

Milk biomarkers to detect ketosis and negative energy balance using MIR spectrometry



C. Grelet¹, C. Bastin², M. Gelé³, J.-B. Davière⁴, M. Johan⁴, A. Werner⁵, R. Reding⁶, C. Darimont¹, S. Baugnies⁷, J.A. Fernandez Pierna¹, F.G. Colinet², P. Dardenne¹, X.Massart⁷, N. Gengler², H. Soyeurt², F. Dehareng¹

Negative energy balance and ketosis

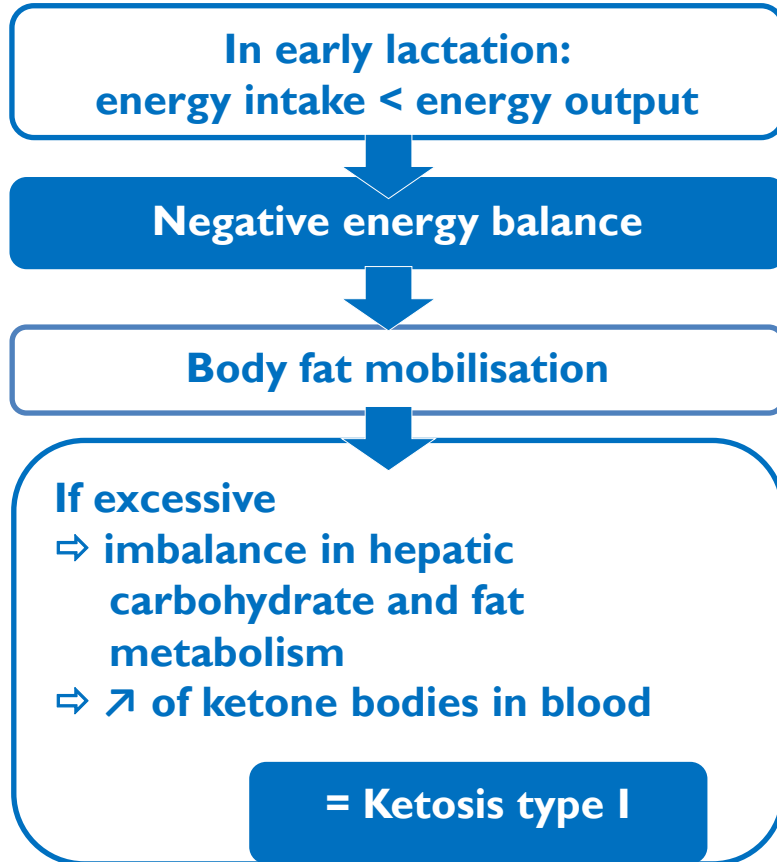
In early lactation:
energy intake < energy output

Negative energy balance

↘ fertility
↘ health

(Collard et al., 2000;
Butler, 2003)

Negative energy balance and ketosis



↘ fertility

↘ health

(Collard et al., 2000;
Butler, 2003)

Prevalence : 7 to 43% (Suthar et al., 2013)

↘ milk yield

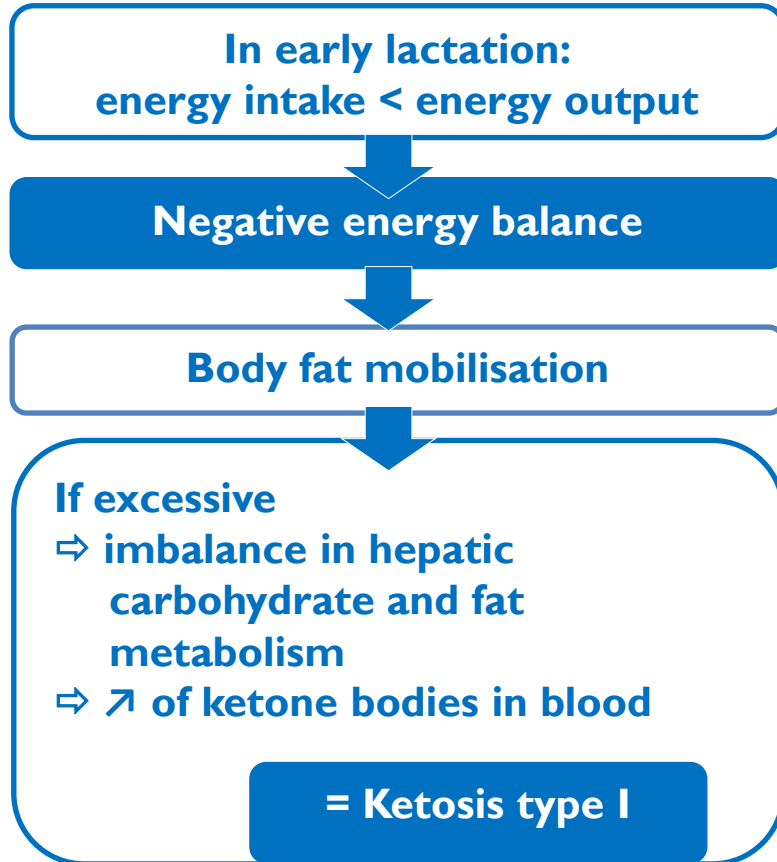
↘ reproductive performances

↗ displaced abomasum

...

(Duffield, 2000)

Negative energy balance and ketosis



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↘ health

(Collard et al., 2000;
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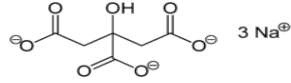
(Duffield, 2000)

**BHB and
Acetone known
as biomarkers**

(Enjalbert et al., 2001)

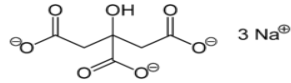
Citrate ?

- Krebs cycle molecule
- Present in milk



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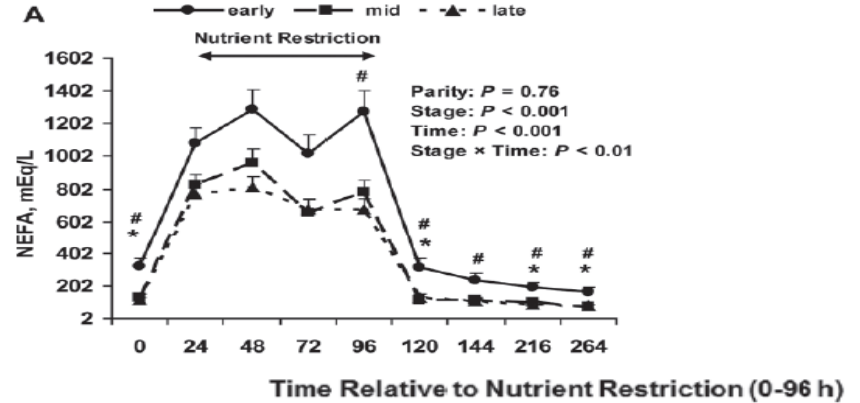
J. Dairy Sci. 95:2362–2380
<http://dx.doi.org/10.3168/jds.2011-4419>
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Metabolic and production profiles of dairy cows in response to decreased nutrient density to increase physiological imbalance at different stages of lactation

V. Bjerre-Harpoth,* N. C. Friggens,*†‡ V. M. Thorup,* T. Larsen,* B. M. Damgaard,* K. L. Ingvarsen,* and K. M. Moves*¹

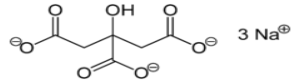
Induced nutrient restriction

NEFAs in blood



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- Present in milk



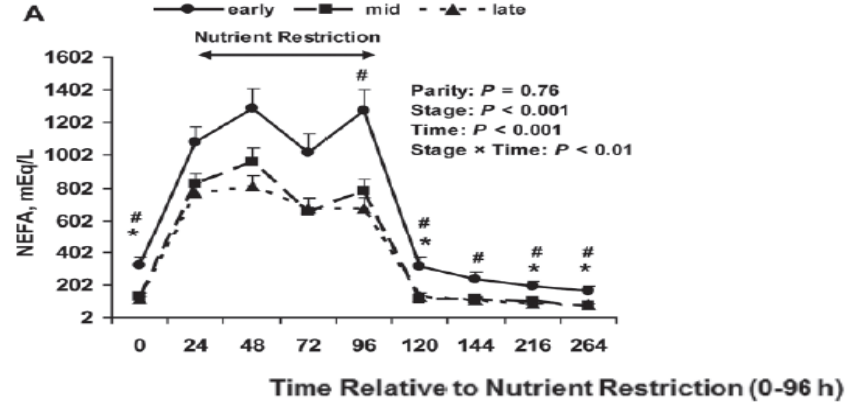
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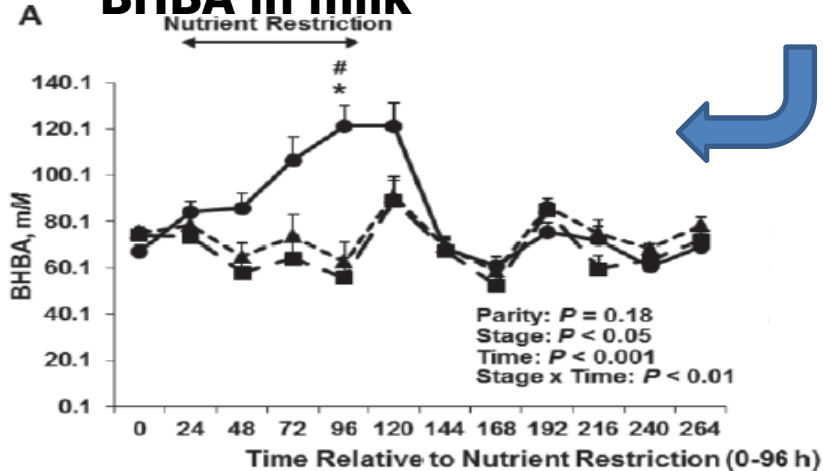
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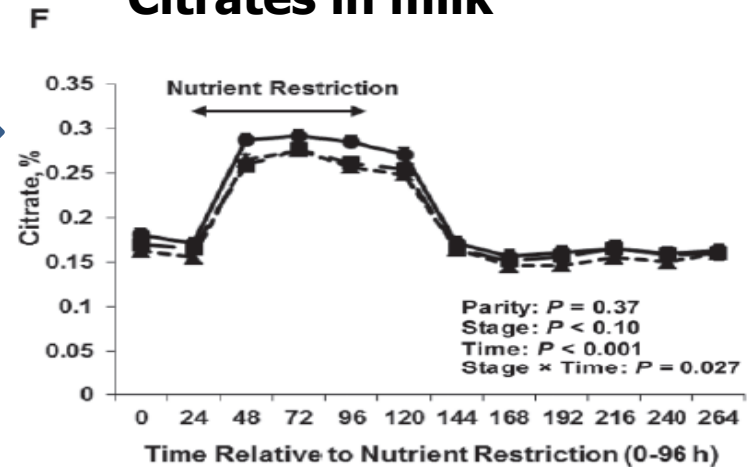
NEFAs in blood



BHBA in milk



Citrates in milk

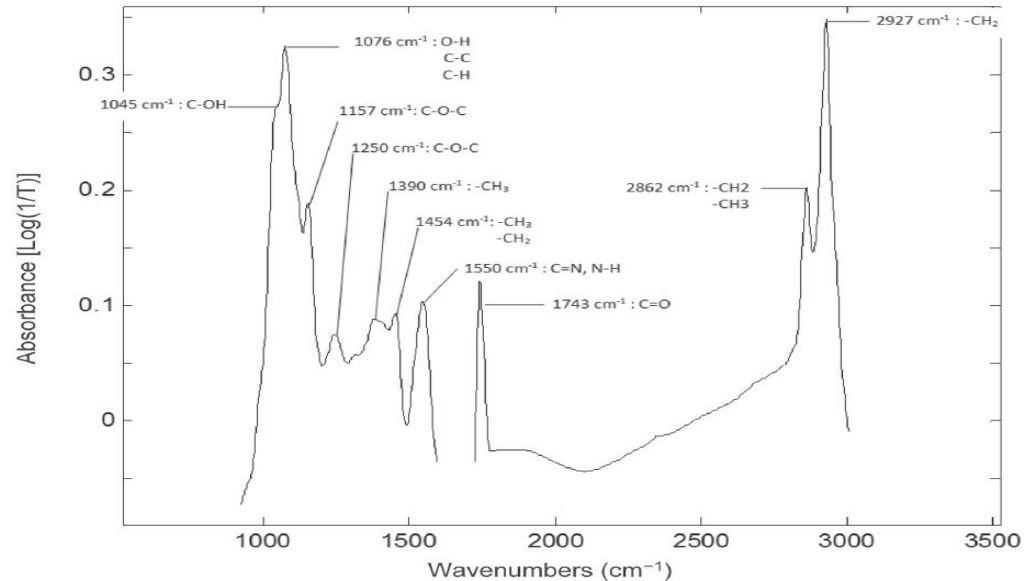


Citrate ?

- Bjerre-Harpoth (2012)
 - « ...*greatest increase (58%) during restriction for all cows* »
 - « ...*promising early indicator of physiological imbalance* »
- Baticz et al. (2002)
 - « *Sodium citrate should be measured by easy and automated method such as FT-MIR technology to evaluate the energy status of cows* »

Mid Infra Red (MIR)

- MIR spectrum reflect milk composition
- World-wide used for milk recording, payment
- Fast, cheap
- 1 sample → X predicted values
 - Fatty acids
 - Minerals
 - Methane
 - Cows state
 - Technical properties
 - ...
- Limit of detection : 100 ppm (Dardenne, 2015)



Previous studies in link with MIR



Acetone: ketosis biomarker

			Calibration			Cross validation			Validation		
		Reference method	N	RMSE	R ²	SECV	RMSE	R ²	N	RMSE	R ²
Hansen	1999	Vanilin test	302	-	-	-	0.240	0.80	58	0.270	0.81
Heuer	2001	Gas chromatography	180	-	-	0.210	-	-	-	-	-
De Roos	2007	Continuous flow analyser	1063	-	-	0.184	-	0.72	-	-	-
Hanus	2011	Microdiffusion photometric	14	-	0.65	-	-	-	-	-	-
Hanus	2014	Microdiffusion photometric	89	-	0.39	-	-	-	-	-	-

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BHB: ketosis biomarker

			Calibration			Cross validation			Validation		
		Reference method	N	RMSE	R ²	SECV	RMSE	R ²	N	RMSE	R ²
De Roos	2007	Continuous flow analyser	1069	-	-	0.065	-	0.63	-	-	-

Previous studies in link with MIR



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Citrate: energy status of cow/physiological imbalance

- **Not very well documented, no target values or thresholds in the literature**
- **No published MIR calibration (existing FOSS calibration)**

Goals of the study

In early lactation:
energy intake < energy output

Negative energy balance

Body fat mobilisation

If excessive

⇒ imbalance in hepatic carbohydrate and fat
metabolism

⇒ ↑ of ketone bodies in blood

= Ketosis type I

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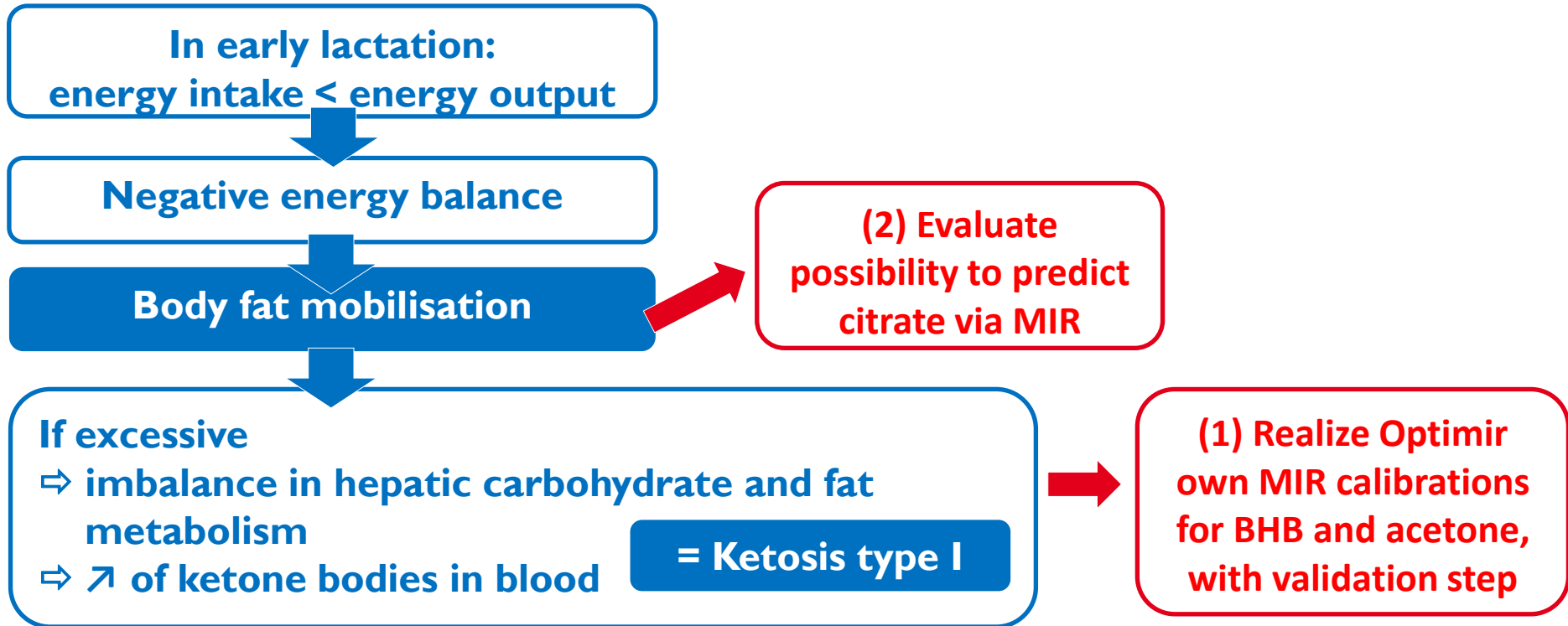
⇒ imbalance in hepatic carbohydrate and fat metabolism

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= Ketosis type I

(1) Realize Optimir own MIR calibrations for BHB and acetone, with validation step

Goals of the study



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Body fat mobilisation



If excessive
⇒ imbalance in hepatic carbohydrate and fat metabolism
⇒ ↑ of ketone bodies in blood

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(2) Evaluate possibility to predict citrate via MIR

(3) Use samples and spectra from several countries
→ robust equations



(1) Realize Optimir own MIR calibrations for BHB and acetone, with validation step

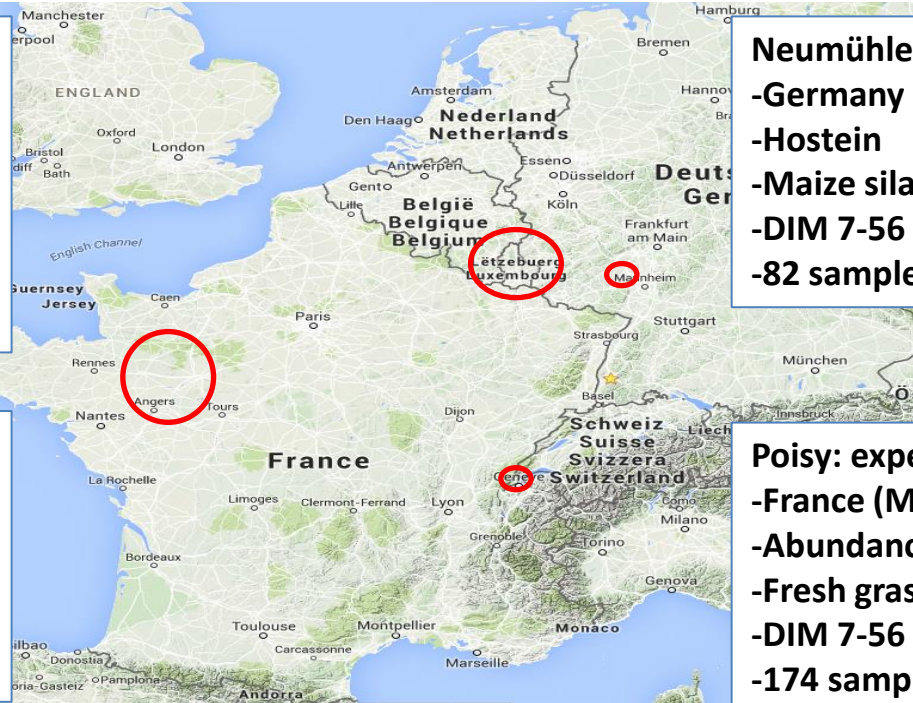
Collect of samples

Convis: MRO

- Luxembourg
- Hostein
- Maize silage supplemented by grazing in summer
- DIM 5-60
- 110 samples

CLASEL: MRO

- France
- Hostein and Normande
- Maize silage or fresh grass
- DIM 7-305
- 200 samples



Neumühle: experimental farm

- Germany
- Hostein
- Maize silage
- DIM 7-56
- 82 samples

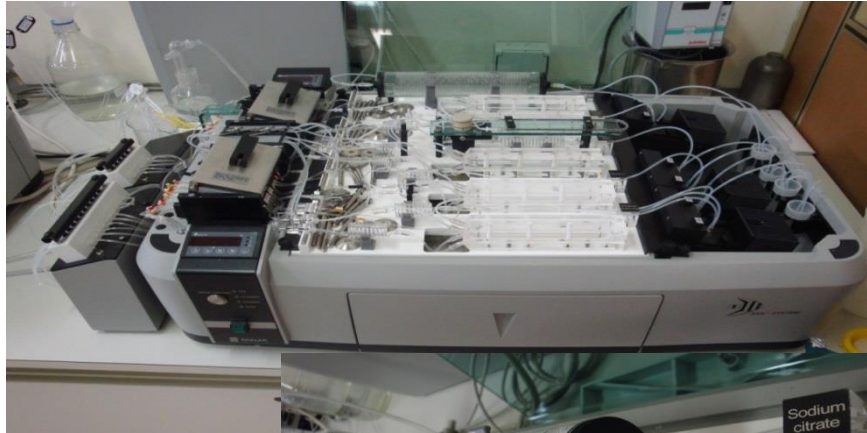
Poisy: experimental farm

- France (Mountain area)
- Abundance and Montbéliarde
- Fresh grass or hay and maize silage
- DIM 7-56
- 174 samples

- Harmonized protocol by IDELE
- ICAR approved sampling systems
- Morning and evening samples pooled
- 566 * 2 identical samples generated → MIR and chemical analysis

Analysis of samples

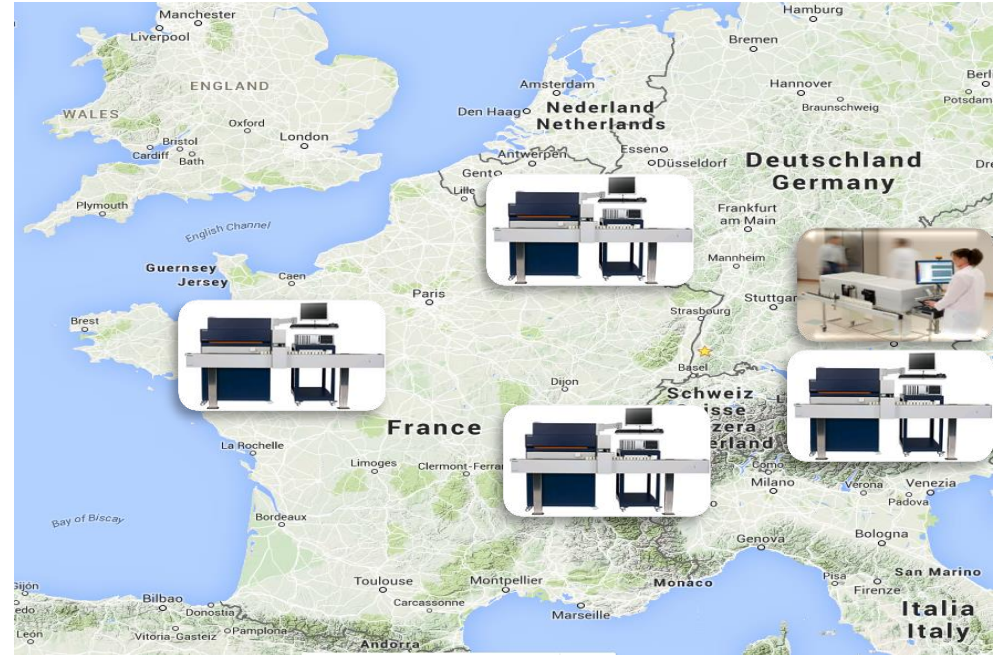
- Chemical analysis at CRA-W (Belgium)
- Continuous flow analyzer (Skalar, The Netherlands)
- Enzymatic/chemical reactions



Analysis of samples

- Chemical analysis at CRA-W (Belgium)
- Continuous flow analyzer (Skalar, The Netherlands)
- Enzymatic/chemical reactions

- Spectral analysis locally
- Foss and Bentley
- **Standardization of spectra enabling a common database and a common use**



Results of chemical analysis



- 566 samples in total
- Removing of missing values
- Same ranges than literature (Denis-Robichaud et al., 2014; Garnsworthy et al., 2006)

Component	Unit	N	Min	Max	Mean	SD	SEL
BHB	mmol/L	558	0.045	1.596	0.215	0.174	0.005
Acetone	mmol/L	548	0.02	3.355	0.103	0.26	0.006
Socium citrate	mmol/L	506	3.88	16.12	9.04	2.21	0.216

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- Limit of detection with MIR: 100 ppm

	Concentration (mmol/L)	Molar mass (g/mol)	Concentration (ppm)	
BHB	0.215	104.10	21.7	→ Indirect prediction
Acetone	0.103	58.08	5.8	→ Indirect prediction
Trisodium Citrate	9.03	258.07	2262.5	→ Potential for calibration

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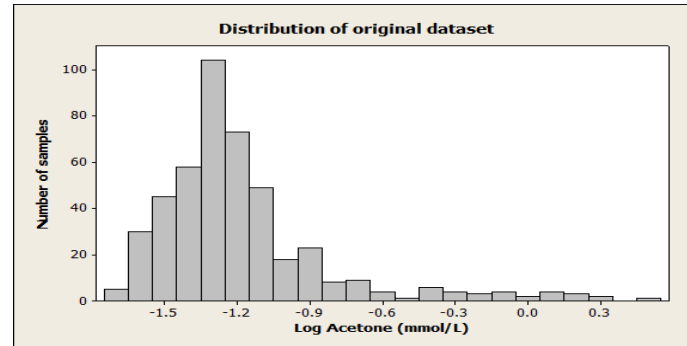
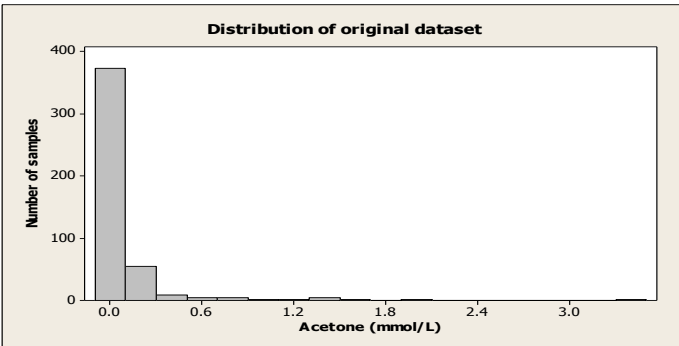
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	Concentration (mmol/L)	Molar mass (g/mol)
BHB	0.215	104.10
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Trisodium Citrate	9.03	258.07

Concentration (ppm)	
21.7	→ Indirect prediction
5.8	→ Indirect prediction
2262.5	→ Potential for calibration

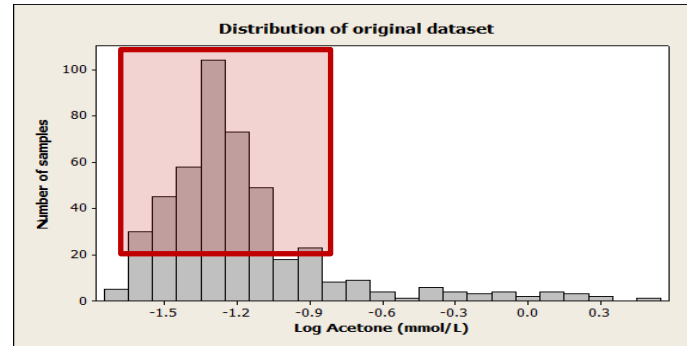
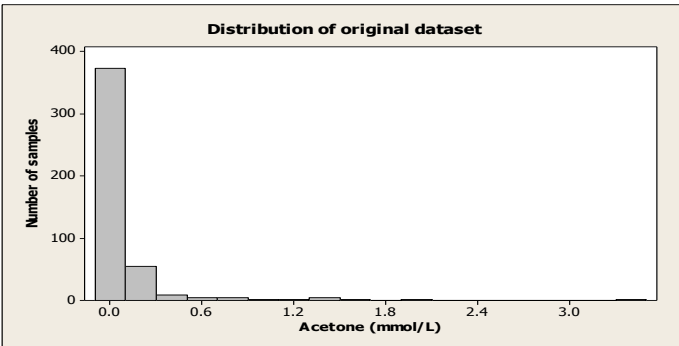
Editing of data

- Unbalanced distribution for BHB and Acetone
→ Use of Log (10) transformation



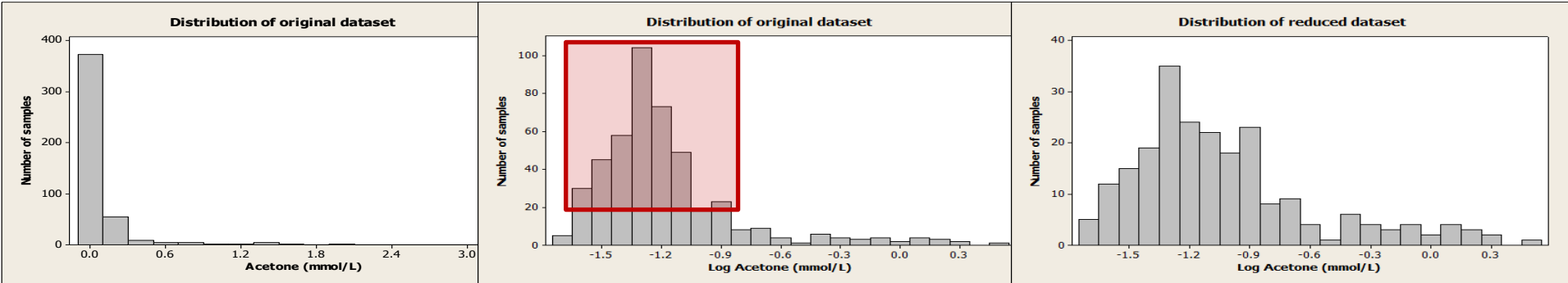
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Editing of data

- **Unbalanced distribution for BHB and Acetone**
 - Use of Log (10) transformation
 - Artificial removing of low values (randomly)



558 → 433 samples for BHB

548 → 224 samples for acetone

MIR calibrations



- **Spectral pretreatment:**

Absorbance, Standardized, First derivative gap 5, Autoscale

Area used : 968.1 - 1577.5, 1731.8 - 1762.6, 1781.9 - 1808.9 and 2831.0 - 2966.0 cm^{-1}

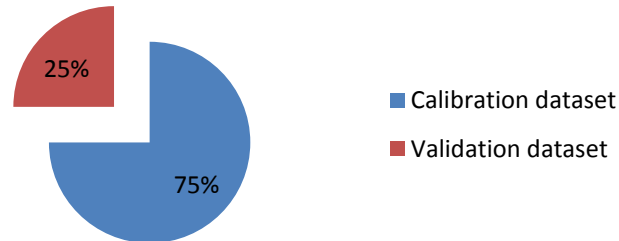
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- **Partial Least Square (PLS) regression**
- **Cross-validation using 10 subsets**
- **Validation $\frac{3}{4}$ - $\frac{1}{4}$**



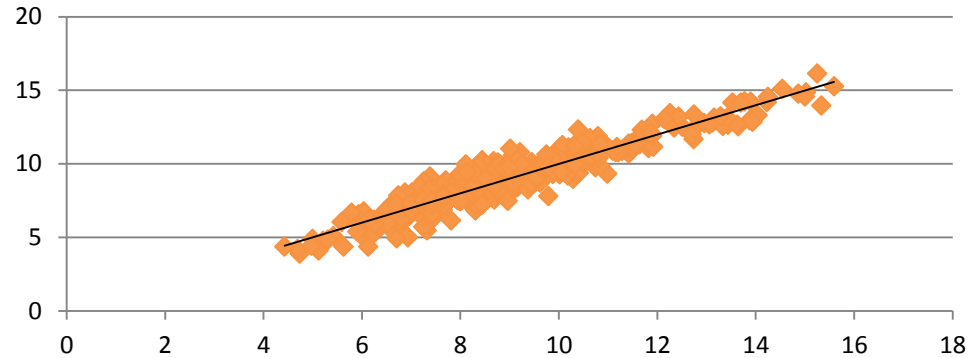
- **Use of Matlab and the PLS toolbox**

MIR calibrations

- Criteria observed

- R^2 (but dependent of the range)
- RMSE (Root Mean Square Error)

$$\text{RMSE} = \sqrt{\frac{\sum_{i=1}^n |\varepsilon_i|^2}{n}}$$

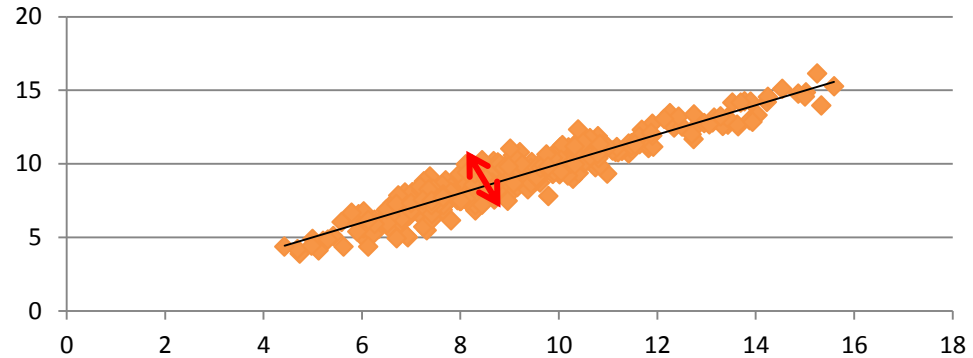


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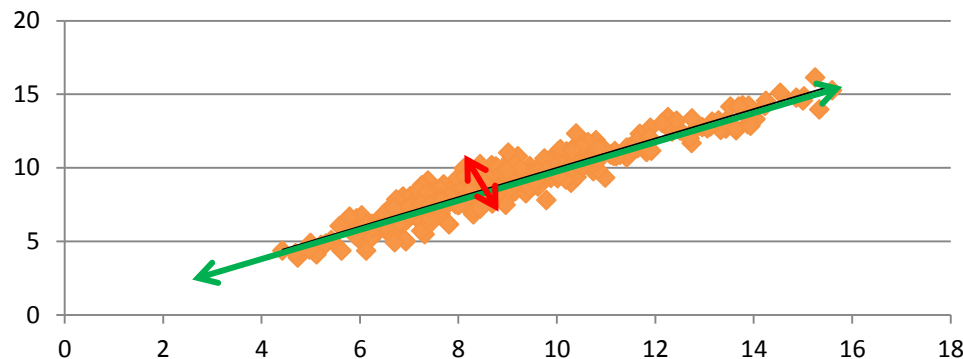
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- $\text{RPD} = \text{SD (calibration)} / \text{RMSE}$ 



RPD	Class	Application	Symbol
0	2	Very poor Allows to compare groups of cows, distinguish high or low values	-
2	3	Poor Rough screening	0
3	5	Fair Screening	+
5	6.5	Good Quality control	++
6.5	+	Excellent As precise as reference value	+++

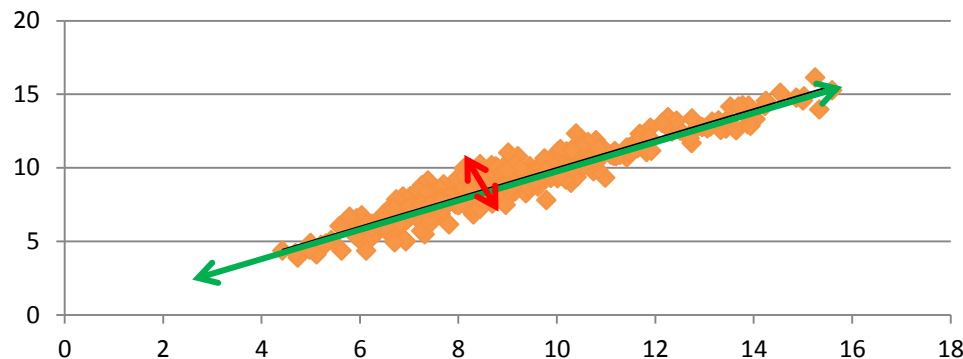
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- $RPD = SD \text{ (calibration)} / RMSE$ ↕↗



Classification

- 0.20 mmol/L for BHB
- 0.15 mmol/L for acetone

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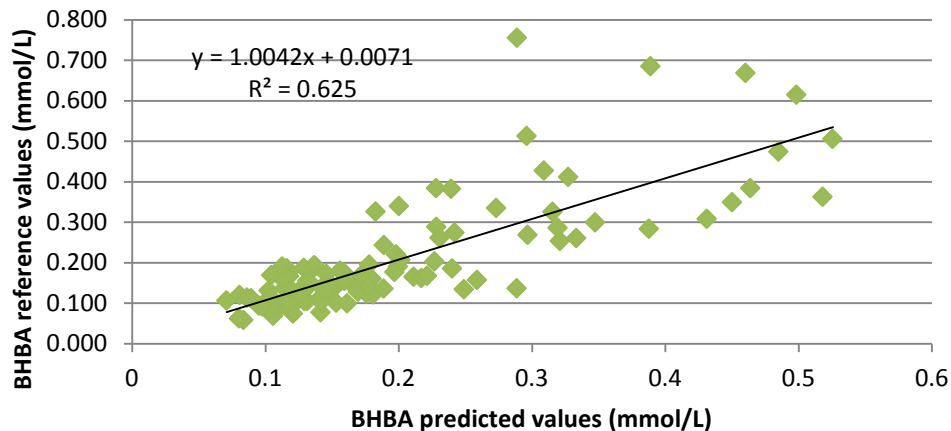
Results – BHB



- Statistics

Item	N	No. of LV	No. of Outliers	Min	Max	Mean	SD	RMSE	R ²	RPD
BHB (mmol/L)										
Cross-validation	325	8	7	0.045	1.596	0.235	0.193	0.109	0.71	1.77
Validation	108	-	-	0.058	0.755	0.204	0.136	0.083	0.63	2.36

Validation dataset



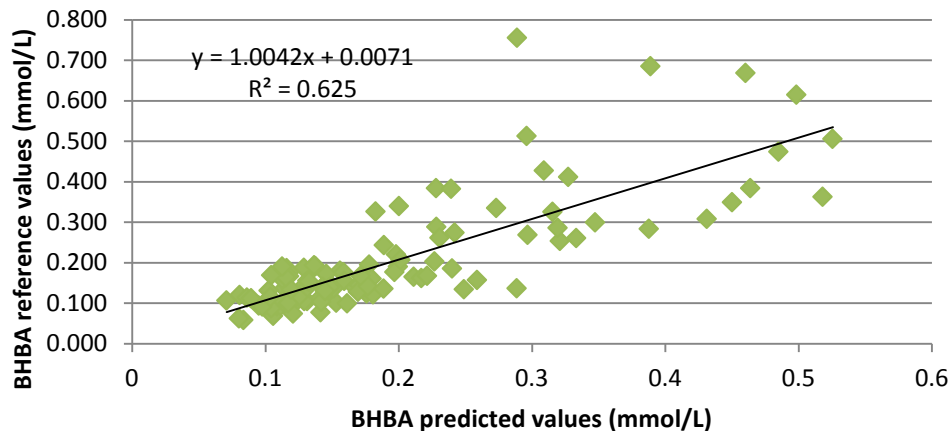
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Allows discriminate high or low levels

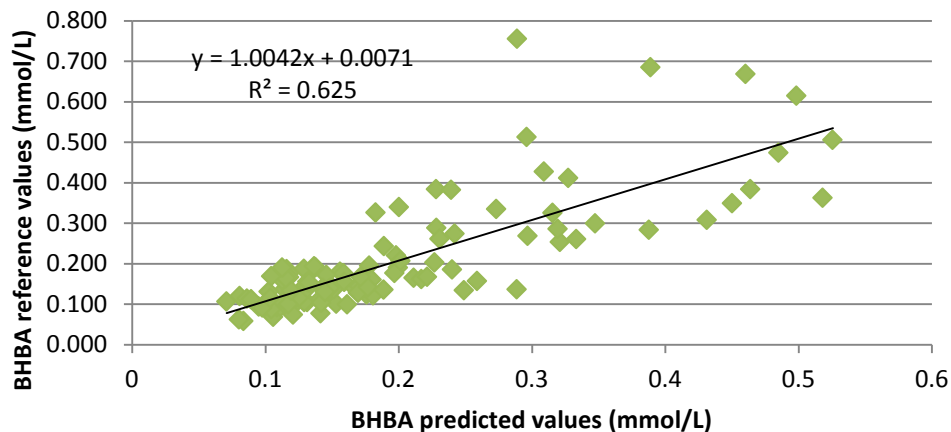
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Validation dataset



	Low BHB content (<0.200mmol/l)	High BHB content (>0.200mmol/l)	Global good classification
Validation	n=77	n=32	
Predicted low	90.90%	9.40%	90.80%
Predicted high	9.10%	90.60%	

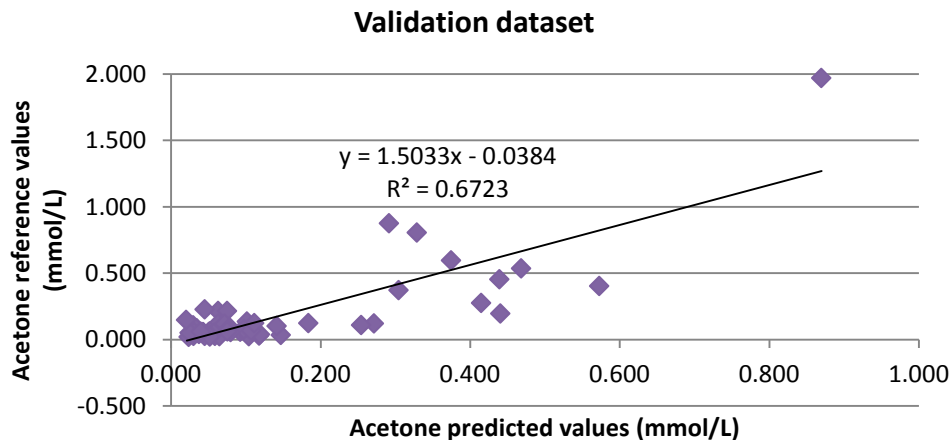
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Results – Acetone



- Statistics

Item	N	No. of LV	No. of Outliers	Min	Max	Mean	SD	RMSE	R ²	RPD
Acetone (mmol/L)										
Cross-validation	168	7	2	0.02	3.355	0.19	0.397	0.248	0.73	1.6
Validation	56	-	-	0.021	1.968	0.179	0.306	0.196	0.67	2.03

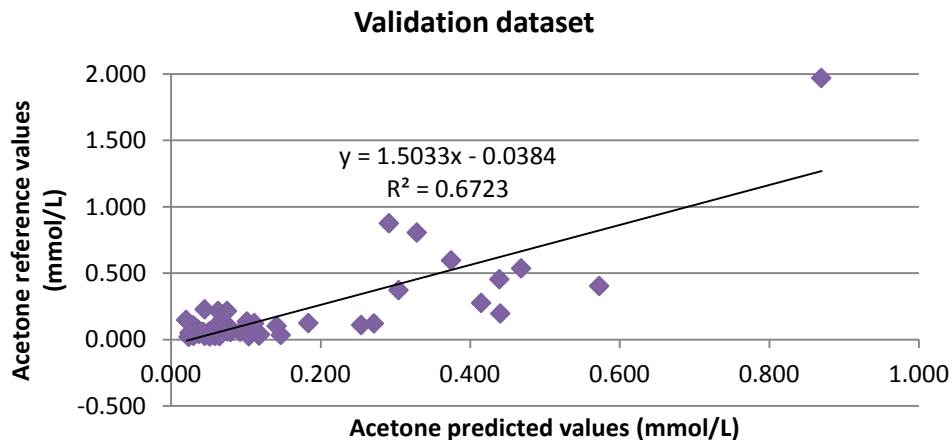


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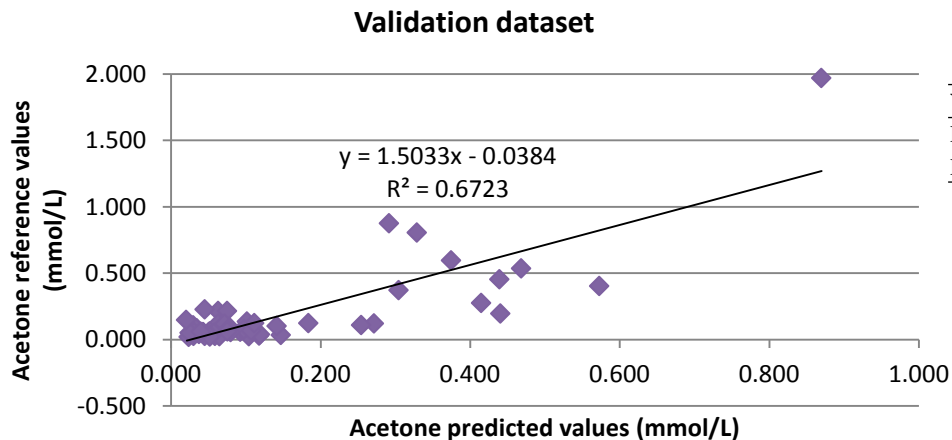
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	Low acetone content (<0.150mmol/l)	High acetone content (>0.150mmol/l)	Global good classification
Validation	n=43	n=13	
Predicted low	93.00%	23.10%	89.30%
Predicted high	7.00%	76.90%	

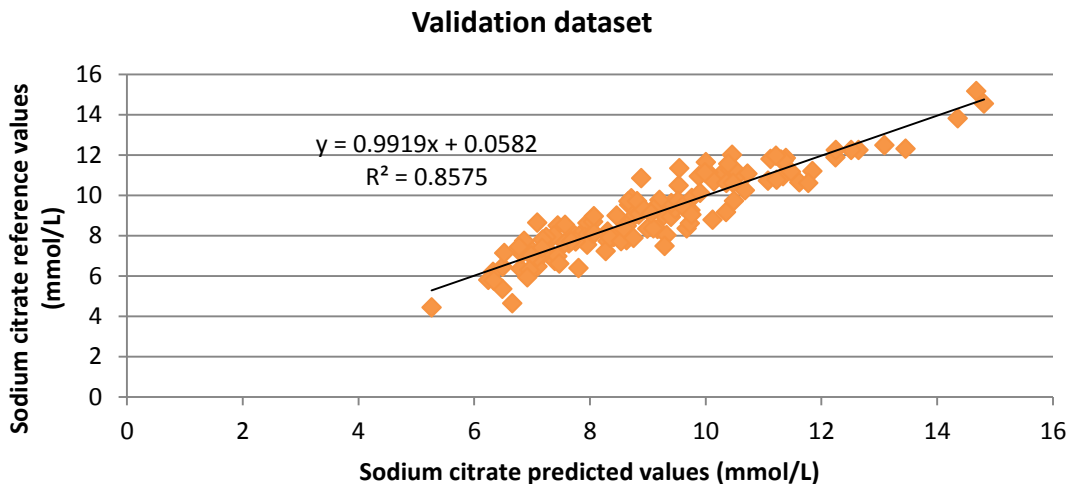
Allows discriminate high or low levels

Results – Citrate



- Statistics

Item	N	No. of LV	No. of Outliers	Min	Max	Mean	SD	RMSE	R ²	RPD
Sodium citrate (mmol/L)										
Cross-validation	380	9	2	3.88	16.12	9.03	2.26	0.7	0.9	3.21
Validation	126	-	-	4.44	15.16	9.08	2.03	0.76	0.86	2.96

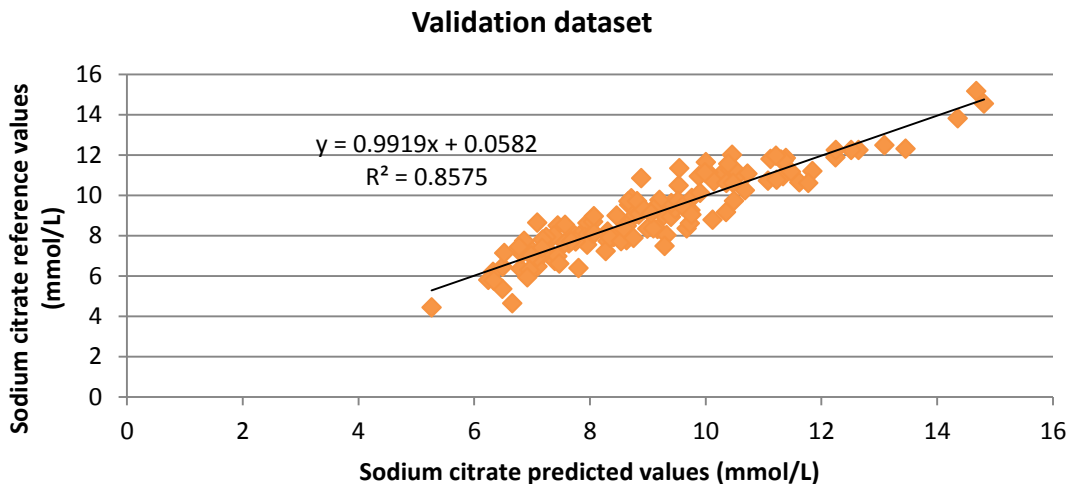


Results – Citrate



- Statistics

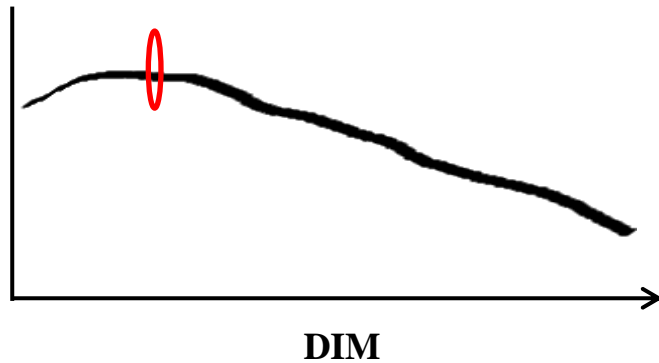
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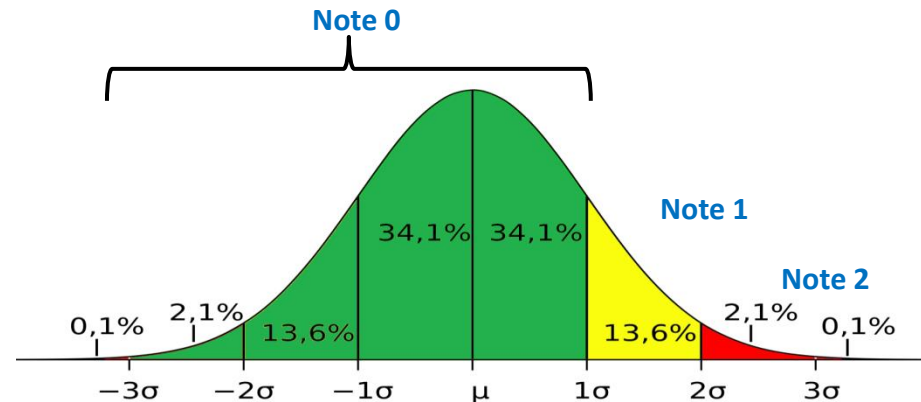
Allows screening,
quantitative information

Exemple of use by MROs (Baugnies, 2015)

- Walloon breeding association (AWE) tool
- BHB, acetone, citrate, C18:1 cis 9
- Relative approach
- Cow value compared to population values at same DIM



- Score 0,1 or 2 for each component



Exemple of use by MROs (Baugnies, 2015)



- Global score from 0 to 8 as a global approach of metabolic disorders

Exploitation	DATE CTRL	n° animal	n° lactation	JEL	Production (dl)	Cellules (*1000/mL)	Urée (mg/L)	Rapport TB/TP	Indice BHB	Indice acétone	Indice citrate	Indice c18:1cis9	Indice GLOBAL
A	17/02/2014	15146978	1	15	294	760	30	1.67	2	1	1	1	5
A	15/04/2014	14876705	2	59	376	400	179	1.36	0	2	0	1	3
A	18/11/2014	15012953	2	69	237	280	179	0.46					
A	16/12/2014	13904979	4	7	167	560	350	2.54	2	2	0	2	6
B	26/02/2014	15676607	1	115	275	10	290	1.12	2	0	2	1	5
B	23/05/2014	14022741	3	268	128	360	170	0.93	1	2	0	1	4
B	4/11/2014	14921815	2	212	203	60	310	1.39	2	0	2	0	4
C	9/08/2012	15180867	1	387	152	120	350	1.21	1	0	1	1	3
C	8/11/2012	15180793	5	11	258	300	50	1.59	2	2	1	2	7
C	6/04/2013	15180840	4	12	110	40	240	1.86	1	1	0	2	4
C	6/10/2013	14090385	3	14	226	560	170	1.75	1	1	1	2	5

- Complex interpretation (ketosis, fat mobilization, fattening, feed effect, mastitis...)
- Preliminary tests in 4 farms
- Good feedback from breeders
- → Cows to follow

Conclusions/Implications



- Calibrations for BHB and acetone → distinctions between high and low levels
- Citrate by MIR → good accuracy
- Standardisation of spectra: usable by all Optimir MROs

Conclusions/Implications



- Calibrations for BHB and acetone → **distinctions between high and low levels**
- Citrate by MIR → **good accuracy**
- Standardisation of spectra: **usable by all Optimir MROs**

- **USE ON FIELD**
 - **Complex interpretation**
 - **Different way to use it by MROs**
 - **Interest from breeders**
 - **Already used in France and Luxembourg**
 - **Tests in Germany, Belgium**

Thank you for your attention



C. Grelet, C. Bastin, M. Gelé, J.-B. Davière, M. Johan, A. Werner, R. Reding, C. Darimont, S. Baugnies, J.A. Fernandez Pierna, F.G. Colinet, P. Dardenne, N. Gengler, H. Soyeurt, F. Dehareng

c.grelet@cra.wallonie.be