

# Towards the quantitative characterization of piglets robustness to weaning: A modelling approach



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# Introduction

## Weaning: a critical period

- Weaning is one of the most critical phases in modern swine breeding conditions<sup>1</sup>
- Practice at around 3-4 weeks of age. Natural weaning occurs around 17 weeks after birth<sup>2</sup>



<sup>1</sup> Lallès *et al.*: *Proc Nutr Soc.* 2007, 66:260-268.

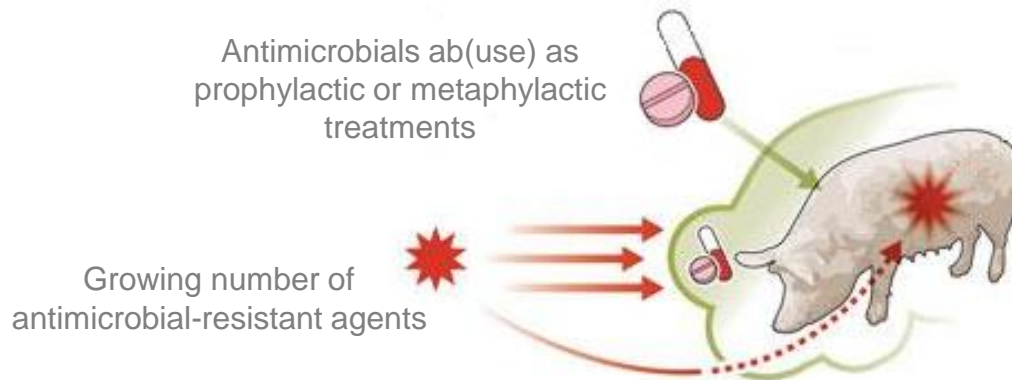
<sup>2</sup> Jensen: *Appl Anim Behav Sci.* 1986, 16:131-142.



# Introduction

## Weaning: a critical period

- Weaning is a sudden, stressful, short, and complex event characterized by changes in diet, social, and environmental life conditions<sup>3</sup>
- Multiple stressors inducing: anorexia, intestinal inflammation, unbalanced gut microbiota...<sup>4</sup>



<sup>3</sup> Campbell *et al.*: *J Anim Sci Biotechnol.* 2013, 4:19.

<sup>4</sup> Pié *et al.*: *J Nutr.* 2014, 134:641-647.



# Introduction

## Weaning: assistance health and management

- Increasing interest of developing tools for assisting health and management decisions around weaning
- It is key to provide robustness indexes that inform on the animal resilience to weaning

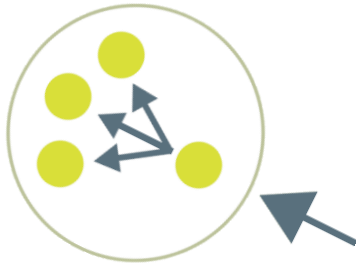




# Introduction

## Robustness concept

- A new crucial goal in breeding strategies
- Definition: Capacity to maintain productivity in a wide range of environments without compromising reproduction, health, and wellbeing<sup>5</sup>



- Elements of robustness:
  - The potential to keep functioning (**resistance**) and take short periods to recover (**resilience**) under varying environmental conditions<sup>6</sup>
- **Multi-trait index**, according to their fitness value in a given environment and production system

<sup>5</sup> Friggens *et al.*: *Animal* 2017, 11:2237-2251.

<sup>6</sup> Star *et al.*: *J Agric Environ Ethics* 2008, 21:109-125.

# Objective



## our **aim**

Develop a modelling approach for facilitating the quantification of piglet resilience/robustness at weaning



## our **material**

Using an experimental Large White population



## our **strategy**

Construct a perturbed model in order to provide biological parameters that inform on the amplitude and length of the perturbation



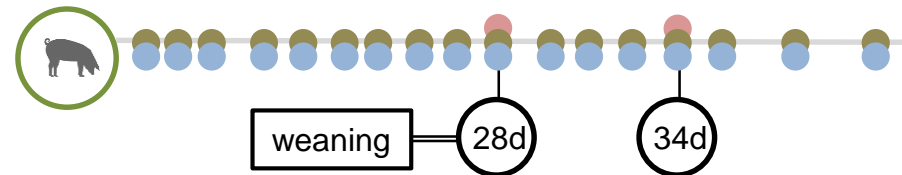
# Material & Methods

## Experimental population

### INRA's *Le Magneraud* experimental unit



- **325 Large White pigs**
  - Without antibiotic administration
  - Conventionally housed and fed during the post-weaning period
- **Recorded traits**
  - Body weight measurements
  - Diarrhoea score (0, 1, 2)
  - Health status measurements



# Material & Methods

## Mathematical model approach



## Perturbed model Gompertz-Makeham equation

Normalized Error function (i)

$$\text{Error value} = \left( \frac{W - W_d}{W_d} \right)^2 \quad (\text{i})$$

Where  $W_d$  represented the weight data (kg) and  $W$  the weight predicted by the model

Error weighted with respect to the size of the registers for each animal (ii)

$$J = \frac{\text{sum (Error value)}}{\text{length (t)}} \quad (\text{ii})$$

<sup>7</sup> <https://www.scilab.org/>.





# Material & Methods

## Mathematical model approach: A perturbed model

- Dynamic model based on the **Gompertz-Makeham law**<sup>8</sup> (iii, iv)
  - Describe live weight during the first 75 days after weaning
  - Animal response to the perturbation partitioned in two time windows:
    - perturbed / recovery window
    - Individual specific transition time between windows

**Gompertz-Makeham law** is an extension of the Gompertz model to consider the effect of a disturbing environment

<sup>8</sup> Golubev: *J Theor Biol.* 2009, 258:1-17.



# Material & Methods

## Mathematical model approach: A perturbed model

Dynamic of weight of piglets represented by two ordinary differential equations (iii, iv) based on **Gompertz-Makeham law**

$$dW/dt = W * (-C + \mu) \quad \text{(iii)}$$

$$d\mu/dt = -D * \mu \quad \text{(iv)}$$

Where  $W$  (kg) is the weight,  $\mu$  (1/d) is the specific growth rate,  $D$  (1/d) is a developmental parameter and  $C$  (1/h) is a parameter representing the effect of the environment on the weight



# Material & Methods

## Mathematical model approach: A perturbed model

To represent the moment at which the animal is perturbed and the moment at which it recovers from the perturbation, we assumed **two time windows**.  
Mathematically modelled in the parameter  $C$

$$C > 0 \text{ if } t \leq t_s$$

$$C = 0 \text{ if } t > t_s$$

Where  $t_s$  is the time of switch and is assumed to be specific for each animal



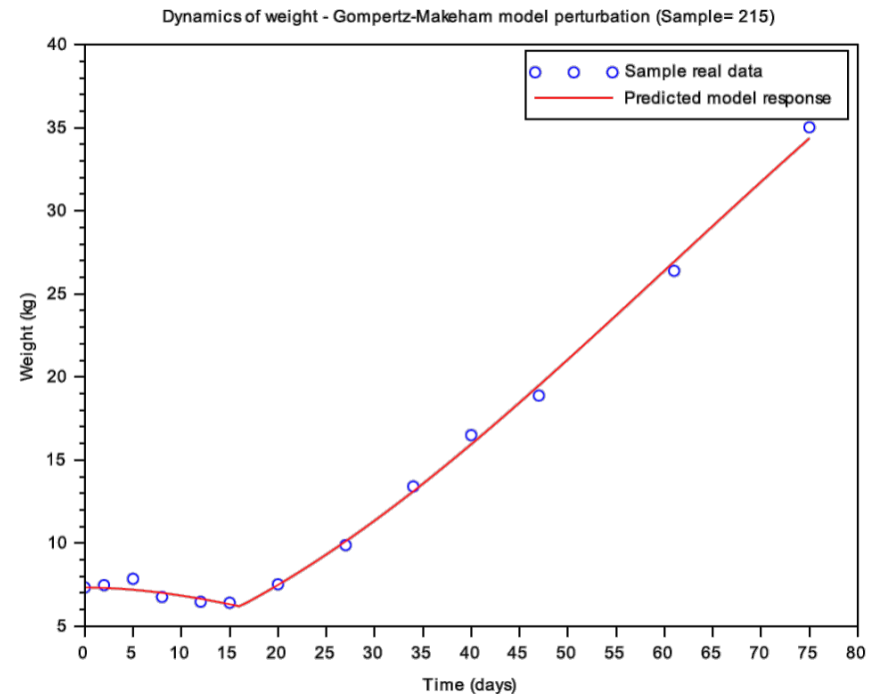
# Results

## Perturbed model: parameters

**Gompertz-Makeham law** consider the effect of a disturbing environment (weaning)

### Parameters

- *Model Error*: Level of fitting of the model
- *C*: Discriminative of the level of perturbation
- $t_s$ : Indicates the moment at which the animal recovers from the perturbation



**Figure 1** | Dynamics of weight using perturbed Gompertz-Makeham law



# Results

## Perturbed model: parameters

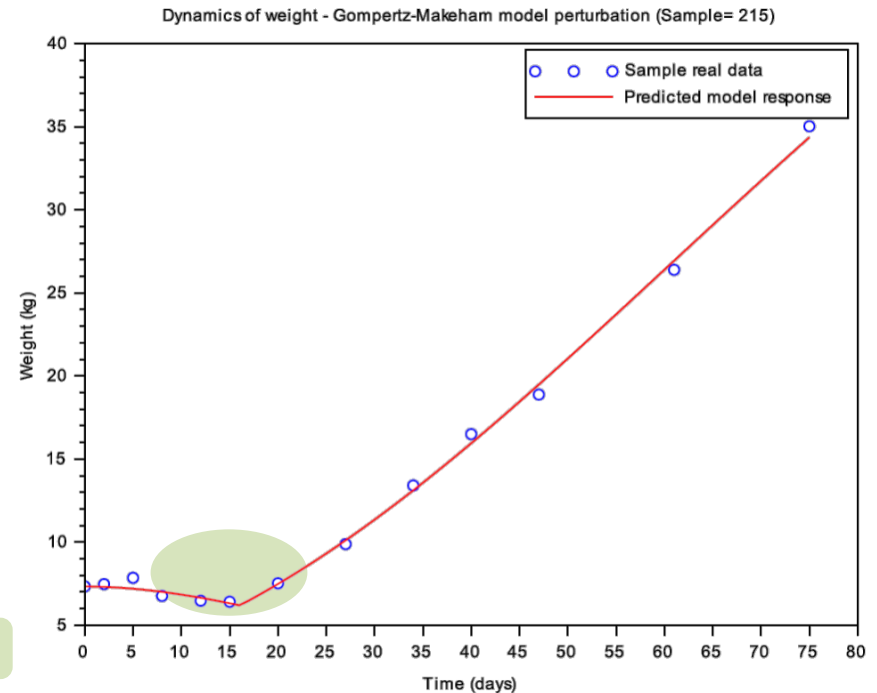
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**Figure 1** | Dynamics of weight using perturbed Gompertz-Makeham law



# Results

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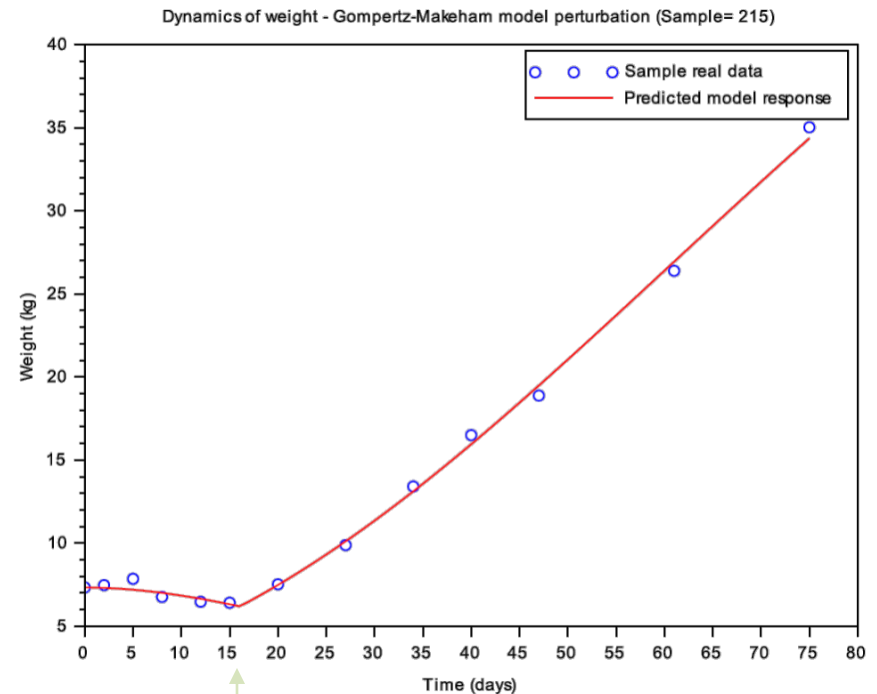
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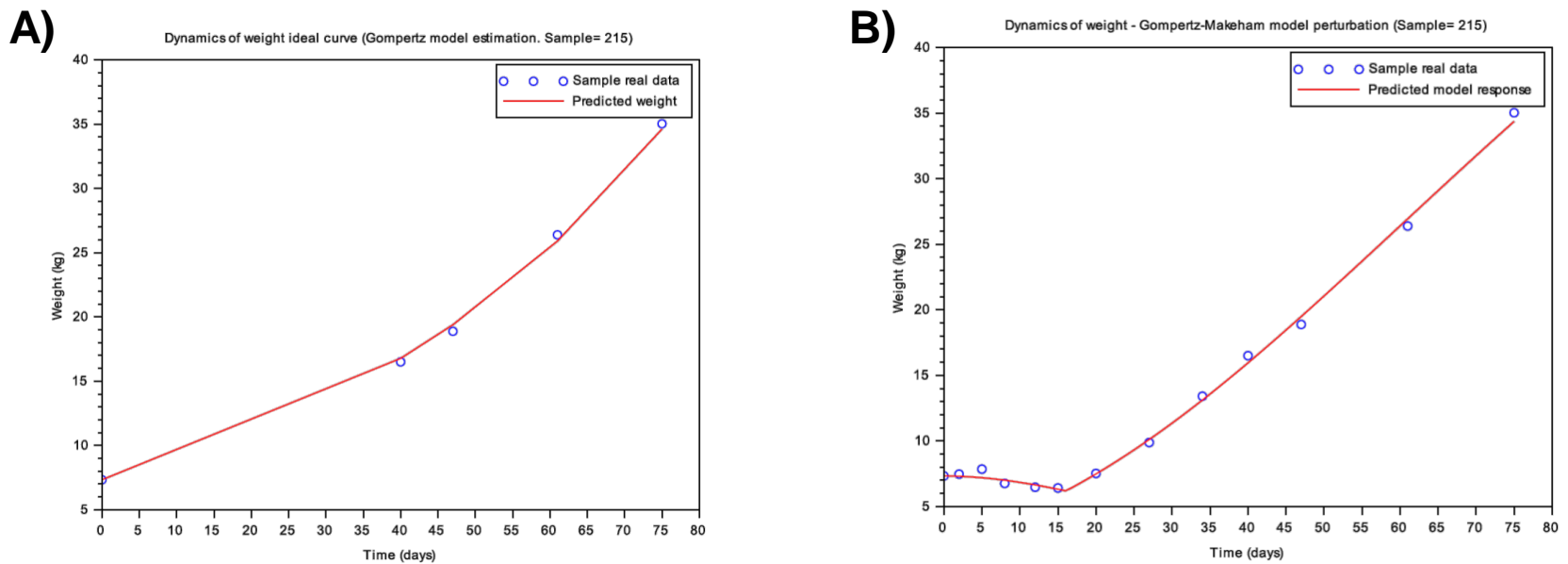


**[Figure 1]** Dynamics of weight using perturbed Gompertz-Makeham law



# Results

## Theoretical growth rate curve (Unperturbed) and Gompertz-Makeham model (Perturbed)



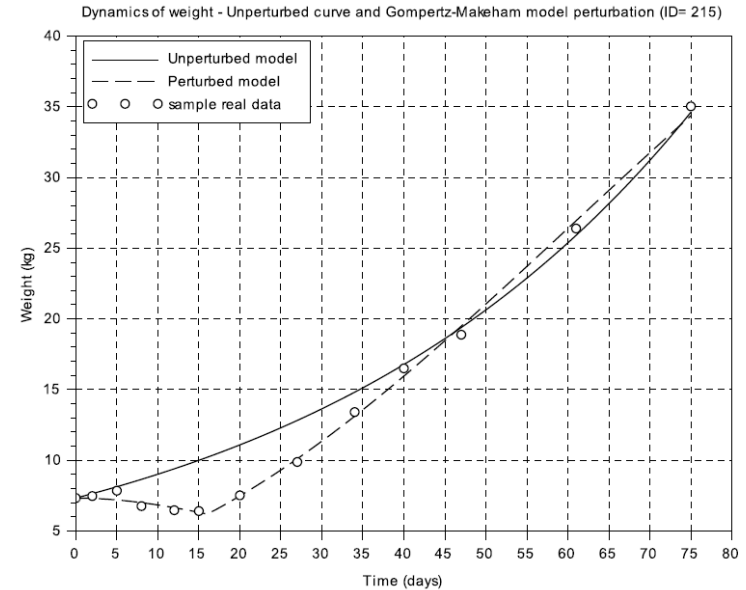
**[Figure 2]** Example of the dynamics of weight for one animal (sample= 215). **A)** Theoretical growth rate curve (Unperturbed) using Gompertz equation. **B)** Predicted response using Gompertz-Makeham law (Perturbed)



# Results

## Area between curves (*ABC*) parameter

- The area between curves (*ABC*) parameter is an index that balances goodness of fitting of the model
- **Robustness index**
- Inform on the animal capabilities in terms on the amplitude and length of perturbation, and the rate of animal recovery



**Figure 3** | Comparison of the weight dynamics as predicted by the unperturbed and the Gompertz-Makeman (perturbed) models. ID= 215 is represented

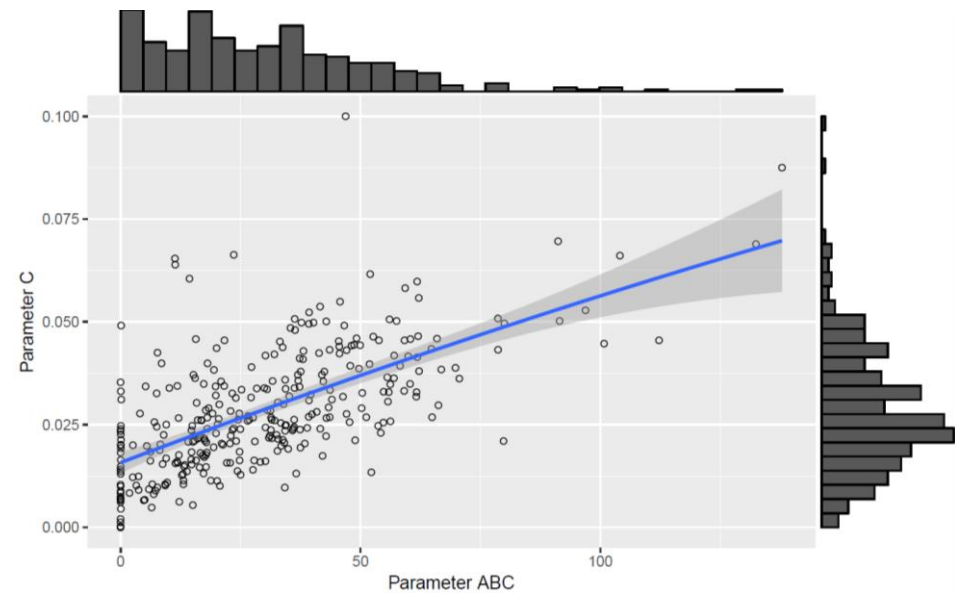




# Results

## Perturbed model: parameters correlation

- High positive correlation ( $r= 0.64$ ;  $p\text{-value}= 3.34 \times 10^{-17}$ ) between Parameter C and Parameter ABC
- High proportion of animals with a moderate degree of perturbation



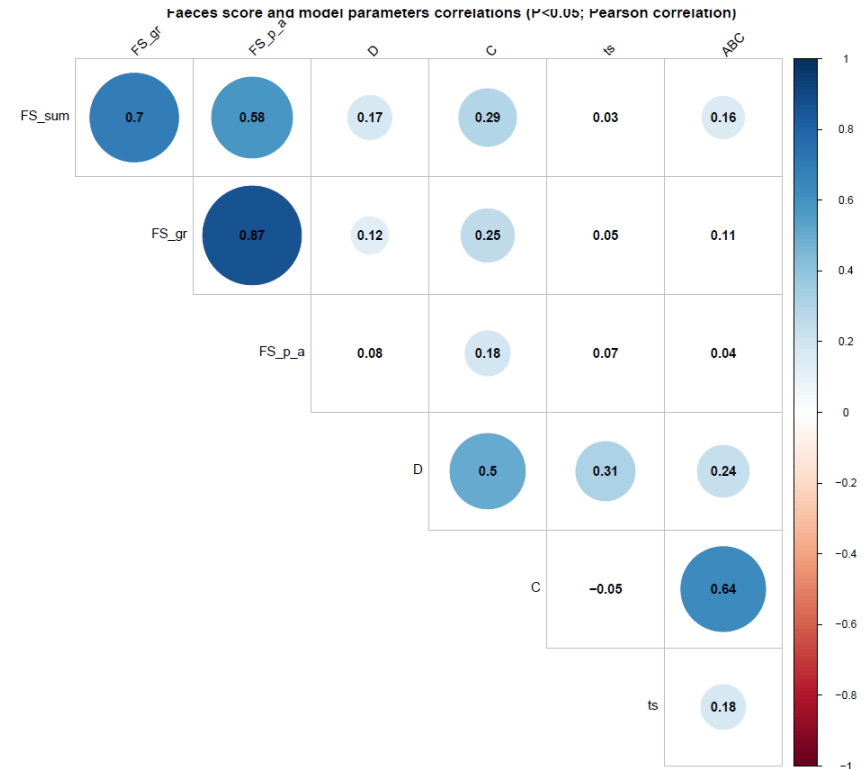
**[Figure 4]** Scatter plot with marginal histograms illustrating the relationship between: Parameter C and Parameter ABC



# Results

## Correlation analyses: Faeces Score

- The **Model Parameters** and **Faeces Score correlations** revealed significant positive associations
- Faeces Score data:
  - *FS\_sum*: Number of diarrhoea measurements, corrected by number of observations per each animal
  - *FS\_group* (3 levels):
    - 0: No diarrhoea observation
    - 1: One diarrhoea register
    - 2: Two or more diarrhoea registers
  - *FS\_p\_a* (2 levels): Presence/absence



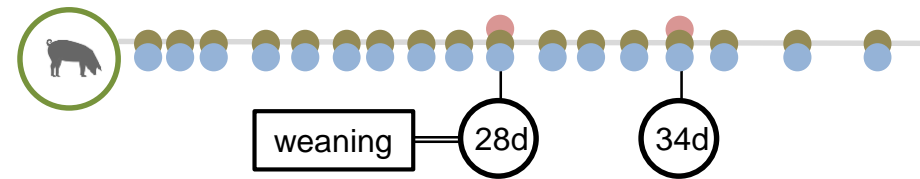
**[Figure 5]** Correlations among Model Parameters and Faeces Score data



# Results

## Correlation analyses: Health status measurements

- The **Model Parameters** and **health status** measurements revealed significant associations



Date Measurements	Model Parameter	Health status measures	Correlation	Bibliography
28d	ABC	Hematocrit (Hct)	-0.38 <sup>***</sup>	High association with average daily gain in the three weeks post-weaning <sup>9</sup>
		Hemoglobin (Hgb)	-0.32 <sup>***</sup>	
34d	ABC	Monocytes (Mon)	-0.30 <sup>***</sup>	Estimator of the animal health status <sup>10</sup>

<sup>9</sup> Bhattarai & Nielsen: *Livest Sci.* 2015, 182:64-68.

<sup>10</sup> Chamorro *et al.*: *Immunology* 2005, 114:63-71.



# Conclusions



- We have create an **animal ranking** with respect to the distance between the population data and the model
- This work provides **biological parameters** derived by modelling piglet body weight trajectories from weaning
- These parameters inform on the **amplitude** and **length of perturbation**, and the rate of animal recovery
- We have identified **significant correlations** between the model **parameters index** and individual **diarrhoea scores** and **health status** measurements

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With the collaboration of





### *UMR MoSAR*

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L.P. Broudiscou  
R. Muñoz-Tamayo

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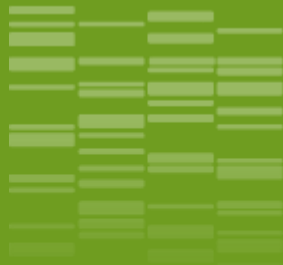
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