

# Leveraging Mid-Infrared Milk Spectroscopy to Increase the Sustainability of Dairy Farms

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ICAR Annual Conference 2025, NDDB Anand, Gujarat, India, 1st April 2025.







If we want to understand and effectively manage sustainability, it requires a large amount of standardized data and measurements that accurately represent its complexity, diversity and evolution

... and ideally, these should not be too expensive





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# To estimate the quality of models -> Clustering based on RPD, RMSE and R<sup>2</sup>



Large-scale phenotyping in dairy sector using milk MIR spectra: Key factors affecting the quality of predictions

C. Grelet<sup>a</sup>, P. Dardenne<sup>a</sup>, H. Soyeurt<sup>b</sup>, J.A. Fernandez<sup>a</sup>, A. Vanlierde<sup>a</sup>, F. Steevens<sup>a</sup>, N. Gengler<sup>b</sup>, F. Dehareng<sup>a</sup>,\*

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# To estimate the quality of models -> Clustering based on RPD, RMSE and R<sup>2</sup>

Model quality	RPDcv	Relative RMSEcv	R <sup>2</sup> cv	Interpretation for application
1	+ 6	<5%	>0.97	Any application
2	4.2 - 6	<10%	>0.94	Quality control
3	3 - 4.2	<10%	>0.89	Quantitative screening
4	2 - 3	<25%	>0.74	Rought screening
5	1.5 - 2	<25%	>0.55	Allows to compare groups, discriminate high or low values
6	1.5 - 2	>25%	>0.55	Highly imprecise, can be used to detect extreme values
7	0 - 1.5	-	< 0.55	Not recommended

Grelet et al., 2021



# **Major components**

e.g: FAT, PROT, LACTOSE...



LEFIER ET AL.: JOURNAL OF AOAC INTERNATIONAL VOL. 79, No. 3, 1996 711

FOOD COMPOSITION AND ADDITIVES

### Determination of Fat, Protein, and Lactose in Raw Milk by Fourier Transform Infrared Spectroscopy and by Analysis with a Conventional Filter-Based Milk Analyzer

DOMINIQUE LEFIER, REMY GRAPPIN, and SYLVIE POCHET Institut National de la Recherche Agronomique, Station de Recherches en Technologie et Analyses Laitières, BP 89, 39801 Poligny Cedex, France

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# **Fatty acids**



J. Dairy Sci. 94:1657–1667 doi:10.3168/jds.2010-3408 © American Dairy Science Association<sup>®</sup>, 2011.

# Mid-infrared prediction of bovine milk fatty acids across multiple breeds, production systems, and countries

# H. Soyeurt,\*<sup>†1,2</sup> F. Dehareng,<sup>‡1</sup> N. Gengler,\*<sup>†</sup> S. McParland,§ E. Wall,<sup>‡</sup> D. P. Berry,§ M. Coffey,<sup>#</sup> and P. Dardenne<sup>‡</sup>

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	Groups of models		Predicted variable	Min	Max	Mean	SD 1	R <sup>2</sup> cv	Relative RMSEcv	RPDcv	Model quality
			Milk C4 (g/dL)	0.01	0.23	0.10	0.03	0.93	8%	3.67	3
			Milk C6 (g/dL)	0.01	0.16	0.07	0.02	0.91	9%	3.32	3
Fatty acids			Milk C8 (g/dL)	0.01	0.11	0.05	0.01	0.91	9%	3.29	3
			Milk C10 (g/dL)	0.02	0.32	0.11	0.04	0.91	9%	3.37	3
			Milk C12 (g/dL)	0.02	0.41	0.13	0.04	0.92	9%	3.62	3
			Milk C14 (g/dL)	0.05	1.20	0.45	0.13	0.93	7%	3.88	3
			Milk C14_1 (g/dL)	0.00	0.15	0.04	0.02	0.68	21%	1.78	5
			Milk C16 (g/dL)	0.12	3.32	1.20	0.40	0.94	8%	4.18	3
			Milk C16_1c (g/dL)	0.01	0.24	0.07	0.03	0.73	20%	1.91	5
			Milk C17 (g/dL)	0.00	0.09	0.03	0.01	0.80	13%	2.24	4
			Milk C18 (g/dL)	0.05	1.32	0.40	0.15	0.84	14%	2.51	4
			Milk C18_1cis9 (g/dL)	0.08	2.69	0.76	0.29	0.95	8%	4.35	2
			Milk C18_2c9c12 (g/dL)	0.00	0.17	0.06	0.02	0.72	19%	1.91	5
		CRA-W, Ulg, Teagasc,	Milk C18_2c9t11 (g/dL)	0.00	0.14	0.03	0.02	0.74	37%	1.95	6
		SRUC, FCEL, LKV-BW	Milk C18_3c9c12c15 (g/dL)	0.00	0.09	0.02	0.01	0.68	22%	1.77	5
	Milk Fatty acids	LKV-NRW, LUKE,	Milk Tot18_1cis (g/dL)	0.09	2.77	0.82	0.31	0.95	8%	4.58	2
		Valio, LKV-Austria	Milk Tot18_2 (g/dL)	0.01	0.32	0.10	0.03	0.69	15%	1.79	5
			Milk Total_C18_1 (g/dL)	0.10	2.98	0.94	0.33	0.96	7%	5.18	2
			Tot18_1trans (g/dL)	0.01	0.57	0.13	0.06	0.79	21%	2.17	4
> Nutritional du	uality		Milk Total_Trans (g/dL)	0.02	0.75	0.16	0.08	0.80	19%	2.26	4
	adity		Milk isoanteiso FA (g/dL)	0.02	0.28	0.09	0.03	0.75	14%	2.00	5
			Milk Odd fatty acids (g/dL)	0.03	0.50	0.16	0.04	0.83	10%	2.41	4
Physical prop	erties		Milk omega3 (g/dL)	0.00	0.11	0.03	0.01	0.66	22%	1.73	5
	CITICS		Milk omega6 (g/dL)	0.01	0.33	0.10	0.03	0.72	14%	1.89	5
			Milk SAT FA(g/dL)	0.31	6.9/	2.70	0.75	0.99	3%	10.22	1
Cow status hi	omarkers		Milk UNSAT (g/dL)	0.14	3.86	1.25	0.39	0.97	5%	5.75	2
	omarkers		Milk MONO FA (g/dL)	0.12	3.42	1.08	0.35	0.97	5%	5.83	2
			MIIK PUFA (g/dL)	0.02	0.53	0.16	0.05	0.77	13%	2.10	4
> Milk typicity			$\frac{1}{1} \frac{1}{1} \frac{1}$	0.05	0.80	0.35	0.10	0.95	/% 70/	5.88 4.52	3
			$M_{\text{HK}} = M_{\text{CEA}} \left( \frac{g}{dL} \right)$	0.19	4.19 5.10	1.39	0.32	0.93	/% 50/	4.52 5.52	2
			which with a (g/uL)	0.22	J.40	∠.00	0.00	0.91	J%0	5.55	2



### De novo Fatty acids synthesis

# Fatty acids



### Mixed and preformed Fatty acids synthesis



Source: Courtesy of M. Woolpert

# > Nutritional quality

- Physical properties
- Cow status biomarkers
- Milk typicity



#### J. Dairy Sci. 107:9504-9515 https://doi.org/10.3168/jds.2024-25034

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### Predicting subacute ruminal acidosis from milk mid-infrared estimated fatty acids and machine learning on Canadian commercial dairy herds

F. Huot,<sup>1,2,3</sup> S. Claveau,<sup>4</sup> A. Bunel,<sup>4</sup> D. Warner,<sup>5</sup> D. E. Santschi,<sup>5</sup> R. Gervais,<sup>1</sup>\* and E. R. Paquet<sup>1,2,3</sup>\* <sup>1</sup>Département des Sciences Animales, Université Laval, Québec, QC G1V 0A6, Canada <sup>2</sup>Institut Intelligence et Données, Université Laval, Québec, QC G1V 0A6, Canada <sup>3</sup>Centre de Recherche en Données Massives, Université Laval, Québec, QC G1V 0A6, Canada <sup>4</sup>Agrinova, Alma, QC G8B 7S8, Canada <sup>5</sup>Lactanet, Ste-Anne-de-Bellevue, QC H9X 3R4, Canada



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### De novo Fatty acids synthesis

# **Fatty acids**



Mixed and preformed Fatty acids synthesis



Source, Courtesy of M. Woo

# **Discrimination of the GRASS milk**

Nutritional quality

- > Physical properties
- Cow status biomarkers
- Milk typicity



Soyeurt et al., 2022



#### Article

Prediction of Indirect Indicators of a Grass-Based Diet by Milk Fourier Transform Mid-Infrared Spectroscopy to Assess the Feeding Typologies of Dairy Farms

Hélène Soyeurt <sup>1,\*</sup>, Cyprien Gerards <sup>1</sup>, Charles Nickmilder <sup>1</sup>, Jérôme Bindelle <sup>1</sup>, Sébastien Franceschini <sup>1</sup>, Frédéric Dehareng <sup>2</sup>, Didier Veselko <sup>3</sup>, Carlo Bertozzi <sup>4</sup>, Nicolas Gengler <sup>1</sup>, Antonino Marvuglia <sup>5</sup>, Alper Bayram <sup>5,6</sup> and Anthony Tedde <sup>1,7</sup>



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# Methane



*Hot topic*: Innovative lactation-stage-dependent prediction of methane emissions from milk mid-infrared spectra

A. Vanlierde,\*<sup>1</sup> M.-L. Vanrobays,†<sup>1</sup> F. Dehareng,\* E. Froidmont,‡ H. Soyeurt,† S. McParland,§ E. Lewis,§ M. H. Deighton,# F. Grandl,|| M. Kreuzer,|| B. Gredler,¶ P. Dardenne,\* and N. Gengler†<sup>2</sup>

Journal of the Science of Food and Agriculture



#### Research Article

Improving robustness and accuracy of predicted daily methane emissions of dairy cows using milk mid-infrared spectra

Amélie Vanlierde, Frédéric Dehareng 🔀 Nicolas Gengler, Eric Froidmont, Sinead McParland, Michael Kreuzer, Matthew Bell, Peter Lund, Cécile Martin, Björn Kuhla, Hélène Soyeurt

# Reference : SF6 & Respiratory chamber





# Methane Ref. analysis \_\_\_\_ Quality of precision the models





**Reference**:

**Sniffers** 

animal Volume 16, Issue 3, March 2022, 100469



animal Volume 18, Issue 7, July 2024, 101200

Combining short-term breath

measurements to develop methane

prediction equations from cow milk mid-

S. Fresco <sup>a b</sup>  $\stackrel{\diamond}{\sim}$   $\stackrel{\boxtimes}{\boxtimes}$  , A. Vanlierde <sup>c</sup>, D. Boichard <sup>b</sup>, R. Lefebvre <sup>b</sup>, M. Gaborit <sup>d</sup>, R. Bore <sup>e</sup>, S. Fritz <sup>a b</sup>,

### Predicting enteric methane emission in lactating Holsteins based on reference methane data collected by the GreenFeed system

R. Liu <sup>a b 1</sup>, D. Hailemariam <sup>a 1</sup>  $\stackrel{\circ}{\sim}$   $\stackrel{\boxtimes}{\simeq}$  , T. Yang <sup>a</sup>, F. Miglior <sup>c</sup>, F. Schenkel <sup>c</sup>, Z. Wang <sup>a</sup>, P. Stothard <sup>a</sup>, S. Zhang <sup>b</sup>, G. Plastow <sup>a</sup>



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infrared spectra

N. Genaler <sup>f</sup>, P. Martin <sup>b</sup>

### Predicting methane emissions of individual grazing dairy cows from spectral analyses of their milk samples

S. McParland, M. Frizzarin, B. Lahart, M. Kennedy, L. Shalloo, M. Egan, K. Starsmore, and D. P. Berry\* Teagasc, Animal & Grassland Research and Innovation Centre, Moorepark, Fermoy P61 P302, Co. Cork, Ireland

#### Smart Agricultural Technology 5 (2023) 100286

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Is it possible to predict the methane emission intensity of Swedish dairy cows from milk spectra?

S. Mohamad Salleh<sup>a,b,\*</sup>, C. Krongvist<sup>a</sup>, E. Detmann<sup>a,c</sup>, J. Karlsson<sup>a,d</sup>, R. Danielsson<sup>a</sup>



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**Reference**:

Greenfeed



# **Nitrogen Efficiency**





#### J. Dairy Sci. 103:4435–4445 https://doi.org/10.3168/jds.2019-17910

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# Potential of milk mid-infrared spectra to predict nitrogen use efficiency of individual dairy cows in early lactation

C. Grelet,<sup>1</sup> © E. Froidmont,<sup>1</sup> © L. Foldager,<sup>2,3</sup> © M. Salavati,<sup>4</sup>\* © M. Hostens,<sup>5</sup> C. P. Ferris,<sup>6</sup> © K. L. Ingvartsen,<sup>2</sup> © M. A. Crowe,<sup>7</sup> © M. T. Sorensen,<sup>2</sup> J. A. Fernandez Pierna,<sup>1</sup> A. Vanlierde,<sup>1</sup> © N. Gengler,<sup>8</sup> © GplusE Consortium,<sup>†</sup> and F. Dehareng<sup>1</sup> ‡ ©



Grelet et al., J. Dairy Sci. 103:4435–4445 (2020)

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# Health status Mastitis

### Reference $\rightarrow$ Elisa kits & fluorometric methods



• Lactoferrin (Soyeurt et al., 2020)

Groups of models		Predicted variable	Min	Max	Mean	SD	R <sup>2</sup> cv	Relative RMSEcv	RPDcv	Model quality
Lactoferrin	EMR/CRA-W/ULG	Lactoferrin (mg/L)	7	1248	299	222	0.66	44%	1.71	б

# • NAGase (quantitative & qualitative models; Grelet et al., 2024)

						Relative		Model
Predicted variable	Min	Max	Mean	SD	R²v	RMSEv	RPDv	quality
Milk NAGase (unit/L)	0	25.10	1.91	1.61	0.68	50%	1.98	6

See the presentation of Octave Christophe(Technical session 4)

*Prediction of mastitis via mid infrared analysis of milk : Validation through* 

experimental approach

Method	Sensitivity	Specificity	Accuracy
Optimized PLS-DA	85%	88%	88%



#### J. Dairy Sci. 107:1669–1684 https://doi.org/10.3168/jds.2023-23843 © 2024 The Authors: Published by Eleavier Inc. on behalf of the Ame

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kers in dairy cows through milk national collaborations

Vathes, <sup>4</sup> C. P. Ferris, <sup>5</sup> K. L. Ingvartsen, <sup>2</sup> C. Marchitelli, <sup>6</sup> F. Becker, <sup>7</sup> Auer, <sup>10</sup> A. Köck, <sup>11</sup> L. Dale, <sup>12</sup> J. Sölkner, <sup>13</sup> O. Christophe, <sup>1</sup> ndez Pierna, <sup>1</sup> H. Soyeurt, <sup>15</sup> M. Calmels, <sup>16</sup> R. Reding, <sup>17</sup> M. Gelé, <sup>18</sup> n,† and F. Dehareng<sup>1</sup>‡



# **Heat Stress**



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# Residual analysis for the identification of potential mid-infrared-derived biomarkers of heat stress in dairy cattle

Pauline Lemal,<sup>1</sup>\* <sup>(b)</sup> Clément Grelet,<sup>2</sup> <sup>(b)</sup> Frédéric Dehareng,<sup>2</sup> <sup>(b)</sup> Hélène Soyeurt,<sup>1</sup> <sup>(b)</sup> Martine Schroyen,<sup>1</sup> <sup>(b)</sup> and Nicolas Gengler<sup>1</sup> <sup>(b)</sup> <sup>1</sup>University of Liège, Gembloux Agro-Bio Tech (ULiège-GxABT), 5030 Gembloux, Belgium <sup>2</sup>Walloon Agricultural Research Center (CRA-W), 5030 Gembloux, Belgium

- Good biomarkers : protein %, Mg concentration
- Genetic evaluation : interest for MUFA, C18:1 cis-9 or citrate variations



# **Chronic stress**

valionie

**RA-W** 

herche



"stress is the non-specific response of the body to any demand made upon it" (Selye, 1976)



*Figure of General adaption syndrome (from A.C. Brown, C.I. Waslien, in Encyclopedia of Food Sciences and Nutrition (Second Edition), 2003)* 



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See the presentation of <u>Clément Grelet (Technical session 4)</u> Possibilities of rapid MIR analysis of milk to provide information on cow's welfare



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# **Chronic stress**

## **Cortisol discriminant models**

# Hair cortisol



#### **Cross validation** Low cortisol High cortisol Sensibility Specificity Accuracy Predicted Low 719 73 81% 77% **Predicted High** 59.4% 172 107 891 180 1071 **External-Herd-Validation** Low cortisol High cortisol Sensibility Specificity Accuracy Predicted Low 656 71 74% 71% Predicted High 109 60.6% 235 891 180 1071

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# **Chronic stress**

### **Blood fructosamine model**

### **Cross validation**

		Low	High				
		fructosamine	fructosamine		Sensibility	Specificity	Accuracy
	Predicted Low	513	58			75%	750/
	Predicted High	175	194	_	77.0%		1370
		688	252	940			
stress							

### **External-Herd-Validation**

	Low	High
	fructosamine	fructosamine
Predicted Low	467	77
Predicted High	221	175
	688	252



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# Blood fructosamine



# And many other models...

> related to the prediction of milk taste (lipolysis or free fatty acids)

- for predicting the ability to be processed into dairy products (ability to be transformed into cheese, butter, yogurt, etc.)
- in relation to the quality of the processed product (e.g., spreadability of butter)
- ➢ for protein composition
- > and many others, the list is long

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# **Objective and importance of MIR spectral standardization**

### Harmonization of spectra across instruments, labs, countries, continents

- Sharing of model
- Sharing of data (costly reference)



### Harmonization of spectra across time

- Useability of models in time
- Stability of predictions



### Harmonization of historical database

- Use of new models on historical spectra
- Power of big data
- Genetic evaluation





# Standardization of MIR instruments





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Standardization of milk mid-infrared spectrometers for the transfer and use of multiple models

C. Grelet,\* J. A. Fernández Pierna,\* P. Dardenne,\* H. Soyeurt,† A. Vanlierde,\* F. Colinet,† C. Bastin,‡ N. Gengler,† V. Baeten,\* and F. Dehareng\*1

# **Creation of historical spectral Database**



As all our models are built with standardized spectra, meaning they are directly compatible with these databases. This allows for many predictions to be directly accessible and potentially comparable to each other!





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# Take home messages



- If you are thinking about improving the sustainability of your dairy farms, think big and global! The factors and interrelations are numerous and complex to understand
- Milk is an excellent phenomics candidate !
- A multitude of parameters can be predicted based on its composition
- Anticipate! Unfortunately, spectral standardisation is not retroactive
- Collaborate as much as possible! By this way, you can share data (often very expensive), and create common models more robust



To our collaborators and supports !



Avec le soutien de la

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