1 Highlights

- We parameterize and validate a DEB model of *Pinna nobilis* accounting for metabolic acceleration.
- Ontogeny is captured well, and parameters are consistent with those of related species.
- Ontogeny of post-larval life stages is described well under the assumption of isometric growth.
- The model predicts growth and reproduction under various food and temperature conditions.
- Estimating food availability from individual sizes is plausible when food limits growth.

Dynamic energy budget of endemic and critically endangered bivalve *Pinna nobilis*: a mechanistic model for informed conservation

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Abstract 12

The noble pen shell Pinna nobilis L. is the largest, endemic, critically endangered, and protected bivalve of the Mediterranean Sea. Effective conservation and management strategies for this species highly depend on understanding how environmental change and anthropogenic pressures, impact its physiology and thereby ecological function, population persistence, and survival. Dynamic Energy Budget (DEB) theory offers a valuable mechanistic modelling framework for capturing how an organism acquires and utilizes available energy for growth, maturation, development and reproduction throughout its life cycle, while accounting for environmental conditions. In this study we parameterized and compared two types of DEB models using limited literature data: a standard model that accounts for morphological metamorphosis only, and a model that through metabolic acceleration between birth and metamorphosis captures physiological changes occurring in the larval life stage. The model with metabolic acceleration performed better, successfully simulating life history traits, growth, and reproduction of *P. nobilis*. We used the model to predict how food availability implemented through functional response affects growth, maturation, and reproduction of the species throughout its lifespan. We found that (i) abundant food had little effect on the size at maturation, (ii) maximum fecundity at ultimate age doubled compared to typically lower food availability in the wild, (iii) puberty could not be reached below the food availability corresponding to functional response value of 0.164, and (iv) energy allocated to reproduction was positively correlated with both bivalve size and food availability. Accounting for allometric growth observed in *P. nobilis* did not affect the findings, prompting us to recommend that isometric growth be assumed when modelling the bivalve using DEB. The model presented here is the first full-life cycle bioenergetic model made for *P. nobilis*. It can be used standalone for predicting energy budget of individuals at specific environmental conditions, or as a building block for modeling populations and ecosystems under various environmental scenarios. The model can readily incorporate other environmental factors relevant to changes in physiology and energy allocation, such as oxygen and pH.

Keywords: Noble pen shell, Dynamic Energy Budget (DEB) theory, Parameter estimation, Life 13

history, Food availability, Conservation 14

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15 1. Introduction

The noble pen shell *Pinna nobilis* (Linnaeus, 1758) is the largest endemic bivalve of the Mediterranean 16 Sea. Initially collected for its meat, byssus threads, and as a souvenir, the bivalve has also been impacted 17 by other human activities such as boat anchoring, coastal construction, and illegal trawling (Katsanevakis 18 et al., 2011; Deudero et al., 2015; Basso et al., 2015b). Despite being protected in Croatia since 1977 19 and Europe-wide since 1992 (EU Directive 92/43/EEC, Barcelona Convention Annex II), P. nobilis has 20 been experiencing an accelerated decline, culminating with mass mortality events due to parasite infec-21 tions that started in 2016 (Vázquez-Luis et al., 2017; Cabanellas-Reboredo et al., 2019; Carella et al., 22 2019). Consequently, in October 2019, conservation status of P. nobilis was updated from endangered to 23 critically endangered (Kersting et al., 2019). As an immediate action, several Mediterranean institutions 24 started ex situ conservation programs focused on captive breeding and reintroduction (Kersting et al., 25 2019; Prado et al., 2019), with additional emphasis on preserving still intact wild populations. To be 26 effective, such conservation programs require understanding of how environmental changes and anthro-27 pogenic pressures impact physiology of the species, and thereby their ecological function, population 28 persistence, and survival (Seebacher and Franklin, 2012). The idea of integrating physiology perspective 29 into conservation was conveniently summarized under the term *conservational physiology* (Wikelski and 30 Cooke, 2006; Cooke et al., 2013). 31

Mechanistic predictive models play a significant role in conservational physiology by predicting how various scenarios of environmental change affect organisms and populations, thus informing conservation planning (Urban et al., 2016; Ijima et al., 2019; Marn et al., 2020). Individual-level bioenergetic models are especially valuable because they reveal how the organisms use currency of life - energy - for various physiological processes across a range of environmental scenarios.

Bioenergetic models based on Dynamic energy budget (DEB) theory (Kooijman, 2010) benefit from 37 a particularly flexible parameterization: while only limited data is *necessary*, a wide range of data types 38 and sources can be assimilated. DEBtool, a specialized DEB parameter estimation tool, facilitates 39 assimilation by mostly automatizing the parameter estimation procedure (Lika et al., 2011; Marques 40 et al., 2019). A well parameterized DEB model interconnects fundamental life processes of an individual 41 - energy assimilation, growth, development, maintenance, and reproduction - at all life stages, while 42 accounting for a dynamic environment (Sousa et al., 2008; Nisbet et al., 2012). If we assume that the 43 idealized individual – i.e., one holding average characteristics – is representative of a population, then 44 gaining insight into its complex energy dynamics enables assessment of population-level response to a 45 range of environmental conditions. 46

In this study we parameterize a DEB model of *Pinna nobilis* using growth and reproduction data available from the literature. Following an introduction of biology and ecology of *P. nobilis* and overview of the DEB modelling approach, we provide a description of data used for parameterization. We then present model parameters and the model validation, and discuss physiological implications of the results
focusing on growth and reproductive output as a function of food availability. We end by discussing a possibility of scaling up the DEB model to be used as a building block for modeling impacts of environmental
change on higher levels of biological organisation.

54 2. Material and Methods

55 2.1. Biology and ecology of P. noblis

The noble pen shell *Pinna nobilis* is one of the largest and long -living bivalves worldwide, reaching up to 120 cm in length (Zavodnik et al., 1991) and more than 27 years of age (Galinou-Mitsoudi et al., 2006; Rouanet et al., 2015). It has been endemic to the Mediterranen Sea since Miocene, occupying coastal areas up to 60m of depth (Gómez-Alba, 1988; Zavodnik et al., 1991). Associated with soft sediments, it inhabits primarily seagrass meadows or bare sand, where it is partially buried and fixed in the substrate, with the posterior end projected into the water column (Šiletić and Peharda, 2003; Katsanevakis, 2005; Marin et al., 2011).

P. nobilis is a successive hermaphrodite, developing both male and female gonads and experiencing 63 asynchronous gamete maturation (Deudero et al., 2017). The gonad development starts in early spring, 64 followed by the spawning season during summer (De Gaulejac, 1993; Richardson et al., 1999). P. nobilis 65 undergoes the classical bivalve development, starting of as a larvae that initiates feeding after two days, 66 and settles within 10 days (Trigos et al., 2018). The settlement usually occurs in late summer and early 67 autumn (Butler et al., 1993). Once settled, the individual grows rapidly and typically reaches sexual 68 maturity by the age of two years (Butler et al., 1993; Richardson et al., 1999). The reproduction and 69 recruitment potential vary between years (Peharda et al., 2012; Vafidis et al., 2014) because they depend 70 on pre-spawning state of the adult (Cabanellas-Reboredo et al., 2009), and are strongly influenced by 71 environmental conditions.

P. nobilis has two major ecological roles: (i) as a large filter feeder, it contributes to water clarity by retaining substantial amounts of detritus and organic matter (Trigos et al., 2014), and (ii) it supports biodiversity of soft-bottom areas by providing hard substrate and shelter for other benthic organisms (Garcia-Marsh and Vicente, 2006; Basso et al., 2015b). Due to its susceptibility to various pressures, *P. nobilis* also serves as an important bio-indicator of health status for Mediterranean ecosystems (Cabanellas-Reboredo et al., 2019).

79 2.2. Application of DEB theory to P. nobilis

We used Dynamic Energy Budget (DEB) theory (Sousa et al., 2008; Kooijman, 2010; Jusup et al., 2017) to model the energy budget and life cycle of *P. nobilis*. The theory describes and quantifies the flow of mass and energy within the organism by obeying thermodynamic principles. Contrary to other available bioenergetic models, DEB models describe the organism's energy budget throughout the whole
life cycle, from embryonic to adult life stages, while accounting for impact of environmental conditions
(primarily temperature and food) on physiological processes (Kooijman, 2010; Jusup et al., 2017).

DEB theory applies to all life on Earth and, to accommodate special requirements of specific taxa 86 such as extra life stage or metabolic change, it allows for the construction of variety of typified DEB 87 models (Marques et al., 2018). All typified models are variations on the standard DEB model, with state variables and energy fluxes following the same basic concept, albeit including additional processes and the related parameters. Choosing the typified model, or otherwise extending the basic model should be 90 based on insights into physiological characteristics of the species. If the insights are lacking, then using 91 the simplest model that yields satisfactory results is the conservative approach that minimizes overfitting. 92 To model *P. nobilis*, two specific ontogeny characteristics need to be considered: possible metabolic 93 change at metamorphosis, and allometric growth after metamorphosis. Because available data are in-94 sufficient to a-priori identify the more appropriate model, we parameterized different variants of the 95 DEB model. First, we compared the standard DEB model to a model accounting for metabolic change 96 assuming isometric growth. Following the comparison, we investigated the effects of allometric growth. 97

Standard DEB model. The standard (std) DEB model divides organism into compartments described 98 by 4 state variables: energy reserve (E), structure (V), maturity (E_H) , and reproduction buffer (E_R) 99 (Fig. 1). The energy flow through the organism is tracked by specifying energy fluxes. Energy is ingested 100 (\dot{p}_X) through feeding, assimilated into reserve (\dot{p}_A) , and mobilized for physiological processes (\dot{p}_C) . A 101 fixed fraction (κ) of energy is mobilized to somatic branch, where it is used for maintaining current 102 structure of the organism (somatic maintenance, \dot{p}_S) and for somatic growth (\dot{p}_G). Remaining fraction 103 $(1-\kappa)$ is allocated into reproductive branch, where it is spent on maintaining developmental complexity of 104 the organism (maturity maintenance, \dot{p}_J), and maturation before - or reproduction after - the organism 105 becomes an adult (\dot{p}_R) . Once defined, the energy fluxes determine differential equations guiding the 106 dynamics of state variables (Table 1). 107

State variables of the DEB model in principle cannot be measured directly, and need to be related to observable quantities where possible. Structural volume, V, is a cube of structural length, L, and is related to physical length of the organism, L_w , through an auxiliary parameter shape coefficient, δ_M :

$$L = \delta_M L_w \tag{1}$$

The physical length has to be carefully chosen to accurately represent the size of the organism, and has to be independent of energy reserves and/or reproductive buffer (i.e., fatness).



Figure 1: Schematic representation of a DEB model with associated state variables (boxes) and energy fluxes (arrows). State variables: reserve (E), structure (V), maturity (E_H), reproduction buffer (E_R). Energy fluxes: \dot{p}_X - ingestion, \dot{p}_A - assimilation, \dot{p}_C - mobilization, \dot{p}_S - somatic maintenance, \dot{p}_G - growth, \dot{p}_J - maturity maintenance, \dot{p}_R - maturation/reproduction. A fixed fraction of energy, $\kappa \dot{p}_C$, is mobilized into somatic branch, while the remaining energy, $(1-\kappa)\dot{p}_C$, goes to reproductive branch.

As most bivalves, *P. nobilis* undergoes a larval life stage and metamorphoses into an adult bivalve. Hence, at least two measures of physical length are needed to describe the organism: the larvae diameter before, and shell length after metamorphosis. The morphological transformation from one stage to the other is captured using an additional shape coefficient corresponding to larval shape.

Metabolic change at metamorphosis. Life history traits of *P. nobilis* suggest that a change in morphology may not be sufficient to explain substantial adaptations required for changing from a freedrifting planktonic to a sessile benthic way of life. We hypothesize that metamorphosis of *P. nobilis* may also involve a metabolic change that cannot be captured by the *std* model; a typified *abj* model should be used instead (Kooijman, 2014; Marques et al., 2018).

The typified *abj* model is a one-parameter extension of the above described *std* model that, alongside the extra shape coefficient to address larvae shape, also includes an acceleration factor, s_M , accounting for metabolic acceleration between birth and metamorphosis. Acceleration factor increases from unity at birth to its maximum value at metamorphosis, and thereafter remains constant, equal to ratio of length at metamorphosis L_j , and length at birth L_b :

$$s_M = \frac{L_j}{L_b} \tag{2}$$

Acceleration factor increases values from birth to metamorphosis of two primary parameters: surfacespecific maximum assimilation rate $\{\dot{p}_{Am}\}$ and energy conductance \dot{v} . The increase, in turn, affects energy fluxes determining the dynamics of state variables (Table 1).

Table 1: Energy fluxes and state variables of the standard (*std*) and typified *abj* DEB models. The *abj* model is a oneparameter extension of the *std* model - acceleration factor s_M (indicated in bold) affects assimilation (\dot{p}_A) and mobilisation (\dot{p}_C) energy fluxes. Even though dynamics is impacted by the differences in \dot{p}_A and \dot{p}_C , both models share general mathematical expressions for ingestion (\dot{p}_X), growth (\dot{p}_G) and maturity/reproduction (\dot{p}_R), and state variables reserve (*E*) and structure (*V*). Somatic and maturity maintenance (\dot{p}_S , \dot{p}_J), and state variables maturity (E_H) and reproduction (E_R), are not impacted by the acceleration. The list of model parameters is presented in Table A.1 and Table 3, for the *std* and typified *abj* model, respectively.

Energy flux	std	abj		
Ingestion	į	$p_X = \frac{\dot{p}_A}{\kappa_X}$		
Assimilation	$\dot{p}_A = \left\{ \dot{p}_{Am} \right\} f L^2$	\dot{p}_A = $\{\dot{p}_{Am}\}\boldsymbol{s_M}fL^2$		
Mobilization	$\dot{p}_{C} = E \frac{\dot{v}[E_{G}]L^{2} + \dot{p}_{S}}{\kappa E + [E_{C}]L^{3}} \dot{p}_{C} = E \frac{\dot{v}s_{M}[E_{G}]L^{2} + \dot{p}_{S}}{\kappa E + [E_{C}]L^{3}}$			
Somatic maintenance	\dot{p}_S	$= [\dot{p}_M]L^3$		
Growth	\dot{p}_G :	= $\kappa \dot{p}_C - \dot{p}_S$		
Maturity maintenance	<i>į</i> bu politikas karalitiniai politikas karali	$\dot{E} = \dot{k}_J E_H$		
Maturity/Reproduction	\dot{p}_R = $(1-\kappa)\dot{p}_C-\dot{p}_J$			
State variable	std and abj			
Reserve	$\frac{dE}{dt} = \dot{p}_A - \dot{p}_C$			
Structure	$\frac{dV}{dt} = \frac{\dot{p}_G}{[E_G]} \qquad W$	here $V = L^3$		
Maturity	$\frac{dE_H}{dt} = \dot{p}_R \qquad \text{if} \qquad$	$E_H < E_H^p$ else $\frac{dE_H}{dt} = 0$		
Reproduction	$\frac{dE_R}{dt} = \kappa_R \dot{p}_R$ if	$E_H \ge E_H^p$ else $\frac{dE_R}{dt} = 0$		

Allometric growth. In this study we initially assume that P. nobilis has isometric growth both before 130 and after metamorphosis. However, according to Katsanevakis et al. (2007), the shell of P. nobilis exhibits 131 allometric growth best described using two-segment allometric model with a breakpoint at the length of 132 20 cm. Up to the breakpoint, relative growth of width in relation to length is strongly positive, i.e. the 133 bivalve preferentially widens, while thereafter the allometry becomes negative, and the bivalve elongates. 134 In order to investigate whether allometric growth impacts the physiological energetics of the bivalve, 135 we parameterized an additional ab_j model accounting for allometric growth as described in detail in 136 Appendix C. 137

Environmental factors. Both *std* and *abj* models incorporate impacts of two environmental factors, temperature and food, on physiological processes. This allows inclusion of multiple data sets collected under various environmental and laboratory conditions into single parameterization process. Effects of environmental temperature are incorporated as a correction factor based on the Arrhenius expression

$$TC = \exp\left(\frac{T_A}{T_{ref}} - \frac{T_A}{T}\right) \tag{3}$$

where T_A is the Arrhenius temperature, T_{ref} is the reference temperature, and T is the environmental temperature. The factor is applied by multiplying physiological rates given at T_{ref} with the expression Eq. 3. We calculated Arrhenius temperature of *P. nobilis* using growth rate-temperature relation reported by Richardson et al. (1999). The correction applies to: assimilation $\{\dot{p}_{Am}\}$, energy conductance \dot{v} , specific volume-linked somatic maintenance rate $[\dot{p}_M]$, and maturity maintenance rate coefficient \dot{k}_J . Response to environmental food availability is incorporated as a Holling type-II functional response f that quantifies amount of food available, ranging from 0 (no food) to 1 (unlimited food):

$$f = \frac{X}{X + K} \tag{4}$$

where X is the environmental food concentration, and K the half-saturation constant.

150 2.3. Empirical data for parameterization and validation

For parameterization and validation of the models we gathered empirical data from literature. The 151 same data were used to parameterize all models. Data points representing information on life history traits 152 such as age and length at specific life events (birth, metamorphosis, puberty, ultimate) and reproduction 15 (gonadosomatic index - GSI, energy of an egg) are given in Table 2 (column 4). DEBtool refers to 154 these type of data as *zero-variate* data. Various time series and other series of data (e.g. growth rate vs. 155 length) constitute uni-variate data in DEB. We used uni-variate data on (i) average length vs. age for two 156 populations, length vs. time of two young individuals (1 and 2 year old), and growth rate vs. temperature 157 from Richardson et al. (1999); (ii) growth rate vs. length from Siletić and Peharda (2003); and (iii) 158 fecundity vs. length data from laboratory experiments performed by Trigos et al. (2018). All data were 150 extracted from graphs using PlotReader freeware (https://jornbr.home.xs4all.nl/plotreader/). 160

Data were accompanied with information on corresponding environmental temperature and functional 161 response f representing food availability. Initial value of f for each sampling site was estimated according 162 to Marn et al. (2017), as a ratio of site-specific ultimate size (the largest individual ever reported for 163 respective sampling site), and the size of the largest individual ever reported, i.e. 120 cm (Zavodnik et al., 164 1991), which we assume to represent maximum size for the species at abundant food f = 1. Because such 165 estimates are not as reliable as measurements, we let f adjust itself during parameterization. Value of 166 f for assimilation of zero-variate data was similarly calculated by dividing the common ultimate size of 167 the species in the wild, 86 cm (Richardson et al., 1999), by the largest observed size of 120 cm. Value of 168 f for laboratory data was fixed to 1, assuming ad libitum feeding. All values of f are given in Table 4. 169

Model was validated using an independent length vs. time dataset from an *in situ* growth experiment reported by Kožul et al. (2012) with temperature data for the respective area taken from Peharda et al. (2012), and corresponding estimation of functional response value.

Table 2: Observed and fitted life history traits of *Pinna nobilis* using typified *abj* model, at functional response value f = 0.72. References denote the sources of observed data. RE represents relative error of the fitted values. Goodness of fit statistics: MRE = 0.202; SMSE = 0.194.

Data	Unit	Reference	Observed	Fitted	RE
Age at birth	d	Trigos et al. (2018)	2	1.98	0.01
Age at metamorphosis	d	Butler et al. (1993)	10	7.05	0.29
Age at puberty	у	Richardson et al. (1999)	1.5	1.26	0.15
Lifespan	у	Galinou-Mitsoudi et al. (2006)	27	27	< 0.01
Size at birth	cm	Trigos et al. (2018)	0.0085	0.0085	< 0.01
Length at metamorphosis	cm	Butler et al. (1993)	0.1	0.23	1.28
Length at puberty	cm	Deudero et al. (2017)	16.5	20.18	0.22
Ultimate shell length	cm	Richardson et al. (1999)	86	79.82	0.07
Initial energy of an egg	J	van der Veer et al. $\left(2006\right)$	0.001^{*}	0.001	0.02
Gonadosomatic index (GSI)	-	Deudero et al. (2017)	0.52	0.48	0.08

* Data for *Crassostrea gigas*

173 2.4. Parameter estimates and goodness of fit

We used DEBtool package (https://add-my-pet.github.io/DEBtool_M/) in Matlab R2011b to 174 estimate parameters of both std and typified abj P. nobilis DEB models, as well as the abj model 175 accounting for allometric growth. The estimation process follows a co-variation method which, based 176 on the provided data, aims to find a parameter set that minimizes the difference between predicted 17 and observed values using a Nelder-Mead search algorithm (Lika et al., 2011; Marques et al., 2019). The 178 parameterization requires initial values of primary parameters to facilitate start of the estimation process, 179 but do not constrain the final result. The initial values were either parameter values of related species, if 180 available, or of a generalized animal at the reference temperature (20°C) (Kooijman, 2010). 181

The obtained parameter set was evaluated for goodness of fit by computing Mean Relative Error (MRE) and Symetric Mean Square Errors (SMSE). The values lie in the interval $[0,\infty)$ and [0,1], respectively, where 0 indicates exact match between observed data and their predictions. To assign the completeness of the real data we followed guidelines in Lika et al. (2011).

186 2.5. Predicting impact of food availability on reproduction

Using the parameterized *abj* typified DEB model, we predicted the impact of food availability on the energy invested in growth, maturity and reproduction. Predictions were carried out for the common lifespan of *P. nobilis* (27 years), and for four food levels. Abundant food scenario was set as f = 1, common food level of wild populations was f = 0.72, and the lowest food scenario of f = 0.16 was selected as the highest f that did not support reproduction. An additional f = 0.3 was selected arbitrarily between the lowest and the common value to represent how lower food level affects organism that reproduces. We also predicted the combined effect of food availability and bivalve size on the amount of energy allocated to reproduction and the number of produced eggs (fecundity). To obtain the fecundity, we first multiplied the amount of energy accumulated in the reproductive buffer by the egg conversion efficiency κ_R , and then divided the result by the corresponding initial reserve of an egg for each food level.

197 3. Results

Estimated parameters of both *std* (Table A.1) and typified *abj* (Table 3) DEB models provided a good fit between the observations and the model outputs of *Pinna nobilis* traits. Overall performance of the *abj* model was better, resulting in more realistic simulations of life history traits (Table 2 vs. Table A.2) and growth of the species (Fig. 2a vs. Fig. A.1a).

Inclusion of the allometric growth into the *abj* model had minor impact on the parameter values, with largest effects on energy thresholds of life stages, and the shape coefficient after metamorphosis (Table C.1). Estimates of age, length at puberty, and ultimate length (data not shown) were closer to the values used for parameterization compared to the estimates obtained with the typified *abj* model. However, the allometric model had lower overall goodness of fit despite higher complexity and three additional parameters (MRE: 0.212 vs. 0.202; SMSE: 0.201 vs. 0.194; with vs. without allometry, respectively).

According to Lika et al. (2011), completeness of real data used for parameterization was 3 out of 10, among the top 3% in the AmP species database. Hereafter, we present results of the typified *abj* model, while the full results of the *std* model and the *abj* model accounting for allometric growth are given in Appendix A and Appendix C, respectively.

213 3.1. Model parameters

Shape coefficients, 0.611 and 0.066 for pre- and post metamorphosis phase, respectively, represent 214 the change from spherical to elongated shape very well. The acceleration factor s_M accelerates initial 215 metabolism to almost 3-fold at metamorphosis, with surface-specific assimilation rate $\{\dot{p}_{Am}\}$ reaching 216 $101.44 \,\mathrm{J \, d^{-1} \, cm^{-2}}$, and energy conductance \dot{v} increasing to $0.026 \,\mathrm{cm \, d^{-1}}$. Allocation to soma $\kappa = 0.53$ 217 implies that the energy is almost equally divided between the somatic and reproductive branches. The 218 volume-specific cost of structure $[E_G] = 2362 \,\mathrm{J \, cm^{-3}}$ is close to the median value of $2357 \,\mathrm{J \, cm^{-3}}$ for the 219 bivalves (AmP-collection, 2020), while the volume-specific maintenance cost $[\dot{p}_M]$ of 7.299 J d⁻¹ cm⁻³ is 220 somewhat at the low end, but still in the range reported for other bivalves $(0.49-51.68 \,\mathrm{J \, d^{-1} \, cm^{-3}}$ with an 221 outlier of 136.5 J d⁻¹ cm⁻³, 50 species). Maturity at puberty is relatively high, which is not rare for a long-222 living organism. The self-adjusted values of functional responses did not differ considerably from initially 223 estimated values, except for one sampling site where the initial value was underestimated (Table 4). 224

Parameter	Symbol	Value	Unit
Maximum surface-specific assimilation rate	$\left\{\dot{p}_{Am}\right\}$	$34.74 (101.44)^*$	J d ⁻¹ cm ⁻²
Fraction of food energy fixed in reserve	κ_X	0.80	_
Allocation fraction to soma	κ	0.53	_
Reproduction fraction fixed in eggs	κ_R	0.95	_
Maximal surface-specific searching rate	F_m	6.5	$\rm l~d^{-1}~cm^{-2}$
Energy conductance	\dot{v}	$0.0089 \ (0.026)^*$	${\rm cm}~{\rm d}^{-1}$
Volume-specific somatic maintenance rate	$[\dot{p}_M]$	7.299	$\rm J~d^{-1}~cm^{-3}$
Volume specific costs of structure	$[E_G]$	2362	$\rm J~cm^{-3}$
Maturation threshold for birth	E_H^b	$2.9 \cdot 10^{-04}$	J
Maturation threshold for metamorphosis	E_H^j	$7.3 \cdot 10^{-03}$	J
Maturation threshold for puberty	E_H^p	5601	J
Maturity maintenance rate coefficient	\dot{k}_J	0.002	d^{-1}
Zoom factor	z	2.52	-
Shape coefficient (larvae)	δ_{M1}	0.611	-
Shape coefficient (adult)	δ_{M2}	0.066	-
Acceleration factor	s_M	2.92	-
Reference temperature	T_{ref}	293.15	Κ
Arrhenius temperature	T_A	9002	Κ

Table 3: Parameter estimates of typified *abj* DEB model for *Pinna nobilis* at the reference temperature $T_{ref} = 20$ °C. Fixed parameters (κ_X , κ_R , F_m , T_{ref} , T_A) are indicated in bold.

* The value in the brackets is the parameter value after metamorphosis (affected by s_M).

Table 4: Initial estimates and fitted site-specific values of functional responses f using a typified *abj* model for *Pinna nobilis*. Values of f were estimated under the assumption that food limits growth, as the ratio between site-specific ultimate size and the largest *P. nobilis* individual ever reported^{*}. If not indicated differently, the site-specific ultimate size was taken from the corresponding reference (column 5). f was not fitted for zero-variate, laboratory, and validation data sets. The estimation procedure works well for 3 out of 4 localities, but fails for a locality with high anthropogenic influence, where size may not be limited by food (locality with estimate f = 0.38).

Site no.	Dataset	Estimated f	Fitted f	Reference
-	Zero-variate ¹	0.72	-	see Table 2
1	Length vs. age	0.41	0.43	Richardson et al. (1999)
2	Length vs. age	0.58	0.61	Richardson et al. (1999)
3	Length vs. time	0.38	1	Richardson et al. (1999)
3	Growth rate vs. temperature	0.38	1	Richardson et al. (1999)
4	Growth rate vs. length	0.65	0.55	Šiletić and Peharda (2003)
Lab	Fecundity vs. length	1	-	Trigos et al. (2018)
-	Length vs. age^2	0.58	-	Kožul et al. (2012)

* Largest recorded individual had 120 cm, reported in Zavodnik et al. (1991).

¹ The ultimate size used to estimate f, 86 cm, was taken from Richardson et al. (1999).

225 3.2. Simulation of life history traits, growth and reproduction

The fitting procedure captured the observed life history traits well (Table 2). Initial energy content of an egg, length at birth, and lifespan were close to observed values, while ultimate length and gonadosomatic index (GSI) were slightly underestimated. Age at metamorphosis and puberty were underestimated, and the corresponding length was overestimated, especially at metamorphosis.

Simulations successfully reproduced growth of adults (Fig. 2a) and young individuals (Fig. 2c). As expected, growth rate decreased with size (Fig. 2b), and for both 1- and 2- year old specimens increased with temperature (Fig. 2d). The model also captured positive correlation between size of the organism and its fecundity (Fig. 2e).

234 3.3. Validation of the model

Simulations agree well with independent growth data used for validation (Fig. 2f). Inclusion of water temperature corresponding to sampling area facilitated prediction of variable growth throughout the year, accurately capturing growth peak during warm, and growth stagnation during cold seasons. Consequently, validation suggests that the physiology of *P. nobilis* is well captured by the obtained parameter set.

239 3.4. Prediction of growth and reproduction for a range of food availability

The predictions of *P. nobilis* growth, maturity, energy allocated for reproduction, and fecundity for a 240 period of 27 years at four food levels are presented in Fig. 3. As expected at abundant food (f = 1), the 241 bivalve grows and matures the fastest, reaches puberty after 373 days at length of 20.6 cm, and has the 242 ultimate length of 110 cm (Fig. 3a and 3b, black dashed line). Lowering the food to the common level 243 of wild populations (f = 0.72), ultimate size and fecundity decreased 28% and 60%, respectively, while 244 time to reach puberty increased about 25%, compared to the abundant food (Fig. 3a and 3b, red line vs. 245 black dashed line; Fig. 3d, red dots vs. black crosses). Size at maturation was least impacted, decreasing 246 only 1%. For f = 0.3, maturity was reached after approx. 3 years at size of 19.5 cm (Fig. 3b, orange 247 dash-dotted line), and the reproduction output was 96% lower compared to abundant food (Fig. 3d, 248 orange diamonds vs. black crosses). For f < 0.164, the ultimate size of the bivalve was 16.6 cm, they 249 never reached puberty, and did not reproduce (Fig. 3, blue dotted line and blue 'x' markers). 250



Figure 2: Observed data (markers) and model simulations (lines) for *Pinna nobilis* using a typified *abj* DEB model. (a) Shell length vs. age for populations in Aguamarga (•, -) and Carboneras (\blacksquare , - -), Spain. (b) Growth rate vs. time for population in Mljet, Croatia. (c) Length vs. time and (d) temperature vs. growth rate for 2-year old (•, -) and 1-year old (•, -) individual from Villaricos, Spain. Arrow indicates assumed time of settlement of the younger bivalve. The older individual is assumed to have settled in mid-to-early autumn of the previous year. (e) Fecundity vs. shell length. (f) Validation: shell length vs. age for population in Mali Ston **Pay**, Croatia. Temperature (dashed line) is taken from Peharda et al. (2012). Observed data taken from: (a),(c) and (d) Richardson et al. (1999); (b) Šiletić and Peharda (2003); (e) Trigos et al. (2018); (f) Kožul et al. (2012).



Figure 3: Predictions of growth (3a), maturation (3b), annual energy allocated for reproduction (3c) and annual fecundity (3d) of *Pinna nobilis* for a lifespan of 27 years at different food levels. Value of f ranges from the highest f that did not support reproduction (f = 0.16) to ad libitum feeding (f = 1).

Fecundity (Fig. 4), derived from the amount of energy allocated to reproduction (Appendix B), shows a general positive correlation with size and functional response. However, higher number of eggs, albeit with lower initial reserve, can be found for lower food availability. This result, counter-intuitive to the nature of most bivalves that produce smaller amount of eggs when exposed to low food conditions, suggests a potential modelling artefact.



Figure 4: Fecundity (number of eggs per year) of *Pinna nobilis* depending on the bivalve size and food availability, predicted using the typified *abj* model. The gray area represents sizes greater than the maximum reachable for a given food availability. Darkest area corresponds to no reproduction. Energy required for sperm production is not included.

256 4. Discussion

Recent mass mortality events of the critically endangered endemic Mediterranean bivalve *Pinna nobilis* highlight the need for understanding the species' energy dynamics that could facilitate decision-making in conservation (Riva, 2002). We created a Dynamic Energy Budget (DEB) model to capture the energy dynamics of *P. nobilis*, and predict growth and reproduction for a range of food availability scenarios. The key step in model development was to determine how metamorphosis should be accounted for. To this end, we parameterized a standard (std) and a modified (typified abj) DEB model and compared their outputs. Additionally, we investigated effects of allometry after metamorphosis by comparing outputs of abj models with and without allometric growth.

The inclusion of allometric growth into the *abj* model had minor effect on the parameter values and 265 on the overall model performance. Increased complexity of the model yielding practically identical results 266 prompts us to recommend that isometric shell growth be assumed when modelling the bivalve using DEB. 267 Better performance of the typified *abj* model compared to the *std* model indicates that *P. nobilis* 268 undergoes significant metabolic changes along with shape change during metamorphosis. The standard 269 DEB model (Appendix A), which only accounts for change in shape, results in (i) high maximum as-270 similation and somatic maintenance rates, high maximum reserve density, and high development speed, 271 with (ii) low energy conductance and low ultimate length. The typified abj model, on the other hand, by 272 accounting for metabolic acceleration between birth and metamorphosis, yields a better fit to the data, 273 and parameter values consistent with those of related species (AmP-collection, 2020; van der Veer et al., 274 2006; Saraiva et al., 2011; Sarà et al., 2013; Matzelle et al., 2014). 275

The acceleration of metabolism assumed by the abj model is consistent with physiological requirements 276 of both planktonic and benthic stage of *P. nobilis*. Assuming mainly larval dispersal (Garstang, 1951), 277 slow metabolism during the larval stage allows for more dispersal time (Kooijman, 2014). In contrast, 278 higher assimilation rate after settlement optimizes organisms' ability to retain available food, a very 279 important trait for a sessile filter feeder. The metabolic acceleration increases both assimilation and 280 mobilisation, keeping the maximum energy density and somatic maintenance rate constant (Kooijman, 281 2014). Increased maximum assimilation rate, combined with the relatively low somatic maintenance, 282 supports rapid growth characteristic of *P. nobilis*. 283

Seemingly underestimated maturation age of 15 months predicted by the typified *abj* model, compared 284 to 18 months typically observed (Richardson et al., 1999), offers insight into ontogeny of *P. nobilis*. 285 Observed maturation age is determined by looking at *results* of a reproductive effort such as advanced 286 gamete production or a spawning event. Maturation in DEB, however, denotes the *start* of energy 287 investment into reproduction. Therefore, time of gonad differentiation - although also an overestimate of 288 the true maturation time - is much closer to actual maturation than other observable physiological events 289 (e.g. spawning). Indeed, observations of gonad differentiation coincide with DEB estimate of maturation: 290 Deudero et al. (2017) reports differentiation starting in December, which would be 15 months after 291 settlement assuming typical spawning and settlement pattern in Butler et al. (1993) - just as predicted 292 by our abj DEB model. 203

When restricted by food, *P. nobilis* has less energy available for growth, maturation and reproduction. As a successive hermaphrodite, it will develop first male, and only later (at a larger size) female gonads (Deudero et al., 2017). Assuming male gonad development starts at 16.5 cm shell length, and female ²⁰⁷ gonad development at 23 cm shell length (Deudero et al., 2017), we see that *P. nobilis* will produce both ²⁰⁸ male and female gametes by the time of first spawning only when food availability is high. When food ²⁰⁹ availability is low, the bivalve will require an additional year to grow and start producing eggs.

For lower f, the model predicted smaller total energy committed to a reproductive event, smaller 300 initial reserve per individual larvae, but higher number of offspring per individual (fecundity, Fig. 4). 301 This apparent contradiction between higher fecundity for lower f results from the balance between size 302 and number of offspring corresponding to the environmental conditions due to the maternal effect (Smith 30 and Fretwell, 1974; Marshall and Uller, 2007; Segers and Taborsky, 2011). The general concept of the 304 maternal effect in DEB is that females in environments with lower food availability produce smaller eggs 305 that require less energy per egg (Kooijman, 2010); hence, even though total energy accumulated for 306 reproduction is lower, number of eggs (and, therefore, fecundity), might be higher. However, in bivalves, 30 more often than not, lower food availability results in smaller size and amount of produced eggs (Bayne 308 et al., 1978 cf. McEdward and Miner, 2003), suggesting that for *P. nobilis* higher fecundity found at 309 lower food availability could be a modelling artefact. Predictions agree with observations that lower f310 leads to smaller initial reserves for larvae. Lack of food could, therefore, impact the early developmental 311 phase of the bivalve, reducing its survival (Bayne, 1976; Helm et al., 2004), overall recruitment, and -312 consequently - viability of the population. 313

Results support the idea that environmental food level (f) can be estimated as a ratio of site specific 314 ultimate size and overall maximal size of the species. The initial estimates coincide with fitted f for three 315 out of four sampling sites, with one estimate significantly lower than the fitted value. The corresponding 316 site has, however, been under intense anthropogenic influence: severe trawling and collection of P. nobilis 317 specimens have been reported (Richardson et al., 1999), implying that human activities, rather than food, 318 constrained the ultimate size of the bivalves. We therefore conclude that the size-based food estimation 319 method is reliable when applied to non-disturbed locations where food is the main limiting factor, but is 320 of limited utility in areas where anthropogenic pressures prevail. 321

Food quality, not just quantity, could have effects on the ontogeny of *P. nobilis*. For simplicity, 322 we assumed all individuals assimilated food of the same quality; this is, however, typically not the 323 case. Small P. nobilis individuals ingest detritus of higher organic content than larger ones, who mostly 324 predate on phyto- and zooplankton (Davenport et al., 2011). Hence, size-differential feeding may have 325 to be considered when incorporating our model into ecological models, especially when modelling food 326 competition between different life stages. Disturbances such as coastal discharge, algal blooms, and 327 sediment re-suspension may influence the amount of available food for different size groups, support or 328 limit their performance, and impact population structure. The effects of food quality can readily be 329 incorporated into the DEB model by changing assimilation efficiency or a related parameter. 330

Temperature affects gonad maturation, onset of spawning, and survival during early development

(Basso et al., 2015a; Deudero et al., 2017). The optimal temperature for growth of *P. nobilis* is 20 °C, with 332 reproductive processes regulated by seasonal fluctuations between 16 °C and 25 °C (Trigos et al., 2015). 333 In the Mediterranean, temperatures range from 13 °C in winter to 27 °C in summer, which stresses the 334 bivalve at both extremes. Since the Mediterranean is a climate change hot-spot (Giorgi, 2006), extreme 335 temperatures are - especially in shallow coastal areas - expected to increase in severity and frequency, 336 thus posing additional stress on the bivalve (Basso et al., 2015b). Our model, by quantifying effects of 337 changing temperature on growth and reproduction, enables forecasting of effects of climate change, and 33 identification of potential problems facing the population as environmental conditions continue to evolve. 339 Characterised by slow population dynamics and low population recruitment (Cabanellas-Reboredo 340 et al., 2019), P. nobilis has limited capacity to overcome negative impacts. Current conservation sta-341 tus of the species requires employment of efficient conservation measures relying on (i) the ability to 342 cultivate individuals ex situ and reintroducing them into the wild, and (ii) effective protection of still 343 intact wild populations (Kersting et al., 2019). The cultivation and reintroduction efforts, as well as 344 wild population management, can benefit from predictions of how rearing and environmental conditions 345 dictate the performance of an individual and populations. The developed DEB model can facilitate such 346 predictions. As a standalone tool, the model can predict how organisms individually respond to potential 347 rearing conditions, and help optimise cultivation scenarios. The model can also help in selecting the most 348 appropriate individuals for cultivation and reintroduction, depending on the environmental conditions at 349 the reintroduction site. 350

Inclusion of DEB into population models is valuable because physiological processes of an individual ultimately significantly affect the population dynamics. DEB can be implemented into various population modelling approaches, such as matrix models (Klanjscek et al., 2006), individual-based models (Martin et al., 2012) and integral projection models (Smallegange et al., 2017). As a modelling building block, DEB incorporates biological realism of individual's functioning into population dynamics, with the ability to extrapolate individual changes to untested and dynamic environments (Jager et al., 2014; Marn et al., 2020).

The presented DEB model can be extended to include additional environmental factors. Given its 358 large size, *P. nobilis* requires high oxygen levels, and is therefore sensitive to hypoxia. This is especially 359 pronounced in enclosed shallow lagoons where high water temperatures facilitate oxygen depletion, and 360 can cause collapse of dense populations (Trigos et al., 2015). Inclusion of dissolved oxygen into the model 361 might improve the model performance and therefore give more reliable predictions. Since energy uptake 362 appears to be the process most sensitive to hypoxia (Thomas et al., 2019), the resulting effects of oxygen 363 availability on reserve dynamics, growth, and reproduction, can be accounted for by applying a correction 364 factor to the ingestion rate, as demonstrated for a related bivalve *Crassostrea gigas* (Thomas et al., 2019). 365 Another factor of potential interest is seawater pH, which is strongly affected by climate change. Within 366

DEB, impact of pH on metabolism has been explored to some degree (Muller and Nisbet, 2014), and applied to bivalves by adjusting relevant parameters to fit the data from impacted conditions (Klok et al., 2014). For *P. nobilis*, effects of low pH (i.e. acidification) are still understudied. However, for such a large calcifying organism, negative effects on physiological performance, metabolism, and calcification processes are likely, and may have to be accounted for in the future.

372 5. Conclusion

In this study, we used Dynamic Energy Budget (DEB) theory as a framework for creating a mech-373 anistic bioenergetic full life cycle model for critically endangered and protected Mediterranean endemic 374 species, *Pinna nobilis*. Using only literature data, and corresponding environmental temperature and 375 food availability, we successfully parameterized the model accounting for morphological and metabolic 376 metamorphosis. The model resulted in realistic predictions of growth, maturation and reproduction at 377 various food levels. Model can readily incorporate other relevant environmental factors, such as oxygen 378 and pH. Finally, the implementation of the DEB model into population and ecosystem models can trans-379 late individual responses into population and ecosystem dynamics, developing a guiding tool for effective 380 conservation decision-making. 381

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Appendices

559 A. Standard (std) DEB model

Next to the typified dynamic energy budget (DEB) model that accounts for metabolic acceleration between birth and metamorphosis (*abj*), we also parameterized a standard (*std*) DEB model of *Pinna nobilis*. With this step our aim was to determine whether metamorphosis of *P. nobilis* refers only to morphological change, which can be captured by the *std* model, or there is also a metabolic change which would be overlooked by the *std* and can be captured only by the *abj* model.

We parameterized the *std* model using the same empirical data as described in the section 2.3. Table A.1 presents fitted parameters for *std* model, along with parameters of typified *abj* model for comparison. Table A.2 presents observed and fitted life history traits for both *std* and typified *abj* model. Fig. A.1 presents the simulations obtained using *std* model.

Although statistics of goodness of fit indicated that *std* parameter set fits the data well, some obvious 569 discrepancies exist. Lifespan, size at birth, and initial energy of an egg were close to values used for 570 parameter estimation. However, shell length at puberty was overestimated, while remaining life history 571 traits were underestimated (Table A.2). The std model is characterized by constant primary parameter 572 values, so compared to the abj model, the bivalve modelled with std has high maximum surface-specific 57 assimilation rate $\{\dot{p}_{Am}\}$, low energy conductance \dot{v} , and relatively high volume-specific somatic mainte-574 nance rate $[\dot{p}_M]$ throughout the life cycle. Unlike in *abj* model, higher initial assimilation in the *std* model 575 results in (i) faster initial growth and (ii) restricted ultimate size because assimilation does not increase 576 to exceed maintenance costs (Fig. A.1a). Since both of these effects are inconsistent with observations, 57 we conclude that the *abj* model offers a more appropriate description of *P. nobilis* ontogeny. 578

Table A.1: Parameter estimates of the standard ((std) and the typified abj	DEB models for P	inna nobilis, at the reference
temperature $T_{ref} = 20$ °C. Fixed (not-estimated)	parameters (κ_X, κ_R, F_m ,	(T_{ref}, T_A) are indi	cated in bold.

Parameter	Symbol	std model	typified abj model	Unit
Maximum surface-specific assimilation rate	$\left\{\dot{p}_{Am}\right\}$	270.06	$34.74 (101.44)^*$	$\rm J~d^{-1}~cm^{-2}$
Fraction of food energy fixed in reserve	κ_X	0.80	0.80	_
Allocation fraction to soma	κ	0.40	0.53	_
Reproduction fraction fixed in eggs	κ_R	0.95	0.95	_
Maximal surface-specific searching rate	F_m	6.5	6.5	$\rm l~d^{-1}~cm^{-2}$
Energy conductance	\dot{v}	0.006	$0.0089 \ (0.026)^*$	${\rm cm}~{\rm d}^{-1}$
Volume-specific somatic maintenance rate	$[\dot{p}_M]$	30.03	7.299	$\rm J~d^{-1}~cm^{-3}$
Volume specific costs of structure	$[E_G]$	2346	2362	$\rm J~cm^{-3}$
Maturation threshold for birth	E_H^b	$9.8 \cdot 10^{-05}$	$2.9 \cdot 10^{-04}$	J
Maturation threshold for puberty	E_H^p	2522	5601	J
Maturity maintenance rate coefficient	\dot{k}_J	0.002	0.002	d^{-1}
Zoom factor	z	3.6	2.52	-
Shape coefficient (larvae)	δ_{M1}	0.357	0.611	-
Shape coefficient (adult)	δ_{M2}	0.035	0.066	-
Reference temperature	T_{ref}	293.15	293.15	К
Arrhenius temperature	T_A	9002	9002	K

* The value in the brackets is the parameter value after metamorphosis (affected by acceleration factor, $s_M = 2.92$).

Table A.2: Observed and fitted life history traits of *Pinna nobilis* using standard (*std*) and typified *abj* DEB models at functional response value of f = 0.72. RE represents relative errors of the fitted values. Goodness of fit statistics (*std*; *abj*, respectively): MRE = 0.167; 0.202; SMSE = 0.193; 0.194. Consult Table 2 for references of observed data.

			std mod	el	typified abj	model
Data	Unit	Observed	Fitted	\mathbf{RE}	Fitted	\mathbf{RE}
Age at birth	d	2	1.34	0.33	1.98	0.01
Age at puberty	У	1.5	1.24	0.17	1.26	0.15
Lifespan	У	27	27	< 0.01	27	< 0.01
Size at birth	cm	0.0085	0.0085	< 0.01	0.0085	< 0.01
Length at puberty	cm	16.5	19.95	0.21	20.18	0.22
Ultimate shell length	cm	86	74.28	0.14	79.82	0.07
Initial energy of an egg^*	J	0.001	0.001	0.01	0.001	0.02
Gonadosomatic index (GSI)	-	0.52	0.50	0.04	0.48	0.08

* Data for *Crassostrea gigas*



Figure A.1: Observed data (markers) and model simulations (lines) for *Pinna nobilis* using standard (*std*) DEB model. (a) Shell length vs. age for two Spanish populations, Aguamarga (\bullet , -) and Carboneras (\blacksquare , --), Spain. (b) Growth rate vs. time for population in Mljet, Croatia. (c) Length vs. time and (d) temperature vs. growth rate for 2-year old (\bullet , -) and 1-year old (\circ , --) individual from Villaricos, Spain. (e) Fecundity vs. shell length. Observed data taken from: (a),(c) and (d) Richardson et al. (1999); (b) Šiletić and Peharda (2003); (e) Trigos et al. (2018).

579 B. Energy allocation to reproduction

Energy allocation to reproduction is proportional to shell length and food availability, i.e., functional response f (Fig. B.1). Once energy allocated to reproduction (as a function of size and food availability) is known, we can also express fecundity as a function of size and food availability (Fig. 4 in the main text), while taking into account the maternal effect to calculate the initial energy in an egg.



Figure B.1: Amount of energy (Joules) allocated to the reproduction of *Pinna nobilis* per year depending on the bivalve size and food availability, predicted using the typified *abj* model. The gray area represents sizes greater than the maximum reachable for a given food availability. Darkest area indicates conditions when no energy is allocated for reproduction.

584 C. Allometric growth

For each life stage, one representative morphometric dimension, L_w - chosen to accurately represent the size of the organism, and be independent of energy reserves - is used to calculate structural length, L, and consequently structural volume, V. When assuming isometric growth, the ratios between morphometric dimensions are constant throughout ontogeny and the structural volume can be calculated as a cube of structural length

$$V = L^3 = (\delta_M L_w)^3 \tag{C.1}$$

with δ_M as an auxiliary parameter called the shape coefficient, which accounts for proportions among the morphometric dimensions and their relation to structural length. For *Pinna nobilis* the representative dimension is the shell length (Figure C.1).



Figure C.1: The morphometric dimensions of *Pinna nobilis*. L_w - length, W - width, T - thickness. Adapted from Rabaoui et al. (2007).

P. nobilis has isometric growth during the larval phase, but it shows allometric growth after metamor phosis by changing the ratio between shell width and length (Katsanevakis et al., 2007; Rabaoui et al.,
 2007). The allometric relation is best described with a two-segment allometric model (Katsanevakis et al.,
 2007)

$$W = \begin{cases} \alpha_1 L_w^{b_1}, \ L_w \le B \\ \alpha_2 L_w^{b_2}, \ L_w > B \end{cases}$$
(C.2)

where W is the shell width, L_w is the shell length, and b_1 and b_2 are allometric exponents for each segment. The model assumes a breakpoint B, i.e. the shell length at which positive allometry (preferential widening) changes to negative allometry (preferential elongation). In such case, when isometric growth is violated, and the ratios between body dimensions change as the organism grows, the structural volume calculated using the Eq. C.1 may be under- or overestimated. Hence, allometric relation should be takeninto account.

Using the allometric relationship from Eq. C.2 we derived a new expression for calculating structural length of P. nobilis after metamorphosis

$$L = \begin{cases} \delta_M L_w^{\frac{2+b_1}{3}}, \ L_w \le B\\ \beta \delta_M L_w^{\frac{2+b_2}{3}} \text{ with } \beta = B^{\frac{b_1-b_2}{3}}, \ L_w > B \end{cases}$$
(C.3)

where δ_M is the shape coefficient, β is the normalization factor, and b_1 and b_2 are allometric exponents for pre- and post-breakpoint length, respectively. Note that, at $L_w = B$, the following must be true:

$$\delta_M L_w^{\frac{2+b_1}{3}} = \beta \delta_M L_w^{\frac{2+b_2}{3}}.$$
 (C.4)

⁶⁰⁷ The normalization factor can be calculated from equation C.4.

Accounting for allometric growth after metamorphosis adds three parameters to the typified abj model: the allometry breakpoint (B), and the two allometric exponents $(b_1 \text{ and } b_2)$. Energy fluxes and state variables are described by the same equations of the typified abj model (Table 1), the only difference lies in the conversion between the representative morphometric dimension and the structural length.

The values of additional parameters were taken from Katsanevakis et al. (2007): B = 20, $b_1 = 1.2554$, and $b_2 = 0.5801$. The final parameter set obtained by parameterization is given in Table C.1, along with parameters of the typified *abj* model (as in Table 3), for comparison. The fit between data and model predictions does not differ much from that obtained by the typified *abj* model (not shown), while the added three parameters add to model complexity.

Table C.1: Parameter estimates of the *abj* DEB model accounting for allometric growth (column 3) and the typified *abj* model assuming isometric growth (column 4), for *Pinna nobilis*, at the reference temperature $T_{ref} = 20$ °C. Fixed parameters (*B*, b_1 , b_2 , κ_X , κ_R , F_m , T_{ref} , T_A) are indicated in bold. The given parameter sets result in fitted life history traits with goodness of fit (for model with; without allometry, respectively): MRE = 0.212; 0.202; SMSE = 0.201; 0.194.

Parameter	Symbol	allometry abj^1	typified abj^2	Unit
Allometric breakpoint [*]	В	20	-	cm
Allometric coefficient (pre/post breakpoint)*	b_1/b_2	1.2554 / 0.5801	-	-
Maximum surface-specific assimilation rate	$\left\{\dot{p}_{Am}\right\}$	$34.08 (94.74)^{**}$	$34.74 (101.44)^{**}$	$\rm J~d^{-1}~cm^{-2}$
Fraction of food energy fixed in reserve	κ_X	0.80	0.80	-
Allocation fraction to soma	κ	0.51	0.53	-
Reproduction fraction fixed in eggs	κ_R	0.95	0.95	-
Maximal surface-specific searching rate	F_m	6.5	6.5	$\rm l~d^{-1}~cm^{-2}$
Energy conductance	\dot{v}	$0.0087 \ (0.024)^{**}$	$0.0089 \ (0.026)^{**}$	${\rm cm}~{\rm d}^{-1}$
Volume-specific somatic maintenance rate	$[\dot{p}_M]$	6.785	7.299	$\rm J~d^{-1}~cm^{-3}$
Volume specific costs of structure	$[E_G]$	2362	2362	$\rm J~cm^{-3}$
Maturation threshold for birth	E_H^b	$3.1 \cdot 10^{-04}$	$2.9 \cdot 10^{-04}$	J
Maturation threshold for metamorphosis	E_H^j	$6.6 \cdot 10^{-03}$	$7.3 \cdot 10^{-03}$	J
Maturation threshold for puberty	E_H^p	6098	5601	J
Maturity maintenance rate coefficient	\dot{k}_J	0.002	0.002	d^{-1}
Zoom factor	z	2.57	2.52	-
Shape coefficient (larvae)	δ_{M1}	0.606	0.611	-
Shape coefficient (post metamorphosis)	δ_{M2}	0.059	0.066	-
Acceleration factor	s_M	2.78	2.92	-
Reference temperature	T_{ref}	293.15	293.15	Κ
Arrhenius temperature	T_A	9002	9002	Κ

 $^{\overline{1}}$ Assumes isometric growth before, and allometric growth after metamorphosis.

 $^2\,$ Assumes isometric growth both before and after metamorphosis.

 * Taken from Katsanevakis et al. (2007).

** The value in the brackets is the parameter value after metamorphosis (affected by acceleration factor, s_M).