

# Genetic and Environmental Info in goat milk FTIR spectra

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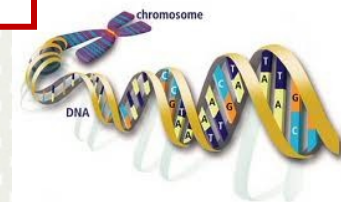
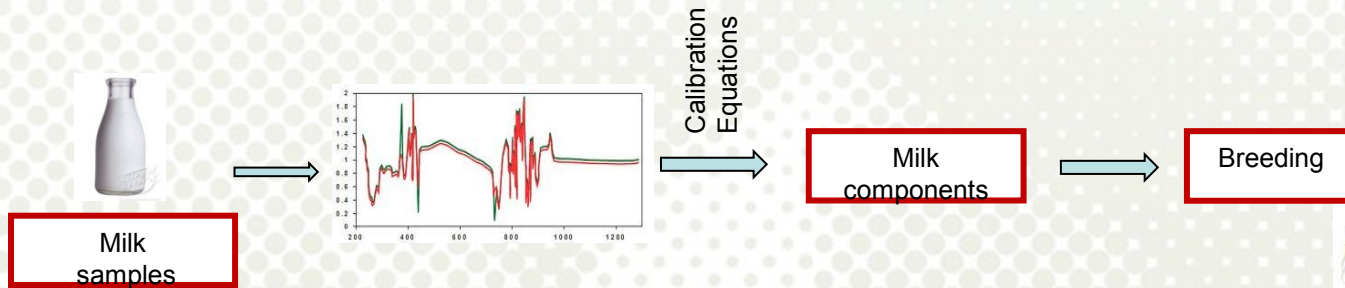
## Outline

- Background
  - Milk composition
  - Infrared (IR) spectroscopy
  - Objectives
- Methods
- Results
- Conclusion

# Background



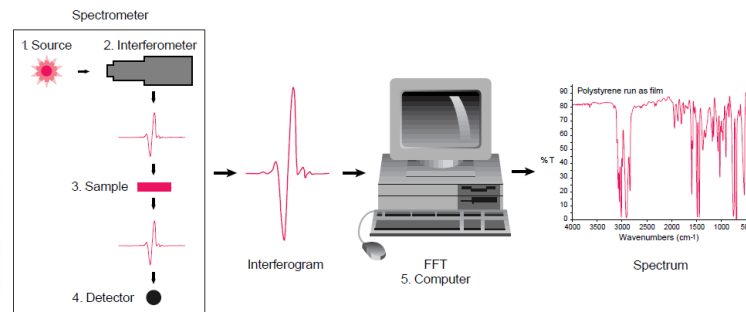
- Milk is a complex mixture of several thousand kinds of bio-molecules
  - In the current animal breeding programs, **only few major milk components** are included
  - Fat %, protein %, lactose %, SCC, FFA, etc
- Infrared (IR) spectrometry is used
  - Rapid method (chemical analysis are **time** and **labor** intensive)



# Infrared (IR) spectra

- **Fourier Transform Infrared (FTIR)**

- ❖ Improve signal to noise ratio
- ❖ Multiplexing capabilities
- ❖ Higher energy throughput



- Genetic variability of **cow milk** based on MIR spectra (*Soyeurt et al., 2010*)
- Genetic variability of **goat milk FTIR spectra** have not been studied
  - Some regions are **indirectly** known

## Objective:

Direct estimation of genetic and environmental variability of goat milk FTIR spectra



## Materials and Methods

- **Raw FTIR Spectra data**

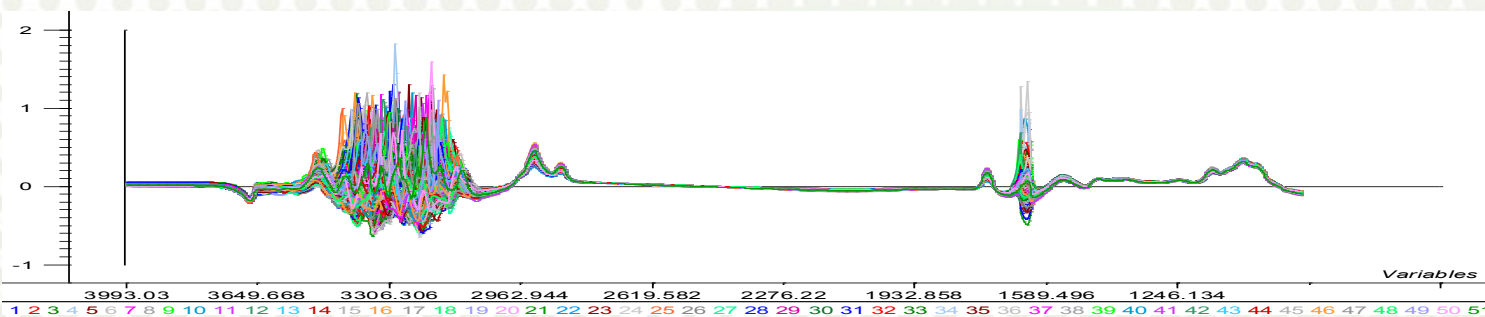
- TINE (Norwegian dairies) has four D-labs performing routine FTIR analysis on **milk samples**
- Raw FTIR spectra are stored since 2007 in a database

- **For this study:** :

- Two years (2007 and 2008)
- Total of **73,858** observations
  - **28,269** goats
  - **271** farms



CombiFoss™ FT

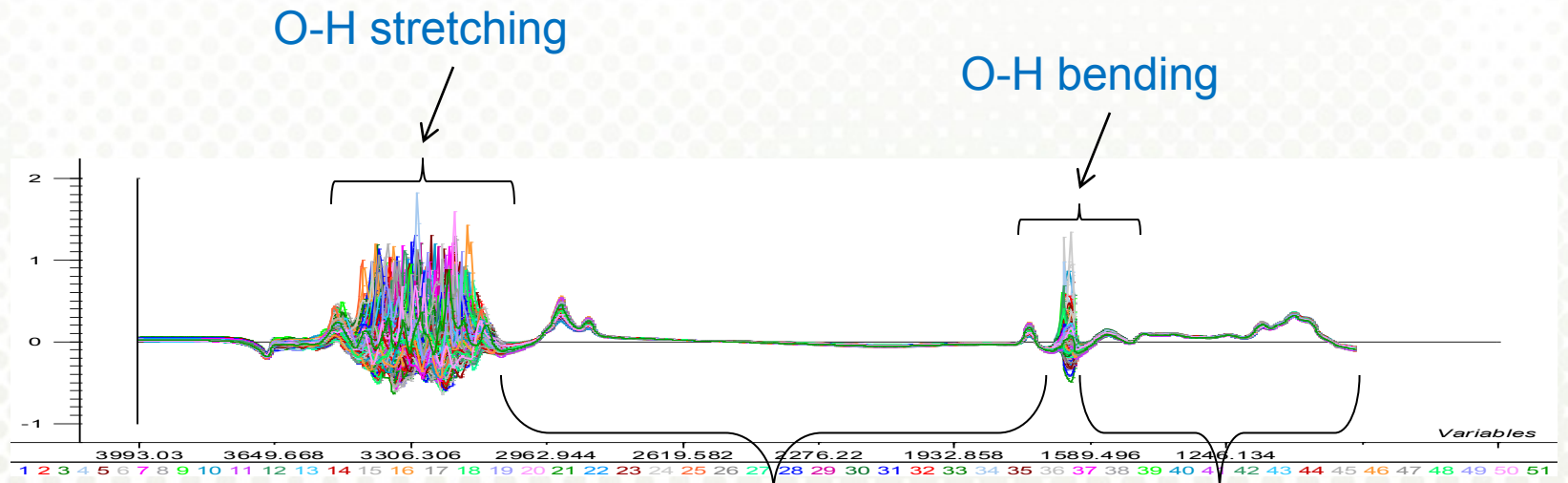


# Cont...

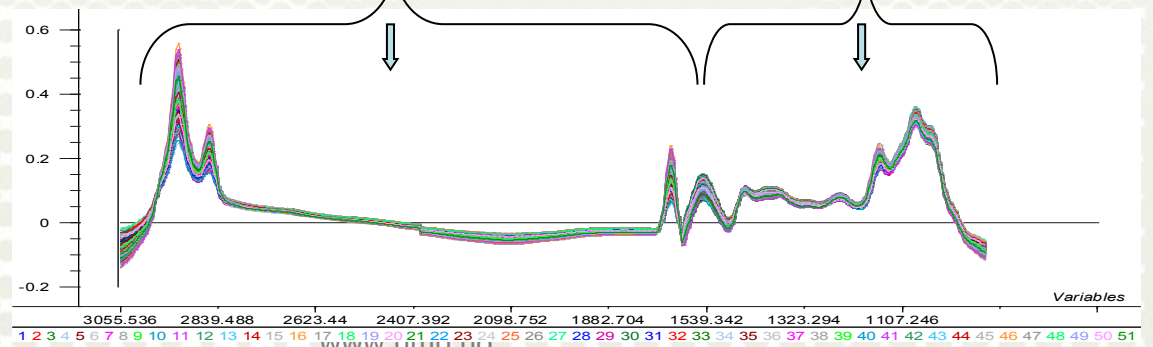
- Selection of FTIR spectra

- O-H bending region (between 1600cm<sup>-1</sup> and 1700 cm<sup>-1</sup>)
- O-H stretching region (between 3025 cm<sup>-1</sup> and 3500 cm<sup>-1</sup>)

Low signal to noise ratio



536 removed  
524 selected



## Cont ...

- **Limitations ...**

- Simultaneous genetic analysis of selected spectra data points is not possible with the current methods available for genetic analysis

e.g. DMU 31, WOMBAT 42, ASReml 21 traits, ...

- **Two step analysis performed**

- **Dimension (trait) reduction**
  - Principal component analysis (PCA)
- **Genetic analysis**
  - Mixed model

## Cont ...

- **Principal component analysis (PCA)**

**Goal:** to extract a set of fewer components that explain as much variation as possible of the original variation

$$Y = TP' + F$$

- **Y** are the FTIR spectral data
- **T** is score matrix
- **P** is loading matrix
- **F** is error term

- **PROC PRINCOMP** in SAS (SAS Institute, 1994)
  - On correlation matrix of Y
  - Scores, T, are considered as new traits → **PC traits**

- **Pre-correction**

- PC traits T corrected for:
  - farm region (12 levels)
  - kidding season (3 levels)
  - lactation stage (4 co-variables)
  - age at kidding (5 levels)
  - lactation number (3 levels)



# Methods Cont...

## Model

- Multi-trait linear mixed model on pre-corrected PC traits

$$\mathbf{t}_c = \mathbf{X}\mathbf{b} + \mathbf{Z}\mathbf{a} + \mathbf{Q}\mathbf{p} + \mathbf{W}\mathbf{h} + \mathbf{e}$$

- $\mathbf{t}_c$  is the vector of **pre-corrected PC traits**
- $\mathbf{b}$  is the vector of **fixed** effect (HTY and HTM)
- $\mathbf{a}$  is the vector of **additive genetic** effect
- $\mathbf{p}$  is the vector of **permanent environment** effect
- $\mathbf{h}$  is the vector of **random herd-test-day (HTDr)** effect
- $\mathbf{e}$  is the vector of **random residual** effect
  
- $\mathbf{X}$ ,  $\mathbf{Z}$ ,  $\mathbf{Q}$ , and  $\mathbf{W}$  are the corresponding design matrices

- AI-REML of WOMBAT (*Meyer, 2007*)

## Results and Discussion

- **PCA**

- Resulted in **8 PCs** which explain  $\sim 99\%$  of the total spectral variation
- The dramatic reduction of the number of components suggests there is high correlation among spectral variables

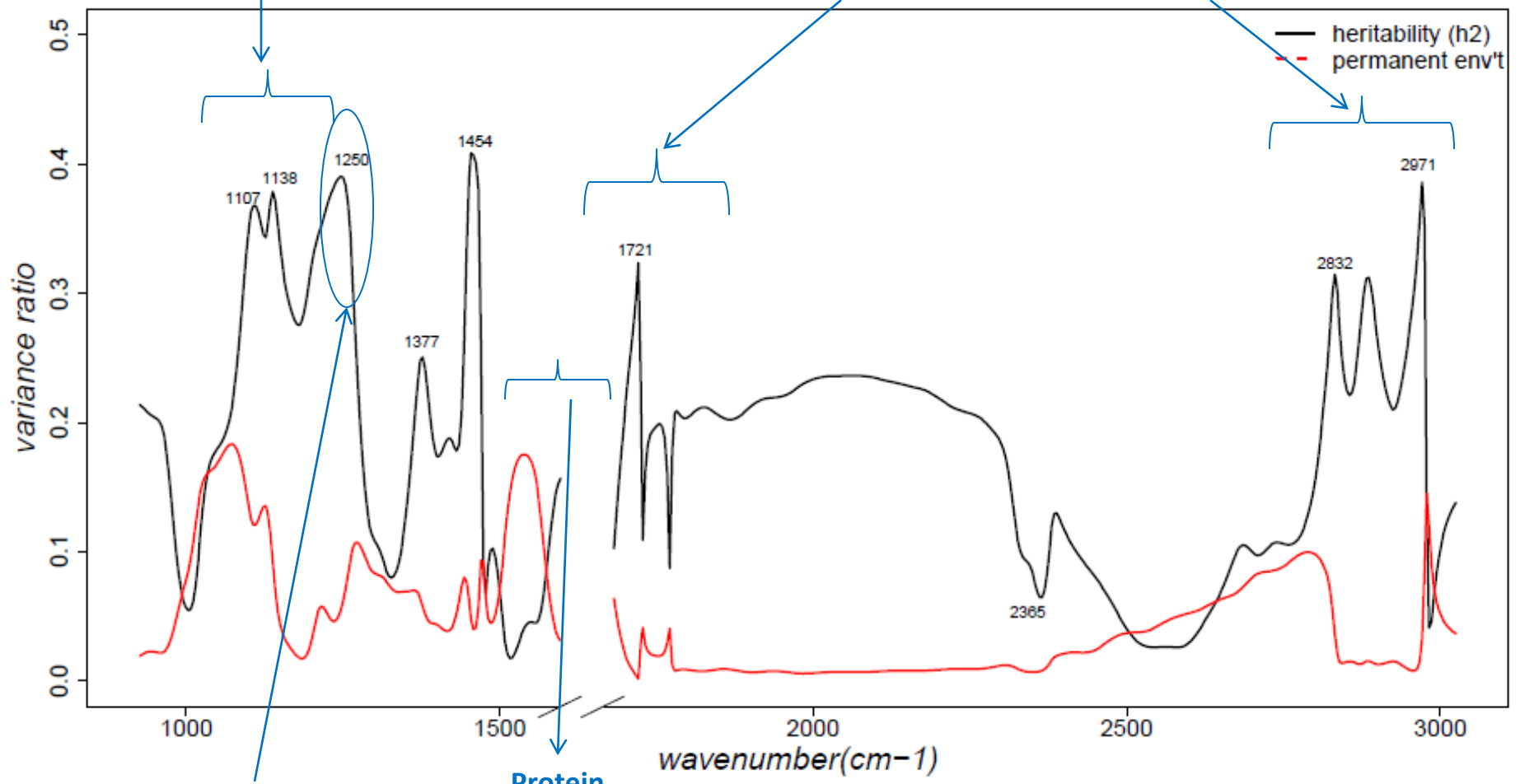
Table 1: Variance ratios for genetic, permanent environment, HTDr and residual random effects

PCs	Relative eigenvalues	Genetic (heritability)	Permanent environment	Herd test-day (HTDr)	Residual
1	58.96	0.154	0.020	0.105	0.721
2	25.62	0.264	0.091	0.298	0.347
3	7.74	0.146	0.015	0.388	0.451
4	3.24	0.057	0.270	0.020	0.653
5	1.66	0.011	0.013	0.941	0.035
6	1.07	0.229	0.135	0.277	0.359
7	0.41	0.211	0.058	0.298	0.432
8	0.28	0.285	0.033	0.140	0.542

**Lactose**  
OH group  
(C-OH bond)

**Fat A**  
Carbonyl group  
(C=O bond)

**Fat B**  
Fatty acids chains  
(C-H bond)



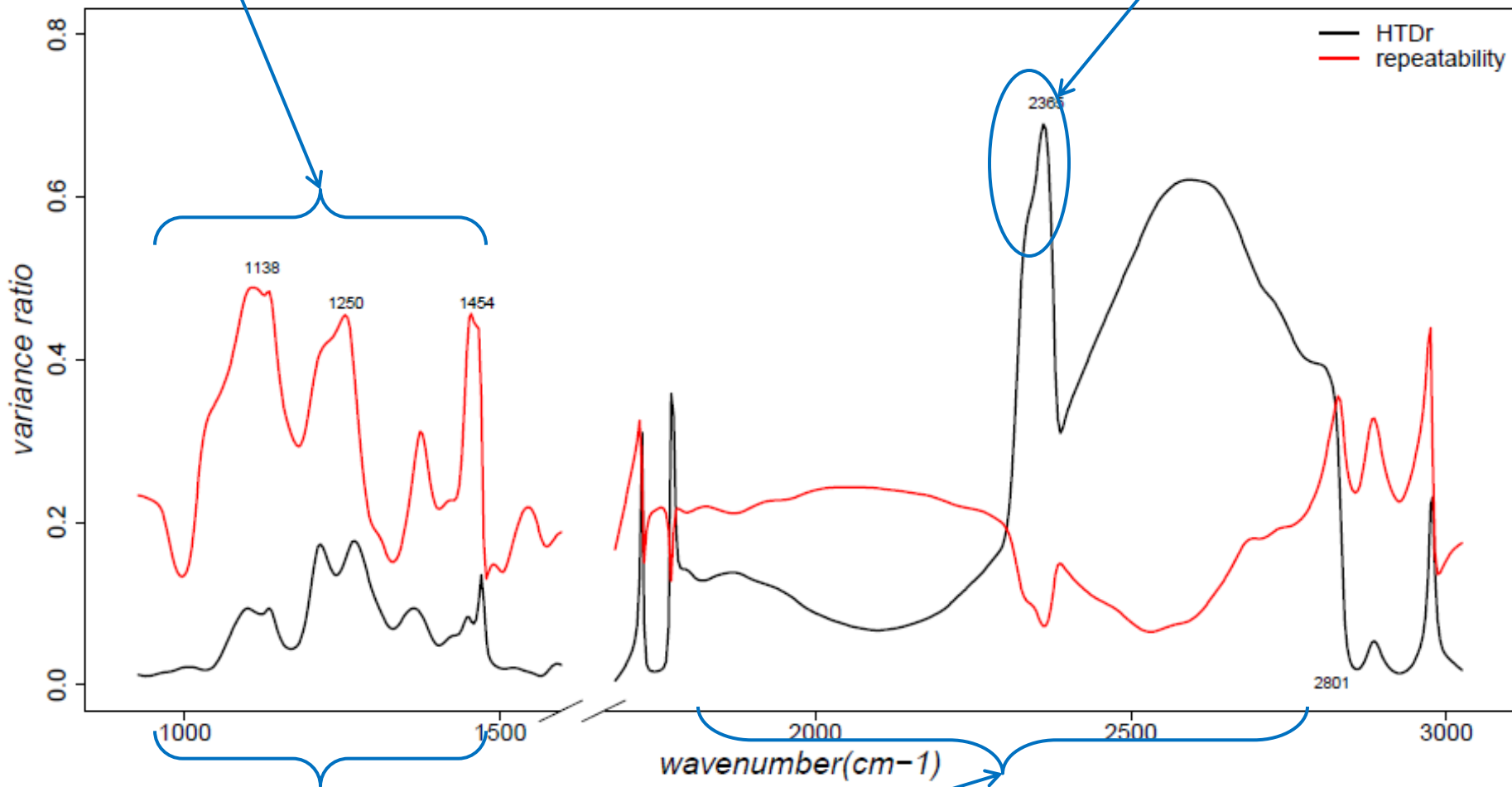
Amide III (protein)  
OPO asym. Stretch (mixture)  
CO stretch (mixture)

**Protein**  
amide II group  
(N-H bond)

FTIR fingerprint region

C-O and C-C stretching mode

Atmospheric CO<sub>2</sub>



No specific chemical information

## Cont ...

- Average spectral heritabilities

Traits	Estimated heritability (2009)	Spectral heritability (range)
Lactose	0.38	0.25 (0.054 – 0.38)
Fat	0.30	0.22 (0.041 – 0.385)
Protein	0.35	0.25 (0.017 – 0.39)

1000 – 1200 cm<sup>-1</sup>

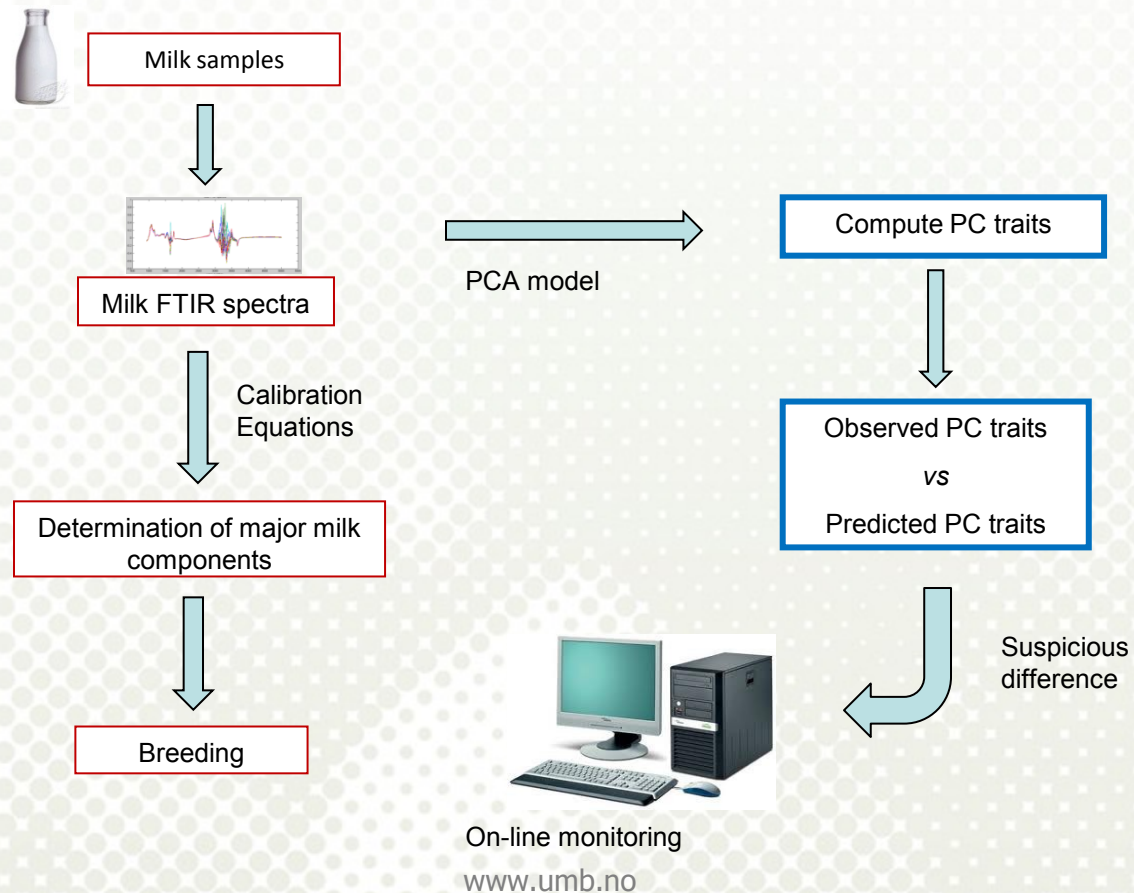
1740 – 1800 cm<sup>-1</sup> (Fat A)  
2800 – 2900 cm<sup>-1</sup> (Fat B)

1240 – 1260 cm<sup>-1</sup> (amide III)  
1520 – 1560 cm<sup>-1</sup> (amide II)

Contents are predicted from FTIR spectra

# Conclusion

- There is a substantial amount of genetic variation in goat milk FTIR spectra
  - Not all FTIR regions are of breeding interest
  - But could be used in herd management



Thank you for your attention!

