This is the accepted manuscript version of the contribution published as:

Bahlburg, D., Meyer, B., Berger, U. (2021): The impact of seasonal regulation of metabolism on the life history of Antarctic krill *Ecol. Model.* **442**, art. 109427

The publisher's version is available at:

http://dx.doi.org/10.1016/j.ecolmodel.2021.109427

The impact of seasonal scaling of metabolism on the life history of Antarctic krill

Dominik Bahlburg^{1,a,b}, Bettina Meyer^{c,d,e}, Uta Berger^a

a) Technical University Dresden, Forest Biometrics and Forest Systems Analysis, Pienner Straße 8, D-01737 Tharandt

b) Helmholtz Centre for Environmental Research Leipzig/Halle, Department of Ecological Modelling, Permoserstraße 15, D-04318 Leipzig
c) Alfred Wegener Institute Helmholtz Centre for Polar and Marine Research, Section Polar Biological Oceanography, Am Handelshafen 12, D-27570 Bremerhaven
d) Institute for Chemistry and Biology of the Marine Environment (ICBM) Carl-von-Ossietzky University, Carl-von-Ossietzky-Straße 9-11, D-26111 Oldenburg
e) Helmholtz Institute for Marine Functional Biodiversity (HIFMB), Ammerländer

Heerstrasse 231, D-26111 Oldenburg

1) Corresponding Author

E-Mail: dominik.bahlburg@tu-dresden.de

Address: Dominik Bahlburg

Permoserstrasse. 04318 Germany 15

Leipzig

Abstract: Antarctic krill up- and down-regulate their metabolism as a strategy to cope with the strong seasonal environmental fluctuations in the Southern Ocean. In this study, we investigate the impact of this light- and temperature dependent metabolic regulation on growth, reproduction and winter survival of krill. Therefore, we advance a bioenergetic growth model of krill by adding a data-derived scaling function of krill activity. With SERBIK (SEasonally Regulated Bloenergetic Krill growth model), we conduct a numerical experiment which tests the impact of such scaling on krill life history under two different winter food conditions: In the first scenario, we simulate life history of krill when winter food availability is low; in the second scenario, winter food availability is increased within realistic ranges. The results demonstrate that the scaling of metabolism is especially important during low food winters. Reducing metabolism during winter permits individuals to grow to larger body length, reproduce successfully and release a greater number of eggs. It further significantly reduces within-year size fluctuations caused by starvation during months with low food availability. Finally, SERBIK can be used in future spatial modelling studies which include movement of krill along latitudinal gradients and thus spatio-temporal gradients in light- and temperature.

Keywords: DEB theory, *Euphausia superba*, metabolic regulation, temperature, photoperiod

1 **1. Introduction**

2 Antarctic krill (*Euphausia superba*, Dana, 1852 – hereafter krill) is considered a key 3 species in the Southern Ocean ecosystem. Its enormous biomass and circumpolar 4 distribution makes krill an important organism in the functioning of nutrient cycling, carbon export and trophic interactions in the Southern Ocean (Le Fèvre et al. 1998, 5 6 Ballerini et al. 2014, Belcher et al. 2017). This central role, a rapidly changing environment (Gille 2002, Whitehouse et al. 2008) and the growing krill fisheries 7 8 industry put pressure on the scientific community to improve the understanding of krill 9 as individuals, populations and as part of a complex network of biogeochemical processes. In this context, it is necessary to go beyond phenomenological descriptions 10 of the response of krill to environmental cues but explore and understand the 11 12 underlying bio-physical processes mechanistically.

13 The response of krill to the physical environment is closely linked to its relatively complex life cycle. After hatching, krill goes through 12 larval stages until it reaches 14 15 sexual maturity after approximately 2-3 years (lkeda 1984; lkeda 1987; Jia et al. 2014; Quetin et al. 1994). During this time, individuals undergo significant changes in their 16 body shape (from rather compact nauplius larvae to elongated furciliae, juveniles and 17 adults), feeding behaviour (volk reserves or active feeding), their ability to store lipids 18 19 and sexual maturation. The dynamics of these life-history traits are directly affected 20 by the strong seasonal fluctuations in food and light availability, temperatures and sea 21 ice.

Krill population, and thus biomass dynamics emerge from the interplay of many individual life histories. Therefore, a comprehensive mechanistic understanding of individuals' life histories could open new doors for many theoretical and applied krill studies. However, the dependence of individual krill life history on specific 26 environmental drivers remains unclear. The Southern Ocean is a habitat characterized by strong seasonal fluctuations of light, temperature, food availability and sea ice 27 extend. In order to survive in such an extreme environment, krill needs to find ways to 28 29 cope with these strong fluctuations. The resulting eco-physiological adaptations of the crustaceans are expressed as internal regulation of metabolism, adaptive behaviours 30 31 or other strategies such as shrinkage. These adaptations, in turn, affect the dynamics of reproduction, growth and starvation which are commonly referred to as the "life 32 history" of an individual. In this study, we focus on the seasonal scaling of krill 33 34 metabolism as a particularly important adaptation to the strong seasonality in temperature and light availability of the Southern Ocean. Seasonal scaling of 35 36 metabolism describes the up- and down-regulation of an individual's metabolic activity 37 which is mainly driven by light and temperature.

Therefore, we advance an existing bioenergetic model which describes the growth of 38 39 individual krill based on the Dynamic Energy Budget theory (DEB, Jager and 40 Ravagnan 2015). This theory describes the development of an individual as a function of energy intake and its subsequent allocation into reproduction and growth (Kooijman 41 2010). It has been successfully applied to a broad range of organisms such as 42 Icelandic capelins (Einarsson et al. 2011), the Pacific oyster (Ren and Ross 2001) and 43 44 even endoparasitic wasps (Llandres et al. 2015). Recent studies (Guillaumot et al. 45 2020; Groeneveld et al. 2020) emphasize how individual based modelling and DEBtheory can be especially useful for studying Antarctic species when habitat access is 46 limited and data is sparse. The framework of bioenergetic modelling further holds the 47 potential to project from individuals to population dynamics, which makes the 48 development of a DEB-based krill model particularly interesting (Martin et al. 2013). 49 The full theoretical background of DEB theory is described in Kooijman (2010) and a 50

51 summary can be found in Jager et al. (2013). Parameterizing a DEB-based growth model, however, requires detailed knowledge about the ecophysiology of krill. Jager 52 and Ravagnan (2015) propose a first version of such a model and demonstrate its 53 54 general applicability to reproduce typical life history patterns. Nevertheless, it most notably lacks a seasonal component which scales krill metabolism under the influence 55 of environmental drivers. In addition, the Jager and Ravagnan (2015) model has only 56 been tested under "laboratory" conditions with ad libitum food availability and constant 57 water temperatures of 0°C. The study presented is intended to overcome this lack of 58 59 knowledge by (1) including environmental seasonality and thus, seasonality in the 60 krill's metabolism, and (2) parameterizing and validating the model against field data. Another feature of the model proposed by Jager and Ravagnan (2015) is that the 61 62 individual is running at "full blast" throughout its life. All physiological functions such as feeding and metabolism are constantly running at their maximum physiological 63 rates. However, past and current research shows that the metabolism of krill 64 undergoes strong seasonal oscillations with increased metabolic rates (measured as 65 weight-specific oxygen consumption rates) during the Austral summer and reduced 66 rates during winter (Brown et al. 2013; Kawaguchi et al. 1986; Meyer et al. 2010). 67 During winter, mean respiration rates can correspond to only 29% of summer rates 68 69 (Meyer et al. 2010). Meyer et al. (2010) and Atkinson et al. (2002) show that a similar 70 scaling happens with winter feeding rates which can also be as low as 20% of summer 71 rates when individuals are exposed to similar feeding conditions. These findings have been backed by long-term experimental studies which investigate annual metabolic 72 73 dynamics under controlled laboratory conditions (Brown et al. 2013; Piccolin et al. 2018b). While it is clear that there is a strong seasonality in krill activity, the question 74 of possible drivers has not yet been fully answered. More specifically, there is an 75

76 ongoing debate about how much external factors (temperature, light availability, food concentration) or internal processes (e.g. molecular clocks) contribute to the annual 77 up- and down-regulation of metabolism, respectively. Since there is evidence for both 78 79 (Biscontin et al. 2017; Brown et al. 2010; Brown et al. 2013; Höring et al. 2018; S. Kawaguchi et al. 2007; Piccolin et al. 2018a; Piccolin et al. 2018b; Teschke et al. 80 81 2007), it is likely that a combination of external and internal processes regulate the activity of krill. In general, food, temperature and more recently light availability are 82 often named as main drivers in the seasonal scaling of metabolism. 83

84 Temperature dependent scaling of metabolism is one of the key elements of metabolic theory of ecology (Clarke 2006) and annual temperature fluctuations should be 85 reflected in the metabolic activity of krill. The exact functional relationship between krill 86 87 metabolism and temperature has been subject to numerous studies (Hirche 1984, McWhinnie and Marciniak 1964, Ngan et al. 1997, Segawa et al. 1979, Tarling 2020). 88 In summary, krill metabolism typically seems to follow the Van't Hoff-Arrhenius 89 90 equation which projects exponentially increasing metabolic costs with increasing temperature. Single studies such as McWhinnie and Marciniak (1964) and Ngan et al. 91 (1997) report saturating metabolic rates above a critical temperature of ~5°C and 92 Segawa et al. (1979) observed constant metabolic temperature between ---1°C and 93 94 3°C. However, using a much larger dataset, Tarling (2020) found that the Van't Hoff-95 Arrhenius equation is adequate in describing the thermal response of krill metabolism. Typical Q10-values, which estimate the rate at which metabolism increases with a 96 temperature increase of 10°C, were found to be ~2.8. In addition, Tarling (2020) 97 demonstrates that the response is generally independent of geographical location. 98 The photoperiod – or light exposure – has been linked to respiration rate either as a 99

100 direct driver (Piccolin et al. 2018b; Teschke et al. 2007) or as a pacemaker which

101 regulates the synchronicity of an endogenous regulation system (Brown et al. 2013, Höring et al. 2018). Similar to temperature, there are strong indications that metabolic 102 103 rates increase with increasing light exposure of the individual. For instance, Teschke 104 et al. (2007) simulated winter and summer light regimes of the Southern Ocean in order to investigate the physiological response of krill to differences in light exposure. 105 106 They could observe that winter food assimilation rates could be as low as 36% of summer rates. Oxygen consumption was significantly lower when individuals were 107 108 kept under complete darkness compared to high and reduced light availability. In 109 addition, Piccolin et al. (2018a, 2018b) and Höring et al. (2018) demonstrate that light availability alone can drive seasonal patterns of respiration rates or gene expression. 110 111 Furthermore, Seear et al. (2012) found that winter genes related to feeding activity, 112 digestion and immunity were expressed at higher rates around South Georgia compared to the Antarctic Peninsula. Since winter light availability varies markedly 113 114 between these two locations, it is possible that light has a role in regulating the 115 expression of these genes. However, the authors could not find differences in the expression of genes involved in respiration. 116

In this study, we synthesize the new insights from the growing amount of data
on seasonal scaling of krill metabolism to parameterize a temperature- and light
dependent scaling function. This scaling function is then implemented into the
bioenergetic growth model for krill introduced by Jager and Ravagnan (2015). We refer
to the new model as SEasonally Regulated Bloenergetic Krill growth model (SERBIK).
With the introduction of SERBIK, we aim to answer two main questions:

How does the previous model version compare with a model version where
 metabolism is scaled as a function of temperature and light availability?

125 2. How does the seasonal scaling of metabolism impact the life history of krill126 individuals under different environmental conditions?

127 It has been suggested that the down-regulation of metabolism helps the individuals to reduce energetic demands during winter when food concentrations are low. A possible 128 reason could be a better physiological condition before food availability starts to 129 130 increase in spring since resources can be saved during the winter period. In order to address question 2, we generate two environmental datasets which are characterized 131 by low and high winter food availability. The environmental data are derived from field 132 measurements from the Palmer Research Station (Anvers Island, 64.77° S, 64.05° 133 134 W), part of the Palmer Long Term Ecological Research program (Smith et al. 2013).

136 2. Methods

We use the R Programming Language (R Core Team 2020) for all coding. Data
processing and visualization was done with help of the "tidyverse"-environment
(Wickham et al. 2019)

SERBIK builds on an existing growth model published by Jager and Ravagnan (2015).
Its description follows the Overview, Design and Details protocol suggested by Grimm
et al. (2006; 2020).

143

144 **2.1 Purpose**

The purpose of the individual-based bioenergetic growth model is to predict the 145 146 development of krill individuals as a function of water temperature, food availability 147 and day length. A specific goal is the analysis of the importance of light- and temperature dependent regulation of metabolism on the life history of krill. The model 148 149 is suitable to investigate inter-seasonal dynamics of krill development for a given 150 latitude and allows intra-seasonal comparisons between different krill habitats. Trajectories for growth, stage development, reproductive output as well as starvation 151 and ultimately death throughout the life of a krill individual for given environmental 152 conditions are used to validate the model's performance against empirical data. 153

154

155 **2.2 Entities, state variables, and scales**

156 The model consists of two entities - environment and the krill individual.

157 The environment has three state variables: *temperature* (water temperature in Kelvin), 158 *day length* (hours between sunrise and sunset) and *food concentration* (density of 159 chlorophyll a in mg m⁻³ named as *chla*). The krill individual is characterized by four 160 state variables, namely *age* (days), *structural biomass* (measured in mg dry weight),

reproductive biomass (mg dry weight) and assimilate stored in the *egg buffer* (mg dry weight). More information about the entities and their state variables can be found in Table 1.

The model simulates 6 years (or 2190 days) of krill development with a timestep of 1 day. The life span of 6 years lies within commonly suggested maximum life span for krill (Nicol 1990). The model has no spatial component.

167

168 2.3 Process Overview and Scheduling

169 <u>Update Environmental Conditions:</u> temperature, day length, and food availability will

170 be updated for the respective day.

171 <u>Check Developmental Stage</u>: the current stage (embryo, juvenile, or adult) will be 172 assigned to the krill individual based on stage-specific classification criteria.

<u>Growth</u>: the daily net growth of the individual is determined based on the amount of assimilated energy. The energy is allocated to structural biomass. Growth can be either positive or negative (shrinkage) in case of energy shortages.

176 <u>Reproduction</u>: Spawning is triggered by a size-dependent threshold energy-level in

the reproduction buffer which has to be reached within the spawning window (October

178 1^{st} – March 31^{st}).

179 <u>Mortality</u>: The individual dies after 6 years.

180 See section "Submodels" for further details.

181

182 2.4 Design concepts

183 Basic principles:

184 We use a slightly simplified framework derived from standard DEB theory (Sousa et 185 al. 2010) called "DEBkiss" which was introduced by Jager et al. (2013). While both

models share the philosophy of describing life-history of an animal as a function of
energy uptake and allocation, DEBkiss most noticeably lacks an intermediate energy
storage between energy uptake (feeding) and energy allocation. A simplified scheme
of the model is shown in Figure 1.





Figure 1: Schematic depiction of the major compartments of the krill growth model. 191 192 While in the non-feeding larval state, the individual assimilates energy from the egg 193 buffer. When feeding, the individual ingests energy which is converted into assimilates at the rate ϵ_F . The assimilated energy, J_A, is then allocated to structure (κ -branch) and 194 reproduction $(1-\kappa)$. Energy from the κ -branch is partially depleted as maintenance 195 196 costs of structure (J_M) while the remainder, J_v , goes into new structural biomass. 197 Reproduction energy following the 1-*k*-branch is allocated to the reproduction buffer. $J_{\rm R}$ equals the "1- κ - energy" minus some losses due to the conversion of assimilates 198 199 into reproductive biomass.

200

201 Emergence:

The model produces inter- and intra-annual fluctuations of body size, stage development and energy in the reproduction buffer as a result of a seasonally varying environment (chlorophyll a, light availability, temperature).

In addition, the (de)activation of light- and temperature dependent scaling of metabolism produces varying trajectories of life history,

- 207
- 208 Adaptation:
- 209 The agents are not capable of adaptation or decision making.
- 210

211 Sensing:

212 Individuals are aware of the current month in order to determine whether the current 213 day lies within the reproductive period or not. They are also aware of ambient

temperature, day length and food concentration.

215

216 Interaction:

217 In this study, the model simulates only one individual at a time. Thus, there is no 218 interaction between individuals.

219

220 Stochasticity:

The model is deterministic and includes no stochastic processes.

222

223 Observation:

At each time step, information about age, date, structural body mass, biomass stored in the reproduction buffer and energy stored in the egg buffer are output to a main data table which contains a broad overview about the state of the individual. In a

separate table, the model records daily information on the bioenergetics such as energy assimilation, maintenance costs, energy deficits, whether and how much structural biomass has been assimilated and spawning events. Since the complete environmental dataset is generated at the model initialization, there is no need to specifically write out environmental information at each timestep.

232

233 **2.5 Initialization**

Per default, the simulation starts on January 1st. However, the initialization date can
be set to any day of the year.

After the initialization date and total running time (default: 6 years/2190 days) are set, the environmental dataset for the entire simulation is generated starting at the respective initialization date. The user chooses between two environmental scenarios:

- 239 1. "palmer" which represents annual food and temperature dynamics derived
 240 from field data from Palmer Research Station
- 241 2. "palmer winter boost" which generates the same data for the summer months
 242 as "palmer" but increases food availability during winter, as described in Section
 243 2.6.6

After the environment is generated, the krill individual is initialized with very low but non-zero structural biomass (10⁻⁴ mg dry weight) and a full egg buffer which equals the assimilates contained within the eggs after spawning (0.028 mg dry weight). Before the simulation starts, the user can choose whether light- and temperature dependent scaling of metabolism should be active or not with the default being active.

249

250 **2.6 Input Data**

251 In order to address question 2, we generate two environmental datasets which are characterized by low and high winter food availability. The environmental data are 252 derived from field measurements from the Palmer Research Station (Anvers Island, 253 64.77° S, 64.05° W), part of the Palmer Long Term Ecological Research program 254 (Smith et al. 2013). The environmental dataset contains daily climatological values of 255 chlorophyll concentration (mg m⁻³), water temperature (Kelvin), and day length (hours). 256 Daily day length (time between sunrise and sunset at Palmer station) is calculated with 257 help of the R-package "suncalc" (Thieurmel and Elmarhraoui 2019). For the 258 chlorophyll concentrations we use a time series ranging from 1991-2018. The 259 "palmer"-scenario consists of the average monthly chlorophyll a concentrations from 260 261 this time series. The "palmer winter boost" scenario is composed of average 262 chlorophyll concentrations during months where average chla > 1 mg m⁻³ and maximum observed chlorophyll concentrations for months where average chla < 1 mg 263 264 m⁻³. Temperature data are calculated as daily mean surface water temperatures from 265 the same time range.

This way, we create an environmental dataset which spans over 1 year. Since we do not consider interannual variation, the full environmental dataset used in the simulation consists of (six) consecutive repetitions of this annual dataset. The annual environmental dynamics are shown in Figure 2.





Figure 2: Mean seasonal dynamics of the environmental variables chla, temperature and day length derived from Palmer Station time series data (1991-2018). Dark bars in the chlorophyll plot show the annual food dynamics in the "palmer" scenario and the light grey bars show the increased winter food concentrations in the "palmer winter boost" scenario.

276

277 2.7 Submodels

278 <u>2.7.1 Update Environmental Conditions:</u> In each timestep, the model extracts water
279 temperature, food concentration and day length from the environmental dataset for
280 the current day. These data are used as input data for the physiological functions
281 defined in the following submodels.

282

2.7.2 Check Developmental Stage: the particular stage (embryo, juvenile, or adult) will 283 be assigned to the krill individual. Consistent with DEB-theory, the individual goes 284 through three developmental stages. Individuals start as embryos (stage 1) which first 285 286 live off the energy reserves stored in the egg buffer. When the egg buffer is depleted, 287 hatching occurs and the individuals advance into the juvenile stage (stage 2). Juveniles actively feed from the water column and invest energy into somatic growth 288 289 and the reproduction buffer. However, the energy allocated to reproduction is 290 completely burned which is interpreted as maturation of the gonads. After the juvenile reaches a critical length of 35 mm, "puberty" is reached and the individual is considered an adult (stage 3, Siegel and Loeb 1994). In contrast to juveniles, adults are able to store assimilates in the reproduction buffer which enables spawning. Only adults can spawn. Based on these criteria (egg buffer depletion, critical length of 35 mm), the model assigns the respective developmental stage to the individual. This is necessary since it decides which food source is used and whether assimilates allocated to the reproduction buffer can be stored or not.

298

299 <u>2.7.3 Growth:</u>

Growth in this model is the change of structural biomass (K_s) of krill over time. It is defined as the difference of assimilated food allocated to structural growth (" κ -branch") and structural maintenance costs (metabolism). Many growth-related processes scale with the volumetric length, *L*. The volumetric length is part of DEB-theory and is defined as

 $L = \sqrt[3]{\frac{K_S}{d_V}}$

- 306 where
- 307 K_s structural biomass (mg dry weight)

 d_V – dry weight density (mg dry weight mm⁻³)

309 Thus, growth can be written as:

310
$$\frac{dK_S}{dt} = \varepsilon_S(\kappa J_A(L) - J_M(L))(E_{deficit} = 0) - E_{deficit}$$

311 where

312	\mathcal{E}_S	-	conversion efficiency of assimilates to structural biomass
313	κ	_	fraction allocation to structural biomass
314	$J_A(L)$	_	total assimilated energy (function)

315 $J_M(L)$ – structural maintenance costs (function)

316 $E_{deficit}$ – Energy deficit

The equation contains a Boolean switch ($E_{deficit} = 0$). A Boolean switch is an expression which behaves like a logical operator in programming. It returns 1 when the condition is true (aka $E_{deficit}$ is 0) or 0 otherwise and thus "keeps" or "cancels out" the first part of the equation.

321 $E_{deficit}$ itself is defined as:

322
$$E_{deficit} = (|\kappa J_A(L) + E_R - J_M(L)| > 0) \cdot |\kappa J_A(L) + E_R - J_M(L)|$$

323 where

 E_R – energy stored in the reproduction buffer

The equation contains another Boolean expression. The resulting $E_{deficit}$ is positive when the assimilated energy and the energy stored in the reproduction buffer fail to cover somatic maintenance costs. Otherwise it equals 0.

328 In summary, three "growth scenarios" are possible:

1. Positive growth in case
$$\kappa J_A(L) > J_M(L)$$

2. No growth in case $\kappa J_A(L) \le J_M(L)$ but assimilates in the reproduction buffer can cover the deficit

332 3. Negative growth in case
$$\kappa J_A(L) < J_M(L)$$
 and assimilates in the reproduction
333 buffer cannot cover the deficit

The assimilation of energy is described by a Holling type II function and is proportional to L^2 :

336
$$J_A(L) = \begin{cases} M_{reg}(l_D, T)\varepsilon_F \cdot 0.28 A_{max}L^2, & \text{when stage} = 1\\ M_{reg}(l_D, T)\varepsilon_F \frac{chla}{chla+k}A_{max}L^2, & \text{else} \end{cases}$$

337 with

338 $M_{reg}(l_D,T)$ – light- and temperature dependent scaling function

339 ε_F -conversion efficiency of food to assimilates340chla-chlorophyll a concentration in the environment [mg m⁻³]341k-half saturation constant for chlorophyll uptake [mg m⁻³]342 A_{max} -maximum area-specific assimilation rate [mg dry weight343mm⁻² d]

344 *L* – volumetric length [mm]

When the individual is still an embryo (stage = 1), energy from the egg buffer is assimilated with the rate 0.28. The assimilation rate is parameterized such that hatching occurs after ~30 days. In the juvenile and adult stage, the amount of ingested food depends on the food density *chla*, volumetric length *L* and the metabolic scaling function $M_{reg}(l_D, T)$ described below.

In contrast to food uptake, somatic maintenance $J_M(L)$ is proportional to the body volume of the individual L^3 : This builds on the assumption that cells are threedimensional structures which need "three dimensional maintenance". Thus:

353

$$J_M(L) = M_{reg}(l_D, T) J_{Mmax}L^2$$

where J_{Mmax} stands for the maximum volume-dependent somatic maintenance flux. As with food uptake, somatic maintenance is regulated by the seasonal metabolic scaling function $M_{reg}(l_D, T)$.

357

358 The seasonal metabolic scaling function $M_{reg}(l_D, T)$:

359 $M_{reg}(l_D, T)$ scales structural maintenance costs and feeding activity as a function of 360 water temperature *T* and day length l_D . $M_{reg}(l_D, T)$ is composed of two independent 361 sub-functions: a temperature dependent scaling function $f_T(T)$ and a light dependent 362 scaling function $f_{PP}(l_d)$: 363 Temperature-dependent scaling of metabolism is described using the Van't Hoff-364 Arrhenius equation:

365 $f_T(T) = \frac{Ae^{\frac{-E}{KT}}}{Ae^{\frac{-E}{K\cdot 273.15}}}$

366 where

367	А	-	pre-exponential factor
368	Ε	-	activation energy [eV]
369	К	-	Boltzmann constant = 8.617 10 ⁻⁵ eV K ⁻¹
370	Т	_	temperature [Kelvin]

This way, temperature-dependent energy demand of an organism is directly linked to 371 372 the temperature-dependence of enzyme kinetics. We use experimental data from Hirche (1984) in order to estimate the activation energy E. The division by $Ae^{\frac{-\kappa}{k\cdot 273.15}}$ 373 scales $f_T(T)$ such that the physiological functions related to "krill activity" ($J_A(L)$ and 374 $J_M(L)$) return values equal to their original parameterization at 0°C since the original 375 model by Jager and Ravagnan (2015) is parameterized for water temperatures of 0°C. 376 377 Thus, for higher water temperatures, simulated krill activity will be increased in comparison to its reference value at 0°C. 378

The second sub-function, light-dependent scaling of metabolism, is a linear function based on experiments carried out by Piccolin et al. (2018b). In their study, the authors investigate the response of krill respiration rates (a proxy for metabolic rate) when exposed to different light regimes, keeping all other variables constant. We fit a linear regression function to their data in order to derive $f_{PP}(l_d)$:

384

 $f_{PP}(l_d) = 0.035l_D + 0.161$

385 where

 l_D – photoperiod/day length in hours

In order to derive the linear regression, we scaled the experimental data of Piccolin et al (2018b) such that $f_{PP}(l_d)$ predicts 1 (or 100%) metabolic activity when day length l_D is at its maximum (24 hours). l_D is defined as the time between sunrise and sunset. By multiplying both subfunctions, we arrive at the temperature- and light dependent metabolic scaling function:

392

$$M_{reg}(l_D, T) = f_T(T) \cdot f_{PP}(l_d)$$

The functioning of $M_{reg}(l_D, T)$ and its impact on the annual energy budget of a krill individual in the "palmer"-scenario is shown in Figure 3. For the environmental conditions used in this study, $M_{reg}(l_D, T)$ scales winter krill activity to 32% of the reference value obtained at 20 hours of daylight and 0°C water temperature. During summer, krill activity can increase to 116% since water temperatures are higher than 0°C.

399

400 <u>2.7.4 Reproduction:</u>

In this model, reproduction is driven by the amount of assimilates that are stored in
the reproduction buffer as well as an annual spawning window that allows for egg
release. Energy influx into the reproduction buffer comes from the 1-κ-branch when
the individual is in the adult stage.

405 The reproduction buffer serves two purposes:

406 1. It is the compartment where assimilates are converted into eggs which are released407 when spawning is triggered.

408 2. If the ingested food cannot cover structural maintenance costs, energy from the 409 reproduction buffer is allocated to the structure compartment in order to "pay" for the 410 maintenance deficit. Therefore, it can also act as an energy buffer which can be 411 burned under food shortage and prevent the loss of structural biomass.

In general, spawning is triggered when the assimilate dry mass in the reproduction buffer surpasses a size-specific threshold level within the spawning window (October 1^{st} – March 31^{st}). The threshold level-function $E_{Rep}(L_B)$ accepts body length L_B (in mm) as an input variable. L_B refers to the standard length of krill and can be derived from Lwith help of the shape correction coefficient $\delta_M = 0.2$ (Jager and Ravagnan, 2015) assuming isomorphy of krill.

418 $E_{Rep}(L_B)$ is defined as:

419

 $E_{Rep}(L_B) = (150.83L_B - 3027) \cdot w_{egg}$

420 Eq. 1

421 where w_{egg} refers to the dry mass of a krill egg (0.028 mg, Table 2). w_{egg} also equals

the weight of assimilates stored in the egg buffer which is depleted by the embryo.

According to this function, small adults (35 mm) will produce ~2250 eggs and fully grown individuals (59 mm) 5720 eggs. These values lie within low to intermediate ranges of count data which are summarized in Kawaguchi (2016), slightly higher than clutch sizes in the krill reproduction model of Constable and Kawaguchi (2018) but below those of a reproduction model by Tarling et al. (2007).

428

429 <u>2.7.5 Mortality:</u>

430 Krill die after they reach an age of 6 years.

431

432 2.8. Model Sensitivity

We use a parameter screening (Morris method, (Morris 1991) to identify the parameters which have the highest impact on the model dynamics. The screening is performed for three different response variables in the two environmental scenarios

436 ("palmer" and "palmer winter boost"): Maximum body size, day of reaching maturity437 and the total number of eggs produced.

In conclusion, A_{max} , ε_F and κ turn out to be the most influential parameters in most cases with each being positively correlated to maximum body size and total number of eggs produced. The number of eggs produced is negatively influenced by increases of these parameters meaning that individuals mature earlier at higher parameter values. The detailed sensitivity analysis can be found in the Supplementary Material.

443

444 2.9 Design of numerical experiments

In order to assess the impact of the light- and temperature dependent scaling of krill metabolism, we run the model for two different environmental scenarios as mentioned above, After each of these runs, we analyze the maximum body size of the individual, size fluctuations, timing of spawning as well as total spawning output (number of eggs produced). We consider these life history traits to be indicative for the magnitude of "hardship" or "success" an individual experienced throughout its life.

In each of the environmental scenarios we perform model runs where the light- and 451 452 temperature dependent scaling of krill metabolism is either switched on or off. When switched on, $M_{reg}(l_D, T)$ scales food uptake as well as somatic maintenance costs as 453 described in section 2.7.3. When switched off the light- and temperature dependent 454 455 scaling function $M_{reg}(l_D, T)$ is set to 1 which means that all physiological functions are running with their default parameterization. Thus, the "regulation off"-run acts as a 456 457 control run. Consequently, differences in the model dynamics between "regulation off" and "regulation on" can be attributed to light- and temperature dependent scaling of 458 459 krill metabolism.

461 **3. Results:**

462 Simulation experiment 1 – the impact of seasonal regulation of metabolism during low
463 food winters:

When winter food is low (scenario "palmer"), krill reach maximum lengths of 464 approximately 41 mm without and 46 mm with active metabolic scaling (Figure 4a). 465 The individuals reach the adult stage and therefore sexual maturity in their second 466 year. After switching to the adult stage, the "regulated" and "unregulated" individuals 467 start storing assimilates in their reproduction buffers but no spawning is triggered. With 468 469 the onset of autumn and winter, these reserves are depleted in order to avoid starvation-induced shrinkage. However, after the full depletion of the energy reserves, 470 471 the individuals start to reduce their size. This reduction is much stronger in the 472 "unregulated" individual with size fluctuations of 16 mm compared to 10 mm in the "regulated" individual. The effect of the seasonal scaling function on the annual energy 473 budget dynamics during the last simulation year are shown in Figure 3. 474



Figure 3 Left panel: the annual regulation of krill metabolism as a function of light and temperature for environmental conditions measured at Palmer station. Right two panels: Difference between assimilated food and somatic maintenance costs in the last simulation year of the "palmer"-scenario. The lollipops in all three plots show weekly aggregated data.

481 Figure 3 shows how the regulation of metabolism and feeding activity reduces the amplitude of starvation during the winter months. Without the metabolic regulation, the 482 483 total winter energy deficit sums up to 99.5mg C whereas with metabolic regulation, the 484 deficit equals -81.3mg C. During the process of shrinkage, the "unregulated" individual repeatedly regresses to the juvenile stage. When food concentrations increase again, 485 486 the individual starts to grow until it reaches the adult stage again. However, the amount of assimilates which are then allocated to reproduction never suffices to trigger a 487 spawning event. In contrast, the "regulated" individual succeeds in spawning from its 488 489 third summer on. Since the intra-annual size fluctuations are less pronounced, it does 490 not regress into the juvenile stage and thus can store assimilates in the reproduction 491 buffer as soon as spring sets in. The timing of the spawning is quite rhythmic with all



Figure 4: Results of the simulation experiments: Simulations started on January 1st
and ended on December 31st after 6 years. a) and b): Body length of the individual.
Dots on the growth curves represent stage transitions of the individual. c) and d):
Energy dynamics of the reproduction buffer. e) and f): Spawning events. Each
simulation year is represented by one half annulus with time progressing from left to

right and from the inside to the outside. Timepoints inside the light grey areas in year0 and year 7 lie outside the simulated time range.

501

502 *Simulation experiment 2 – the impact of seasonal regulation of metabolism during high* 503 *food winters:*

When winter food concentrations are comparatively high (scenario: "palmer winter 504 boost"), krill are able to reach larger sizes compared to the "palmer"-scenario from 505 506 experiment 1 (Figure 4b). The "regulated" and "unregulated" individuals grow to similar 507 maximum sizes of 58 and 59 mm respectively after reaching the adult stage after 1 year. Individuals without seasonal metabolic scaling generally express higher growth 508 509 rates and are generally larger compared to the "regulated" individual for the first 4 510 years. Therefore, individuals without metabolic scaling are able to reproduce earlier. Both individuals release eggs twice in their second summer - one year earlier than in 511 512 the "palmer"-scenario. The distribution of spawning events is generally concentrated 513 in December and January but isolated egg releases occur in spring (October) or autumn (March). The total reproductive output is slightly higher for "unregulated" 514 individuals (22900 eggs) compared to "regulated" ones (21100 eggs). 515

In the third simulation year, the "unregulated" individual performs a spawning in late 516 517 March which prevents it from building up sufficient energy reserves for the winter. As 518 a consequence, starvation-induced shrinkage can be observed and the krill falls back 519 to a slightly lower body length than the "regulated krill". When the "regulated" individual performs a late spawning in March in the 4th simulation year, almost no shrinkage 520 follows due to the reduced metabolic costs in winter. The size of both individuals starts 521 to saturate in the 5th year when structural maintenance costs become so high that all 522 assimilates allocated to structure via the k-branch need to be burned. 523

524

525 4. Discussion

As already demonstrated in Jager and Ravagnan (2015), the model is capable of producing plausible trajectories of growth, development and reproduction of individual krill. In this study, we advance the model with the addition of a seasonal component which scales krill metabolism as a function of light and temperature. The activation of seasonal metabolic scaling comes with distinct effects depending on the food availability during winter:

532 When food concentrations are high, decreasing metabolism slows down growth and ontogenetic development of krill since individuals cannot exploit the full energetic 533 534 potential of the available food. This is consistent with feeding experiments carried out 535 by Meyer et al. (2010) who exposed krill individuals to a similar range of food concentrations during winter and summer. In their results, winter feeding rates were 536 537 up to six times lower than summer rates. As a consequence, individuals would not be 538 able to make use of high food concentrations during winter. It is open for discussion whether this should be considered a disadvantage of seasonal metabolic scaling or a 539 540 rare side-effect of an adaptation which is most beneficial in harsh winters. Generally, winter food availability in the Southern Ocean is low and patchily distributed (Meyer et 541 542 al. 2017, Shen et al. 2017). In the Palmer time series which is used in this study, only 543 ~2% of the recorded chlorophyll a concentrations in June, July and August are higher than 0.25 mg m⁻³ (n = 509). Even though these data should not be interpreted as being 544 representative of the entire habitat of krill, they emphasize the rareness of high 545 546 concentrations of autotrophs during winter.

547 According to our simulations, seasonal scaling of metabolism decreases the amount 548 of intra-annual shrinkage experienced when feeding conditions are less favorable. It

549 is unclear whether lethal threshold values of shrinkage exist and whether a dampening 550 might be lifesaving. In our simulations, annual size minima during winter in 551 "unregulated" individuals correspond to 62% of the summer length or 24% of the 552 summer structural biomass (dry weight) which is much lower than any reported weight losses (Auerswald et al. 2015; Ikeda and Dixon 1982). The activation of seasonal 553 554 metabolic scaling reduces the intra-annual size fluctuations by half to 80% winter length compared to summer length. The simulated dry weight reduction of ~50% 555 556 compares to values on the upper end of non-lethal starvation-induced biomass losses 557 reported from experiments and the field (Auerswald et al. 2015; Ikeda and Dixon 1982, Nicol et al. 1992). Consequently, light- and temperature driven scaling of metabolism 558 559 might be a lifesaving adaptation which prevents potentially lethal starvation of krill 560 during winter.

In addition, the down-regulation of metabolism is essential in order to allow successful 561 562 reproduction in the subsequent summer in our model. In our simulations, it prevents 563 annual regressions from the adult to the juvenile stage during winter. Remaining as an adult enables the krill to immediately invest energy into egg production once food 564 565 concentrations increase in spring. Although the regression of the reproductive organs of adult krill to a juvenile appearance is possible (Thomas and Ikeda 1987), it remains 566 567 questionable whether any individual could survive the drastic developmental alternation as experienced by the "unregulated" krill in the "palmer" scenario. The 568 569 sexual regression described by Thomas and Ikeda (1987) was not accompanied by a reduction in body length much in contrast to our simulations. 570

However, and in general agreement with our model results, Cuzin-Roudy and Labat
(1992) found adult individuals with juvenile ovaries in early summer in regions of the
Weddell Sea with high sea-ice cover and low winter food concentrations. In contrast,

individuals from regions in the Scotia Sea with higher winter productivity had either
fully developed ovaries or had already spawned at the same time. According to our
model, a possible reason for this might be the interaction of different winter food
concentrations and seasonal regulation of metabolism.

In summary, the SERBIK model quantifies the role of temperature- and light 578 579 dependent scaling of metabolism in krill. We investigate the effects of such scaling on 580 the life history of krill under two environmental scenarios – one characterized by rather 581 high winter food concentrations and one characterized by low winter food 582 concentrations. Our results indicate that seasonal metabolic scaling could be essential for krill survival when winter food concentrations are low. On the other hand, it slows 583 584 down the development of krill when winter food concentrations are high. However, the 585 augmented winter food time series that we use to demonstrate this is at the upper end 586 of observed winter values and is probably a rare case in the Southern Ocean where winter food availability is generally low. According to our model, seasonal scaling also 587 588 plays a key role for successful reproduction of krill since saving energy during winter allows individuals to build up reproductive energy reserves faster at the onset of 589 590 spring.

Most importantly, the model provides a first parameterization of the photo-regulation 591 592 of metabolism in a mechanistic krill growth model. This makes the model especially 593 applicable for spatial simulation experiments where individuals move through 594 latitudinal gradients with different annual light regimes. In order to improve the model, future work should advance the reproduction submodel. The current concept of a 595 596 threshold energy value oversimplifies the mechanisms of krill reproduction which has been described in more detail in Constable and Kawaguchi (2018) and Kawaguchi et 597 598 al. (2007). Jager & Ravagnan (2015) suggest an alternative reproduction function

599 which forced individuals to reproduce after a fixed number of days. This leads to 600 variable clutch sizes at each spawning which depend on the amount of assimilates 601 stored in the reproduction buffer. However, this approach is detached from 602 environmental drivers and as such may not be an improvement to the current method.

603

604 **5. Conclusion**

In conclusion, this study introduces and demonstrates the functioning of a bioenergetic 605 606 krill growth model with special focus on the seasonal regulation of krill metabolism. 607 This advancement is important for the investigation of krill responses to environmental fluctuations in the extremely seasonal habitat of the Southern Ocean. As 608 609 demonstrated in this study, down-regulating foraging activity and metabolism during 610 winter strongly changes the model predictions on krill life history, especially when food availability during winter is low. Because of its relative simplicity, the model is suitable 611 612 for research which wants to scale from individuals to populations since it allows for 613 many simulation runs while keeping computational efforts comparatively low. The application of such models will therefore advance the understanding of the krill life 614 615 cycle in the critical over-wintering period which is an important goal for management 616 strategies.

617

618 **6. Acknowledgement**

We thank Dr. Sally Thorpe (British Antarctic Survey) and Dr. Eugene Murphy (British Antarctic Survey) for valuable discussions and comments on the manuscript. We also thank the Long Term Ecological Research Network for the open access to environmental data from Palmer Station. This work was supported by the German

- Research Foundation (DFG, grant number 411096565). The model code is available
- 624 under https://github.com/dbahlburg/SERBIK

References:

626	Atkinson, A., B. Meyer, D. Stuübing, W. Hagen, K. Schmidt, and U. V. Bathmann. 2002.
627	"Feeding and Energy Budgets of Antarctic Krill Euphausia Superba at the Onset of
628	Winter—II. Juveniles and Adults." Limnology and Oceanography 47 (4): 953-66.
629	https://doi.org/10.4319/lo.2002.47.4.0953.
630	Auerswald, Lutz, Bettina Meyer, Mathias Teschke, Wilhelm Hagen, and So Kawaguchi.
631	2015. "Physiological Response of Adult Antarctic Krill, Euphausia Superba, to Long-
632	Term Starvation." Polar Biology 38 (6): 763-80. https://doi.org/10.1007/s00300-014-
633	1638-z.
634	Ballerini, Tosca, Eileen E. Hofmann, David G. Ainley, Kendra Daly, Marina Marrari,
635	Christine A. Ribic, Walker O. Smith, and John H. Steele. 2014. "Productivity and
636	Linkages of the Food Web of the Southern Region of the Western Antarctic Peninsula
637	Continental Shelf." Progress in Oceanography 122 (March): 10-29.
638	https://doi.org/10.1016/j.pocean.2013.11.007.
639	Belcher, A., G. A. Tarling, C. Manno, A. Atkinson, P. Ward, G. Skaret, S. Fielding, S. A.
640	Henson, and R. Sanders. 2017. "The Potential Role of Antarctic Krill Faecal Pellets in
641	Efficient Carbon Export at the Marginal Ice Zone of the South Orkney Islands in
642	Spring." Polar Biology 40 (10): 2001–13. https://doi.org/10.1007/s00300-017-2118-z.
643	Biscontin, Alberto, Thomas Wallach, Gabriele Sales, Astrid Grudziecki, Leonard Janke,
644	Elena Sartori, Cristiano Bertolucci, et al. 2017. "Functional Characterization of the
645	Circadian Clock in the Antarctic Krill, Euphausia Superba." Scientific Reports 7 (1):
646	17742. https://doi.org/10.1038/s41598-017-18009-2.
647	Brown, Matthew, So Kawaguchi, Steven Candy, and Patti Virtue. 2010. "Temperature
648	Effects on the Growth and Maturation of Antarctic Krill (Euphausia Superba)." Deep
649	Sea Research Part II: Topical Studies in Oceanography, Krill Biology and Ecology:

- 650 Dedicated to Edward Brinton 1924-2010, 57 (7): 672–82.
- 651 https://doi.org/10.1016/j.dsr2.2009.10.016.
- Brown, Matthew, So Kawaguchi, Steven Candy, Toshihiro Yoshida, Patti Virtue, and Steve
- 653 Nicol. 2013. "Long-Term Effect of Photoperiod, Temperature and Feeding Regimes
- on the Respiration Rates of Antarctic Krill (<I>Euphausia Superba</I>)."
- 655 *Open Journal of Marine Science* 03 (02): 40–51.
- 656 https://doi.org/10.4236/ojms.2013.32A005.
- 657 Clarke, A. 2006. "Temperature and the Metabolic Theory of Ecology." *Functional Ecology*
- 658 20 (2): 405–12. https://doi.org/10.1111/j.1365-2435.2006.01109.x.
- 659 Constable, Andrew John, and So Kawaguchi. 2018. "Modelling Growth and Reproduction of
- Antarctic Krill, Euphausia Superba, Based on Temperature, Food and Resource
- 661 Allocation amongst Life History Functions." *ICES Journal of Marine Science* 75 (2):
- 662 738–50. https://doi.org/10.1093/icesjms/fsx190.
- 663 Cuzin-Roudy, Janine, and Jean Philippe Labat. 1992. "Early Summer Distribution of
- Antarctic Krill Sexual Development in the Scotia-Weddell Region: A Multivariate

665 Approach." *Polar Biology* 12 (1): 65–74. https://doi.org/10.1007/BF00239966.

- 666 Einarsson, Baldvin, Björn Birnir, and Sven Sigurðsson. 2011. "A Dynamic Energy Budget
- 667 (DEB) Model for the Energy Usage and Reproduction of the Icelandic Capelin
- 668 (Mallotus Villosus)." *Journal of Theoretical Biology* 281 (1): 1–8.
- 669 https://doi.org/10.1016/j.jtbi.2011.03.031.
- Gille, Sarah T. 2002. "Warming of the Southern Ocean Since the 1950s." Science 295
- 671 (5558): 1275–77. https://doi.org/10.1126/science.1065863.
- 672 Grimm, Volker, Uta Berger, Finn Bastiansen, Sigrunn Eliassen, Vincent Ginot, Jarl Giske,
- John Goss-Custard, Tamara Grand, Simone K. Heinz, and Geir Huse. 2006. "A

674 Standard Protocol for Describing Individual-Based and Agent-Based Models." *Ecological Modelling* 198 (1–2): 115–126. 675 Grimm, Volker, Steven F. Railsback, Christian E. Vincenot, Uta Berger, Cara Gallagher, 676 677 Donald L. DeAngelis, Bruce Edmonds, et al. 2020. "The ODD Protocol for Describing Agent-Based and Other Simulation Models: A Second Update to Improve 678 679 Clarity, Replication, and Structural Realism." Journal of Artificial Societies and 680 Social Simulation 23 (2): 7. 681 Groeneveld, Jürgen, Uta Berger, Natasha Henschke, Evgeny A. Pakhomov, Christian S. 682 Reiss, and Bettina Meyer. 2020. "Blooms of a Key Grazer in the Southern Ocean -An Individual-Based Model of Salpa Thompsoni." Progress in Oceanography 185 683 684 (June): 102339. https://doi.org/10.1016/j.pocean.2020.102339. 685 Guillaumot, Charlène, Thomas Saucède, Simon A. Morley, Starrlight Augustine, Bruno Danis, and Sebastiaan Kooijman. 2020. "Can DEB Models Infer Metabolic 686 687 Differences between Intertidal and Subtidal Morphotypes of the Antarctic Limpet Nacella Concinna (Strebel, 1908)?" Ecological Modelling 430 (August): 109088. 688 https://doi.org/10.1016/j.ecolmodel.2020.109088. 689 Hirche, Hans-Jürgen. 1984. "Temperature and Metabolism of Plankton-I. Respiration of 690 691 Antarctic Zooplankton at Different Temperatures with a Comparison of Antarctic and 692 Nordic Krill." Comparative Biochemistry and Physiology Part A: Physiology 77 (2): 361-68. https://doi.org/10.1016/0300-9629(84)90074-4. 693 694 Höring, Flavia, Mathias Teschke, Lavinia Suberg, So Kawaguchi, and Bettina Meyer. 2018. 695 "Light Regime Affects the Seasonal Cycle of Antarctic Krill (Euphausia Superba): Impacts on Growth, Feeding, Lipid Metabolism, and Maturity." Canadian Journal of 696 697 Zoology 96 (11): 1203–13. https://doi.org/10.1139/cjz-2017-0353.

- 698 Ikeda, T. 1984. "Development of the Larvae of the Antarctic Krill (Euphausia Superba Dana)
 699 Observed in the Laboratory." *Journal of Experimental Marine Biology and Ecology*
- 700 75 (2): 107–17. https://doi.org/10.1016/0022-0981(84)90175-8.
- 701 . 1987. "Mature Antarctic Krill (Euphausia Superba, Dana) Grown from Eggs in the
 702 Laboratory." *Journal of Plankton Research* 9 (3): 565–69.
- 703 https://doi.org/10.1093/plankt/9.3.565.
- 704 Ikeda, T., and P. Dixon. 1982. "Body Shrinkage as a Possible Over-Wintering Mechanism of
 705 the Antarctic Krill, Euphausia Superba Dana." *Journal of Experimental Marine*
- 706 *Biology and Ecology* 62 (2): 143–51. https://doi.org/10.1016/0022-0981(82)90088-0.
- Jager, Tjalling, Benjamin T. Martin, and Elke I. Zimmer. 2013. "DEBkiss or the Quest for
- the Simplest Generic Model of Animal Life History." *Journal of Theoretical Biology*328 (July): 9–18. https://doi.org/10.1016/j.jtbi.2013.03.011.
- Jager, Tjalling, and Elisa Ravagnan. 2015. "Parameterising a Generic Model for the Dynamic
 Energy Budget of Antarctic Krill Euphausia Superba." *Marine Ecology Progress*

712 *Series* 519: 115–28. https://doi.org/10.3354/meps11098.

- Jia, Zhongnan, Patti Virtue, Kerrie M. Swadling, and So Kawaguchi. 2014. "A Photographic
- 714 Documentation of the Development of Antarctic Krill (Euphausia Superba) from Egg
- to Early Juvenile." *Polar Biology* 37 (2): 165–79. https://doi.org/10.1007/s00300-013-
- 716 1420-7.
- 717 Kawaguchi, Kouichi, Shingo Ishikawa, and Osamu Matsuda. 1986. "The Overwintering
- Strategy of Antarctic Krill (Euphausia Superba DANA) under the Coastal Fast Ice off
 the Ongul Islands in Lutzow-Holm Bay, Antarctica." In .
- Kawaguchi, S. 2016. "Reproduction and Larval Development in Antarctic Krill (Euphausia
 Superba)." In *Biology and Ecology of Antarctic Krill*. New York, NY: Springer Berlin
 Heidelberg.

723	Kawaguchi, So, Toshihiro Yoshida, Luke Finley, Paul Cramp, and Stephen Nicol. 2007. "The
724	Krill Maturity Cycle: A Conceptual Model of the Seasonal Cycle in Antarctic Krill."
725	Polar Biology 30 (6): 689–98. https://doi.org/10.1007/s00300-006-0226-2.
726	Kooijman, S.A.L.M. 2010. Dynamic Energy Budget Theory for Metabolic Organisation.
727	Cambridge university press.
728	Le Fèvre, Jacques, Louis Legendre, and Richard B. Rivkin. 1998. "Fluxes of Biogenic
729	Carbon in the Southern Ocean: Roles of Large Microphagous
730	Zooplankton1Contribution to Programme Antares (JGOFS-France), and to the
731	Programmes of GIROQ (Groupe Interuniversitaire de Recherches Océanographiques
732	Du Québec) and the Ocean Sciences Centre, Memorial University of
733	Newfoundland.1." Journal of Marine Systems 17 (1): 325-45.
734	https://doi.org/10.1016/S0924-7963(98)00047-5.
735	Llandres, Ana L., Gonçalo M. Marques, James L. Maino, S. a. L. M. Kooijman, Michael R.
736	Kearney, and Jérôme Casas. 2015. "A Dynamic Energy Budget for the Whole Life-
737	Cycle of Holometabolous Insects." Ecological Monographs 85 (3): 353-71.
738	https://doi.org/10.1890/14-0976.1.
739	Martin, Benjamin T., Tjalling Jager, Roger M. Nisbet, Thomas G. Preuss, and Volker
740	Grimm. 2013. "Predicting Population Dynamics from the Properties of Individuals: A
741	Cross-Level Test of Dynamic Energy Budget Theory." The American Naturalist 181
742	(4): 506–19. https://doi.org/10.1086/669904.
743	McWhinnie, M.A., and P. Marciniak. 1964. "Temperature Responses and Tissue Respiration
744	in Antarctic Crustacea with Particular Reference to the Krill Euphausia Superba." In
745	Antarctic Research Series, edited by Milton O. Lee, 63-72. Washington, D.C.:
746	American Geophysical Union. https://doi.org/10.1029/AR001p0063.

- 747 Meyer, Bettina, Lutz Auerswald, Susanne Spahic, Carsten Pape, Mathias Teschke, Bettina
- Fach, Andreas Lopata, and Veronica Fuentes. 2010. "Seasonal Variation in Body
- 749 Composition, Metabolic Activity, Feeding, and Growth of Adult Krill Euphausia
- 750 Superba in the Lazarev Sea." *Marine Ecology Progress Series* 398 (January).
- 751 https://doi.org/10.3354/meps08371.
- 752 Meyer, Bettina, Ulrich Freier, Volker Grimm, Jürgen Groeneveld, Brian P. V. Hunt, Sven
- 753 Kerwath, Rob King, et al. 2017. "The Winter Pack-Ice Zone Provides a Sheltered but
- Food-Poor Habitat for Larval Antarctic Krill." *Nature Ecology & Evolution* 1 (12):
- 755 1853–61. https://doi.org/10.1038/s41559-017-0368-3.
- 756 Morris, Max D. 1991. "Factorial Sampling Plans for Preliminary Computational
- Experiments." *Technometrics* 33 (2): 161–74.
- 758 https://doi.org/10.1080/00401706.1991.10484804.
- 759 Ngan, Phan Van, Vicente Gomes, Paulo S. M. Carvalho, and Maria José de A. C. R. Passos.
- 760 1997. "Effect of Body Size, Temperature and Starvation on Oxygen Consumption of
- 761 Antarctic Krill Euphausia Superba." *Revista Brasileira de Oceanografia* 45 (1–2):

762 01–10. https://doi.org/10.1590/S1413-77391997000100001.

- Nicol, S, M Stolp, T Cochran, P Geijsel, and J Marshall. 1992. "Growth and Shrinkage of
- 764 Antarctic Krill Euphausia Superba from the Indian Ocean Sector of the Southern

765 Ocean during Summer." *Marine Ecology Progress Series* 89: 175–81.

- 766 https://doi.org/10.3354/meps089175.
- 767 Nicol, Stephen. 1990. "The Age-Old Problem of Krill Longevity." *BioScience* 40 (11): 833–
 768 36. https://doi.org/10.2307/1311486.
- Piccolin, Fabio, Bettina Meyer, Alberto Biscontin, Cristiano De Pittà, So Kawaguchi, and
 Mathias Teschke. 2018a. "Photoperiodic Modulation of Circadian Functions in

771	Antarctic Krill Euphausia Superba Dana, 1850 (Euphausiacea)." Journal of
772	Crustacean Biology 38 (6): 707–15. https://doi.org/10.1093/jcbiol/ruy035.
773	Piccolin, Fabio, Lavinia Suberg, Robert King, So Kawaguchi, Bettina Meyer, and Mathias
774	Teschke. 2018b. "The Seasonal Metabolic Activity Cycle of Antarctic Krill
775	(Euphausia Superba): Evidence for a Role of Photoperiod in the Regulation of
776	Endogenous Rhythmicity." Frontiers in Physiology 9 (December).
777	https://doi.org/10.3389/fphys.2018.01715.
778	Quetin, L. B., R. M. Ross, and A. Clarke. 1994. "Krill Energetics: Seasonal and
779	Environmental Aspects of the Physiology of Euphausia Superba." In Southern Ocean
780	Ecology: The BIOMASS Perspective, edited by S. Z. El-Sayed, 165-84. Cambridge:
781	Cambridge University Press. http://nora.nerc.ac.uk/id/eprint/517322/.
782	R Core Team. 2020. R: A Language and Environment for Statistical Computing. R
783	Foundation for Statistical Computing. Vienna, Austria. https://www.R-project.org/.
784	Ren, Jeffrey S., and Alex H. Ross. 2001. "A Dynamic Energy Budget Model of the Pacific
785	Oyster Crassostrea Gigas." Ecological Modelling 142 (1): 105–20.
786	https://doi.org/10.1016/S0304-3800(01)00282-4.
787	Seear, Paul, Geraint Tarling, Will Goodall-Copestake, A.H. Fleming, and Ezio Rosato. 2012.
788	"Seasonal and Spatial Influences on Gene Expression in Antarctic Krill (Euphausia
789	Superba Dana)." Marine Ecology Progress Series 467 (October): 61–75.
790	https://doi.org/10.3354/meps09947.
791	Segawa, S., M. Kato, and M Murano. 1979. "Oxygen Consumption of the Antarctic Krill."
792	Transactions of the Tokyo Unversity of Fisheries 3: 113–19.
793	Shen, Yuan, Ronald Benner, Alison E. Murray, Carla Gimpel, B. Greg Mitchell, Elliot L.
794	Weiss, and Christian Reiss. 2017. "Bioavailable Dissolved Organic Matter and
795	Biological Hot Spots during Austral Winter in Antarctic Waters." Journal of

- 796 *Geophysical Research: Oceans* 122 (1): 508–20.
- 797 https://doi.org/10.1002/2016JC012301.
- Siegel, V., and V. Loeb. 1994. "Length and Age at Maturity of Antarctic Krill." *Antarctic Science* 6 (4): 479–82. https://doi.org/10.1017/S0954102094000726.
- 800 Smith, Raymond C., William R. Fraser, Sharon E. Stammerjohn, and Maria Vernet. 2013.
- 801 "Palmer Long-Term Ecological Research on the Antarctic Marine Ecosystem." In
- 802 *Antarctic Research Series*, edited by Eugen Domack, Amy Levente, Adam Burnet,
- Robert Bindschadler, Pete Convey, and Matthew Kirby, 131–44. Washington, D. C.:
- American Geophysical Union. https://doi.org/10.1029/AR079p0131.
- 805 Sousa, Tânia, Tiago Domingos, J.-C. Poggiale, and S. A. L. M. Kooijman. 2010. "Dynamic
- 806 Energy Budget Theory Restores Coherence in Biology." *Philosophical Transactions*807 *of the Royal Society B: Biological Sciences* 365 (1557): 3413–28.
- 808 https://doi.org/10.1098/rstb.2010.0166.
- Tarling, Ga, J Cuzin-Roudy, Se Thorpe, Rs Shreeve, P Ward, and Ej Murphy. 2007.
- 810 "Recruitment of Antarctic Krill Euphausia Superba in the South Georgia Region:
- 811 Adult Fecundity and the Fate of Larvae." *Marine Ecology Progress Series* 331
- 812 (February): 161–79. https://doi.org/10.3354/meps331161.
- 813 Tarling, Geraint A. 2020. "Routine Metabolism of Antarctic Krill (Euphausia Superba) in
- 814 South Georgia Waters: Absence of Metabolic Compensation at Its Range Edge."
- 815 *Marine Biology* 167 (8): 108. https://doi.org/10.1007/s00227-020-03714-w.
- 816 Teschke, Mathias, So Kawaguchi, and Bettina Meyer. 2007. "Simulated Light Regimes
- 817 Affect Feeding and Metabolism of Antarctic Krill, Euphausia Superba." *Limnology*
- 818 *and Oceanography* 52 (3): 1046–54. https://doi.org/10.4319/lo.2007.52.3.1046.

- 819 Thieurmel, Benoit, and Achraf Elmarhraoui. 2019. Suncalc: Compute Sun Position, Sunlight
- 820 *Phases, Moon Position and Lunar Phase* (version R package version 0.5.0.).

821 https://CRAN.R-project.org/package=suncalc.

- 822 Thomas, P. G., and T. Ikeda. 1987. "Sexual Regression, Shrinkage, Re-Maturation and
- 823 Growth of Spent Female Euphausia Superba in the Laboratory." *Marine Biology* 95
- 824 (3): 357–63. https://doi.org/10.1007/BF00409565.
- 825 Whitehouse, M. J., M. P. Meredith, P. Rothery, A. Atkinson, P. Ward, and R. E. Korb. 2008.

826 "Rapid Warming of the Ocean around South Georgia, Southern Ocean, during the

- 827 20th Century: Forcings, Characteristics and Implications for Lower Trophic Levels."
- 828 Deep Sea Research Part I: Oceanographic Research Papers 55 (10): 1218–28.
- 829 https://doi.org/10.1016/j.dsr.2008.06.002.
- 830 Wickham, Hadley, Mara Averick, Jennifer Bryan, Winston Chang, Lucy McGowan, Romain
- 831 François, Garrett Grolemund, et al. 2019. "Welcome to the Tidyverse." *Journal of*

832 *Open Source Software* 4 (43): 1686. https://doi.org/10.21105/joss.01686.

- 833
- 834

Tables

entity	state variable	abbreviation	value (range)	unit	type
environment	temperature	Т	271.22 - 274.61	Kelvin	floating point number
	day length	LD	4.17 - 21.07	hours	number floating point
	food concentration	chla	0.09 - 6.59	mg m ⁻³	number
krill					
individual	age	а	1 - 2190	days	integer floating point
	structural biomass	Es	0.0001 - 348	mg dry weight	number floating point
	reproductive biomass assimilates in egg	E_R	0 - 159	mg dry weight	number floating point
	buffer	EA	0 - 0.028	mg dry weight	number
	stage	stage	1 - 3	-	integer

Table 1: State variables of the krill growth model and their properties

type	abbreviation	meaning	value (range)	unit	reference
auxiliary functions	$f_T(T)$	temperature-dependent metabolic scaling	0.3-1.25	-	
	f _{PP} (Id)	light-dependent metabolic scaling	0.161 - 1		
	$M_{reg}(I_d,T)$	environmental scaling of metabolism	0.46 - 1		
	J _A (L)	total assimilated energy	0 - 4.66	mg dry weight	
	$J_M(L)$	structural maintenance costs	0 - 2.12	mg dry weight	
	E _{deficit}	energy deficit	0 - 1.06	mg dry weight	
	E _{rep}	reproduction energy threshold	63-164	mg dry weight	
parameters					
	Е	activation energy	0.663 (0.633 - 0.693)*	eV	Hirche 1984
		slope linear regression light- dependent scaling	0.036 (0.018 - 0.052)*		Piccolin et al. 2018b
		intercept linear regression light- dependent scaling	0.161 (-0.105 - 0.427)	hours	Piccolin et al. 2018b
	ε _s κ	conversion efficiency assimilates to structure fraction allocation to structural biomass	0.8 0.7	mgC mgC ⁻¹	Jager and Ravagnan (2015)
	ε _F	conversion efficiency food to assimilates conversion efficiency structure to cover energy deficit	0.8	mg dry weight mg dry weight-1	Jager and Ravagnan (2015)
	Emetab		0.8	mg dry weight mg dry weight-1	Jager and Ravagnan (2015)
	εΑ	conversion efficiency egg buffer to structure	0.95	mg dry weight mg dry weight-1	Jager and Ravagnan (2015)
	Kchia	half saturation constant chlorophyll a uptake	1	ma m ⁻³	с с ,
	Amax	maximum area-specific assimilation rate	0.087	ma drv weiaht mm ⁻² d ⁻¹	Jager and Ravagnan (2015)
	James	maximum volume-specific somatic	0.0032	ma dry weight mm ⁻³ d ⁻¹	Jager and Bayagnan (2015)
	W/a	weight egg	0.028	ma dry weight	Jager and Bayagnan (2015)
	Sw	spawning window	Oct - Mar	ing dry weight	ouger and havaghan (2010)
	d.	dry weight density	0.22	ma dry weight mm ⁻³	Jager and Bayagnan (2015)
	0,	conversion factor volumetric length	5.22	ing dry weight min	lager and Payagnan (2015)
	CBL		5		Jager and Ravagnan (2015)
		iransilion size juvenile to adult	30	11111	Jayer anu navagnan (2015)
derived variables	L	volumetric length	0.077 - 9.166	mm	
	LB	body length	0.34 - 58.28	mm	

838 Table 2: Model parameters and their values. *95% Confidence interval for estimated

839 parameters obtained via bootstrapping

Supplementary material for online publication only

Click here to access/download Supplementary material for online publication only BahlburgEtAlSupplement.docx