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A simple mathematical model of the bovine estrous cycle: follicle development and endocrine interactions

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Abstract

Bovine fertility is the subject of extensive research in animal sciences, especially because fertility of dairy cows has declined during the last decades. The regulation of estrus is controlled by the complex interplay of various organs and hormones. Mathematical modeling of the bovine estrous cycle could help in understanding the dynamics of this complex biological system. In this paper we present a mechanistic mathematical model of the bovine estrous cycle that includes the processes of follicle and corpus luteum development and the key hormones that interact to control these processes. The model generates successive estrous cycles of 21 days, with three waves of follicle growth per cycle. The model contains 12 differential equations and 54 parameters. Focus in this paper is on development of the model, but also some simulation results are presented, showing that a set of equations and

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parameters is obtained that describes the system consistent with empirical knowledge. Even though the majority of the mechanisms that are included in the model are based on relations that in literature have only been described qualitatively (i.e. stimulation and inhibition), the output of the model is surprisingly well in line with empirical data. This model of the bovine estrous cycle could be used as a basis for more elaborate models with the ability to study effects of external manipulations and genetic differences. *Keywords:*

cow, reproduction, hormone patterns, differential equations, systems biology 2000 MSC: 92C42, 92C30, 90C31, 65L09

1 1. Introduction

Systems biology is a relatively new research area in the field of animal sciences. It aims at understanding how the various components of a biological system function together, rather than investigating only individual parts. One approach is the translation of a conceptual biological model into a set of mathematical equations that represent the dynamic relations between system components. The purpose of building such mathematical models is to interpret and predict the dynamics of complex biological systems, and to identify new research questions.

One example of a dynamic biological system is the bovine estrous cycle, the hormonally controlled recurrent periods when the cow is preparing for reproduction by producing a fertilizable oocyte. Concurrent with selection for increased milk yield, a decrease in dairy cow fertility has been observed during the last decades (for reviews see [1, 2]). This decline in fertility is shown

by e.g. alterations in hormone patterns during the estrous cycle, reduced 15 expression of estrous behavior and lower conception rates [3]. However, it 16 is hard to understand which underlying mechanisms cause this decline in 17 fertility. The regulation of estrus is controlled by the interplay of various 18 organs and hormones. Mathematical modeling of the involved mechanisms is 19 expected to improve insight in the biological processes underlying the bovine 20 estrous cycle, and could thereby help to find causes of declined fertility in 21 dairy cows [4]. 22

Although the endocrine and physiologic regulation of the bovine estrous 23 cycle is studied extensively, mathematical models of cycle regulation are 24 scarce and of limited scope [5, 6]. A number of models have been devel-25 oped for other runiant species, especially ewes [7, 8], but these models do 26 not contain all the key players that are required to simulate follicle develop-27 ment and the accompanying hormone levels throughout consecutive cycles. 28 A model that integrates the major tissues and hormones involved, and that 20 is able to simulate the dynamics of follicular development, has been devel-30 oped for the human menstrual cycle by Reinecke [9]. This model, which is 31 based on previous work by Selgrade and colleagues [10, 11, 12], describes the 32 dynamics of hormones, enzymes, receptors, and follicular phases throughout 33 the cycle in a set of differential equations. 34

The objective of the work described in this paper was to develop a mathematical model of the dynamics of the bovine estrous cycle on individual cow level, that is able to simulate follicle development and the accompanying fluctuations in hormone concentrations. Physiologic and endocrine mechanisms that regulate the cycle are very similar between human and cows. There-

fore, some mechanisms of the human model in [9] could be used (although
sometimes with simplifications), and extended with other mechanisms like
follicular wave emergence and corpus luteum regression.

Focus in this paper is on the model development. Section 2 describes the 43 biological mechanisms of the bovine estrous cycle and how these mechanisms 44 are incorporated in the model. In Section 3, the mathematical description 45 and all model equations and parameters are given. Simulation results are 46 presented in Section 4, showing that a set of equations and parameters is 47 obtained that describes the system consistent with biological data for cows. 48 In Section 5, it is discussed how the current model could be applied and 49 extended. 50

⁵¹ 2. Biological background

52 2.1. Follicles

Two different patterns of follicle development are identified in mammals. 53 In humans (and rats and pigs), the development of follicles to ovulatory 54 size occurs only during the follicular phase, while in cattle (and sheep and 55 horses), development of follicles to ovulatory or near-ovulatory size occurs 56 throughout the cycle [13]. A normal cycle includes two or three wave-like 57 patterns of follicle development, in which a cohort of follicles start to grow. 58 The average duration of the bovine estrous cycle is 20 days for 2-wave and 59 22 days for 3-wave cycles (reviewed in [14]). Each follicular wave is initi-60 ated by an increase of follicle stimulating hormone (FSH) release from the 61 anterior pituitary [15]. The growing follicles produce estradiol (E2) and in-62 hibin (Inh), which are released into peripheral blood. In the first one or two 63

waves, a dominant follicle deviates from the cohort of growing follicles that 64 does not ovulate, but undergoes regression under influence of progesterone 65 (P4) produced by the corpus luteum (CL). When the CL is regressed under 66 influence of PGF2 α , the concentration of P4 decreases [16]. The dominant 67 follicle present at that moment develops and matures, and ovulation can 68 then take place because the inhibiting effect of P4 on the surge of luteinizing 69 hormone (LH) is removed [17]. Elevated E2 levels increase the secretion of 70 gonadotropin releasing hormone (GnRH), which triggers the LH surge and 71 thereby induces ovulation. Once an oocyte is successfully ovulated, the re-72 mains of the follicle form a new P4-producing CL. If conception has failed, 73 the CL regresses, P4 levels decrease, and the cycle restarts (reviewed in [4]). 74 The ovaries contain a pool of small follicles with immature oocytes. Un-75 der influence of FSH, a cohort of 8-41 growing follicles emerge [14]. Approx-76 imately two days after cohort recruitment, one follicle is selected to become 77 the dominant follicle, and continues to grow [18]. This deviation of the dom-78 inant follicle is associated with increased FSH and LH receptor binding, ac-70 tivating the enzymes that catalyze steroidogenesis, resulting in increased E2 80 production and higher E2 serum levels [18]. The dominant follicle expresses 81 more FSH receptors, and it can therefore continue to grow even when FSH 82 serum levels are low [19]. In the model, the emergence of a follicular wave 83 is induced when FSH exceeds a threshold which becomes lower when fol-84 licles become larger, representing that larger follicles are more sensitive to 85 FSH. Dominant follicles also secrete increasing amounts of inhibin (Inh). Inh 86 suppresses FSH and, hence, suppresses the growth of subordinate follicles. 87 Ovulation or regression of the dominant follicle eliminates this suppression, 88

allowing the onset of the next follicular wave [20, 21].

Small follicles of an emerging cohort may release very small amounts of 90 E2 and Inh per follicle, but taken together, this amount is not negligible. Fur-91 thermore, there is always a medium-size or large follicle present [22, 23, 24], 92 which results in a basal hormone production throughout the cycle. Differ-93 ent follicles are recruited, growing, and regressing in each cycle and in each 94 wave. However, total E2 and Inh production capacity is modeled as a contin-95 uous function throughout subsequent waves and cycles, representing the total 96 amount of hormone production of the follicles present at any moment. Folli-97 cle regression is promoted by high P4 levels and by the LH surge (Equation 98 7). The capacity of follicles to produce E2 and Inh is denoted as "follicular 90 function" in the rest of this paper. 100

101 2.2. Corpus luteum

The CL develops within 2-3 days after ovulation, starting the synthesis 102 and release of P4, which maintains the readiness of the endometrium for 103 receiving the embryo. In absence of a conceptus, the CL will regress at day 17-104 18 of the cycle [25, 26]. In each cycle a new CL develops, but CL development 105 is modeled as a continuous function of P4 producing tissue, denoted as "CL 106 function" in the rest of this paper. In the model, CL development is induced 107 by the LH surge. A threshold and delay are incorporated in the effect of LH 108 on the CL, to account for the time required for the process of transition from 109 follicle to CL [16] and the shift from E2 to P4 production [27, 28]. If the CL 110 reaches a certain size, it continues to grow without further stimulation by LH 111 [29]. CL regression is induced by PGF2 α secretion from the uterus (described 112 in Section 2.4). Growth and regression of CL function are described by 113

114 Equation 9.

115 2.3. Estradiol and inhibin

E2 affects LH synthesis and release [30] and FSH release [19, 31]. E2 116 serum levels are higher in ovulatory than in non-ovulatory waves [20, 32] and 117 reach peak levels around estrus [20, 32, 33, 34, 35, 23]. This suggests that 118 the preovulatory follicle has the largest capacity to produce and release E2, 119 although its maximum size is not significantly different from the maximum 120 size of non-ovulatory dominant follicles. Considering the results in [36, 37], 121 where a better vascularity of the ovulatory follicle is reported, it is reasonable 122 that the ovulatory follicle can secrete more E2 than non-ovulatory follicles 123 and, consequently, E2 serum levels are highest at estrus. In the model, the 124 rate of E2 production and release to the blood is taken as proportional to 125 follicular function (Equation 11). 126

Inh inhibits FSH synthesis and thus reduces FSH release [21]. Compared to basal Inh serum levels, peak levels are almost doubled in non-ovulatory waves and increase further in ovulatory waves [38]. There are different forms of inhibin, but only inhibin A is considered in the model, as it is the predominant form in bovine follicular fluid [19]. In the model, Inh production rate is taken as proportional to follicular function (Equation 12).

133 2.4. Progesterone and prostaglandin $F2\alpha$

The CL is the main source of P4. Serum P4 concentration is near to zero around estrus and high during the luteal phase [39, 40, 32, 41, 42]. A high correlation between CL diameter and P4 output was reported in [43, 44, 24].

In the model, the rate of P4 release into the blood is taken as proportional
to CL function (Equation 10).

Pulsatile PGF2 α release from the uterus induces CL regression. The 139 rise of P4 early in the cycle initiates a series of events or mechanisms that 140 eventually lead to the rise of PGF2 α , followed by a decline of PGF2 α a 141 few days later. It was shown that administration of P4 prior to its natural 142 rise resulted in an equally earlier onset of CL regression [45]. Exposure to 143 effective amounts of P4 must last for 10-13 days to induce PGF2 α pulses 144 [45, 46, 47, 48]. Peak PGF2 α levels are 3-4 times higher than basal levels 145 [49, 50, 51, 52].146

¹⁴⁷ PGF2 α is regulated by oxytocin (OT), P4 and E2 [53]. P4 first prevents ¹⁴⁸ a too early release of PGF2 α pulses, but simultaneously stimulates synthe-¹⁴⁹ sis of enzymes required for PGF2 α production. In the later luteal phase, ¹⁵⁰ changed expression of P4 and OT receptors results in a gradual decrease in ¹⁵¹ the suppression of PGF2 α [49], leading to an OT induced pulsatile release ¹⁵² of PGF2 α [52, 46]. How these mechanisms are regulating each other is quite ¹⁵³ complex and not understood in full detail.

¹⁵⁴ What is clear is that the rise in P4 levels and the continued presence of ¹⁵⁵ P4 above an effective level sets in motion a series of events that lead to CL ¹⁵⁶ regression. Hence, we incorporated these series of events as a black box using ¹⁵⁷ time delays to obtain the right timing of PGF2 α signaling. In the model, ¹⁵⁸ PGF2 α increases a specific number of days (delay $\tau_{P4,1}$) after P4 levels reach a ¹⁵⁹ threshold. Similarly, PGF2 α declines another (larger) number of days (delay ¹⁶⁰ $\tau_{P4,2}$) after P4 levels reached a threshold (Equation 8).

2.5. Gonadotropin releasing hormone, luteinizing hormone and follicle stim ulating hormone

Pulsatile signaling of GnRH regulates LH and FSH secretion [54]. Because 163 GnRH induces the LH surge, it indirectly induces ovulation [55]. The GnRH 164 pulse generator is located in the hypothalamus and is modulated by P4 and 165 E2 [56]. During the luteal phase, both P4 and E2 suppress the activity of the 166 GnRH pulse generator. During pro-estrus however, elevated E2 levels change 167 estrogen receptor signaling, which induces a GnRH surge [30, 56]. GnRH 168 is released into the portal circulation of the pituitary and binds to GnRH 160 receptors of the anterior pituitary [57]. In the model, GnRH stimulates 170 LH release, resulting in an LH surge concurrently with the GnRH surge. 171 GnRH synthesis is taken constant as long as the amount of GnRH in the 172 hypothalamus is below a threshold (Equation 1). GnRH release is inhibited 173 when P4 levels are above a threshold and when both P4 and E2 levels are 174 above a threshold. GnRH release is stimulated when P4 levels are low and 175 E2 reaches a threshold (Equation 1b), resulting in a surge of GnRH. GnRH 176 concentration in the pituitary depends on GnRH amount released from the 177 hypothalamus, and is further increased by high E2 levels, representing that 178 E2 up-regulates expression of GnRH receptors [56, 57] (Equation 2). 179

The LH surge at the day before ovulation induces ovulation of the ovulatory follicle and formation of the CL. The LH surge will shut down E2 and Inh production capacity of the ovulatory follicle [58, 24]. High P4 levels suppress the release of LH via the inhibition of the GnRH pulse generator [59]. Additionally, high P4 levels decrease pituitary sensitivity to E2, thereby increasing the amount of E2 required to induce an LH surge above physio-

logical levels [56]. Peak LH levels are about five times as high as basal levels
or higher [20, 32, 60, 27]. In the model, LH synthesis is stimulated by E2
and inhibited by P4 (Equation 5a). Besides a small basal LH release, there
is a surge of LH when GnRH in the pituitary reaches a threshold (Equation 5b).

FSH synthesis is inhibited by Inh [19]. P4 and E2 modulate FSH release via effects on the anterior pituitary and on the GnRH pulse generator in the hypothalamus. Peak FSH serum levels are about three times higher than basal levels [20, 33]. In the model, FSH synthesis in the pituitary is increased when Inh levels are below a threshold (Equation 3a). FSH release from the pituitary to the blood is stimulated by P4 and GnRH, and inhibited by E2 (Equation 3b).

¹⁹⁸ 3. Mathematical formulation

The mathematical approach used for the bovine model is comparable to the approach used for the model of the human menstrual cycle, which originally has been developed at North Carolina State University by Selgrade and colleagues [10, 11, 61, 12], and has been extended at the Zuse Institute [9, 62].

The system is considered in four compartments: hypothalamus, anterior pituitary, ovaries and uterus, connected through peripheral and portal blood (Figure 1). The model includes the processes of follicle and CL development and the key hormones that interact to control these processes as described in Section 2. The gonadotropin equations are based on synthesis-releaseclearance relations. This structure was first introduced in [11]. The complete



Figure 1: Schematic representation of the compartments in the model of the bovine estrous cycle.



Figure 2: Complete mechanisms of the bovine model. Boxes represent the 12 key components of the system. Differential equations are derived for these 12 components. Arrows denote functional dependencies. Stimulating and inhibiting effects are indicated by + and - respectively.

²¹⁰ mechanisms are shown in Figure 2.

Based on these mechanisms, 12 ordinary differential equations (ODEs) with 54 parameters are formulated. If necessary, time delays are incorporated to model the time between events and their effects, representing the duration of intermediate steps in biological processes. In this case, the ODE is turned into a delay differential equation (DDE). To solve the system of differential equations, we use the solver RADAR5 [63], which has been designed for the solution of stiff delay differential equations.

218 3.1. Hill functions

Because the exact mechanisms are often not known or more specific than necessary, Hill functions are used to model stimulatory and inhibitory effects of the hormones. They are used whenever there is a nonlinear relation between two substances. A Hill function is a sigmoidal function between zero and one, which switches at a specified threshold from one level to the other with a specified steepness. Positive Hill functions are used for stimulating effects and are defined as

$$h^+(S(t);T,n) := \frac{S(t)^n}{T^n + S(t)^n}.$$

S(t) represents the effector, T the threshold for change of behavior, and n controls the steepness of the curve. Negative Hill functions are used for inhibitory effects and are defined as

$$h^{-}(S(t);T,n) := \frac{T^{n}}{T^{n} + S(t)^{n}}$$

Here, the value of the function has its maximum at the lowest value of the initiating substrate S(t), and switches to zero if this substrate passes the threshold T.

²³² Whenever a Hill function is used, it is provided with another parameter ²³³ m that controls the height of the switch. This parameter serves as maximum ²³⁴ stimulatory respectively inhibitory effect. For abbreviation of notation, we ²³⁵ use $H^+(S)$ instead of $m \cdot h^+(S(t); T, n)$. We usually choose the steepness ²³⁶ coefficient n = 2, but, when appropriate, we set n = 1, 5, or 10 to capture ²³⁷ smoother or steeper effects. The complete set of Hill functions is specified in ²³⁸ Appendix A, and parameter values can be found in Appendix B.



Figure 3: Scaled positive Hill functions with different steepness

239 3.2. Model equations

The amount of GnRH in the hypothalamus is a result of synthesis in the hypothalamus and release into the pituitary,

$$\frac{d}{dt}GnRH_{Hypo}(t) = Syn_{GnRH}(t) - Rel_{GnRH}(t).$$
(1)

GnRH synthesis depends on its current level in the hypothalamus. If this
level approaches a specified threshold, synthesis decreases to zero. This effect
is modeled as

$$Syn_{GnRH}(t) = c_{GnRH,1} \cdot \left(1 - \frac{GnRH_{Hypo}(t)}{GnRH_{Hypo}^{\max}}\right).$$
(1a)

As long as GnRH is far below its maximum, the factor $1 - \frac{GnRH_{Hypo}(t)}{GnRH_{Hypo}^{max}}$ has only a small impact. The release of GnRH from the hypothalamus to the pituitary is dependent on its current level in the hypothalamus. E2 inhibits GnRH release during the luteal phase, i.e. if P4 and E2 are high at the same time, described by $H_1^-(P4\&E2)$. $H_1^-(P4\&E2)$ denotes the sum of two Hill functions minus their product, and inhibits GnRH release only if both

²⁵¹ substrates are above their threshold. Additionally, the release of GnRH is
²⁵² inhibited by P4 only,

$$Rel_{GnRH}(t) = (H_1^-(P_4\&E_2) + H_2^-(P_4)) \cdot GnRH_{Hypo}(t).$$
(1b)

²⁵³ Changes in GnRH amount in the pituitary are dependent on the released ²⁵⁴ amount from the hypothalamus, but also on the presence of E2. E2 increases ²⁵⁵ the number of GnRH receptors in the pituitary. This effect is included in the ²⁵⁶ equation as a positive Hill function. GnRH clearance from pituitary portal ²⁵⁷ blood is proportional to the GnRH level in the pituitary, i.e. GnRH clearance ²⁵⁸ is represented by $c_{GnRH,2} \cdot GnRH_{Pit}(t)$, in which $c_{GnRH,2}$ is a constant,

$$\frac{d}{dt}GnRH_{Pit}(t) = Rel_{GnRH}(t) \cdot H_3^+(E2) - c_{GnRH,2} \cdot GnRH_{Pit}(t).$$
(2)

²⁵⁹ FSH is synthesized in the pituitary and released into the blood,

$$\frac{d}{dt}FSH_{Pit}(t) = Syn_{FSH}(t) - Rel_{FSH}(t).$$
(3)

FSH synthesis rate in the pituitary is only dependent on delayed Inh, as in
[61]. FSH is synthesized when the Inh level is low, i.e. high Inh levels inhibit
FSH synthesis, which is included as a negative Hill function,

$$Syn_{FSH} = H_4^-(Inh_\tau). \tag{3a}$$

The index τ stands for a delayed effect of Inh, i.e. Inh is considered at time $t - \tau$. FSH release from the pituitary to the blood is stimulated by P4 and GnRH, and inhibited by E2,

$$Rel_{FSH} = (H_5^+(P_4) + H_6^-(E_2) + H_7^+(GnRH_{Pit})) \cdot FSH_{Pit}(t).$$
(3b)

²⁶⁶ Concluding, FSH serum level is a result of the difference between the released
²⁶⁷ amount from the pituitary and clearance in the blood,

$$\frac{d}{dt}FSH_{Blood}(t) = Rel_{FSH}(t) - c_{FSH} \cdot FSH_{Blood}(t), \qquad (4)$$

where c_{FSH} is the FSH clearance rate constant.

Like FSH, the LH serum level depends on synthesis in the pituitary, release into the blood and clearance thereof,

$$\frac{d}{dt}LH_{Pit}(t) = Syn_{LH}(t) - Rel_{LH}(t).$$
(5)

²⁷¹ LH synthesis in the pituitary is stimulated by E2 and inhibited by P4,

$$Syn_{LH}(t) = H_8^+(E2) + H_9^-(P4).$$
 (5a)

We assume a low constant basal LH release b_{LH} from the pituitary into the blood. On top of that, LH release is stimulated by GnRH,

$$Rel_{LH}(t) = (b_{LH} + H_{10}^+ (GnRH_{Pit})) \cdot LH_{Pit}(t).$$
 (5b)

274 Summarizing, LH in the blood is obtained as

$$\frac{d}{dt}LH_{Blood}(t) = Rel_{LH}(t) - c_{LH} \cdot LH_{Blood}(t), \tag{6}$$

where c_{LH} is the LH clearance rate constant.

Follicular function is stimulated by FSH, whereas its decrease is promoted by P4 and the LH surge,

$$\frac{d}{dt}Foll(t) = H_{11}^+(FSH) - (H_{12}^+(P_4) + H_{13}^+(LH_{Blood})) \cdot Foll(t).$$
(7)

The sensitivity of the follicles to respond to FSH grows with their size. In the model, the threshold of FSH to stimulate the follicular function decreases

with increasing follicular function. For this effect of a rising FSH sensitivity, a negative Hill function is included to control the threshold of FSH,

$$\widetilde{T}_{FSH}^{Foll}(t) := T_{FSH}^{Foll} \cdot h^{-}(Foll(t); T_{Foll}^{FSH}, 1),$$

²⁷⁸ and the Hill function for the effect of FSH on follicular function becomes

$$H_{11}^+(FSH) := m_{FSH}^{Foll} \cdot h^+(FSH_{Blood}(t); \widetilde{T}_{FSH}^{Foll}(t), 2).$$
(7a)

PGF2 α initiates the functional regression of the CL, and thereby the decrease in P4 levels. After a large time delay, PGF2 α synthesis is stimulated by elevated P4 levels above a specified threshold value. The PGF2 α level declines a couple of days after its rise, which is included as a delayed positive effect of P4 on the decay of PGF2 α ,

$$\frac{d}{dt}PGF2\alpha(t) = H_{14}^+(P4_{\tau_1}) - H_{15}^+(P4_{\tau_2}) \cdot PGF2\alpha(t).$$
(8)

The LH peak initiates growth of the CL with a specified delay. After reaching a certain size, the CL continues to grow on its own as long as PGF2 α is low. The CL starts to regress when PGF2 α levels rise above a threshold,

$$\frac{d}{dt}CL(t) = H_{16}^+(LH_\tau) + H_{17}^+(CL) - H_{18}^+(PGF2\alpha) \cdot CL(t).$$
(9)

The production of P4 in the ovary is assumed to be proportional to CL function, and the production of E2 and Inh is assumed to be proportional to follicular function. Therefore, the equations for P4, E2, and Inh do not

²⁹¹ contain any Hill functions,

$$\frac{d}{dt}P_{4}(t) = c_{CL}^{P_{4}} \cdot CL(t) - c_{P_{4}} \cdot P_{4}(t), \qquad (10)$$

$$\frac{d}{dt}E2(t) = c_{Foll}^{E2} \cdot Foll(t) - c_{E2} \cdot E2(t), \qquad (11)$$

$$\frac{d}{dt}Inh(t) = c_{Foll}^{Inh} \cdot Foll(t) - c_{Inh} \cdot Inh(t).$$
(12)

The parameters c_{P4} , c_{E2} and c_{Inh} denote the respective clearance rate constants.

Figure 2 gives an overview of all mechanisms described by the model equations. Detailed notations for the Hill functions, parameters, and equations are given in Appendix A, Appendix B, and Appendix C respectively.

297 3.3. Parameter identification and sensitivity analysis

The main difficulty is not to simulate the system, i.e. to solve the dif-298 ferential equations, but to identify the unknown parameters. Unfortunately, 299 many of the parameters are not measurable. Sometimes the range of values 300 is known, but some parameters are completely unknown. The techniques 301 for parameter estimation that are used in this model are implemented in 302 the software packages PARKIN [64, 65] and NLSCON [66], which have been 303 developed at the Zuse Institute for many years. These programs take into ac-304 count parameter sensitivities and linear dependencies, and include a number 305 of optimization methods such as, for example, affine covariant Gauss-Newton 306 methods [67]. A renewed version of this software, especially adapted to pa-307 rameter identification in ordinary differential equation models, has been used 308 throughout the paper. The mathematical background is described in [67]. 309

To obtain a good initial guess for the parameter optimization procedure, we use a model decomposition approach and successively enlarge the set of

estimated parameters. The first step is to define input curves representing the development of Inh, P4, and E2 levels in the blood over time. This use of explicit functions, which simplifies parameter identification, was already suggested by Schlosser [11]. Composition of these input curves is based on published data for endocrine profiles of cows with a normal estrous cycle, see for example [68].



Figure 4: Simulated curves of the closed model together with the data points used for parameter estimation. Panels 4(a), 4(b) and 4(c) show data points based on qualitative behavior of hormones as described in literature ([68]). Panels 4(d), 4(e) and 4(f) show data points obtained from the input curves. Day zero corresponds to the day of LH peak.

Following the approach in [61], we use the input curves to successively fit the profiles of the other components. The detailed procedure can be found

in [69]. In the last step, the input curves for P4, E2, and Inh are replaced by their original ODE/DDE description to obtain a closed network. The final parameter values are listed in Table B.1, and the corresponding simulation results are illustrated in Figure 4.

A sensitivity analysis has been performed with the techniques desribed in [67]. A more detailed description including column norms of the sensitivity matrix and subconditions, which provide information about the sensitivities and the dependencies of the parameters, can be found in [69]. It turns out that among the most sensitive and best predictable parameters are $p_{36} =$ $\tau_{P4,1}, p_{11} = \tau_{Inh}, p_{20} = c_{FSH}$, and $p_{39} = \tau_{P4,2}$.

330 4. Simulation results

The figures in this section show the computed dynamics of follicle and 331 CL development and accompanying fluctuations in hormone levels over con-332 secutive cycles. The simulation results show that the current set of model 333 parameters generates curves consistent with empirical knowledge for cows 334 with a normal estrous cycle with three follicular waves. Notice that the model 335 generates consecutive cycles that are not entirely identical (quasi-periodic be-336 havior), but that vary slightly in patterns and peak heights between cycles. 337 Small differences in model output at the end of a cycle result in a different 338 starting point of the next cycle, which leads to variation between the curves. 339 This variation in hormone levels between cycles could well resemble variation 340 within a cow over consecutive cycles. However, a different parameterization 341 can be used to produce a stable limit cycle. 342

Each estrous cycle contains three waves of follicular growth (Figure 5).



Figure 5: Output curves of follicular function (Foll) and CL function (CL) over time for one cycle (a) and in consecutive cycles (b).

The CL starts to grow a few days after ovulation and is large during the first two follicular waves, which suppresses follicle growth. As the larger follicles become more sensitive to P4, at a certain size the effect of P4 becomes so large that it induces follicle regression. After regression of the CL, the dominant follicle of the third follicular wave can continue to grow, leading to ovulation, which causes a sharp decline in follicular function.

The pattern of serum E2 levels is a result of follicular function (Figures 5 and 6). The third wave of follicular growth takes place when P4 levels



Figure 6: Output curves of serum concentrations of E2 and LH, and portal concentration of GnRH over time for one cycle (a) and in consecutive cycles (b).

are low, resulting in increased E2 levels. These increased E2 levels induce a steep GnRH and LH surge, which is the trigger for ovulation. Notice that the height of the GnRH surge is determined by the E2 peak level. During the remaining cycle, GnRH and LH levels are low, representing the lower pulse frequency and amplitude compared to the surge.

Increased FSH levels induce the growth of a follicular wave and thereby the start of Inh increase, but FSH is suppressed when Inh levels are above a certain level (Figure 7). Notice that FSH peak levels in the third wave of



Figure 7: Output curves of serum concentrations of Inh and FSH over time for one cycle (a) and in consecutive cycles (b).

the cycle differ in consecutive cycles because of corresponding differences in height of the GnRH surge (Figures 6 and 7). When Inh has declined due to follicular regression, FSH increases again and induces the next follicular wave. Because follicular growth is modeled in three waves, also Inh levels rise in three waves in a cycle.

P4 serum levels are proportional to CL function. P4 concentration is small during the first days of the cycle and rises when the CL starts to grow (Figure 5). Notice that a lower LH peak height results in a less steep



Figure 8: Output curves of serum concentrations of P4 and PGF2 α over time for one cycle (a) and in consecutive cycles (b).

P4 increase and lower levels of P4 in the following cycle (Figures 6 and 8). Increased P4 levels induce a rise in PGF2 α after a couple of days, which causes CL regression and declining P4.

371 5. Discussion and Outlook

The current mathematical model describes the interaction between a number of key physiological processes of the bovine estrous cycle. The model is able to simulate the dynamics of follicle and CL growth and development,

as well as the associated hormone level changes in consecutive cycles. The
current model comprises 12 equations and 54 parameters. The estrous cycles
generated by the model are not entirely identical and could well resemble
variations within a cow over consecutive cycles.

The above simulations show a quasi-periodic behavior, but a different 379 parameterization (not listed in this paper) could be used to produce a stable 380 limit cycle. This shows that the variations between simulated cycles are not 381 an intrinsic characteristic of the model, but depend on the parameterization. 382 However, the cycles of a real cow are usually quite irregular, and we think 383 this is not due to changes in external factors for that cow but rather arises 384 from the fact that each cycle presents slightly new and somewhat different 385 'starting values' for the next cycle, which we think that our model mimics. 386 Alternatively, one could add a stochastic component to the regular system 387 (representing small variations in external factors) to induce variations in 388 consecutive cycles, but this was not in the scope of our work. 389

The sensitivity analysis shows that parameters 36, 20 and 11 are the 390 most sensitive parameters of the model, which means that a small change 391 in the value of one of these parameters will have a large effect on the model 392 solution. Parameter 36 (delay of P4 until stimulating PGF2 α increase) is 393 possibly a sensitive parameter because CL life span is critical for the duration 394 of the cycle. Parameter 20 (FSH clearance rate constant) and Parameter 11 395 (delay of Inh in FSH synthesis) are possibly sensitive parameters because 396 FSH and Inh serum levels have an important effect on the progress of follicle 397 development. 398

399

The modeling method with ODEs/DDEs as used for the presented model

of the bovine estrous cycle was also used for the model of the human men-400 strual cycle [10, 11, 61, 9]. As we aimed at the development of a model 401 for the dynamical changes of a biological system, including the information 402 about how components influence the rates of change of other components, 403 our approach to model the system with differential equations appears to be 404 the most reasonable. Maybe qualitative results could have been obtained 405 with other methods such as, for example, boolean networks, but differen-406 tial equations allow for a simulation of quantitative profiles of the involved 407 components. To our knowledge, no comparable models of the bovine estrous 408 cycle are available. 409

The current model describes the mechanisms of an idealized cow, based 410 on average numbers obtained from several data sources. It would in principle 411 be possible to fit the model to measurement data of an individual cow that 412 would show small deviations of the cycle, or even a pathological abnormal 413 cycle due to certain disorders. This would represent the next step in the 414 modeling approach. Because empirical data are usually noisy, parameter 415 optimization would then also have to take measurement errors into account. 416 Although the current model could thus offer possibilities to simulate fer-417 tility disorders, its predictive ability may be limited in those parts and for 418 those aspects in which the model is not entirely mechanistic but rather de-419 scriptive. One example thereof is the modeling of $PGF2\alpha$. Because the 420 detailed biological mechanisms that induce the rise of $PGF2\alpha$ are very com-421 plex and not completely understood, we chose to restrict the number of state 422 variables for this part of the model, and to include time delays. This mimics 423 the situation in cows that the rise of P4 early in the cycle starts a series of 424

events or mechanisms that eventually lead to the rise of $PGF2\alpha$, followed by 425 a decline of $PGF2\alpha$ several days later. The time delays are thus a 'black box' 426 where the intermediate events that regulate $PGF2\alpha$ levels are not described. 427 In this way, we were able to obtain the right time point of CL regression even 428 though we don't know the biological mechanisms exactly. By reducing the 429 delays, the duration of the luteal phase can be reduced. This could mean 430 that P4 serum levels already decline during the second wave of follicle devel-431 opment, which could then become the ovulatory wave. The shorter delays 432 could thus result in a shorter cycle with only two follicular waves. However, 433 the consequence of the chosen approach is that the predictive abilities for 434 this part of the model are limited. Model improvement and refinement of 435 this sub-model will play an important role in future work. 436

Apart from fitting of the model to individual cow data, mentioned above, 437 we plan to use this model to determine the level of control exerted by vari-438 ous system components on the functioning of the system. Examples of such 439 model applications are to explore the mechanisms that influence the pattern 440 of follicular waves, or to study hormone patterns associated with subfertility. 441 Also, the model can serve as a basis for more elaborate models and simula-442 tions, with the ability to study effects of external manipulations and genetic 443 differences. Possible extensions of the model could be in the field of energy 444 metabolism, stress, disease, and factors affecting the expression of estrous be-445 havior. There are relationships between regulation of the estrous cycle and 446 energy balance, which can cause fertility problems in high producing dairy 447 cows in negative energy balance (for reviews see [70, 71]). Changes in repro-448 ductive performance that are associated with high milk production may in 440

part be explained by elevated P4 and E2 clearance rates, as described in the 450 physiological model of [3]. In this physiological model, clearance rates of hor-451 mones by the liver of cows with high milk production are increased as a result 452 of elevated feed intake, leading to an increased liver blood flow and metabolic 453 activity. With a similar level of hormone production, circulating hormone 454 levels would thus be lower. Lameness, an example of a stress inducing condi-455 tion, was found to inhibit the LH surge and ovulation, whereas incidence of 456 estrous behavior (although with less intensity) was not reduced. These obser-457 vations suggest that stress, caused by lameness, reduces P4 exposure before 458 estrus and/or E2 production by the dominant follicle [72, 73]. Further, a 459 normal endocrinological cycle is prerequisite for appropriate expression of 460 estrous behavior. The relationships found between P4, E2 and intensity of 461 estrous behavior show that hormones involved in regulation of the estrous 462 cycle also affect the expression of estrous behavior [74, 75]. These and other 463 findings and hypotheses about regulation of the bovine estrous cycle could 464 be translated into mathematical equations or modified parameterization and 465 incorporated in the current model. 466

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474 Appendix A. List of Hill functions

The Hill functions listed below are the full notations of the Hill functions mentioned in Section 3.2 and represent the mechanisms shown in Figure 2.

$$\begin{split} H_1^-(P4\&E2) &:= m_{P4\&E2} \cdot \left(h^-(P4(t);T_{P4}^{GnRH,1},2) + h^-(E2(t),T_{E2}^{GnRH,1},2) \\ &-h^-(P4(t);T_{P4}^{GnRH,1},2) \cdot h^-(E2(t),T_{E2}^{GnRH,1},2)\right) \\ H_2^-(P4) &:= m_{P4}^{GnRH,2} \cdot h^-(P4(t),T_{P4}^{GnRH,2},2) \\ H_3^+(E2) &:= m_{E2}^{GnRH,2} \cdot h^+(E2(t),T_{E2}^{GnRH,2},5) \\ H_4^-(Inh_{\tau}) &:= m_{Inh}^{FSH} \cdot h^-(Inh(t-\tau_{Inh}),T_{Inh}^{FSH},2) \\ H_5^+(P4) &:= m_{P4}^{FSH} \cdot h^-(E2(t);T_{P2}^{FSH},2) \\ H_6^-(E2) &:= m_{E2}^{FSH} \cdot h^-(E2(t);T_{E2}^{FSH},2) \\ H_7^+(GnRH_{Pit}) &:= m_{GnRH}^{FSH} \cdot h^-(GnRH_{Pit}(t);T_{GnRH}^{FSH},1) \\ H_8^+(E2) &:= m_{E2}^{LH} \cdot h^+(E2(t);T_{E2}^{LH},2) \\ H_9^-(P4) &:= m_{P4}^{LH} \cdot h^-(P4(t);T_{P4}^{LH},2) \\ H_{10}^+(GnRH_{Pit}) &:= m_{GaRH}^{FSH} \cdot h^+(GnRH_{Pit}(t);T_{GnRH}^{FSH},1) \\ H_{11}^+(FSH) &:= m_{FSH}^{Eol} \cdot h^+(FSH_{Blood}(t);\tilde{T}_{FSH}^{Foll}(t),2), \\ \tilde{T}_{FSH}^{Foll}(t) &:= T_{FSH}^{Foll} \cdot h^-(Foll(t);T_{FSH}^{FSH},1) \\ H_{12}^+(P4) &:= m_{P4}^{Foll} \cdot h^-(LH_{Blood}(t);T_{P4}^{Foll},2) \\ H_{13}^+(LH) &:= m_{P4}^{FOll} \cdot h^+(P4(t-\tau_{P4,1}),T_{P4}^{PGF2\alpha},2) \\ H_{14}^+(P4_{\tau}) &:= m_{P4}^{CL} \cdot h^+(CL(t);T_{CL}^{CL},2) \\ H_{16}^+(LH_{\tau}) &:= m_{CL}^{CL} \cdot h^+(CL(t);T_{CL}^{CL},2) \\ H_{18}^+(PGF2\alpha) &:= m_{P4}^{CL} \cdot h^+(PGF2\alpha(t);T_{P4}^{FL},2) \\ H_{18}^+(PGF2\alpha) &:= m_{P4}^{CL} \cdot h^+(PGF2\alpha(t);T_{P4}^{CL},2) \\ \end{array}$$

475 Appendix B. List of parameters

In our model, [·] stands for the unit of the substance, usually a concentration, and can be specified from measurements. Typical units are [FSH]=[LH]=IU/l, [P4]=ng/ml, and [E2]=pg/ml. t denotes "time"; in our model [t] stands for "days".

Table B.1: List of parameters.

No.	Symbol	Value	Quantity	Explanation
1	$GnRH_{Hypo}^{\max}$	20	$[{\rm GnRH}_{\rm Hypo}]$	maximum value for GnRH in the
				hypothalamus
2	$c_{GnRH,1}$	4.657	$\frac{[\mathrm{GnRH}_{\mathrm{Hypo}}]}{[\mathrm{t}]}$	synthesis rate constant of GnRH in
				the hypothalamus
3	$m_{P4\&E2}$	1.464	$\frac{[{\rm GnRH}_{\rm Hypo}]}{[t]}$	maximum part of GnRH synthesis
			0	rate constant inhibited by E2 and
			C	P4
4	$T_{E2}^{GnRH,1}$	0.1433	[E2]	threshold of E2 to suppress GnRH
	C	0		release
5	$T_{P4}^{GnRH,1}$	0.0294	[P4]	threshold of P4 to allow E2 suppres-
				sion of GnRH release
6	$m_{P4}^{GnRH,2}$	1.503	1/[t]	maximum part of GnRH synthesis
				rate constant inhibited by P4
7	$T_{P4}^{GnRH,2}$	0.0309	[P4]	threshold of P4 to inhibit GnRH re-
				lease directly

No.	Symbol	Value	Quantity	Explanation
8	$m_{E2}^{GnRH,2}$	1.5	$\frac{[\text{GnRH}_{\text{Pit}}]}{[\text{GnRH}_{\text{Hypo}}]}$	maximum scaling of pituitary sensi-
				tivity for GnRH
9	$T_{E2}^{GnRH,2}$	1.276	[E2]	threshold of E2 to increase pituitary
				sensitivity for GnRH
10	$c_{GnRH,2}$	1.299	1/[t]	GnRH clearance rate constant in
				the pituitary
11	$ au_{Inh}$	1.5	[t]	delay of Inh in FSH synthesis
12	m_{Inh}^{FSH}	1	[FSH]/[t]	maximum FSH synthesis rate in the
				pituitary in the absence of Inh
13	T_{Inh}^{FSH}	0.06	[Inh]	threshold of Inh for inhibition of
				FSH synthesis
14	m_{P4}^{FSH}	2	1/[t]	maximum part of FSH release rate
			6	that is stimulated by P4
15	T_{P4}^{FSH}	0.0966	[P4]	threshold of P4 to stimulate FSH re-
		3		lease
16	m_{E2}^{FSH}	0.3	1/[t]	maximum part of FSH release rate
				that is inhibited by E2
17	T_{E2}^{FSH}	2.846	[E2]	threshold of E2 to inhibit FSH re-
				lease
18	m_{GnRH}^{FSH}	3	1/[t]	maximum part of FSH release rate
				that is stimulated by GnRH

Table B.1 – continued from previous page

No.	Symbol	Value	Quantity	Explanation
19	T_{GnRH}^{FSH}	0.4	[GnRH]	threshold of GnRH to stimulate
				FSH release
20	c_{FSH}	0.8	1/[t]	FSH clearance rate constant
21	m_{E2}^{LH}	1.5	[LH]/[t]	maximum part of LH synthesis that
				is stimulated by E2
22	$T^{LH}_{E\mathcal{Q}}$	0.1	[E2]	threshold of E2 to stimulate LH syn-
				thesis
23	m_{P4}^{LH}	4.5	[LH]/[t]	maximum part of LH synthesis that
				is inhibited by P4
24	T_{P4}^{LH}	0.0322	[P4]	threshold of P4 to inhibit LH syn-
				thesis
25	m^{LH}_{GnRH}	4	1/[t]	maximum part of LH release rate
			6	that is stimulated by GnRH
26	T^{LH}_{GnRH}	4	[GnRH]	threshold of GnRH to stimulate LH
		3		release
27	b_{LH}	0.05	1/[t]	basal LH release rate constant
28	c_{LH}	11	1/[t]	LH clearance rate constant
29	m_{FSH}^{Foll}	0.8	[Foll]/[t]	maximum increase of follicular func-
				tion stimulated by FSH
30	T_{FSH}^{Foll}	0.8	[FSH]	threshold of FSH to stimulate follic-
				ular function

Table B.1 – continued from previous page

No.	Symbol	Value	Quantity	Explanation
31	T_{Foll}^{FSH}	0.3	[Foll]	threshold of follicular function to
				downscale FSH threshold
32	m_{P4}^{Foll}	2.5	1/[t]	maximum part of follicular decay
				stimulated by P4
33	T_{P4}^{Foll}	0.1127	[P4]	threshold of P4 to stimulate de-
				crease of follicular function
34	m_{LH}^{Foll}	2.8	1/[t]	maximum part of follicular decay
				stimulated by LH
35	T_{LH}^{Foll}	0.525	[LH]	threshold of LH to stimulate de-
				crease of follicular function
36	$ au_{P4,1}$	12	[t]	delay of P4 until stimulating
			0	$PGF2\alpha$ increase
37	$m_{P4}^{PGF2lpha,1}$	0.3	$[\mathrm{PGF}2\alpha]/[\mathrm{t}]$	maximum growth rate of $\mathrm{PGF2}\alpha$
38	$T_{P4}^{PGF2lpha,1}$	0.1672	[P4]	threshold of P4 to stimulate $\mathrm{PGF2}\alpha$
		3		increase
39	$ au_{P4,2}$	17	[t]	delay of P4 until stimulating
				$PGF2\alpha$ decrease
40	$m_{P4}^{PGF2lpha,2}$	11	$[\mathrm{PGF}2\alpha]/[\mathrm{t}]$	maximum decay rate of $\mathrm{PGF2}\alpha$
41	$T_{P4}^{PGF2lpha,2}$	0.0966	[P4]	threshold of P4 to stimulate $\mathrm{PGF2}\alpha$
				decrease
42	$ au_{LH}$	4.5	[t]	delay of LH in CL

Table B.1 – continued from previous page $% \left({{{\rm{B}}_{{\rm{B}}}} \right)$

No.	Symbol	Value	Quantity	Explanation	
43	m_{LH}^{CL}	0.334	[CL]/[t]	maximum increase of CL stimulated	
				by LH	
44	T_{LH}^{CL}	1.2	[LH]	threshold of LH to stimulate CL in-	
				crease	
45	$m_{\it CL}^{\it CL}$	0.0334	[CL]/[t]	maximum increase of CL stimulated	
				by itself	
46	T_{CL}^{CL}	0.0651	[CL]	threshold of CL to stimulate self-	
				growth	
47	$m_{PGF2lpha}^{CL}$	6.536	1/[t]	maximum decrease of CL stimu-	
				lated by PGF2 α	
48	$T_{PGF2\alpha}^{CL}$	2	$[PGF2\alpha]$	threshold of $\mathrm{PGF2}\alpha$ to initiate de-	
			Ò	crease of CL	
49	c_{CL}^{P4}	3.856	$\frac{[P4]/[CL]}{1/[t]}$	proportionality factor of CL in P4	
				increase	
50	c_{P4}	2.737	1/[t]	P4 clearance rate constant	
51	c_{Foll}^{E2}	1.9	$\frac{[E2]/[Foll]}{1/[t]}$	proportionality factor of follicular	
				function in E2 increase	
52	c_{E2}	0.9	1/[t]	E2 clearance rate constant of	
53	c_{Foll}^{Inh}	4.8	$\frac{[\text{Inh}]/[\text{Foll}]}{1/[\text{t}]}$	proportionality factor of delayed fol-	
				licular function in Inh increase	
54	C_{Inh}	4	1/[t]	Inh clearance rate constant	

Table B.1 – continued from previous page

Appendix C. List of equations 480

The equations listed below are the full notations of the equations de-481 veloped in Section 3.2. Parameters are denoted with p and are numbered 482 according to Table B.1. Components numbering and initial values can be 483 found in Table C.2. 484

	no	component	initial value
	1	$GnRH_{Pit}$	1.598
	2	$GnRH_{Blood}$	0.05003
	3	FSH_{Pit}	0.3994
	4	FSH_{Blood}	0.7996
	5	LH_{Pit}	20.38
	6	LH Blood	0.1096
	7	Foll	0.3988
	8	$PGF2\alpha$	0.03992
	9	CL	0.9808
	10	P_4	0.9995
G	11	E_2	0.009995
	12	Inh	0.1001
		Table C 2. Ini	tial values

Table C.2: Initial values

$$\begin{split} \frac{d}{dt}y_{1}(t) &= p_{2}\cdot\left(1-\frac{y_{1}(t)}{p_{1}}\right) - \left(p_{3}\cdot(h^{-}(y_{10}(t);p_{5},2) + h^{-}(y_{11}(t);p_{4},2)\right) \\ &\quad -h^{-}(y_{10}(t);p_{5},2)\cdot h^{-}(y_{11}(t);p_{4},2)\right) + p_{6}\cdot h^{-}(y_{10}(t);p_{7},2)\right)\cdot y_{1}(t) \\ \frac{d}{dt}y_{2}(t) &= \left(p_{3}\cdot(h^{-}(y_{10}(t);p_{5},2) + h^{-}(y_{11}(t);p_{4},2)\right) \\ &\quad -h^{-}(y_{10}(t);p_{5},2)\cdot h^{-}(y_{11}(t);p_{4},2)\right) \\ &\quad +p_{6}\cdot h^{-}(y_{10}(t);p_{7},2)\right)\cdot y_{1}(t)\cdot p_{8}\cdot h^{+}(y_{11}(t);p_{9},5) - p_{10}\cdot y_{2}(t) \\ \frac{d}{dt}y_{3}(t) &= p_{12}\cdot h^{-}(y_{12}(t-p_{11});p_{13},2) - \left(p_{14}\cdot h^{+}(y_{10}(t);p_{15},2) \right) \\ &\quad +p_{16}\cdot h^{-}(y_{11}(t);p_{17},2) + p_{18}\cdot h^{+}(y_{2}(t);p_{19},1)\right)\cdot y_{3}(t) \\ \frac{d}{dt}y_{4}(t) &= \left(p_{14}\cdot h^{+}(y_{10}(t);p_{15},2) + p_{16}\cdot h^{-}(y_{11}(t);p_{17},2) \right) \\ &\quad +p_{18}\cdot h^{+}(y_{2}(t);p_{19},1)\right)\cdot y_{3}(t) - p_{20}\cdot y_{4}(t) \\ \frac{d}{dt}y_{5}(t) &= p_{21}\cdot h^{+}(y_{11}(t);p_{22},2) + p_{33}\cdot h^{-}(y_{10}(t);p_{24},2) \\ &\quad - \left(p_{27}+p_{25}\cdot h^{+}(y_{2}(t);p_{26},2)\right)\cdot y_{5}(t) \\ \frac{d}{dt}y_{6}(t) &= \left(p_{27}+p_{25}\cdot h^{+}(y_{2}(t);p_{26},2)\right)\cdot y_{5}(t) \\ \frac{d}{dt}y_{6}(t) &= \left(p_{27}+p_{25}\cdot h^{+}(y_{2}(t);p_{26},2)\right)\cdot y_{5}(t) - p_{28}\cdot y_{6}(t) \\ \frac{d}{dt}y_{7}(t) &= p_{29}\cdot h^{+}(y_{4}(t);p_{30}\cdot h^{-}(y_{7}(t);p_{31},1),2) \\ &\quad - \left(p_{52}\cdot h^{+}(y_{10}(t);p_{33},2) + p_{44}\cdot h^{+}(y_{6}(t);p_{35},2)\right)\cdot y_{7}(t) \\ \frac{d}{dt}y_{8}(t) &= p_{37}\cdot h^{+}(y_{10}(t-p_{36});p_{38},2) - p_{40}\cdot h^{+}(y_{10}(t-p_{39});p_{41},10)\cdot y_{8}(t) \\ \frac{d}{dt}y_{9}(t) &= p_{43}\cdot h^{+}(y_{6}(t-p_{42});p_{44},2) + p_{45}\cdot h^{+}(y_{9}(t);p_{46},1) \\ &\quad - p_{47}\cdot h^{+}(y_{8}(t);p_{48},2) \\ \frac{d}{dt}y_{10}(t) &= p_{49}\cdot y_{9}(t) - p_{50}\cdot y_{10}(t) \\ \frac{d}{dt}y_{11}(t) &= p_{51}\cdot y_{7}(t) - p_{52}\cdot y_{11}(t) \\ \frac{d}{dt}y_{12}(t) &= p_{53}\cdot y_{7}(t) - p_{54}\cdot y_{12}(t) \\ 36 \end{aligned}$$

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