

Prediction of the daily nutrient requirements of gestating sows based on behavioural sensor data and machine-learning algorithms

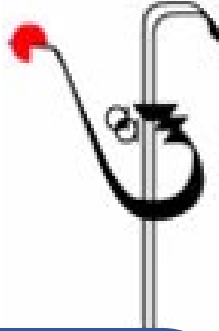


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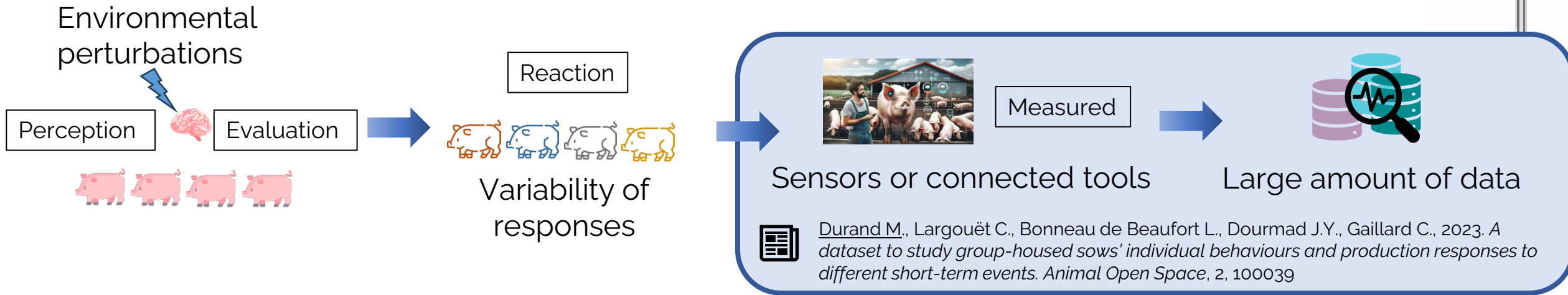
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²Institut Agro, Univ Rennes1, CNRS, INRIA, IRISA, 35000, Rennes, France

Context



Monitoring of animals for multiple benefits



Identify changes in welfare status



Durand M., Largouët C., Bonneau de Beaufort L., Dourmad J.Y., Gaillard C., 2023. Prediction of gestating sows' welfare status based on machine learning methods and behavioural data. *Sci. Rep.*, 13, 21042

Identify changes in behaviour



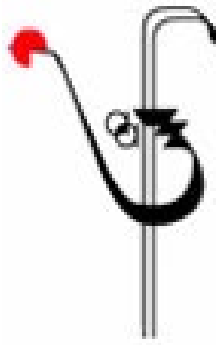
Durand M., Dourmad J.Y., Julianne A., Couasnon M., Gaillard C., 2023. Effects of a competitive feeding situation on the behaviour and energy requirements of gestating sows. *Appl. Anim. Behav. Sci.*, 261, 105884

Identify changes in nutrients requirements



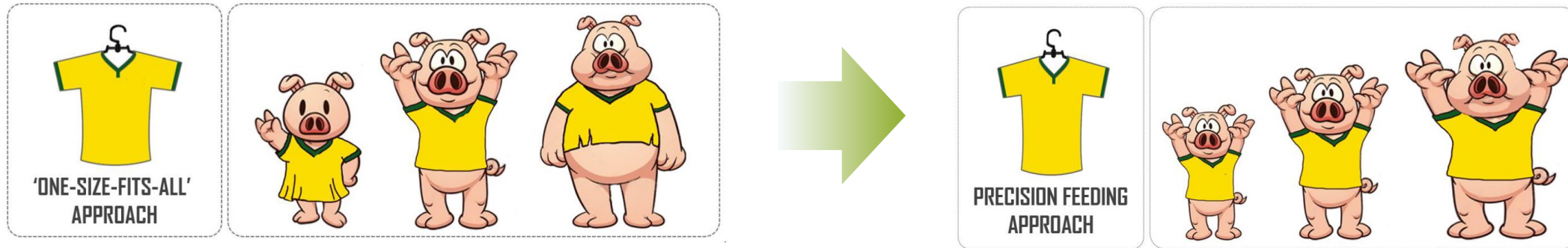
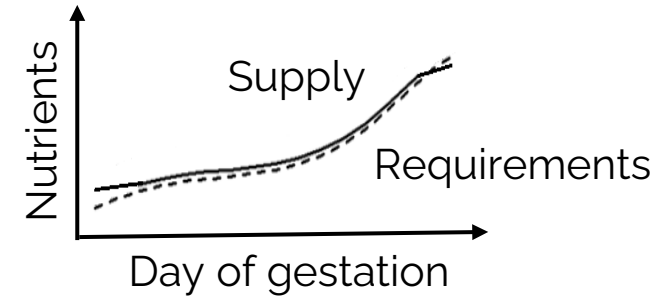
Durand M., Largouët C., Bonneau de Beaufort L., Dourmad J.Y., Gaillard C., 2023. Prediction of daily nutritional requirements of gestating sows based on sensors data and machine learning algorithms. *J. Anim. Sci.*, 101, skad337

Context



Precision feeding for gestating sows

Precision feeding aims to bring the proper amount of feed with the suitable composition to be supplied in a timely manner to individual animals (Pomar *et al.*, 2009).



Reduction of underfed and overfed animals

Decrease of nitrogen excretion by 18 % and phosphorous by 9 %

Decrease of lysine intake by 25 % and phosphorous by 8 %

Crédit Photo : Remus *et al.*, 2019 ; Durand *et al.*, 2021 ; Gaillard *et al.*, 2022

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Aim of the study



ME

SID Lys

Mechanistic model designed for precision feeding of gestating sows: daily metabolizable energy and standardized ileal digestible lysine requirements for each sow

Difficulty of using the model to estimate requirements

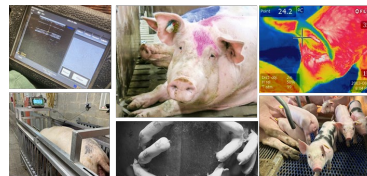


Search for a new method made possible by the development of sensors

Explore and evaluate the prediction of individual daily nutrient requirements, using data measured by sensors and machine learning algorithms



73 gestating sows
(4 batches)

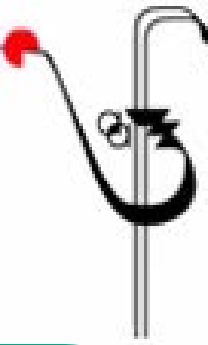


Various digital farm configurations
(electronic feeder, drinker stations)

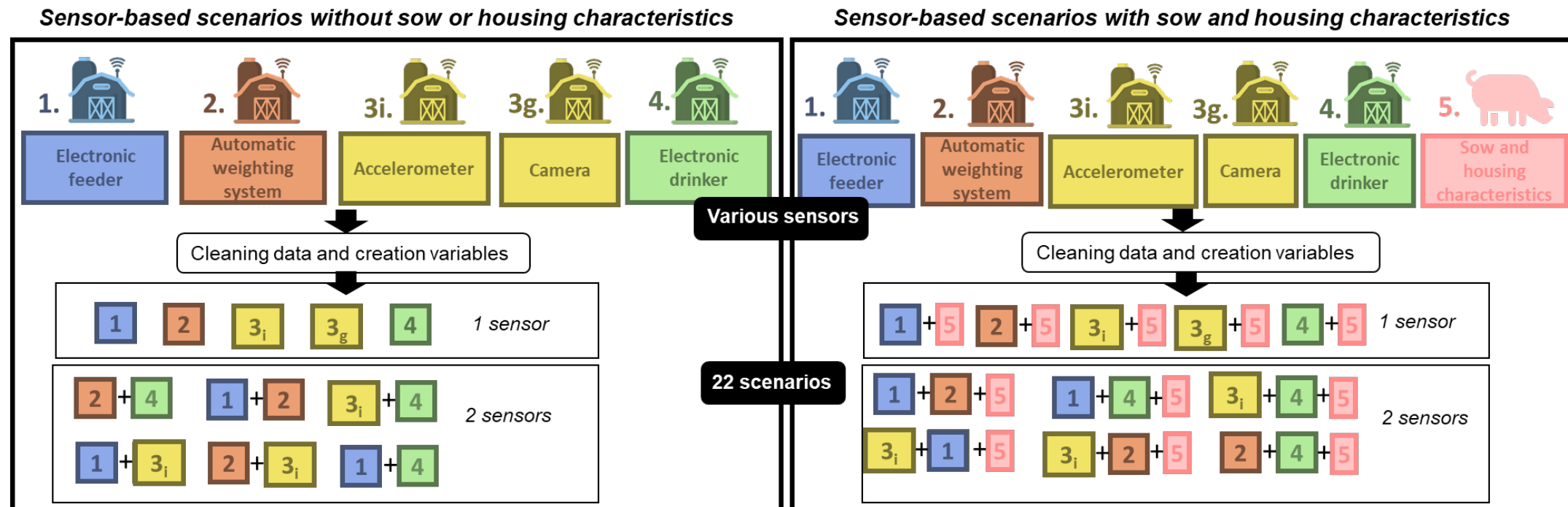


9 machine-learning algorithms

Material and methods (1/2)



Step 1: Scenarios definition



Material and methods (2/2)

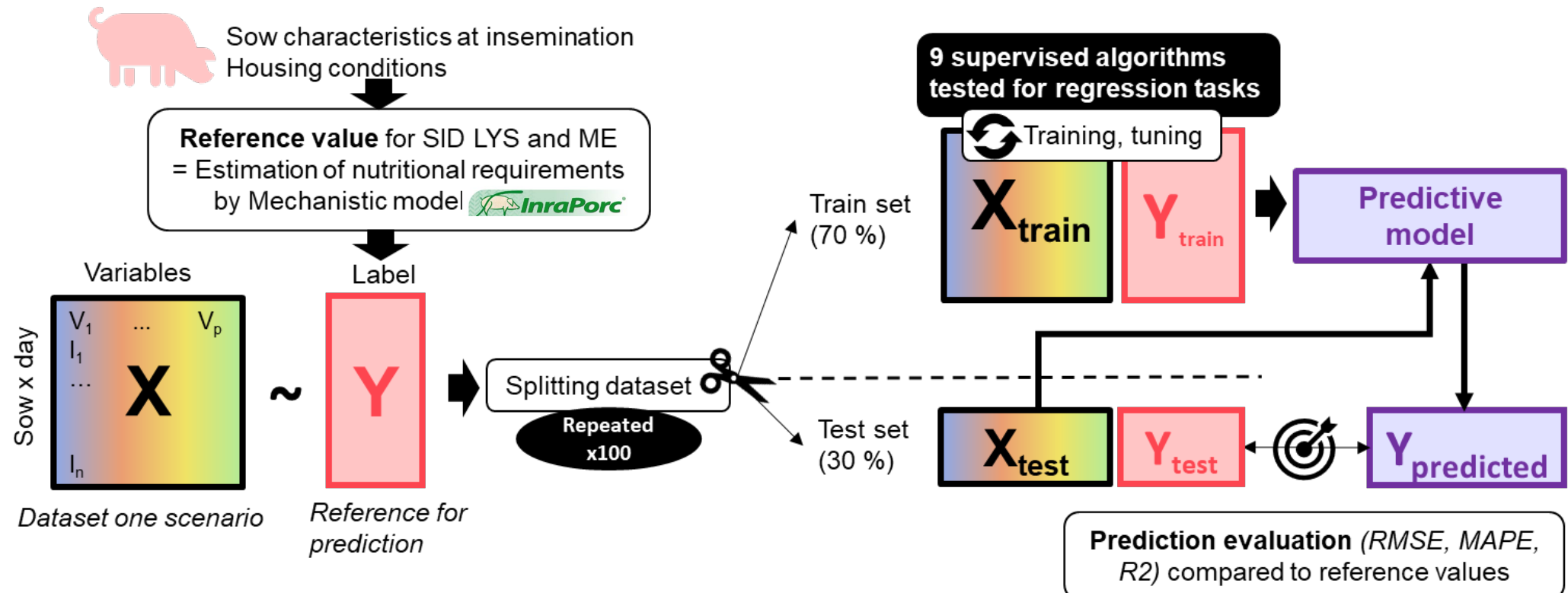
Step 1: Scenarios definition



10 Scénarios
Sensors + Sow & housing characteristics (SP.)

10 Scénarios
Sensors data only (S.)

Step 2 : Prediction of nutrients requirements with 9 machine learning algorithms



Main results (1/3) : best equipments

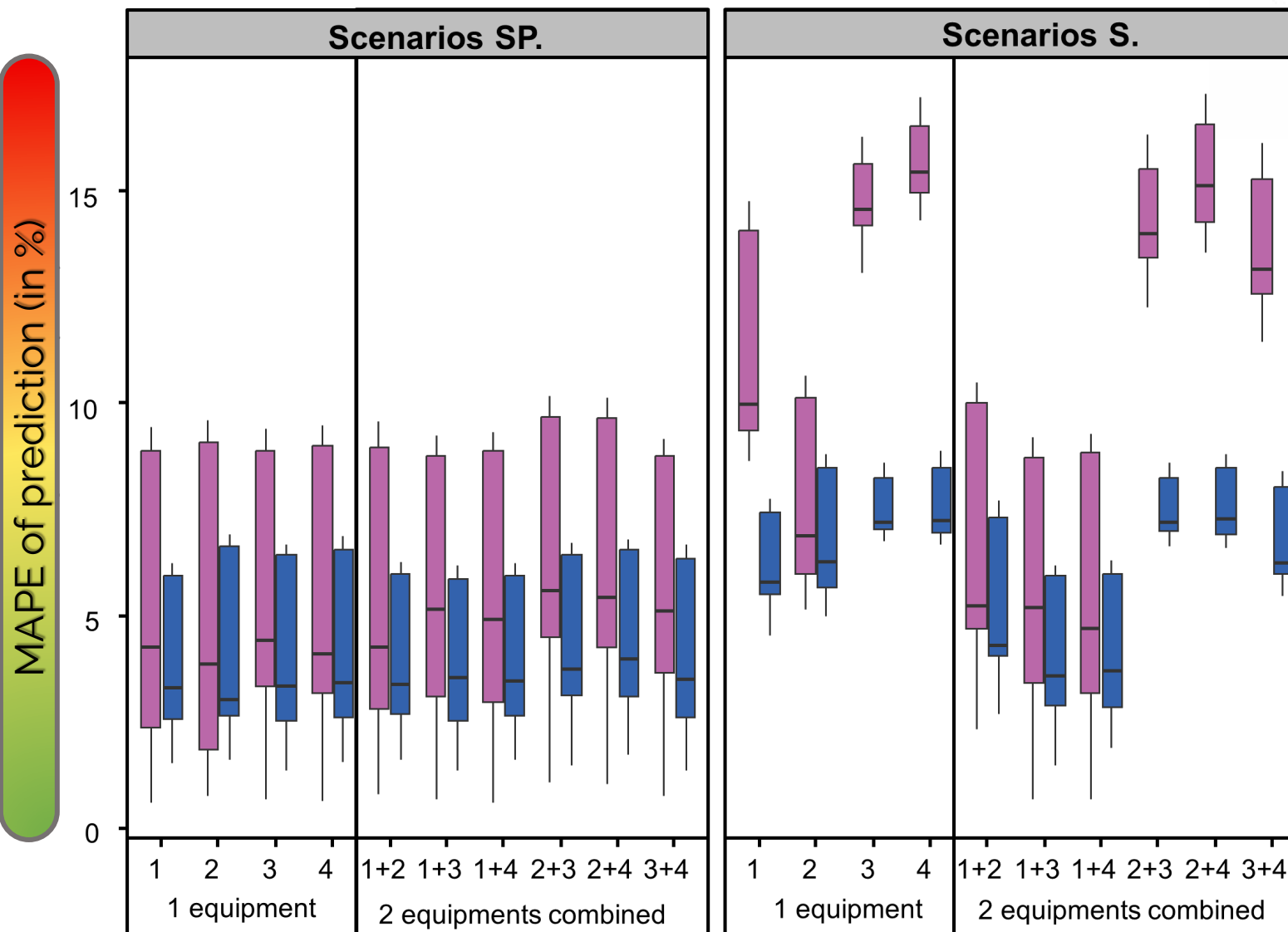
■ Metabolisable energy

Best performance obtained for scenarios with **electronic feeder alone** ($R^2 = 0.74$) or **combined** ($R^2 = 0.75$)

■ Standard ileal digestible lysine

Best performance obtained for scenarios with **electronic feeder or automatic weighting system** ($R^2 = 0.92$)

- 1: electronic feeder
- 2: automatic weighting system
- 3: accelerometer, camera
- 4: electronic drinker



Digital farm configurations

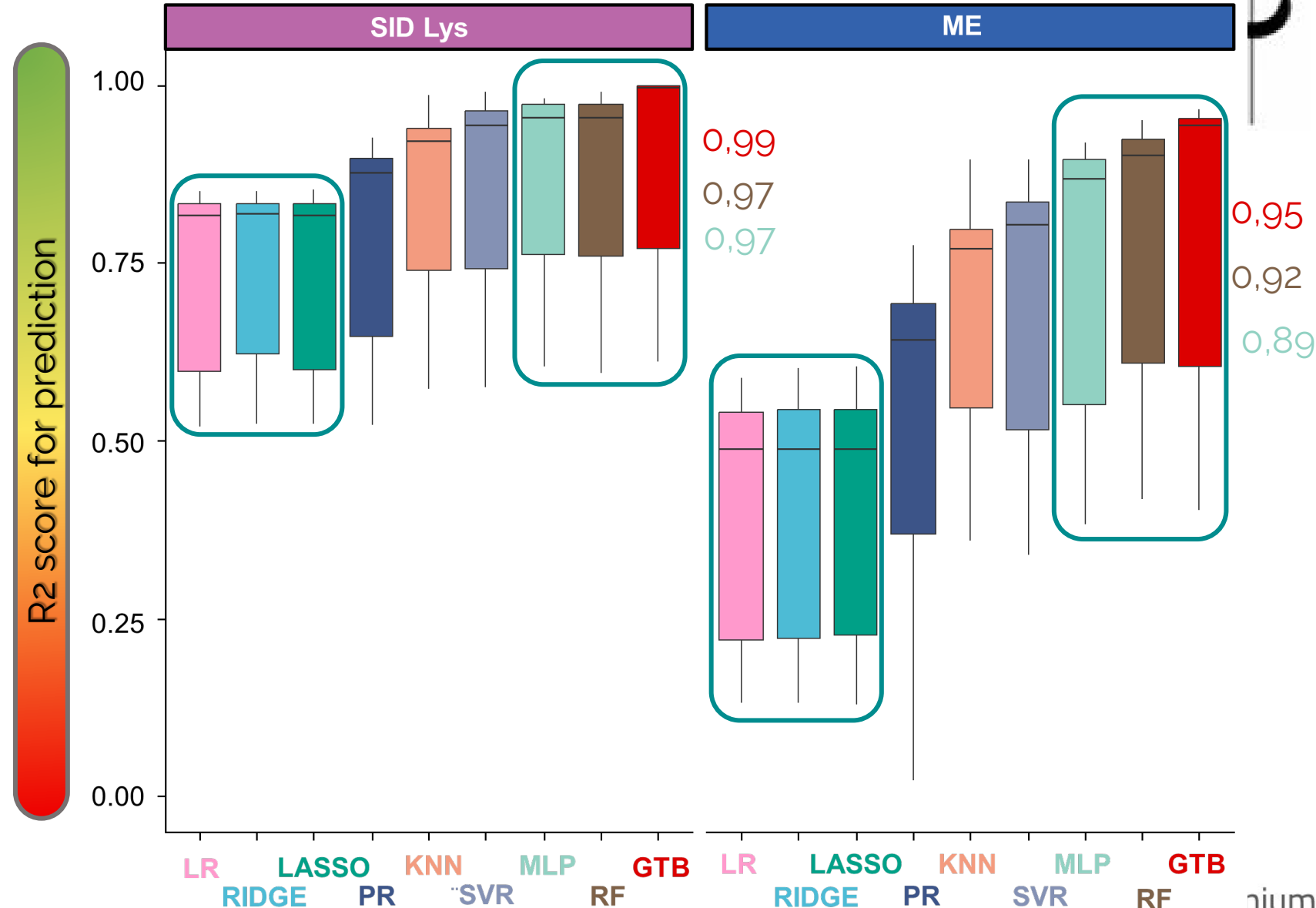
Main results (2/3) : best algorithms

Best performance for GTB

(MAPE = 0.91 MJ/d for energy and 0.08 g/d for lysine), followed by **RF** and **MLP**

Worst performance for linear regressions (MAPE = 2.75 MJ/d for energie and 1.07 g/j pour lysine)

- Linear Regression (LR)
- LR with a RIDGE regularization (RIDGE)
- LR with a LASSO regularization (LASSO)
- Polynomial Regression (PR)
- k-nearest-Neighbors (KNN)
- Support Vector Machine for Regression (SVR)
- Multilayer Perceptron (MLP)
- Random Forest (RF)
- Gradient Tree Boosting (GTB)

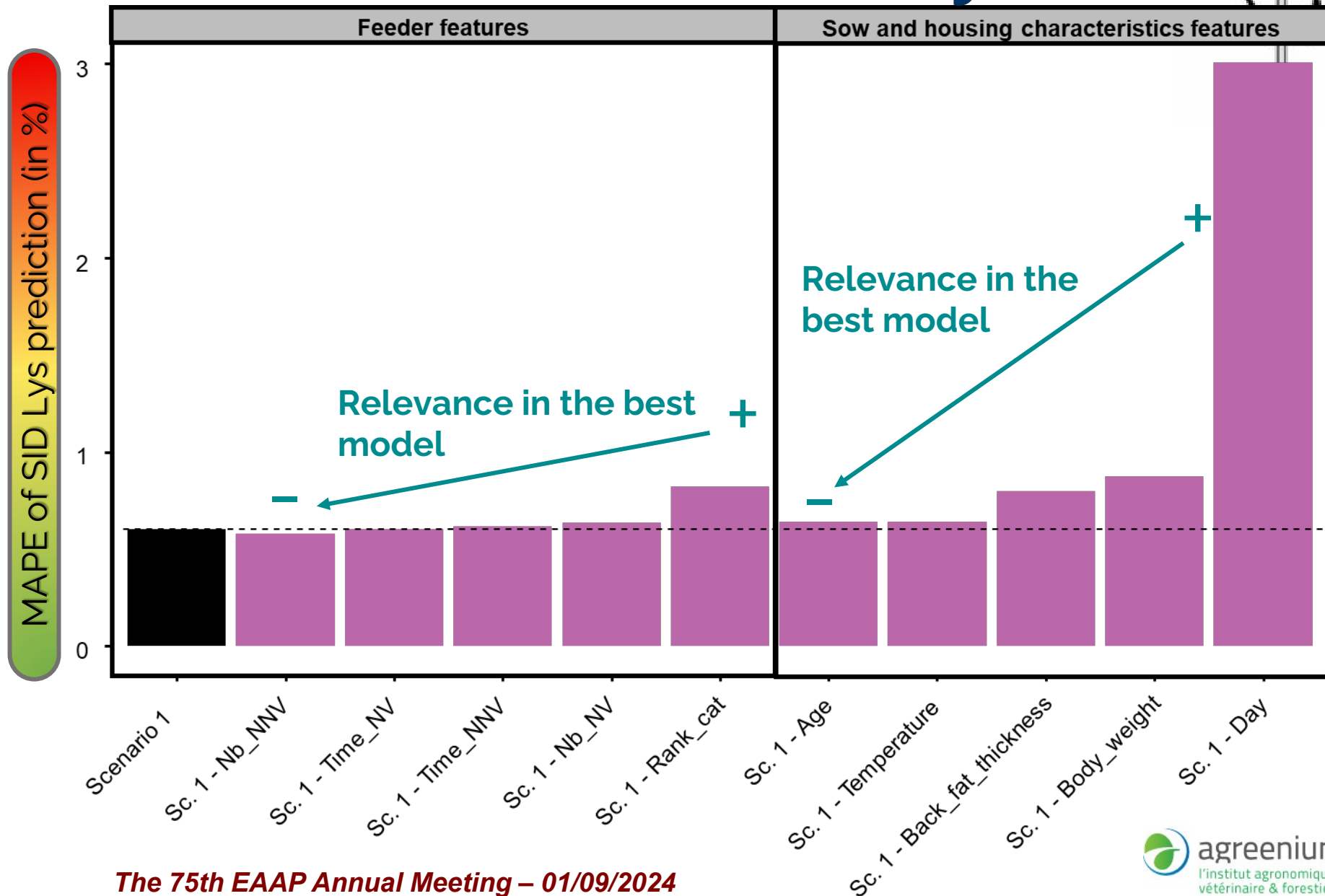


Main results (3/3) : ablation study

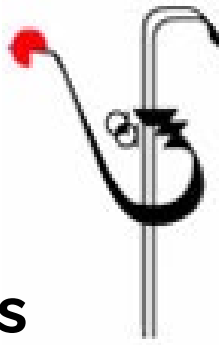
Inclusion of sow and housing characteristics reduced the MAPE by 2.2 pts for energy and 5.6 pts for lysine

Relevance of features:
Importance of feeder order, number of nutritive visit, day of gestation, BW and back-fat-thickness

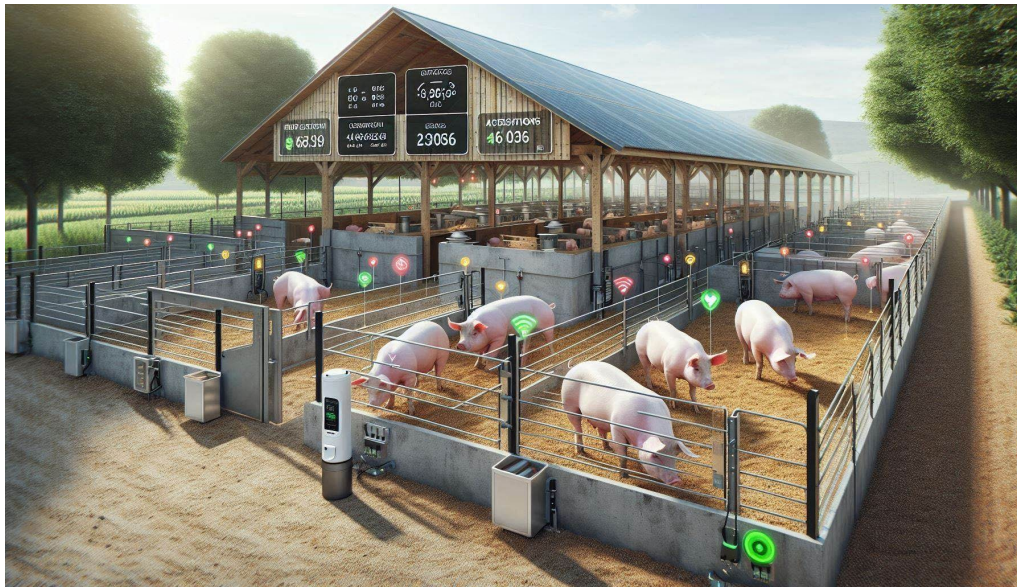
NV : nutritive visit to feeder
NNV : non-nutritive visit to feeder



Conclusion



Prediction of the daily nutrient requirements of gestating sows based on behavioural sensor data and machine-learning algorithms



- Very good prediction performance with low errors (less than 5 and 7% for energy and lysine)
- Superiority of the electronic feeder among the tested scenarios
- Importance of including sow and housing characteristics to improve prediction
- Superiority of decision tree machine learning methods

Thank you for your attention