

Derivation of the metabolic status in dairy cows - prediction of ruminal daily pH mean

A. Mensching¹, M. Zschiesche², J. Hummel², A. R. Sharifi¹

¹ University of Goettingen, Animal Breeding and Genetics Group, Center for Integrated Breeding Research, Goettingen, Germany

² University of Goettingen, Ruminant Nutrition Group, Goettingen, Germany



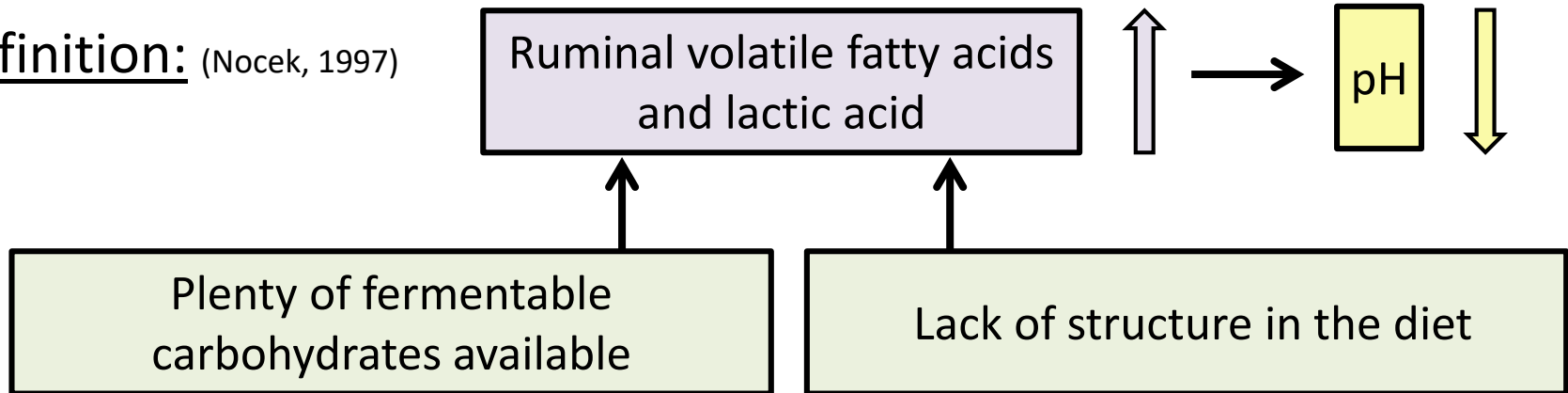
Introduction



Metabolism disorder in dairy cows: Subacute ruminal acidosis (SARA)

“It may [...] be appropriate to suggest that SARA is the most important nutritional disease of dairy cattle.” (Enemark, 2008)

Definition: (Nocek, 1997)



Adequate ruminant nutrition (!)

Present indicators for SARA

- Daily mean pH <6.2 and time pH <5.8 >5.2 h per day (Zebeli et al., 2008)
- Fat-to-Protein ratio <1.0 (Enemark et al., 2002; KTBL, 2016)
- pH <5.5 using rumenocentesis (Nordlund et al., 1995; Garrett et al., 1999)

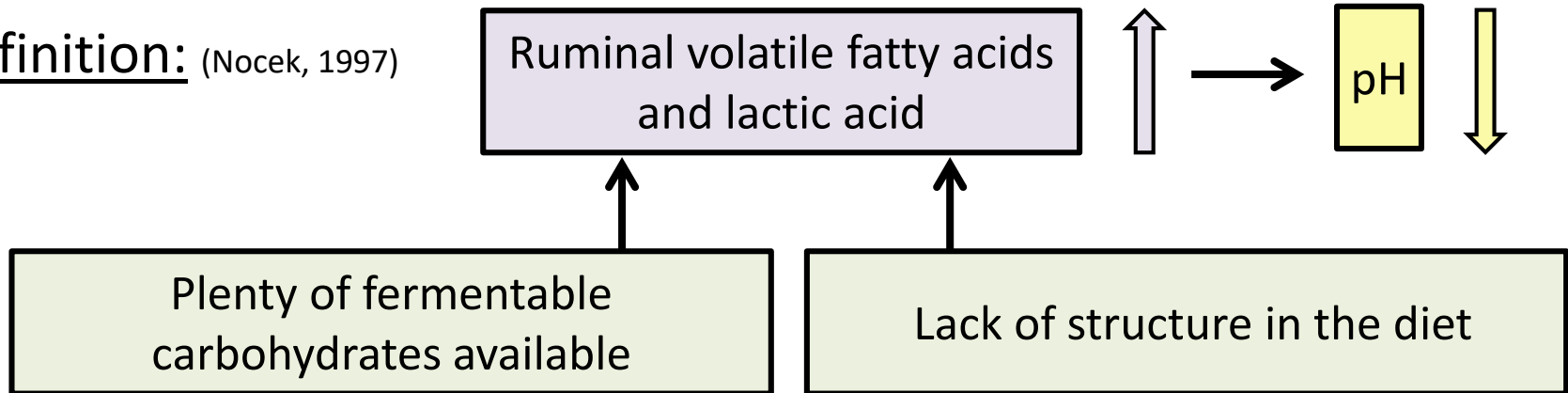
Introduction



Metabolism disorder in dairy cows: Subacute ruminal acidosis (SARA)

“It may [...] be appropriate to suggest that SARA is the most important nutritional disease of dairy cattle.” (Enemark, 2008)

Definition: (Nocek, 1997)



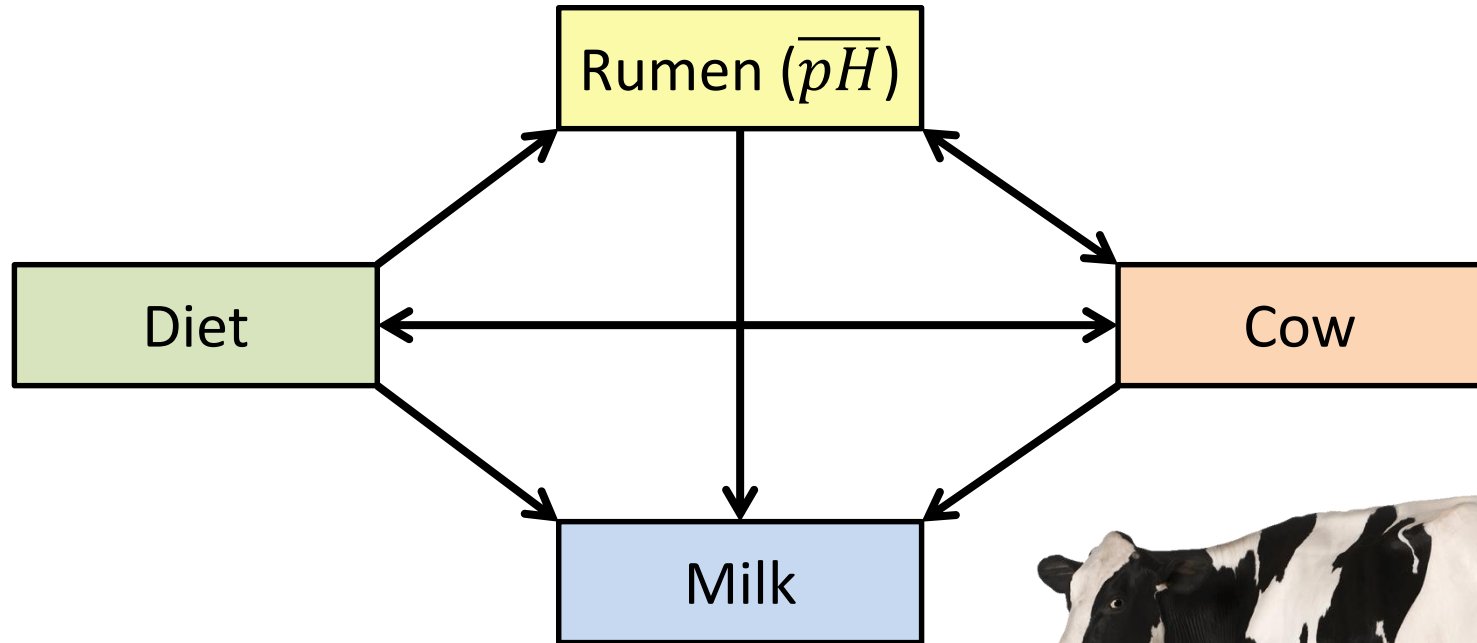
Adequate ruminant nutrition (!)

The phenotype of SARA is not clearly defined yet
→ Main reason: **Subacute = No clinical signs**



Objective

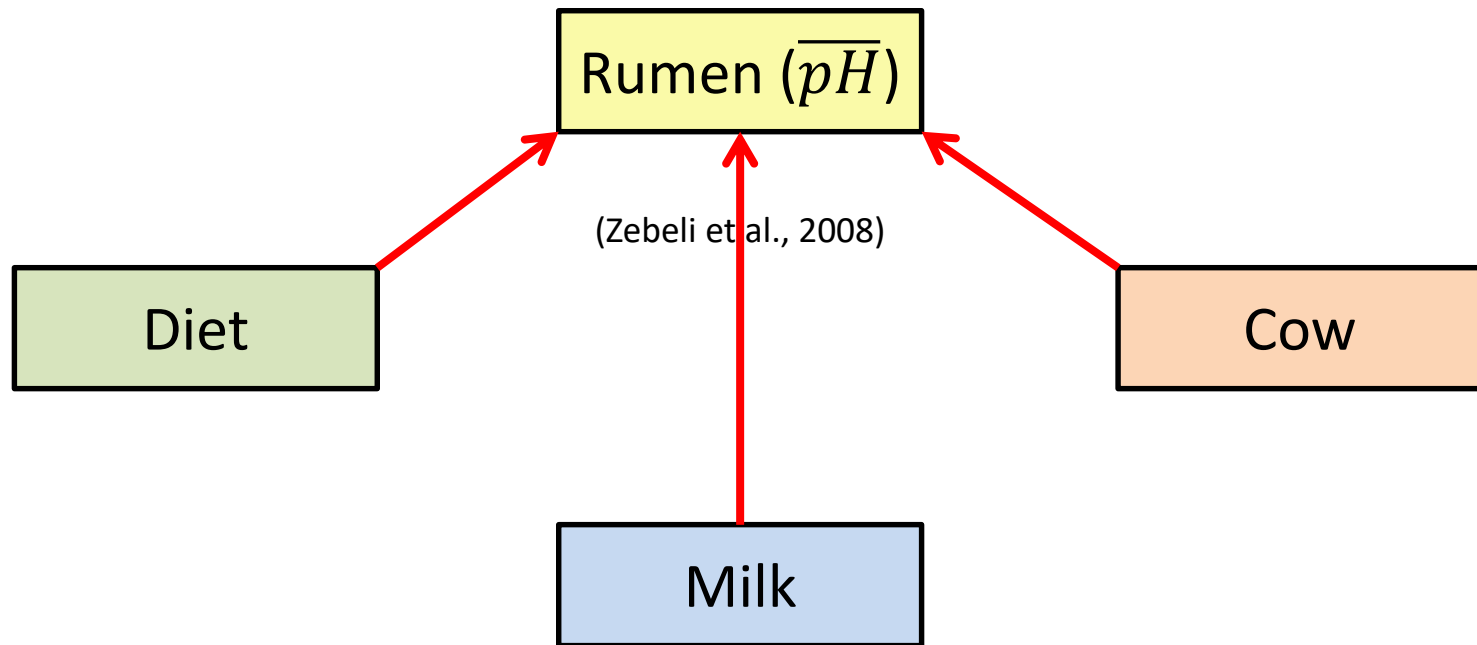
Modeling of the daily mean ruminal pH (\overline{pH}) using meta-analytical methods



Objective



Modeling of the daily mean ruminal pH (\overline{pH}) using meta-analytical methods



- Predictors: Milk- and diet-specific parameters
 - Focus on parameters that are available in agricultural practice
- Analysis and validation of present indicators

Materials and Methods



Workflow

Step I

Literature research and building a data set
→ Problem: $\approx 21\%$ missing values

Step II

Statistical imputation
Method comparison via cross-validation:
Linear Models (LM) vs. linear mixed Models (LMM)

Step III

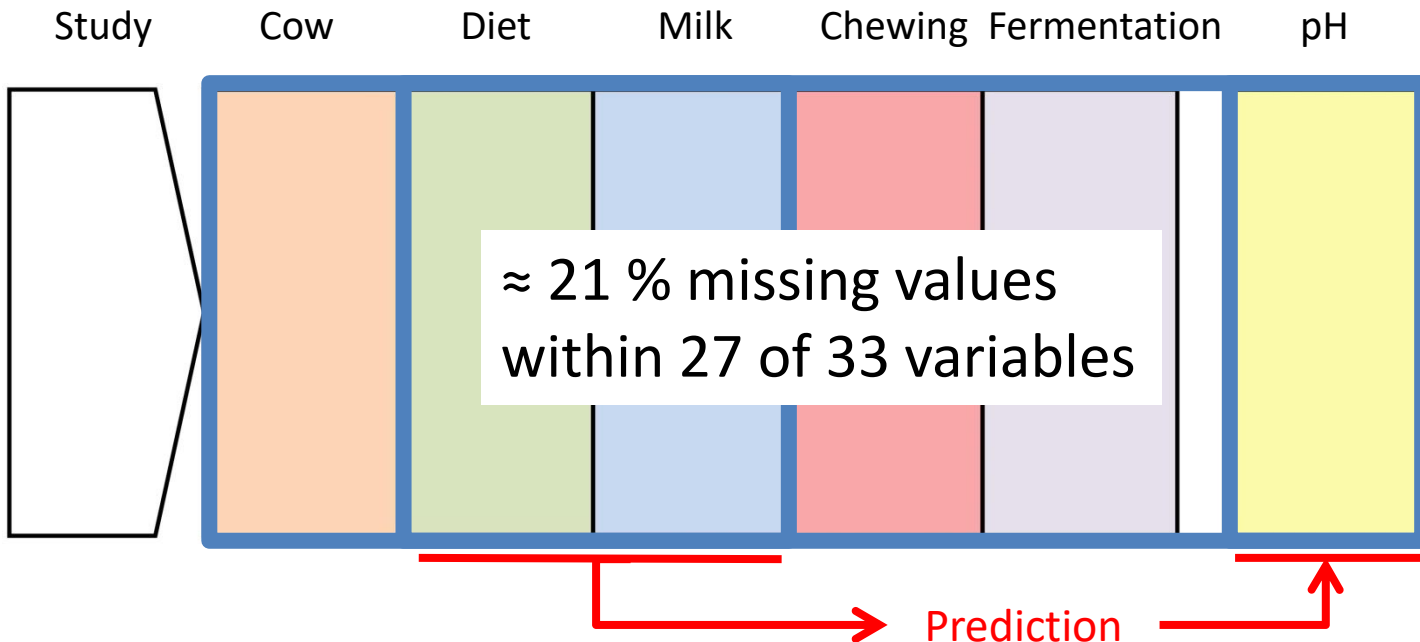
Variable selection for \overline{pH}
Method comparison via cross-validation:
LM vs. LMM

Materials and Methods



Step I: Data

- Selection criteria for studies
 - Continuous pH measurement in the ventral sac of the rumen
 - Measurement >24 h in cannulated lactating Holstein cows
- Hierarchical data structure with group level “study”
 - $n = 39$ studies, $k = 141$ treatment means ($\Sigma = 279$ cows)





Meta-regression for Step II and III:

- LM: linear and quadratic effects

$$y_i = \beta_0 + \beta_1 x_{i,1} + \beta_2 x_{i,2} + \beta_2 x_{i,2}^2 + \dots + e_i$$

- LMM: linear and quadratic effects, study as random effect

$$y_{ij} = \beta_0 + \beta_1 x_{ij,1} + \beta_2 x_{ij,2} + \beta_2 x_{ij,2}^2 + \dots + \text{study}_j + e_{ij}$$

- Weighted least squares estimation

- Weighting by the reciprocal standard error

(Inverse variance method) (Borenstein et al., 2009; Schwarzer et al., 2015)

- Model comparison via leave-one-study-out cross-validation on the correlation between observed and predicted values $r(y, \hat{y})$
(Prediction with LMM only on the fixed effect part)



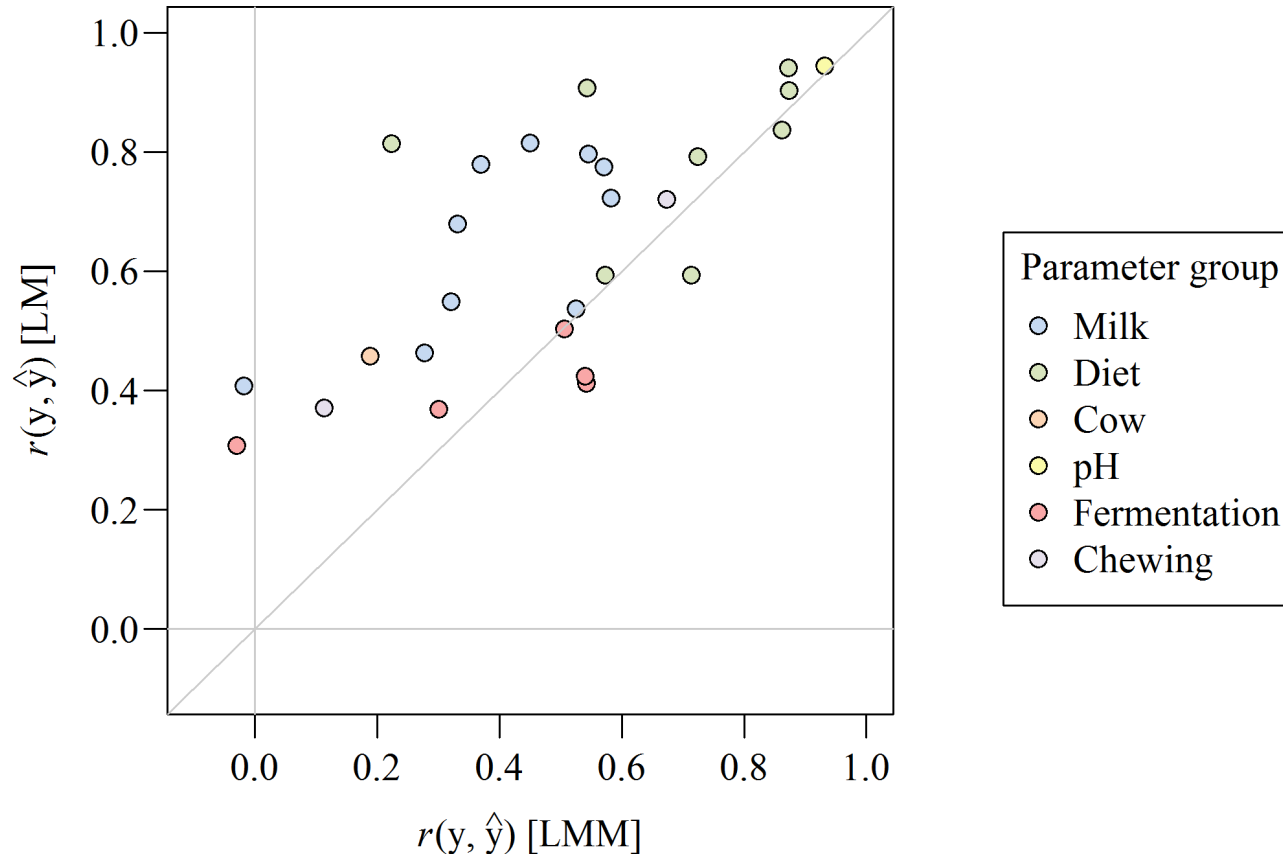
Step II: Statistical imputation

- Multiple Imputation by Chained Equations (MICE) (Azur et al., 2011)
 - Each variable with missing values is modeled by other variables of the same dataset
 - Developed algorithm for variable selection with a stepwise forward selection using the Bayesian information criterion (BIC)
 - Considering linear effects
 - Series of regression models in an iterative process
- Within statistical imputation all variable groups were used

Materials and Methods



Step II: Statistical imputation, Method comparison via $r(y, \hat{y})$



- Imputation performance of LM better than of LMM
→ Further analysis on the data base which was imputed by LM



Materials and Methods

Step III: Variable selection for \overline{pH}

- Developed algorithm for variable selection with a stepwise forward selection using the BIC
- Considering linear and quadratic effects
- Separate variable selection for \overline{pH} on parameters of

Milk

Diet

Milk & Diet



Results and Discussion

Variable selection for \overline{pH}

Predictors	Linear models			Linear mixed models		
	LM1	LM2	LM3	LMM1	LMM2	LMM3
Protein	■	■	■	■	■	■
FPR	■	■	■	■	■	■
Lactose	■	■	■	■	■	■
Lactose ²	■	■	■	■	■	■
NEL	■	■	■	■	■	■
EE	■	■	■	■	■	■
ADF	■	■	■	■	■	■
peNDF>8	■	■	■	■	■	■
(peNDF>8)	■	■	■	■	■	■
NFC	■	■	■	■	■	■

Predictor groups

- Milk
- Diet
- Milk & Diet

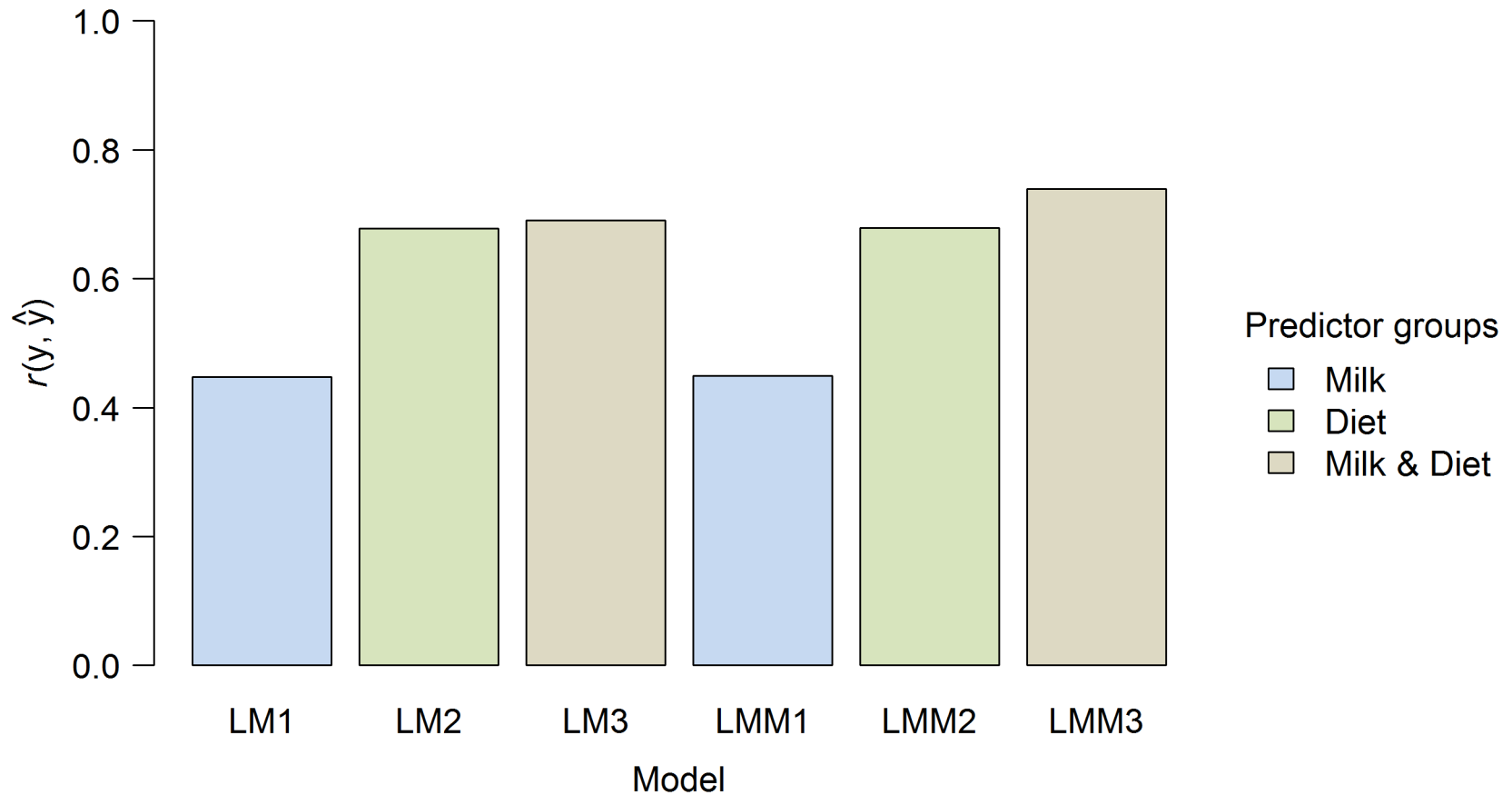
NEL = Net energy lactation, EE = Ether extract, ADF = Acid detergent fiber, peNDF>8 = physically effective neutral detergent fiber >8mm, NFC = Non fiber carbohydrates

Results and Discussion



Variable selection for \overline{pH}

- Results of cross-validation $r(y, \hat{y})$





Conclusion

- Statistical imputation is a useful tool for meta-analytical data
- The explorative variable selection detected known associations
- Moderate predictability of ruminal \overline{pH}
- Additional consideration of milk parameters improves the modeling of \overline{pH}
- Clear signs for **protein** and **lactose** as indicators

Outlook

- Investigation of the influence of location for pH measurement
 - ventral sac of the rumen vs. reticulum
- Validation on data which were collected on 100 cows equipped with boluses on practical farms

Thank you for your attention!

This study was done within the project “Evaluation of Animal Welfare in Dairy Farming – Indicators for the Metabolism and Feeding” (**IndiKuh**)

Funding code: 2817905815

Gefördert durch:



Bundesministerium
für Ernährung
und Landwirtschaft

aufgrund eines Beschlusses
des Deutschen Bundestages





- [1]. <https://www.kisspng.com/png-holstein-friesian-cattle-dairy-cattle-sheep-livest-1183577/> [accessed August 20, 2018].
- Azur, M. J., E. A. Stuart, C. Frangakis, and P. J. Leaf. 2011. Multiple Imputation by Chained Equations: What is it and how does it work?. *Int. J. Meth. Psych. Res.*, 20(1):40–49.
- Borenstein, M., L. V. Hedges, J. P. T. Giggins, and H. R. Rothstein. 2009. *Introduction to Meta-Analysis*. Wiley, Chichester, UK.
- Enemark, J. M. D., Jørgensen, R. J., St. Enemark, P. (2002): Rumen acidosis with special emphasis on diagnostic aspects of subclinical rumen acidosis: A review, *Vet. Zootec. T.* 20(42): 16–29.
- Enemark, J. M. D.. 2008. The monitoring, prevention and treatment of sub-acute ruminal acidosis (SARA): A review. *Vet. J.* 176:32-43.
- Garrett, E. F., M. N. Perreira, K. V. Nordlund, L. E. Armentano, W. J. Goodger, and G. R. Oetzel. 1999. Diagnostic methods for the detection of subacute ruminal acidosis in dairy cows. *J. Dairy Sci.*, 82: 1170-1178.
- Nocek, J. E. 1997. Bovine acidosis: Implications on laminitis. *J. Dairy Sci.* 80:1005-1028.
- Nordlund, K. V., E. F. Garrett, and G. R. Oetzel. 1995. Herd-based rumenocentesis – a clinical approach to the diagnosis of subacute rumen acidosis. *Compend. Contin. Educ. Pract. Vet.* 17: 48-S56.
- Schwarzer, G., J. R. Carpenter, G. Rücker. 2015. *Meta-Analysis with R*. Springer, London, UK.
- Zebeli, Q., J. Dijkstra, M. Tafaj, H. Steingass, B. N. Ametaj, and W. Drochner. 2008. Modeling the adequacy of dietary fiber in dairy cows based on the responses of ruminal pH and milk fat production to composition of the diet. *J. Dairy Sci.* 91(5): 2046–2066.

Appendix



Variable selection for \overline{pH}

Predictors	Linear models			Linear mixed models		
	LM1	LM2	LM3	LMM1	LMM2	LMM3
Intercept	10.172	2.353	43.936	9.993	3.873	10.123
Protein	-0.389		-0.431	-0.457		-0.460
FPR				0.453		
Lactose	-0.615		-15.253	-0.639		-0.529
Lactose ²			1.565			
NEL		0.290			0.249	
EE		0.086			0.078	
ADF		0.027	0.027			
peNDF>8		0.077			0.063	0.049
(peNDF>8) ²		-0.002			-0.001	-0.001
NFC					-0.015	-0.015

Predictor groups

- Milk
- Diet
- Milk & diet

NEL = Net energy lactation, EE = Ether extract, ADF = Acid detergent fiber,
 peNDF>8 = physically effective neutral detergent fiber >8mm, NFC = Non fiber carbohydrates