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Department of Applied Mathematics

Report AM-R8609

October

3 0054 00028 7517

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# Well-Posedness of Physiologically Structured Population Models for Daphnia Magna

(How biological concepts can benefit by abstract mathematical analysis)

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In this paper we heuristically discuss the well-posedness of three variants of the Kooijman/Metz model. Shortcomings concerning the uniqueness and continuous dependence on data of the solutions to one of the variants are traced back to an inconsistency in the biological concept of energy allocation in this model version. The conceptional consequences are discussed and an open question concerning energy allocation is pin-pointed. A rigorous mathematical treatment will be presented in a forthcoming publication.

• 1980 Mathematics Subject Classification: 92A15. Key Words & Phrases:

Daphnia magna, physiologically structured populations, energy allocation, age-dependent mortality, size-dependent reproduction, feed-back with variable time-delay, well-posedness, existence, uniqueness and continuous dependence on data of solutions, nonlinear partial functional-differential equations, measure-valued solutions

Report AM-R8609 Centre for Mathematics and Computer Science P.O. Box 4079, 1009 AB Amsterdam, The Netherlands

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#### Acknowledgement

This work was largely done when the author enjoyed the hospitality of the Centre for Mathematics and Computer Science (CWI) in Amsterdam from August 1984 to July 1985 and was supported by a scholarship from the Netherlands Organization for Pure Scientific Research (ZWO). The paper was finished when the author was supported by a Heisenberg scholarship from the German research foundation (DFG) and stayed at the Sonderforschungsbereich 123 at the university of Heidelberg. The author thanks O. Diekmann, S.A.L.M. Kooijman, H.A. Lauwerier, J.A.J. Metz and M.W. Sabelis for organizing his stay at CWI. He also thanks them and M. Gyllenberg, H.J.A.M. Heijmans, R.M. Nisbet, and S. Luckhaus for useful discussions and comments.

#### Introduction

Kooijman and Metz [7] (see also [2]) recently presented a mathematical model for the development of waterflea (Daphnia magna) populations which takes the observation seriously that the mortality of Daphnia magna widely depends on the age, the fertility, however, on the size of the individual. In particular, the length of the juvenile period (the period before reproduction starts) is essentially affected by the amount of food the waterfleas are supplied with and thus represents a regulatory mechanism for the population density, which is neglected in conventional mathematical models.

The Kooijman/Metz model belongs to the class of physiologically structured population models (see [3] for a survey and a bunch of references) which associate the development of the individual with the dynamics of the

population by means of a population structure which is generated by one or several relevant physiological traits of the individual (age, size, energy reserves etc.). In this way physiologically structured population models translate physiological impacts on the individual into impacts on the population development and vice versa. So the Kooijman/Metz model can possibly be used to identify the toxic effects of chemicals on the various physiological functions of Daphnia magna (which are difficult to observe directly) via the impact of the chemical onto the development of population size and distribution [7]. The applicability of the Kooijman/Metz model (all rates are given explicitly with a limited number of parameters all of which can be estimated or at least be guessed from experimental observation) is achieved by a number of idealizations which neglect biological details for which sufficient information is not available in practice or even in principle. These idealizations, however, which simplify the model, create unusual (at least for mathematical models in population dynamics) mathematical difficulties in proving the well-posedness of the model equations (nonlinear partial functional-differential equations of first order or, alternatively, nonlinear integral equations), i.e. in showing that solutions exist and are uniquely determined by and continuously depend on the model data. The latter point is of particular interest for the modelling itself because it decides upon whether the idealizations are actually justified and the solutions of the idealized model (which is a limiting model) are not too far away from the solution of a presumably more realistic model.

It must be expected that similar problems will arise in many physiologically structured population models which are not only tailored for theory but for practice, so that the analysis of the Kooijman/Metz model as a proto-

type of such models will also be a step towards a general mathematical theory which, up to now, is still in its infancy. In this paper we only give a heuristic analysis of the Kooijman/Metz model; in a forthcoming paper [8] we will give a rigorous analysis of a much more general model in order to leave the theory open for other physiologically structured population models, e.g. for a Daphnia model incorporating energy reserves (see Kooijman's model in [5]).

Though the original Kooijman/Metz model is well-posed for many initial data (in particular if they are close to the equilibrium), one can construct initial conditions under which uniqueness of solutions (and so their continuous dependence on data) fails. So we introduce two other variants of the Kooijman/Metz model: one which incorporates some of the ideas of another group of Daphnia modellers (Gurney, McCauley, Murdoch, Nisbet) and a second one which modifies the original Kooijman/ Metz model according to the lessons taught by the mathematical analysis of this paper. (See section 1 for the general ideas behind the Kooijman/Metz model and its variants, and section 2 for the specific features of the three versions.) We compare the three versions for uniqueness of solutions and for continuous dependence of solutions on the data of the model. In order to study the latter point properly we have to extend the Kooijman/ Metz model such that it admits solutions (representing age-size-distributions of the population in dependence on time) which are measures (see chapter 3 for this extension, see also [4] for another model for physiologically structured populations which also involves measure-valued solutions.). In the forthcoming paper [8] we present and prove a fairly general result concerning the existence of solutions for a large class of physiologically structured population models. Therein we also

study various conditions for the uniqueness of solutions and show that uniqueness implies continuous dependence on model data under very mild assumptions. Three of those conditions are particularly suited for each of the three variants of the Kooijman/Metz model respectively. In section 4 we present the conditions in terms of the Kooijman/Metz model and illustrate heuristically how each of them implies uniqueness of solutions and how uniqueness fails if none of them is satisfied. We discuss the restrictions they impose on the three versions of the Kooi, jman/Metz model. The phenomenon that certain initial conditions do not induce a unique solution to the original Kooijman/Metz model is traced back to the underlying concept of energy allocation. We offer some speculations how this concept can be modified and leave the question to the biologists whether they can identify corresponding physiological mechanisms.

## 1. Some general ideas about the Kooijman/Metz Daphnia model and its variants

In contrast to age-structured population models (see the monograph by Webb [9] for a survey and a flood of references) which are particularly suited for human populations, the Kooijman/Metz model acknowledges the importance of the size structure of the population for its future development. For, according to the observations by Kooijman and Metz, an individual waterflea does not become mature (or adult, i.e. starts reproducing under favourable food conditions) when reaching a certain age, but when its body length passes a threshold length  $l_{\rm T}$  (= 2,5 mm).

The assimilation energy which the individual wins from food consumption is assumed to be proportional to its surface area and to be partitioned between maintenance of tissue and metabolism (with the energy costs being proportional to the volume of the individual), growth, and maturation/reproduction. The Kooijman/Metz model supposes that juveniles and adults channel the same proportion of assimilation energy into growth and so implicitly supposes that the energy which adults use for reproduction is used for maturation (whatever that means) by juveniles. This view is not shared by another group of Daphnia modellers (Gurney, McCauley, Murdoch, Nisbet), who do not separate maturation from growth but assume that juveniles channel all the assimilation energy into maintenance and growth, whereas adults also use energy for reproduction. This assumption, however, (at least if the assimilation energy is not smoothly diverted, but abruptly switched from growth to reproduction) does not lead to the van Bertalanffy individual growth curves which follow from the Kooijman/Metz model and seem to fit quite well the data Kooijman and Metz work with (see [6], [7]). If one distinguishes between growth and maturation in juveniles as is implicitly done in the Kooijman/Metz model one has to acknowledge the apparently perfect synchronization between maturation and growth, namely that even under different food regimes maturity is always reached at the same length 1, . This involves that, by some unknown mechanism, maturation stops when growth stops and vice versa. Since it is the same portion of energy which juveniles channel into maturation and adults channel into reproduction, an individual whose growth stops when reaching the threshold size  $l_{\mathsf{T}}$  should not be able to reproduce. But this relation is not satisfied by the reproduction law of the Kooijman/ Metz model. So we introduce a third version (the second incorporates the ideas of Gurney, McCauley, Murdoch and Nisbet) in which the reproduction law is modified such

that individuals with length  $l_J$  can only reproduce if they grow. The feature of the Kooijman/Metz model that non-growing individuals which are larger than  $l_J$  can reproduce under certain food conditions (as it is actually observed in the laboratory) is preserved. Unfortunately there are several mathematical possibilities to modify the Kooijman/Metz reproduction law, but there is no evidence from biological observation or theory which helps to choose the appropriate one. (In chapter 5 we will offer some speculation which tries to explain the synchronization of maturation and growth and involves a definite reproduction law satisfying our postulates.)

The subsequent analysis of these three versions (which is done heuristically in this paper and will be made rigorous in [8]) scrutinizes whether they are mathematically well-posed, i.e. whether the model equations allow the existence and induce the uniqueness of solutions and whether the solutions depend continuously (in an appropriate sense) on the data of the model (e.g. on the per capita growth and reproduction rate). The last point is of particular importance, for all three versions are idealizations in at least two aspects:

- i) The rapid, but presumably continuous increase of reproduction as growth passes the threshold size is idealized by a jump.
- ii) The high concentration of the birth size distribution at one particular size is idealized by assuming that all individuals are born with exactly the same length  $l_{\rm R}$ .

These idealizations are necessary because the application of the idealized more realistic set—up requires detailed biological information which cannot be obtained in practice or even in principle. The continuous dependence of the

solutions on the model data decides upon whether the idealizations (which are actually limits) are justified. If it does not hold or only holds under restrictions, then there are good reasons to reconsider the underlying biological concept of the model and to identify and modify the hypotheses which are responsible.

2. The submodels for development, reproduction and mortality of individual Daphnia in the three versions of the Kooijman/Metz model

Physiologically structured population models draw their appeal from allowing the modeller first to establish submodels for the relevant processes on the level of the individual and then, only in a second step of modelling, to combine these submodels into an overall model for the dynamics of the populations. In this chapter we present the submodels for the processes affecting the individual Daphnia, namely development, reproduction and mortality. The Kooijman/Metz model assumes that the way in which an average waterflea is subject to these processes depends on its developmental state x which can be described by two variables (a,l) = x, namely by its age a and its length 1. (The Kooijman/Metz model neglects energy reserves. These are taken into account in the Kooijman model [5] which is not considered here.) The submodels for reproduction and mortality define the average per capita birth and death rates B(E,x) and  $\mu(E,x)$  in terms of the state x of the individual and on the environmental conditions E. According to the observations by Kooijman and Metz the reproduction only depends on the length and the mortality (apart from starvation) on the age of the individual. The development of the individual is described by a two-dimensional system of ODEs for the developmental state, namely

(2.1) 
$$\dot{x} = (\dot{1}) = (g_1(E,x)) = g(E,x)$$

Here x denotes the time derivative  $\frac{d}{dt}$  x(t) of the state x(t) at time t, E = E(t) the environmental conditions at time t.  $g_1$  and  $g_2$  denote the rates of aging and growth in dependence on the environment and the state of the individual. It is reasonable to assume that the rate of aging  $g_1$  does not depend on age a and length 1. As a rule of thumb, however, aging speeds up with temperature (i.e. the life span is shorter at higher temperatures) so that  $g_1$  certainly depends on the environment. If the temperature (and maybe other environmental factors) are kept constant, one can assume that  $g_1 = 1$ .

As we explained the general ideas of the Kooijman/Metz model in the previous chapter and as we can refer to the specific explanations in [2], [7], we only outline the submodels for development, reproduction and mortality in the three versions of the Kooijman/Metz model.

## 2.1. The original Kooijman/Metz model (version 1)

A waterflea wins assimilation energy  $\tilde{E}=f(E)$  (per unit area of body surface) by digesting food which is partitioned into maintenance of tissue and metabolism, maturation/reproduction and growth.  $\tilde{E}$  may not only depend on the food density, but also on other environmental conditions, e.g. on temperature, the increase of which speeds up the digestion rate. The length growth rate  $g_2$  is given by

(2.2) 
$$g_2(E,a,1) = [\kappa \tilde{E} - 1]_+$$
,

the per capita birth rate by

$$\beta(E,a,1) = 0 , \text{ if } 1 < 1_{J}$$

$$\beta(E,a,1) = \beta_{O}(E,1), \text{ if } 1 > 1_{J}$$
with
$$(2.4) \quad \beta_{O}(E,1) = w1^{2}\{[\tilde{E}-1]_{+} - [\kappa \tilde{E}-1]_{+}\}.$$

Here 1 does not denote actual length, but some scaled length.  $[\widetilde{E} - 1]_{\perp} 1^2$  is the energy which is available after having covered the energy costs of maintenance. k is the fraction of energy channelled into growth. Reproduction takes priority over growth because the energy needed for maintenance is subtracted from the

energy put into growth as long as the outcome is posi-

For

tive.

(2.4)

$$\beta_0(E,1) = wl^2(1 - \kappa) \hat{E}$$

kE > 1. w is the factor converting assimilation energy into offspring. I, indicates the threshold length which separates juvenile from adult (reproductive) individuals. Note that the fraction of energy channelled into growth is the same for both stages. The energy which adults use for reproduction is used for maturation by juveniles.

## 2.2. Version 2 of the Kooijman/Metz model

Another group of Daphnia modellers (Gurney, McCauley, Murdoch and Nisbet) integrate maturation into growth and assume that juveniles channel all the energy which is not needed for maintenance into growth. We modify the Kooijman/Metz model accordingly by supposing that

energy is switched from growth to reproduction as soon as the individual passes the threshold length  $l_{,\Gamma}$ .

(2.5) 
$$g_{2}(E,a,1) = [\widetilde{E} - 1]_{+}, \text{ if } 1 < 1_{J}$$
$$g_{2}(E,a,1) = [\kappa \widetilde{E} - 1]_{+}, \text{ if } 1 > 1_{J}$$

The reproduction rate is not affected by this modification and is given by (2.3), (2.4).

### 2.3 Version 3 of the Kooijman/Metz model

We have pointed out in section 1 that separating, but synchronizing growth and maturation has the conceptual consequence that individuals which have just passed the threshold length  $l_J$  only reproduce if they grow. Incorporating this idea in the Kooijman/Metz model does not affect the rate of length growth  $g_2$  in (2.2), but requires modifying  $\beta_0$  in (2.3), (2.4) such that

(2.6) 
$$\beta_0(E,l_J) = 0$$
 iff  $g_2(E,a,l_J) = 0$ .

This can be done in replacing  $\beta_0$  in (2.4) by

(2.7) 
$$\beta_{o}(E,1) = w \{ [\tilde{E}1^{2} - 1^{3} - (\frac{1}{k} - 1) 1_{J}^{\alpha} 1^{3-\alpha} ]_{+} - [\kappa \tilde{E}1^{2} - 1^{3}]_{+} \}$$

with some  $0 < \alpha \le 3$  . Note that

$$\beta_0(E, l_J) = (\frac{1}{k} - 1) \text{ w } g_2(E, a, l_J) l_J^2$$

so that (2.6) is satisfied. Moreover we keep the property that individuals of length  $1>1_{\rm J}$  can reproduce without growing under certain environmental conditions. Unfortunately there is no stringent indication how  $\alpha$  should be

chosen. In section 4.6 we offer some speculation which supports the choice  $\alpha = 3$ .

We do not specify the per capita mortality rates here because there is no difference between the three versions. Kooijman and Metz originally assume (see [2]) that a waterflea dies as soon as the assimilation energy won from the food does not cover the maintenance needs. Although this idea has some conceptional appeal, it appears to me unrealistic (even as an idealization) and mathematically difficult to be handled. Actually this point is one of the drawbacks of neglecting energy reserves. Incidentally the Kooijman/Metz model neglects certain aspects of starvation from the very beginning, because it does not include that Daphnia magna may switch from parthenogenetic to sexual reproduction under sudden food shortage. In order to keep the theory open for a better understanding of starvation (e.g. for adding energy reserves as a further state variable) we develop the model for the dynamics of the population more broadly than it is actually needed for the three versions of the Kooijman/Metz model, in particular we admit rather general mortality rates which depend on the environment and on the individual's state in a sufficiently smooth way.

## 3. Model for the dynamics of the population

Imagine that, starting at time t=0, we rear a population of Daphnia magna in a spatially homogeneous environment such that, at any time  $t\geq 0$ , all individuals experience identical environmental conditions. (Here environment means the totality of exterior components affecting the animal like temperature, salinity, pH-value, food density etc..) Laboratory experiments [6,7] have shown that a model which wants to draw a not too unrealistic picture of the development of the population has to include the processes of aging and growth of individuals. For, apart

from environmental impacts, the mortality of Daphnia magna seems to depend on the age of the individual, whereas reproduction is strongly related to its size. In ectothermic animals like Daphnia, however, age does not necessarily mean chronological age (i.e. the time since birth). So, more precisely, the probability of surviving for a period of length  $\tau$  (starting from birth) is a function of  $\tau$  provided that temperature (and other environmental impacts perhaps) are kept constant. As a rule of thumb ectothermic animals die the earlier the higher the temperature (death from frost excepted) [6].

#### 3.1. The general submodel for individual development

More generally than before we assume that the state of an individual is indicated by a vector  $\mathbf{x} \in [0, \infty)^{\mathbf{m}}$  of m traits (like age, size, energy reserves etc.). The development of an average individual is described by the change of its state. Let  $\mathbf{X}(\mathbf{t},\mathbf{s},\mathbf{y})$  denote the state of the individual at time t if it has the state y at time s. Then X is supposed to satisfy the following ODE:

$$X(s,s,y) = y$$
(3.1)
 $\partial_t X(t,s,y) = g(E(t), X(t,s,y))$ 

with g(E,x) indicating the developmental rate of an individual with state x under environmental conditions E. Setting x(t) = X(t,s,y), (3.1) corresponds to (2.1) in the Kooijman/Metz model with initial conditions x(s) = y.

## 3.2. The general submodel for individual survival

In general it is reasonable to assume that the per capita mortality rate  $\mu(E,x)$  depends both on the environmental conditions E and on the individual's state x. We want to derive a formula for the probability K(t,s,x) at which

an individual survives from time s to time  $t \ge s$  if x is the individual's state at time s. It is obvious from the interpretation of K that

(3.2) 
$$K(t+h, s,x) = 1$$
  $K(t+h,t,X(t,s,x)) K(t,s,x)$ 

for  $t \ge s$ , h > 0. If h is sufficiently small

(3.3) 
$$K(t+h,t,y) = 1-\mu(E(t),y) \cdot h + o(h)$$

with  $o(h)/h \longrightarrow 0$  for  $h \searrow 0$ . So we obtain the following differential equation for K:

$$(3.4) \qquad \partial_{t}K(t,s,x) = -\mu(E(t), X(t,s,x)) K(t,s,x)$$

As K(s,s,x) = 1, integration of (3.4) yields

(3.5) 
$$K(t,s,x) = \exp(-\int_{s}^{t} \mu(E(r), X(r,s,x)) dr)$$

The model for the dynamics of the population associates individual development and mortality (as they are described in section 3.1 and 3.2) with the dynamics of the population. For the ease of the reader we first discuss the case that all individuals are born equal.

## 3.3. The case of identical birth state

In the Kooijman/Metz model all waterfleas are born with age a = 0 and length  $l_B$  (= 0,8 mm). More generally we consider the case that all neonates have the same state  $\mathbf{x}_B$ . This implies that all individuals which have been born at some time s > 0 have the same state  $\mathbf{X}(\mathbf{t},\mathbf{s},\mathbf{x}_B)$  at time  $\mathbf{t} \geq \mathbf{s}$  provided they did not die before. The probability

to survive from time s to time t is given by  $K(t,s,x_B)$ . Further individuals from the initial population that had the same state y at time s=0, have the same state X(t,0,y) at time  $t\geq 0$ , if they are still alive. The probability of survival is given by K(t,0,y) in this case.

Let now the continuous (or more generally Borel measurable) function  $\bigoplus$  (x) denote some action (e.g. reproduction, food consumption) of an individual in state x. We want to describe the corresponding action of the whole population at time t in terms of the population birth rate B(s),  $0 \le s \le t$ , and the initial state distribution  $N_0(y)$ , y 6  $[0, \infty)^m$ . We first note that an individual acting at time t was either born at some instant s, 0 < s < t, or was already present at time 0 with a state y. If the individual was born at time s, its action at time  $t \ge s$  is given by

$$\Phi$$
 (X(t,s,x<sub>B</sub>)) K(t,s,x<sub>B</sub>)

If it was already present at time 0 with state y, its action at time  $t \ge 0$  is given by

$$\Phi$$
 (X(t,0,y)) K(t,0,y)

Then the corresponding action  $A_{\Phi}(t)$  of the whole population at time t is given by

In order to write down the formula for the population birth rate we introduce the per capita birth rate  $\beta(E,x)$  which depends on the state x of the individual and the environmental conditions E. Then, by the preceding considerations with  $\Phi(x) = \beta(E(t),x)$  and (3.6),

$$B(t) = \int_{0}^{t} B(E(t), X(t,s,x_{B})) K(t,s,x_{B}) B(s)ds$$

$$(3.7)$$

$$+ \int_{0}^{t} B(E(t), X(t,0,y)) K(t,0,y)N_{0}(y)dy.$$

$$[0, \infty)^{m}$$

Similarly we can describe the dynamics of the environment:

$$\frac{d}{dt} E(t) = q(E(t))$$

$$- \int_{0}^{t} f(E(t), X(t,s,x_B)) K(t,s,x_B) B(s)ds$$

$$- \int_{0}^{t} f(E(t),X(t,0,y)) K(t,0,y)N_{0}(y)dy$$

$$[0,\infty)^{m}$$

The ODE

$$\frac{d}{dt} E(t) = q(E(t))$$

describes the dynamics of the environment in absence of Daphnia, f(E,x) indicates the negative feed back of an individual in state x onto the environment E. The equations (3.1), (3.5), (3.7), (3.8) form a closed model. After having solved the model equations (3.1), (3.5), (3.7), (3.8) we can obtain the state distribution of the population from formula (3.6). In general the state distribution cannot, be described by a Lebesque density, i.e.

$$A_{\widetilde{T}}(t) = \int_{[0, \infty)^m} \widetilde{T}(x) \widetilde{N}(t, x) dx$$

for all continuous bounded  $\Phi$ . This raises the question whether it is reasonable to restrict to initial distributions  $N_o(y)$  which are Lebesque densities. Anyhow it should be possible to include initial populations in which all individuals have the same state. This amounts to replacing the integration  $N_o(y)$ dy by  $N_o(dy)$  in (3.7) and (3.8) with  $N_o$  being now a Borel measure on  $[0, \infty)^m$ .

This formulation of the Kooijman/Metz model corresponds to the formulation (2.10) in [2] after integration and reduction to the population birth rate B. In our derivation we have replaced chronological age by the time of birth in order to avoid confusion because, in this approach, age is a state variable incorporated in the state x already. This has the advantage that temperature-dependent aging is included and that, in a further step of generalization, we can consider initial populations in which all individuals have the same age.

### 3.4 The general model

If we want to study the continuous dependence of solutions on the model data properly we must abandon the formulation in section 3.3 which relies on the assumption that all individuals are born in the same state. The assumption of the Kooijman/Metz model that all neonates have exactly the same length  $l_{\rm B}=0.8$  mm is certainly the idealization of a highly concentrated but dispersed birth length. This requires that the model must be formulated from the very beginning in terms of state distributions which are represented by measures. The following derivation might appear a bit exotic to those who are used to work with densities, but this approach seems unavoidable and quite natural. Those who are only interested in the results may proceed to section 4 immediately. We now start from the state

distribution N(t,L) of individuals at time t with state x in a Borel set L (e.g. an open or a closed set) in  $[0,\infty)^m$ . N(t,L) is assumed to be a Borel measure on the Borel sets L of  $[0,\infty)^m$ . If  $\bigoplus (x)$  again denotes some action of an individual in state x, the corresponding action  $A_{\widehat{\Psi}}$  (t) of the whole population at time t is given by

(3.9) 
$$A_{\Phi}(t) = \int_{[0, \infty)^{m}} \Phi(x) N(t, dx)$$

As the state at birth is not fixed any more, we similarly introduce the state distribution B(t,L) of the population birth rate at time t. If an individual is born in state y at time s E(0,t), its action at time t is

$$\Phi(X(t,s,y)) K(t,s,y)$$

with X(t,s,y) giving its state at time t and K(t,s,y) giving the probability of having survived to time t. So the action of the whole population at time t is given by

$$A_{\overline{\Phi}}(t) = \int_{[0, \infty)^{m}} \Phi(x) N(t, dx)$$

$$= \int_{0}^{t} \int_{[0, \infty)^{m}} \Phi(X(t, s, y)) K(t, s, y) B(t, dy) ds$$

$$+ \int_{[0, \infty)^{m}} \Phi(t, 0, y) K(t, 0, y) N_{o}(dy)$$

with N<sub>o</sub> denoting the initial state distribution of the population. The second term on the right hand side of (3.10) gives the action of the individuals which were already present at the beginning and is essentially the same as in (3.6). Let now  $\beta(L; E,x)$  describe the rate

of neonates with state y in the set L produced by an average individual in state x under the environmental conditions E. Then the population birth rate B is given by (3.9) with  $\Phi = B(L; E, .)$ , i.e.

(3.11) 
$$B(t,L) = \int_{[0,\infty)^m} B(L; E(t),y) N(t,dy).$$

From (3.10) we obtain

$$B(t,L) = \int_{0}^{t} \int_{0}^{\infty} B(L; E(t), X(t,s,y)) K(t,s,y)$$

$$B(s,dy) ds$$

$$+ \int_{0}^{\infty} B(L; E(t), X(t,0,y)) K(t,0,y)$$

$$N_{0}(dy).$$

In a similar way (3.8) is generalized to

$$\frac{d}{dt}E(t) = q(E(t)) - \int_{0}^{t} f(E(t),X(t,s,y))$$

$$(3.13) \qquad K(t,s,y) B(s,dy)ds$$

$$- \int_{0,\infty}^{t} f(E(t),X(t,0,y))K(t,0,y)N(dy).$$

The equations (3.12) and (3.13) in combination with (3.1) and (3.5) form a closed model for the dynamics of Daphnia magna populations. The special case of identical birth state which has been discussed in section 3.3 can be embedded into this model via

$$B(L;E,x) = B(E,x) \mathbb{I}_{L}(x_{B})$$

$$B(t,L) = B(t) \mathbb{I}_{L}(x_{B})$$

with  $x_B$  denoting the identical birth state and  $\Pi_L(x_B) = 1$  if  $x_B \in L$ ,  $\Pi_L(x_B) = 0$  if  $x_B \notin L$ .

We conclude this section with some remarks.

Remark 3.1 a) Let  $\bigoplus$  be any bounded continuously differentiable non-negative function on  $[0, \infty)^m$ . Then we find from (3.10), (3.1), (3.4), and (3.11) that

$$\frac{d}{dt} \int_{[0, \infty)^{m}} \Phi(x) N(t, dx)$$

$$= \int_{[0, \infty)^{m}} (\nabla \Phi(x)) \cdot g(E(t), x) N(t, dx)$$

$$= \int_{[0, \infty)^{m}} \Phi(x) \mu(E(t), x) N(t, dx)$$

$$+ \int_{[0, \infty)^{2m}} \Phi(x) \beta(dx; E(t), y) N(t, dy)$$

In other words N is a distributional solution of the partial differential equation

$$\partial_{t} N(t,dx) + \nabla_{x} \cdot g(E(t),x) N(t,dx)$$

$$+ \mu(E(t),x) N(t,dx) = \begin{cases} \beta(dx; E(t),y) \\ 0, \infty \end{cases}$$

$$N(t,dy)$$

Together with

(3.16) 
$$\frac{d}{dt} E(t) = q(E(t)) - \int_{[0, \infty)^m} f(E(t), x) N(t, dx)$$

and appropriate initial conditions this is also a closed model for Daphnia magna population dynamics. Compare

(3.15) and (3.16) with the formulas in [2], p. 89, above. Whereas the formulation of the model in terms of B seems to be more useful for studying the existence, uniqueness and continuous dependence on data of solutions, the formulation in terms of N seems to be more appropriate for studying the qualitative behaviour. Namely, for fixed E, N induces a linear evolutionary system on the Banach space  $Z^K$  of regular Borel measures on  $[0, \infty)^M$ .  $Z^*$  is the dual space of continuous function on  $[0, \infty)^M$  vanishing at infinity. N and E together induce a (nonlinear) dynamical system (semiflow) on  $Z^* \times [0, \infty)^N$ . A first step towards a general theory of such dynamical systems is done in [1].

b) In order to write (3.15) in a more familiar way let us assume that the state of the individual is characterized by one trait alone, i.e.  $x \in [0, \infty)$ , that all individuals are born in the same state  $x_B$  and that the state distribution of the population can be represented by a sufficiently smooth Lebesque density. Then (3.15) takes the form

$$\partial_{t} N(t,x) + \nabla_{x} \cdot (g(E(t),x) N(t,x))$$

$$+ \mu(E(t),x) N(t,x) = 0 ; x \neq x_{B}$$

$$(3.17)$$

$$g(E(t),x_{B} +) N(t,x_{B} +) - g(E(t),x_{B} -) N(t,x_{B} -)$$

$$= \int_{0}^{\infty} \beta(\{x_{B}\}, E(t),y) N(t,y) dy$$

Here  $x_B$  + and  $x_B$  - denote the limits at  $x_B$  from the right and from the left. This can be seen from the distributional formulation by first choosing  $\Phi$  such that  $\Phi(x_B) = 1$ ,  $\Phi(x) = 0$  if  $|x - x_B| \ge 1/n$  and the graph of  $\Phi(x) = 1/n$  formed by the straight lines connecting the points  $(x_B - 1/n, 0)$ ,  $(x_B, 1)$ ,  $(x_B + 1/n, 0)$  and by then taking the limit  $n \longrightarrow \infty$ .

#### 4. Heuristic outline of results

Differently from most other mathematical models in population dynamics the Kooijman/Metz model is mathematically challenging even as far as the most elementary mathematical question a mathematical model can raise is concerned: namely whether the model is mathematically correctly posed, i.e. whether the model equations allow the existence and induce the uniqueness of solutions and whether the solutions depend continuously on the data of the model. The last point is of paramount importance for the modelling itself: for the jump in the birth rate at the threshold length  $l_{\rm J}$  is the idealization of a drastic increase of births as well as the fixed birth length  $l_{\rm B}$  is the idealization of a highly concentrated birth size distribution.

In this paper we explain heuristically why well-posedness is a problem for the Kooijman/Metz model and to what extent it can be solved. The precise statement and the proof of much more general results can be found in a forthcoming paper [8].

## 4.1 The mathematical crux of the Kooijman/Metz model

Actually the idealizations (jump of the birth rate, fixed birth size) which simplify the model biologically are responsible for making well-posedness a nontrivial problem. Note that in all three versions of the Kooijman/Metz model we left the birth rate undefined for  $1 = l_{\rm J}$  namely

(4.1) 
$$\beta(E,a,1) = \begin{cases} 0 & ; 1 < 1_{J} \\ \beta_{O}(E,1) & ; 1 > 1_{J} \end{cases}$$

with '  $\beta_0(E,1)$  being a continuous function of  $E,1\geq 0$  and

 $B_o(E,l_J) > 0$  being not excluded for appropriate values of E (See (2.3), (2.4), (2.7)). We did this because there is no biological indication from observations or from inherent logic (version 2 excepted) how the birth rate should be defined at  $l_J$ . Actually there are solutions for both of the extreme cases

(4.2) 
$$\widetilde{B}(E,a,1) = \begin{cases} 0 & ; 1 < 1_{J} \\ B_{o}(E,1); 1 \ge 1_{J} \end{cases}$$

(4.3) 
$$\beta(E,a,1) = \begin{cases} 0 & ; 1 \leq 1_{J} \\ \beta_{o}(E,1); 1 > 1_{J} \end{cases}$$

which are called upper and lower solutions (see [8]). The ambiguity of the birth rate makes no problem as long as no length cohort of individuals stops their length growth at  $l = l_{.T}$  (A length cohort is a part of the population which only contains individuals of identical length and has non-zero measure.) In other words a length cohort is a Dirac delta peak of the length distribution of the population.) Once a length cohort had been formed. one cannot exclude that it stops at  $l = l_T$  because the growth rate go in all versions of the Kooijman/Metz model can be zero under appropriate conditions. If this happens, upper and lower solutions will be different, unless  $B_{\Omega}(E(t), l_{T}) = 0$ . But the situation is even worse: It is not clear whether the upper and the lower solutions are determined uniquely because one cannot (in general) derive a Lipschitz condition or other conditions which usually imply uniqueness. Without such conditions uniqueness fails for ODEs  $\beta' = \eta(\beta)$  with continuous  $\eta$ already.

## 4.2 Continuous dependence of solutions on model data

For the Kooiiman/Metz model the continuous dependence of solutions on the model data is closely linked with their uniqueness. For we show in [8] that a sequence of approximating models (i.e. the data of the models approximate the data of the model under consideration in an appropriate sense) contains a subsequence of models the solutions of which (provided that they exist) converge towards a solution of the approximated model. (While the solutions of (3.1) and (3.13) converge strongly, the measures which solve (3.12) only converge in a weak sense, i.e. when they integrate continuous functions with compact support in  $[0, \infty)^2$ .) If the approximated model admits only one solution, not only the solutions of a subsequence of models, but of the whole sequence must converge towards the solution of the approximated model.

One might not understand immediately why we bother about the justification of a troublesome idealizing model if the idealized model (with a sharply increasing, but sufficiently smooth birth rate) is much better behaved mathematically. The point is that, for any practical application (e.g. for computing solutions numerically) it is on principle not possible to describe the 'real' birth rate in sufficient detail. The question how sensitively the solution depends on the choice of an approximate birth rate brings us immediately back to the problem whether the solution of the idealizing model is the limit of the solutions of approximating models whose smooth birth rates approximate the jump in an appropriate sense. Actually this is the way in which we prove the existence of upper and lower solutions in [8]: namely we approximate the upper and lower per capita birth rates  $\tilde{B}$  and B in (4.2) and (4.3) by smooth birth rates from above and below respectively. Then we solve the approximating problems the solutions of which

(after the choice of a subsequence) converge towards a solution of the approximated problem. The approximating problems can be solved by a standard application of Banach's fixed point principle.

#### 4.3 Uniqueness of solutions

So uniqueness of solutions remains as the crucial problem and, as we have already seen, might not hold in general. We remember that the trouble comes from the fact that the birth rate jumps and is not defined at  $l=l_J$  and that it cannot be excluded a priori that a length cohort of individuals stops at length  $l_J$ . Finding conditions which induce uniqueness of solutions now amounts to discovering relations between the birth and the growth rate, which have one of the following two effects:

- i) They actually exclude that length cohorts are formed.
- ii) The ambiguity of the birth rate ß at  $1=1_J$  is at least removed under environmental conditions E which arrest length growth at  $1=1_J$ .

Each version of the Kooijman/Metz model requires a specific approach.

<u>Version 3</u> We have already pointed out in section 2.3 that  $\beta_0$  is defined in such a way that

(4.4) 
$$\beta_0(E,l_J) = 0$$
 iff  $g_2(E,l_J) = 0$ .

This involves that individuals that have just passed  $l_J$  only reproduce if they continue to grow. So, if a length cohort stops at  $l=l_J$ , the jump and the ambiguity in the birth rate (4.1) are removed. So it is heuristically plausible and will be proved rigorously in [8] that the third version of the Kooijman/Metz model has a unique solution.

<u>Version 2</u> At a first glance this version gives a lot of freedom to an individual of length  $l_J$  in allocating its assimilation energy between growth and reproduction. The individual only has to satisfy the constraints that the portion going into growth lies between  $[\kappa \tilde{E} - l_J]_+ l_J^2$  and  $[\tilde{E} - l_J]_+ l_J^2$  and both portions sum to  $[\tilde{E} - l_J]_+ l_J^2$ . But there is some inherent logic how the allocation should be done.

Case 1:  $\tilde{E} \leq l_J$ 

Then no energy is available both for reproduction and growth, so

$$\beta(E,a,l_J) = 0 = \beta_0(E,l_J)$$
  
 $g_2(E,a,l_J) = 0$ .

Case 2: 
$$\tilde{E} > l_J$$
,  $\kappa \tilde{E} \leq l_J$ 

In this situation the individual could decide to put energy into growth, but there is no use in doing so, because, for any  $1 > 1_J$ ,  $g_2(E,a,1) = 0$  such that growth beyond  $1_J$  is impossible; so it will channel all the energy which is left after covering the maintenance costs into reproduction, thus

$$B(E,a,l_J) = \tilde{E} - l_J = B_o(E,l_J)$$
  
 $g_2(E,a,l_J) = 0$ .

## Case 3: $\kappa \tilde{E} > 1_J$

In this situation the individual continues to grow inevitably and immediately is larger than  $l_J$  such that it does not matter how  $\mathbf{g}_2$  and  $\boldsymbol{\beta}$  are defined in this case.

Note that in all three cases  $\beta = \tilde{\beta}$  with  $\tilde{\beta}$  from (4.2) (i.e. the upper per capita birth rate) is the reasonable choice. So upper solutions appear to be the relevant ones. Actually we prove in [8] that there is a unique upper solution to version 2. Continuous dependence of solutions on data, however, only holds in a restricted sense, but the restriction appears to be quite natural: Version 2 differs from the other versions by the following allocation law:

(4.5) 
$$wl^2g_2(E,a,1) + B(E,a,1) = wl^2[\tilde{E}-1]_+$$

for  $1 \neq 1_J$ .

If the per capita growth and reproduction rate are approximated by continuous ones, then the approximating rates should satisfy the same allocation law in order to make biological sense. Under this restriction (actually it can be weakened) the solutions of the approximating models converge towards the upper solution of the approximated model. See [8].

Version 1 First we observe that neither (4.4) nor (4.5) hold. In particular we realize that, under appropriate environmental conditions, individuals may reach the threshold length  $l_J$  with the growth rate  $g_2$  slowing down to zero, but  $\beta_0(E,l_J)>0$ . So the only option which is left to induce uniqueness consists in excluding length cohorts. As the growth rate  $g_2$  is a Lipschitz function of length in version 2, two individuals which have a different length at time s will have a different length at all later times. So length cohorts which might stop at  $1 = l_J$  originate from two sources:

- i) There is already a length cohort of individuals with some length  $1 \le 1$ , at the beginning.
- ii) Individuals accumulate at the birth length  $\mathbf{l}_{\mathrm{B}}$ .

The second happens if individuals are born which cannot immediately start growing. This is excluded by assuming

(4.6) 
$$\beta_{0}(E,1) = 0 \quad \text{for all} \quad 1 \ge 1_{J}$$

$$\text{if} \quad g_{2}(E,0,1_{B}) = 0 .$$

Looking closely to the definitions of  $\beta_0$  and  $g_2$  in (2.2) and (2.4) we find that (4.6) is satisfied if and only if

This relation seems to hold for Daphnia magna because Kooijman and Metz [7] estimated  $\kappa = 1/3$ ,  $l_J = 2.5$  mm,  $l_B = 0.8$  mm. But the (obviously necessary) assumption (i) that the population contains no length cohorts with some length  $l \leq l_J$  at time 0 is a severe restriction. If a length cohort is present at time t = 0 the original version of the Kooijman/Metz model is only a proper idealization after the cohort has died out.

Remark Actually length cohorts only matter if length growth stops when the cohort reaches  $l_T$ . If you have complete control over the environment, you can easily. regulate it in such a way that this really happens. This already causes enough concern because version 1 should also be mathematically well-posed if the population does not couple back to the environment via equation (3.13). But even with the feed back one can readily adjust the initial values and the parameters in such a way that starting with a length cohort growth stops for a while when the cohort reaches length 1, ... Note that in version 1 and 3 of the Kooijman/Metz model length growth (once it has started) never really stops again, if the environmental conditions are constant. A stop of length growth is possible, however, if the environmental conditions deteriorate.

## 5. Comparison of the three versions of the Kooijman/Metz model

Mathematical models in population dynamics are inevitably gross oversimplifications of reality with many idealizations and even conceptual inconsistencies. A mathematical study like this cannot decide, of course, whether a model is biologically appropriate, but it can help to identify inconsistencies which should be taken seriously (by revealing the mathematical pathologies they generate) and may give some advice for possible modifications and pinpoint open biological questions.

As for conceptional simplicity and consistency version 2 is superior to the other two versions. As we have seen heuristically in the previous section and will prove rigorously in [8], version 2 is mathematically well-posed. The length growth curves which Kooijman and Metz observed for Daphnia magna [6,7], however, seem to agree more with the assumptions of version 1 and 3 that juveniles and adults channel the same portion of energy into growth than with the assumption of version 2 that energy is switched from growth to reproduction, if the individual becomes mature. But maybe the last word has not yet been said in this matter. In version 1 (the original Kooijman/ Metz model) uniqueness of solutions may fail, if initial populations are admitted which contain length cohorts (i.e. have a Dirac delta peak in the length distribution). In this case version 1 can only be considered a well-founded idealization after the initial population has died out. Version 3 modifies the reproduction law of version 1 such that the model is well-founded. We now offer some speculation concerning the apparent synchronization between growth and maturation which explains the inconsistency of version 1 and supports the modification (2.7) with  $\alpha = 3$ .

## Some speculation about the energy allocation of Daphnia magna

The original Kooijman/Metz model (i.e. version 1) leaves the question open what juveniles do with the assimilation energy that adults put into reproduction. As a waste of energy makes no biological sense, Kooijman (personal communication) has the idea that juveniles put this energy into maturation with interpreting maturation as an increase of the complexity of the tissue, while growth is a simple enlargement of already existing body structure. But energy is not only needed for increasing size and complexity of the tissue, but already for maintaining the status quo, so that further progress can only be made, if the maintenance needs have been covered. In view of this interpretation version 1 implicitly assumes that the maintenance costs of energy only depend on the size and not on the complexity of the body and are subtracted only from the energy allocated to growth as long as this is sufficient. (See the growth rate g in (2.2) and the per capita reproduction law & in (2.4). observation that under all food conditions maturity is achieved at the fixed length  $l_T = 2.5 \text{ mm}$ suggests, however, that growth and maturation are perfectly synchronized in juveniles, i.e. growth stops if and only if . maturation stops. This seems only to be possible if maintenance costs are not only subtracted from the energy determined for growth, but also from the energy determined for maturation. This does not contradict the observation that adults can reproduce without growing, if we assume that maturation stops when the individual passes the threshold length 1, Let us make this idea more precise and calculate the maintenance costs of an individual of length  $1 < 1_{T}$  under the assumption that the length growth rate is given by (2.2), namely  $g_2(E,a,1) =$  $[k\tilde{E} - 1]_{+}$ , and the assimilation energy available is  $\tilde{E}l^{2}$ . Then growth and, simultaneously, maturation stop, if  $k\tilde{E} = 1$ , i.e.  $\tilde{E}1^2 = \frac{1}{k} \cdot 1^3$ . Since at that moment the available energy just covers the maintenance costs, we conclude that the maintenance costs of an individual of length  $1 < 1_J$  amount to  $\frac{1}{k} \cdot 1^3$ . From the growth rate  $g_2$  we derive that maintenance costs  $1^3$  are subtracted from the energy allocated to growth. Hence the remaining maintenance costs  $(\frac{1}{k} - 1)1^3$  are subtracted from the energy allocated to maturation. It is suggestive to associate the maintenance costs  $1^3$  with the size and the maintenance costs  $(\frac{1}{k} - 1)1^3$  with the maturity of the individual.

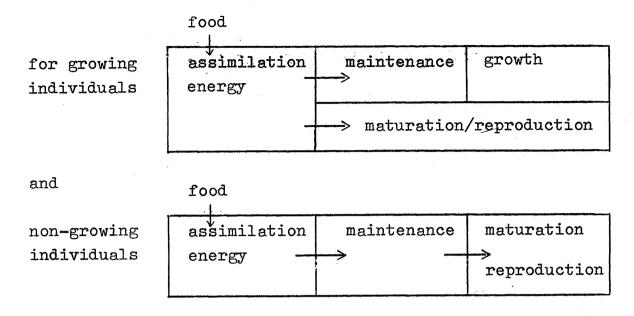
If this relation holds for any length  $1 < l_J$ , it should extend to  $1 = l_J$  such that an individual of length  $l_J$  has maintenance costs  $(\frac{1}{k} - 1)l_J^3$  which are associated with its maturity. Assuming that the maturity of mature individuals, i.e. of length  $1 > l_J$ , does not increase we conclude that the maintenance costs associated with complexity still amount to  $(\frac{1}{k} - 1)l_J^3$ . So the assimilation energy which is available after all the maintenance costs have been covered amounts to

$$[\tilde{E}1^2 - 1^3 - (\frac{1}{k} - 1) 1_J^3]_+$$

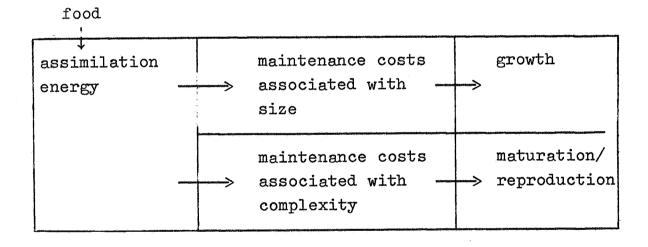
Subtracting the energy put into growth we obtain the energy put into reproduction, namely

(5.1) 
$$\beta_{o}(\widetilde{E},1) = [\widetilde{E}1^{2} - 1^{3} - (\frac{1}{K} - 1)1J_{J}^{3}]_{+}$$
$$- [\kappa \widetilde{E} - 1^{3}]_{+}.$$

With these new ideas about the energy allocation of Daphnia magna the allocation diagrams of the original Kooijman/Metz model



can be unified by the diagram



The switch from the first to the second diagram in the Kooijman/Metz model is replaced by the assumption that the maintenance costs due to maturity stagnate after the individual has become mature (i.e. has passed the threshold size), while the maintenance costs associated with size still increase with further growth.

It remains mysterious, however, how Daphnia magna should manage to cover the maintenance costs due to size just from the energy allocated to growth and to cover the costs due to maturity just from the energy allocated to maturation/reproduction. Here a deeper understanding would be helpful by which biological mechanisms the

assimilation energy is allocated to the different physiological functions. It might appear even more mysterious in which way the perfect synchronization of growth and maturation is achieved in juveniles, if the assimilation energy is partitioned from the very beginning (i.e. before the maintenance costs have been covered). The synchronization would not be astonishing, if the individual covers the maintenance costs first (wherever they come from) and does the allocation to growth and maturation/reproduction afterwards. But such a hypothesis involves that adults only reproduce if they grow, in contrast to the observations. There is an easy mathematical explanation for this mystery, however. We recall that, in versions 1 and 3 of the Kooijman/Metz model the length growth of an individual waterflea is described by

(5.2) 
$$i = [k\tilde{E} - 1]_{+}$$

Here E is the assimilation energy which an individual wins from its food per unit area of body surface  $1^2$ . Then

$$(5.3) \qquad (1^3)^{\circ} = 3 \left[ \kappa \ddot{E} 1^2 - 1^3 \right]_{\perp}$$

and  $\widetilde{El}^2$  is the assimilation energy the individual has available. As before k is the fraction of energy which is channelled into growth. In this scaling  $l^3$  are the maintenance costs which are due to the size  $l^3$ . We assume that maturation is described by a similar law:

(5.4) 
$$\dot{m} = [(1 - k) \tilde{E}1^2 - \delta m]_{+}$$

Here m is some measure for the maturity of the individual.  $\tilde{o}$  m are the maintenance costs due to the maturity of the individual. We easily find that the set  $\tilde{o}$  km =  $(1 - k)1^3$  is invariant under the flow generated by (5.3), (5.4),

if  $\delta = 3$ . The condition  $\delta = 3$  has a biological meaning: For 3 is the relation between the energy needed to increase the volume for one volume unit (in the right scaling) and the energy needed to increase the maturity for one maturity unit.  $\delta$  is the relation between the energy cost of maintaining one volume unit and the energy cost of maintaining one maturity unit.  $\delta = 3$  means that these relations are just the same.

Let us assume that

(5.5) 
$$\delta = 3$$
 and  $3km_B = (1 - k)l_B^3$ 

with  $\mathbf{m}_{\mathrm{B}}$  and  $\mathbf{l}_{\mathrm{B}}$  denoting maturity and length at birth. Then

$$(5.6) 3km(t) = (1 - k)(1(t))^3$$

as long as  $l(t) \le l_J$  . Fitting (5.6) into (5.3) and (5.4) we obtain

$$(5.7) \qquad (1^{3})^{\circ} = 3\kappa [\tilde{E}1^{2} - 1^{3} - 3m]_{+}$$

(5.8) 
$$\dot{m} = (1 - \kappa) \left[ \tilde{E} 1^2 - 1^3 - 3m \right]_+$$

So, if (5.5) is satisfied, (5.3) and (5.4) induce a perfect synchronization of maturation and growth. If growth and maturation are discriminated, it goes without saying that an individual becomes mature by passing a fixed threshold maturity  $m_J$  and not some threshold size. But due to the synchronization of both processes this amounts to the same and so an individual becomes mature just when it passes the threshold length  $l_J$  satisfying  $3km_J = (1-k)l_J^3$ . Although the assimilation energy is partitioned first and the maintenance costs due to size are covered from the energy allocated to growth and the maintenance costs due to maturation, growth and maturation

behave as if the total maintenance costs were covered from the total energy available and the energy were allocated between growth and maturation only afterwards. It is just a question of finding the appropriate relation between the size and the maturity of a neonate.

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