3	0.28



the creation of new biomass and therefore has a clear physical interpretation and is thus far from spurious.

Traditionally, this relation, expressed in terms of the adult lifespan and age at maturity (which typically marks the end of an animal's growth), as in Charnov and Berrigan (1990), has been qualitatively explained in terms of life-history evolution theory. Many versions of life-history theories predict that the age of maturity should be positively correlated with the lifespan (Charnov 1993), as these patterns are a reflection of natural selection (Charnov and Berrigan 1991). In this paper, after rewriting the properties of living organisms in a physically transparent form, we predict the value of this life-history invariant in terms of the relevant energetics ( $E_m$ ,  $E_{2019}$ , k, etc.) and find that the constancy mainly comes from the invariant number  $N_r \sim 10^8$  of respiration cycles per lifetime, a generalization of the well-known relation of a constant number of heartbeats in a mammal's lifetime (Levine 1997; Cook et. al 2006). Nevertheless, we do not study the origin of how the key parameters (E<sub>m</sub>, k, etc.) vary across species, animal groups, and generations, which should be evolutionary in origin and thus set by natural selection (Charnov 1993; Gardner et al. 2005).

It can be straightforwardly obtained that some of the other life-history invariants (Charnov 1993) come directly from the invariant  $G = t_{opn}/t_{life}$  and the universal ontogenetic growth curve. For example, the invariant ratio between the mortality rate (M) and the Bertalanffy growth coefficient (K) (Beverton and Holt 1959; Cushing 1968; Pauly 1980) comes from its relation with  $\tau$  in our formulation,  $Kt = \tau$ , which at the generation time corresponds to  $Kt_{gen} = \tau^* \sim 5$  according to the universal growth curve (West et al. 2001; Barnavar et al. 2002). Noting also that the mortality rate M is approximately the inverse of the lifespan 1/t<sub>life</sub> (in the next section, we will see a more rigorous definition for M), it is straightforward to obtain that M/K =  $t_{gen}/(t_{life}\tau^*)$  = G/5. Another invariant is the ratio between the length at maturity  $l(t_{qen})$  and the maximum asymptotic length L (Charnov and Berrigan 1991), which also comes from  $Kt_{gen} = \tau^*$  by simply recalling the Bertalanffy growth equation (derived in §2):  $l(t_{gen})/L = 1 - e^{-\tau^*}$ . Finally, the invariant fraction of body mass to reproduction per unit time per life span (Charnov et al. 2001) comes from the definition of the dimensionless mass r (Eq. 3) and the invariant G (Eq. 6), which are related as  $\frac{m(t_{gen})}{M} \frac{t_{life}}{c} = (1 - e^{-\tau^*})^{1/\alpha} G^{-1}.$ 

# Implications for population growth: the Malthusian parameter and the "Equal Fitness Paradigm"

Malthus (1798) studied the simplest model of population growth, which can be derived by assuming that all individuals are identical and reproduce continuously; therefore, the

number of individuals (*N*) will change with the birth rate B and death rate D as follows:

$$\frac{dN}{dt} = B - D = (b_N - d_N)N = r_m N, \qquad (7)$$

where  $b_N$  and  $d_N$  are the per capita birth and death rates, respectively, and  $r_m$  is the Malthusian parameter or intrinsic (maximum) population growth rate. The solution of Eq. 7 has an exponential form given by  $N(t) = N_0 e^{r_m t}$ , and therefore, the Malthusian parameter  $r_m = b_N - d_N$  has units of inverse time and can be rewritten in the following form:  $r_m = \bar{b}/t_{adult} - \bar{d}/t_{life}$ . The constants  $(\bar{b}, \bar{d})$  are now dimensionless since we have identified  $t_{life}$  as the characteristic timescale for death rates and  $t_{adult} = t_{life} - t_{gen}$  as the characteristic timescale for the birth rates. The reason for the latter is that  $t_{adult}$  is the reproductive adult lifespan, which is determined by subtracting from the lifespan the time period required to (grow and) mature to reproductive age,  $t_{gen}$ , which does not fulfill the key assumption in Eq. 7 that the individuals are able to reproduce continuously.

Using Eq. 6, which relates  $t_{gen}$  and  $t_{life}$ , the Malthusian parameter is given by

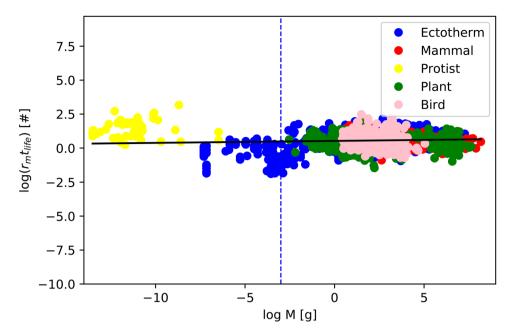
$$\mathbf{r}_{m} = \left(\frac{\bar{b}}{1 - G} - \bar{d}\right) t_{life}^{-1} = \left(\frac{\bar{b}}{1 - G} - \bar{d}\right) \frac{f_{H}}{N_{b}} \propto f_{H}, \tag{8}$$

which gives a Malthusian parameter  $\mathbf{r}_m$  that is again explicitly dependent on the heart frequency  $\mathbf{f}_H$ . The allometric scaling of heart frequency under basal conditions ( $f_H \propto M^{-0.25}$ , Brody 1945, Calder 1968) gives the well-known Fenchel (1974) allometry,  $\mathbf{r}_m \propto M^{-0.25}$ , but again, as most biological rates and times scale as  $\mathbf{M}^{-1/4}$  and  $\mathbf{M}^{1/4}$  (Savage et al. 2004; Burger et al. 2021), a more interesting test will be to study allometric variations of  $\mathbf{r}_m$  in outliers of "1/4 scaling" in terms of the heart frequency  $\mathbf{f}_H$  to determine whether they vary as  $\mathbf{f}_H$ , as predicted by Eq. 8.

Another prediction of Eq. 8 is an inverse correlation between  $r_m$  and  $t_{life}$ , which was recently tested by Hatton et al. (2019). Figure 2 displays the data of Hatton et al. (2019) for all types of living organisms, ranging from protists to mammals and birds. Since the present analysis is restricted to organisms with a heart, we denote with the dashed (blue) line the mass scale of  $10^{-3}$  grams, which corresponds to the scale associated with the smallest organisms with hearts, such as fruit and fairy flies, and coincides in Fig. 2 with a transition to a decrease in the scatter (for larger masses); in addition, all individual animal groups (colors in Fig. 2) satisfy this relation for masses larger than  $10^{-3}$  grams. The solid black line corresponds to the best fit to the data, consistent with a clear inverse correlation between  $r_m$  and  $t_{life}$ , with no residual slope with body mass ( $r_m t_{life} = 3.35 \, M^{0.01}$ , scatter of 0.5 dex or half an order of magnitude).



Fig. 2 Lifetime growth: intrinsic (maximum) population growth rates (r,,,) multiplied by the corresponding lifespans (tlife) for all types of living organisms, ranging from protists to mammals and birds, compiled by Hatton et al. (2019). The solid black line corresponds to the best fit to the data, with no residual slope with body mass,  $r_m t_{life} = 3.35 M^{0.01}$ , as expected from Eq. 8, with a scatter of 0.5 dex. The dashed blue line denotes the mass scale of  $10^{-3}$  grams, which corresponds to the scale associated with the smallest organisms with hearts, to which the present analysis is restricted



The relatively low variation (on average, one order of magnitude spread, since the scatter is 0.5 dex) for a database that includes sources of scatter such as mixing lifespans in captivity and in the wild (Hatton et al. 2019; see de Magalhaes and Costa 2009 for more on this issue) and in particular, a negligible slope with body mass as shown in Fig. 2 has been claimed (Hatton et al. 2019) to support the so-called "Equal Fitness Paradigm" (Brown et al. 2018; Burger et al. 2021), which states that "most organisms are more or less equally fit, as evidenced by the persistence of millions of plant, animal and microbe species of widely varying size, form and function in the Earth's diverse environments" (Brown et al. 2018). In terms of the proposed formalism, Eq. 8 and the low variation of G across animal groups (the factors 2–3 seen in Table 2) also implies a low variation for the parameters  $\bar{b}$  and  $\bar{d}$  across species. These relatively constant values (implied by Fig. 2) for the dimensionless parameters  $(\bar{b}, \bar{d})$  associated with the (net) per capita birth and death per characteristic time, in addition to the spectacular diversity of life histories in terms of growth, reproduction, and survivorship over the life cycle, which implies very diverse life history strategies in the very large mass range displayed in Fig. 2, supports the idea that selection mechanisms should operate in terms of equal fit according to Darwinian evolution.

In the fundamental theorem of natural selection, Fisher (1930) states that the rate of increase in mean fitness (caused by natural selection; Price 1972) is equal to the genetic variance of a species, conceptually linking natural selection with Mendelian genetics. Natural selection can only increase fitness by reducing genetic variance (i.e., selecting away undesirable

alleles; Basener and Sanford 2018), and thus, without mutations and given enough time, selection must reduce genetic variance all the way to zero and fitness must reach a maximum, according to Fisher's theorem and as confirmed through simulations (Basener and Sanford 2018). The "Equal Fitness Paradigm" seems to suggest that a maximum fitness value has been reached by the coexisting species in the current conditions.

Additionally, Demetrius (1974, 1975) found a relation between "evolutionary" entropy (of a population) and reproductive potential with fitness (measured by the Malthusian parameter), in which Fisher's theorem is also obtained as a corollary for a Hardy-Weinberg equilibrium. In Demetrius's formalism, the Malthusian parameter is analogous to the Gibbs free energy (Demetrius 1997) and also behaves effectively like a thermodynamic potential: being the maximum (potential) growth that can be performed by a given population, that becomes null when such population reaches abundance equilibrium. In thermodynamic theory, Gibbs free energy is minimized when entropy is maximized, and according to the second law of thermodynamics, maximum entropy is found only in the state of thermodynamic equilibrium, where (the theorem of) equipartition of energy holds. The "Energetic Equivalence Rule" (Damuth 1981), which was recently verified for ~3000 species in Hatton et al. (2019), seems to be a version of such an equipartition of energy in living matter and thus is also consistent (under abundance equilibrium) with being in the state in which maximum entropy is reached.

Another relation for  $r_m$  that can be derived using the definition of G (Eq. 6) is the relation that predicts an inverse correlation with the generation time  $t_{gen}$ :



$$r_m = \left(\frac{G\bar{b}}{1 - G} - G\bar{d}\right) \frac{1}{t_{gen}} \propto t_{gen}^{-1}, \tag{9}$$

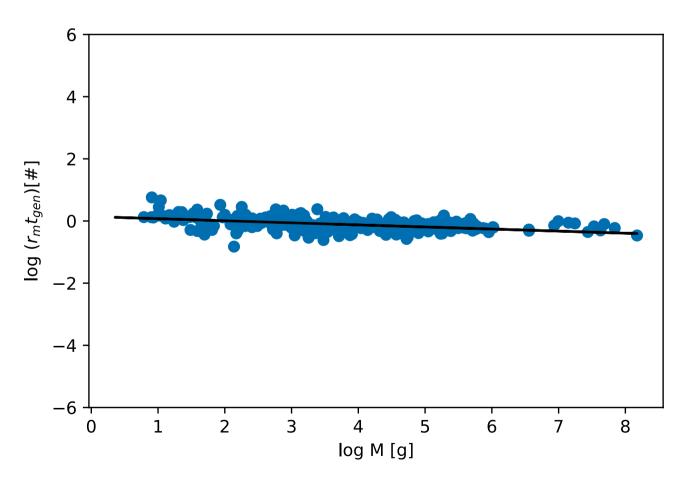
and this is also a relation that can be tested. For this purpose, we use the data in Duncan et al. (2007), which compiles the ages at first reproduction ( $\sim t_{gen}$ ) and maximum population growth rates for mammals. Figure 3 displays the data collected in Duncan et al. (2007), which is in overall agreement with Eq. 9, with no relevant slope with body mass. The solid line denotes the best fit to the data ( $r_m t_{gen} = 1.38 \, M^{-0.067}$ ), which has an average scatter of 0.2 dex. Dillingham et al. (2016) also found equivalent results on this expected inverse relationship using a more sophisticated Bayesian analysis.

The normalizations from the best fit to the data in Figs. 2 and 3 give estimations for  $r_m t_{life} \sim 3.35$  (Fig. 2) and  $r_m t_{gen} \sim 1.38$  (Fig. 3), which in principle can be combined with Eqs. 8 and 9 to determine some of their constants. Unfortunately, it is not possible to determine the constants  $(\bar{b}, \bar{d})$  associated with the dimensionless birth and death rates since Eqs. 8 and 9 are not (linearly) independent equations, but it is still possible to determine that

 $\frac{r_m t_{gen}}{r_m t_{lige}} = G \sim 0.41$ . This is for the average lifespan in the wild because in Hatton et al. (2019), lifespans were normalized to those values, and since maximum lifespans are about 2.5 times the average lifespans in the wild (McCoy and Gillooly 2008), we determine from Figs. 2 and 3 that  $\frac{t_{gen}}{t_{life}} = G^{min} \sim 0.16$ , which agrees with the value determined from the average of the predicted G values in Table 2 ( $G^{min} \sim 0.17$ ).

### Summary

In this paper, we explored the implications of the new metabolic relation (Escala 2019) for ontogenetic growth and found that it can be described by a universal ontogenetic growth curve for all studied species without the aid of ad hoc fitting parameters. The same universal growth curve in West et al. (2001) and Banavar et al. (2002) is found when certain dimensionless quantities are properly defined, but in our case, the characteristic growth timescale (t<sub>erowth</sub>) is set by



**Fig. 3** Generation times  $(t_{gen})$  times the maximum population growth rates  $(r_m)$  for mammals, compiled by Duncan et al. (2007). The solid line denotes  $r_m t_{gen} = 1.38 \, M^{-0.067}$ , which is the best fit to the data and has an

average scatter of 0.2 dex. The best-fitted relation is in overall agreement with the predicted Eq. 9, with no relevant slope with body mass



the inverse of the heart frequency  $f_H^{-1}$ , rescaled by the ratio between the specific energies (per unit of mass) required for metabolism and the creation of new biomass; these are all quantities with clear physical or biological meaning and not obscure fitting parameters. The results for universal growth have the same interpretations as before in terms of conservation of energy, since they come from the same Bertalanffy-type equation, but in our case, the results do not rely on a specific model. Instead, they illustrate the advantages obtained when empirical data are properly described and quantified, reaching this simple description without extra assumptions.

We also explored the implications of the discussed ontogenetic growth model for the generation time, finding that the predicted t<sub>gen</sub> can explain the origin of several "Life History Invariants" when is it combined with the invariant number of respiration cycles per lifetime, a relation that comes from the generalization of the well-known relation of the constant number of heartbeats in a mammal's lifetime (Levine 1997; Cook et al. 2006). In particular, regarding the invariant ratio between the lifespan and age at maturity (G =  $\frac{t_{gen}}{t_{lif.}}$ ), which has been traditionally explained in terms of life-history evolution theory, in our formalism, the value of this life-history invariant is predicted in terms of the relevant energetics and the invariant number of respiration cycles per lifetime. The predicted G and its variation between taxonomic groups shows consistency with the empirically determined value (Table 2). We also showed that other life-history invariants (Charnov 1993) come directly from the universal ontogenetic growth curve and the invariant G.

We finally studied predictions for population growth, finding that the invariant G implies a Malthusian parameter  $\mathbf{r}_m$ , or intrinsic population growth rate, that is inversely proportional to both  $\mathbf{t}_{gen}$  and  $t_{life}$ . We find that these inverse relations are indeed observed in nature, with no relevant slope with body mass and relatively low scatter (0.5 dex for  $\mathbf{r}_m t_{life}$  in Fig. 2 and 0.2 dex for  $\mathbf{r}_m t_{gen}$  in Fig. 3). The ratio  $\mathbf{G}^{min} = \frac{t_{gen}}{t_{life}^{max}}$  that can be estimated from the two best-fitted relations ( $\frac{r_m t_{gen}}{r_m t_{life}^{min}} = G^{min} \sim 0.16$ ) is also consistent with our predicted  $\mathbf{G}^{min}$  ( $\sim 0.17$ ; Table 2). We find relatively constant values for

 $G^{min}$  ( $\sim 0.17$ ; Table 2). We find relatively constant values for the total births and deaths per capita per characteristic time ( $\bar{b}$  and  $\bar{d}$  in Eq. 8), besides the diversity of life histories in living organisms on Earth, which supports the so-called "Equal Fitness Paradigm."

In our formalism, the allometric scaling relations for several critical timescales and rates ( $t_{life}$ ,  $t_{gen}$  and  $r_m$ ) are all derived from their proportionality to  $f_H$ ; therefore, the mass scaling  $f_H \propto M^{-1/4}$  directly explains other well-known allometries (lifespan, generation time, and Fenchel allometries), naturally explaining why most biological times and rates scale as  $M^{-1/4}$  and  $M^{1/4}$  (Savage et al. 2004; Burger et al. 2021). Additionally, the variations from 1/4 scaling should

be explained in terms of the variation in the  $f_H$  mass scaling, since such quantities ( $t_{life}$ ,  $t_{gen}$ , and  $r_m$ ) should have the same mass scaling as  $f_H$  regardless of whether they are 1/4, being a clear testable prediction. This in fact was the case for the metabolic rate relation (Escala 2019).

Nevertheless, our formalism is empirically motivated and does not explain why  $f_H$  should scale as  $M^{-1/4}$  or with another exponent; thus, it is compatible with previous attempts that explained the exponent for the allometric scaling of metabolism and related quantities (West et al. 1997, 1999; Banavar et al. 1999, 2010; Darveau et al. 2002) insofar as the mechanism is based on the anatomy and physiology of the circulatory system. In the context of this work, any attempt to explain the allometric scaling of the heart frequency  $f_H$  will also explain the allometric scaling of metabolism, lifespan, generation time, and the Malthusian parameter, since they are all quantities (either directly or inversely) proportional to  $f_H$  in our formalism, but such explanation could still be one of the previously proposed (West et al. 1997, 1999; Banavar et al. 1999, 2010; Darveau et al. 2002). The difference between these two (compatible) approaches is that the proposed new metabolic formula (and the original one by Kleiber) relates the metabolic rate to macroscopic physiological variables (such as mass, heart frequency), which can be applied to describe a phenomena, such as ontogenetic growth curves. Differently, mechanistic explanations for the "1/4 scaling" of the macroscopic physiological variables (e.g., metabolic rate, heart frequency) are attempts to explain their allometric scaling in terms of a microscopic model (i.e., thru a model of the circulatory system). This is similar to the difference in physics between the (empirically-based and axiomatic) laws of thermodynamics and the statistical mechanics that explain them.

Finally, it is important to emphasize that our predictions were tested without the aid of any free (fitting) parameters. The fitting procedures are shown in Figs. 1, 2, and 3 only for comparison with our predictions, not to determine any free parameters for our formalism. Thus, our formalism follows the criteria suggested by Ginzburg and Jensen (2004) for judging ecological theories, in terms of reducing to a minimum the number of parameters with no empirically determined range. In additionalso directly tested in Fig. 1 ( $E_{2019}$ ) and indirectly in terms of the G value empirically determined by Figs. 2 and 3 ( $E_{2019}$  and  $N_r$ ; Eq. (6)), further supporting the relations for metabolism and lifespan used in this paper.

**Author contributions** A.E. wrote the main manuscript text, performed the calculations, and prepared Figs. 1–3.

**Funding** A.E. acknowledge partial support from the Center of Excellence in Astrophysics and Associated Technologies (FB210003) and Millenium Nucleus NCN19\_058.



**Availability of data and material** In Table 1 for Fig. 1, in Hatton et al. (2019) for Fig. 2, and in Duncan et al. (2007) for Fig 3.

Code availability Under request.

### **Declarations**

Ethics approval Not applicable.

Consent to participate Not applicable.

**Consent for publication** Not applicable.

**Conflict of interest** The author declares no competing interests.

**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 licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence 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 licence, visit http://creativecommons.org/licenses/by/4.0/.

### References

- Anderson JF (1970) Metabolic rates of spiders. Comp Biochem Physiol 33:51–72
- Anderson JF (1974) Responses to starvation in the spiders Lycosa Lenta Hentz and Filistata Hibernalis (Hentz). Ecology 55:576–585
- Banavar JR, Maritan A, Rinaldo A (1999) Nature 399:130–132
- Banavar JR, Damuth J, Maritan A, Rinaldo A (2002) Ontogenetic growth: modelling universality and scaling. Nature 420:626
- Banavar JR, Moses ME, Brown JH, Damuth J, Rinaldo A, Sibly RM (2010) A general basis for quarter-power scaling in animals. Proc Natl Acad Sci USA 107:15816–15820
- Basener WF, Sanford JC (2018) The fundamental theorem of natural selection with mutations. J Math Biol 76:1589–1622
- Beverton RJH, Holt SJ (1959) In Ciba Foundation Colloquia in Ageing. V. The lifespan of animals, G. E. W. Wolstenholme, M. O?Connor, Eds. (Churchill, London), pp. 142-177
- Bonner JT (1965) Size and cycle. Princeton University Press, USA Bridgman PW (1922) Dimensional analysis. Yale University Press
- Brody S (1945) Bioenergetics and growth. Reinhold, New York
- Brown JH et al (2018) Equal fitness paradigm explained by a tradeoff between generation time and energy production rate. Nat Ecol Evol 2:262–268
- Burger JR, Hou C, Hall CAS, Brown JH (2021) Universal rules of life: Metabolic rates, biological times and the equal fitness paradigm. Ecol Lett 24(6):1262–1281
- Calder WA III (1968) Respiratory and heart rates of birds at rest. Condor 70:358–365
- Calder WA (1984) Size, function, and life history. Harvard University Press, Cambridge, MA
- Carrel JE, Heathcote RD (1976) Heart rate in spiders: influence of body size and foraging energetics. Science 193:148–150
- Charnov EL (1993) Life history invariants: some explorations of symmetry in evolutionary ecology. Oxford University Press, Oxford

- Charnov EL (2008) Fish growth: Bertalanffy k is proportional to reproductive effort. Environ Biol Fish 2008(83):185–187
- Charnov EL, Berrigan D (1990) Dimensionless numbers and life history evolution: age of maturity versus the adult lifespan. Evol Ecol 4:273–275
- Charnov EL, Berrigan D (1991) Evolution of life history parameters in animals with indeterminate growth, particularly fish. Evol Ecol 5:63–68
- Charnov EL, Turner TF, Winemiller KO (2001) Proc Natl Acad Sci USA 98:9460
- Clark TD, Farrell AP (2011) Effects of body mass on physiological and anatomical parameters of mature salmon: evidence against a universal heart rate scaling exponent. J Exp Biol 214:887–893
- Cook S et al (2006) High heart rate: a cardiovascular risk factor? Eur Heart J 27:2387–2393
- Cushing DH (1968) Fischeries biology. Univ, Wisconsin Press, Madison, Wisconsin
- Damuth J (1981) Population density and body size in mammals. Nature 290:699–700
- Darveau CA, Suarez RK, Andrews RD, Hochachka PW (2002) Allometric cascade as a unifying principle of body mass effects on metabolism. Nature 417:166–170
- de Magalhaes JP, Costa J (2009) A database of vertebrate longevity records and their relation to other life-history traits. J Evol Biol 22:1770–1774
- de Magalhaes JP, Costa J, Church GM (2007) An analysis of the relationship between metabolism, developmental schedules, and longevity using phylogenetic independent contrasts. J Gerontol A Biol Sci Med Sci 62:149–160
- Demetrius L (1974) Demographic parameters and natural selection. Proc Natl Acad Sci 71:4645–4647
- Demetrius L (1975) Natural selection and age-structured populations. Genetics 79:535–544
- Demetrius L (1997) Directionality principle in thermodynamics and evolution. Proc Natl Acad Sci 94:3491–3498
- Detweiler DK, Erickson HH (2004) Regulation of the Heart, in Dukes' Physiology of Domestic Animals, 12th ed., Reece WO, Ed. Copyright by Cornell University
- Dillingham PW et al (2016) Improved estimation of intrinsic growth rmax for long-lived species: integrating matrix models and allometry. Publications, Agencies and Staff of the U.S. Department of Commerce. Paper 535
- Duncan RP et al (2007) Testing the metabolic theory of ecology: allometric scaling exponents in mammals. Ecology 88:324–333
- Escala A (2019) The principle of similitude in biology. Theor Ecol 12(4):415–425
- Escala A (2022) Universal relation for life-span energy consumption in living organisms: insights for the origin of aging. Sci Rep 12:2407
- Fenchel T (1974) Intrinsic rate of natural increase: the relationship with body size. Oecologia 14:317–326
- Fisher RA (1930) The genetical theory of natural selection. Oxford: Clarendon Press, New York: Dover
- Gardner A, Allsop DJ, Charnov EL, West SA (2005) Am Nat 165:551
   Gillooly JF, Brown JH, West GB, Savage VM, Charnov EL (2001)
   Effects of size and temperature on metabolic rate. Science 293:2248–2251
- Ginzburg LR, Jensen CXJ (2004) Rules of thumb for judging ecological theories. Trends Ecol Evol 19(3)
- Harris C (2009) A guide to traditional pig keeping. Good Life Press Hatton IA et al (2019) Linking scaling laws across eukaryotes. PNAS 116(43):21616–21622
- Hou C, Zuo WY, Moses ME, Woodruff WH, Brown JH, West GB (2008) Energy uptake and allocation during ontogeny. Science 322:736–739
- Jurgens KD et al (1996) Heart and respiratory rates and their significance for convective oxygen transport rates in the



- smallest mammal, the Etruscan shrew Suncus etruscus. J Exp Biol 199:2579-2584
- Kleiber M (1932) Body size and metabolism. Hilgardia 6:315-351
- Kovacs L, Kezer FL, Tozser J, Szenci O, Poti P, Pajor F (2015) Heart rate and heart rate variability in dairy cows with different temperament and behavioural reactivity to humans. PLoS ONE 10(8):e0136294
- Levine HJ (1997) Rest heart rate and life expectancy. J Am Coll Cardiol 30:1104–1106
- Mahida N, Aohagi Y (2001) Electrocardiography, heart rates, and heart weights of free-living birds. J Zoo Wildl Med 32(1):47–54
- Malthus TR (1798) An essay on the principle of population. J. Johnson, London
- McCoy MW, Gillooly JF (2008) Predicting natural mortality rates of plants and animals. Ecol Lett 11:710–716
- Moses ME et al (2008) Revisiting a model of ontogenetic growth: estimating model parameters from theory and data. Am Nat 171(5):632-645
- Nee S, Colegrave N, West SA, Grafen A (2005) The illusion of invariant quantities in life histories. Science 309:1236
- Pauly D (1980) On the interrelationships between natural mortality, growth parameters and mean environmental temperature in 175 fish stocks. J Cons Int Explor Mer 39:175–192
- Price GR (1972) Fisher's fundamental theorem made clear. Ann Hum Genet Lond 36:129–140
- Ramsey JJ, Harper ME, Weindruch R (2000) Restriction of energy intake, energy expenditure, and aging. Free Rad Biol Med 29:946–968
- Reiss MJ (1989) The allometry of growth and reproduction. Cambridge University Press, Cambridge
- Ricklefs RE (2003) Is rate of ontogenetic growth constrained by resource supply or tissue growth potential? A comment on West et al'.s model. Funct Ecol 17:384–393

- Savage VM, Gillooly JF, Woodruff WH, West GB, Allen AP, Enquist BJ, Brown JH (2004) The predominance of quarter-power scaling in biology. Funct Ecol 18:257–282
- Schmidt-Nielsen K (1984) Scaling: why is animal size so important? Cambridge University Press
- Speakman JR (2005) Body size, energy metabolism and lifespan. J Exp Biol 208:1717–1730
- von Bertalanffy L (1957) Quantitative laws in metabolism and growth. O Rev Biol 32:217–231
- Wardle CS, Kanwisher JW (1973) The significance of heart rate in free swimming cod, Gadus morhua: some observations with ultrasonic tags. Mar Behav Physiol 2(1–4):311–324
- Weibel ER, Bacigalupe LD, Schmidt B, Hoppeler H (2004) Allometric scaling of maximal metabolic rate in mammals: muscle aerobic capacity as a determinant factor. Respir Physiol Neurobiol 140:115–132
- Weibel ER, Hoppeler H (2005) Exercise-induced maximal metabolic rate scales with muscle aerobic capacity. J Exper Biol 208:1635–1644
- Welty JC, Baptista L (1988) The life of birds. Saunders College Publishing, New York
- West G, Brown J, Enquist BJ (1999) The fourth dimension of life: fractal geometry and allometric scaling of organisms. Science 284:1677–1679
- West GB, Brown JH, Enquist BJ (1997) A general model for the origin of allometric scaling laws in biology. Science 276:122–126
- West GB, Brown JH, Enquist BJ (2001) Nature 413:628-631
- White Craig R et al (2007) Allometric exponents do not support a universal metabolic allometry. Ecology 88:315–323

