



*Genotype **plus** Environment*  
*Integration for a more sustainable dairy production system*



Gembloux Agro-Bio Tech  
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# Going beyond current limits in defining and using milk infrared spectra based phenotypes

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# Last Presentation for Today 😊

- Since 14:00 many aspects were presented in this session:  
*Novel milk-based phenotypes for use in breeding and management applications*

**THANK YOU  
FOR STAYING !**



# Last Presentation for Today 😊

- ❑ Since 14:00 many aspects were presented in this session:  
*Novel milk-based phenotypes for use in breeding and management applications in dairy production*



- ❑ Several presentations describing use of milk infrared data
- ❑ **But: are there still issues we might have missed?**

# Milk Infrared Spectral Data

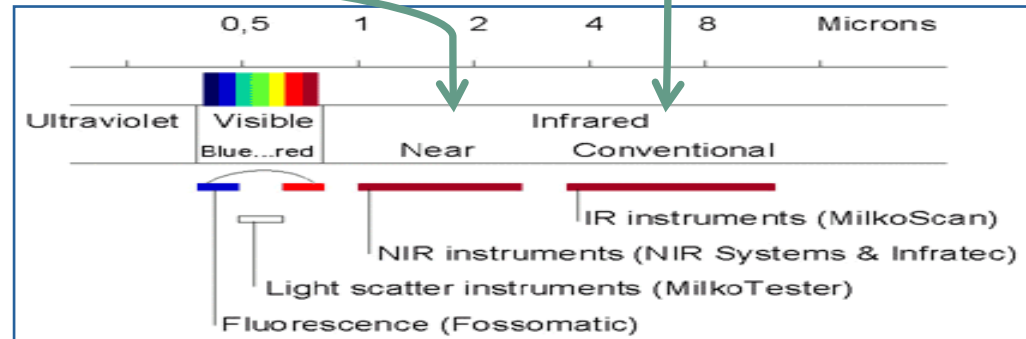
- ❑ **First issue: type of spectra (not aim of this talk)**

- **Mid-Infrared (MIR)**

- ❑ **Still spectrometers rather expensive !!**  
→ limits the use of MIR outside of labs

- **Near-Infrared (NIR)**

- ❑ **On-farm on-line alternative**
- ❑ **Appearing in commercial tools**
- ❑ **More research needed to extend its use**



# Milk Infrared Spectral Data

- ❑ **Second issue: defining phenotypes**
  - **Classically** → **calibrating against reference data**
    - ❑ Spectral data is used as a predictor for a trait of interest
  - **Alternatives**
    - ❑ Spectra (wavenumbers) becoming traits describing phenotypic and genetic variations (**already seen today**)
    - ❑ But we can go even further (**aim of this presentation**)

**Spectra becoming response variables  
to known factors: Response → Trait**

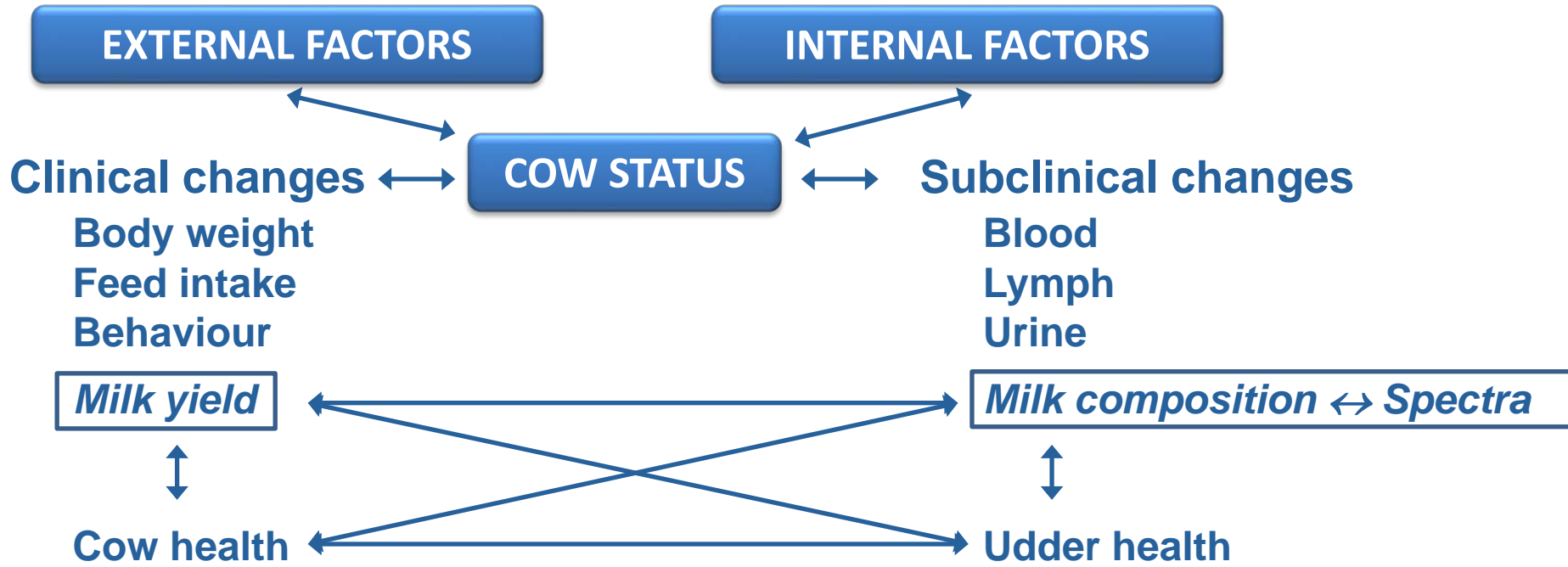
# Spectra as Response Variables

- Considering spectra (wavenumbers) as traits
  - Proof of significant phenotypic variation
  - But also genetic variation<sup>1</sup>

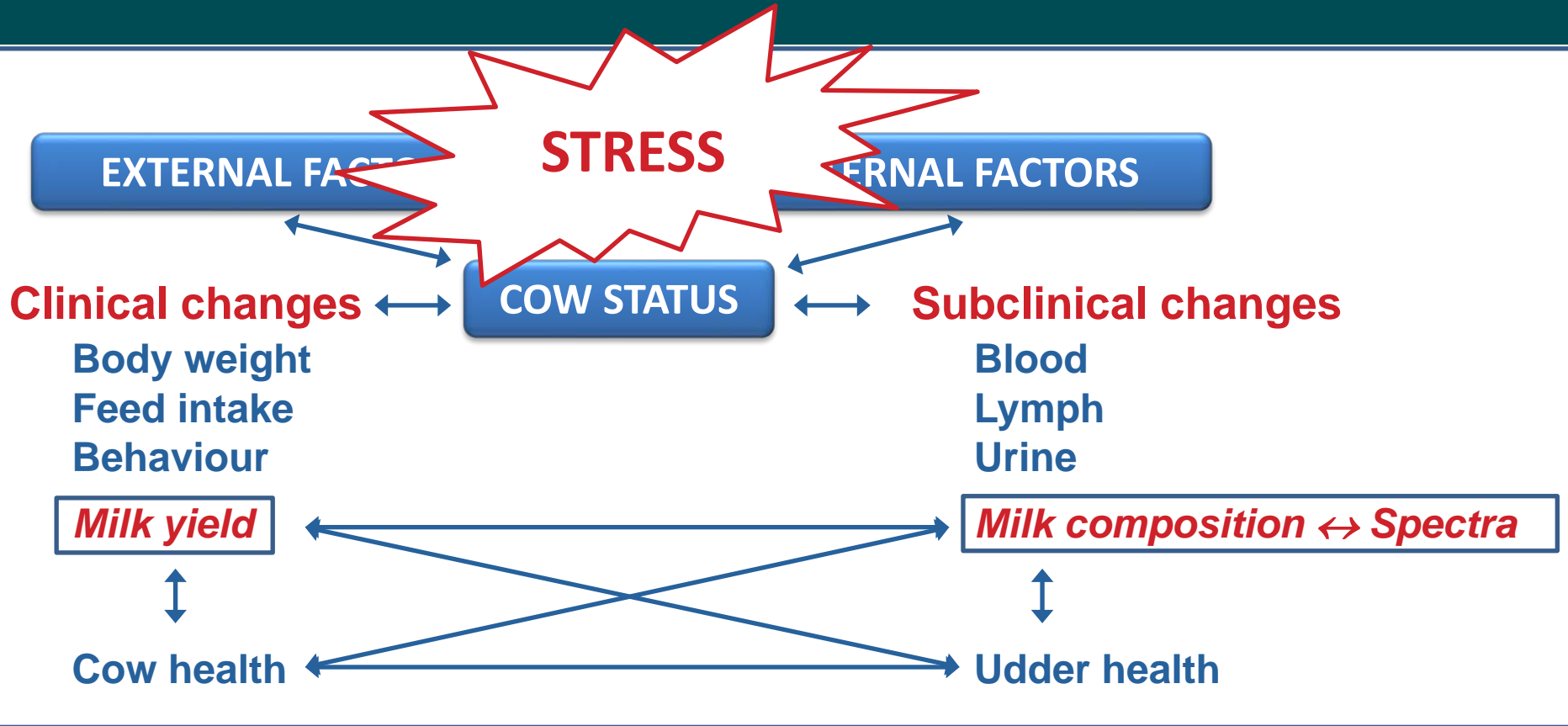
<sup>1</sup> e.g. Soyeurt et al. [2010] - JDS 93: 1722-1728; Dagnachew et al. [2013] - JDS 96: 3973-3985

- Now the 1<sup>st</sup> question is:
  - **What drives the phenotypic variation?**

# Sources of Phenotypic Variation



# Sources of Phenotypic Variation

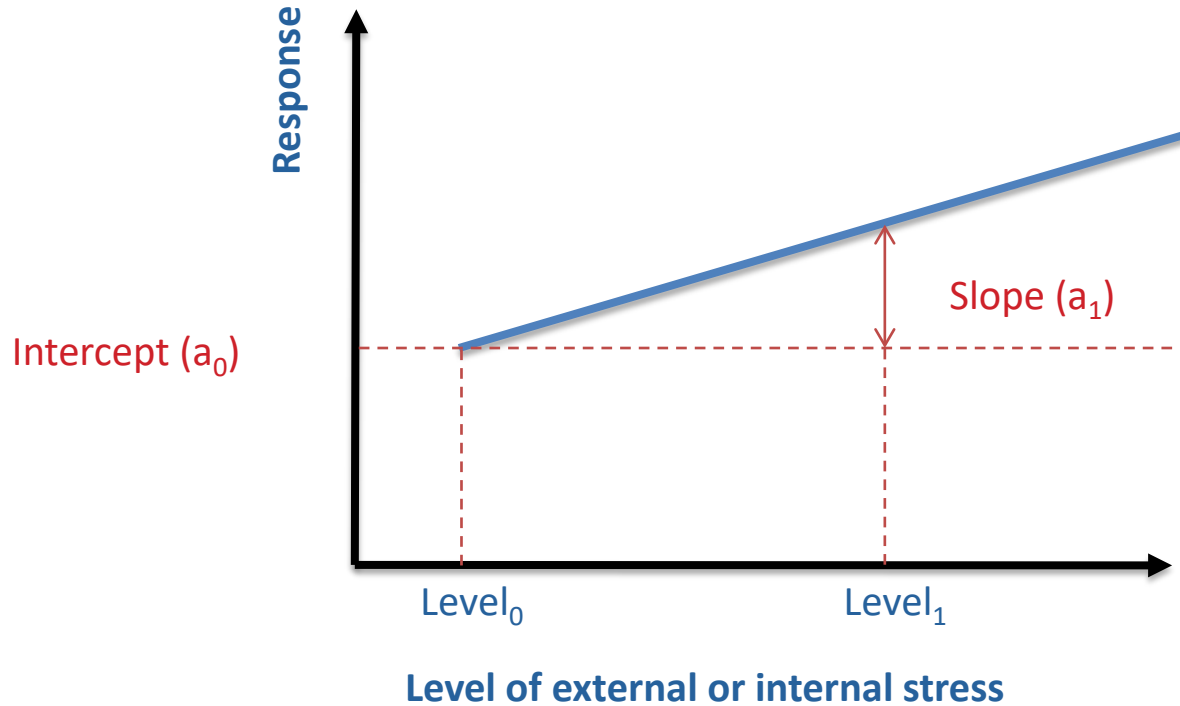




# Spectra Responding to Stress

- Leads to 2<sup>nd</sup> question:
  - How to link responses of milk yield and composition to external and internal stress factors ?
- Concept of “Reaction Norm” defined as:
  - Phenotypic expression of a “genotype” across a range of “environments”

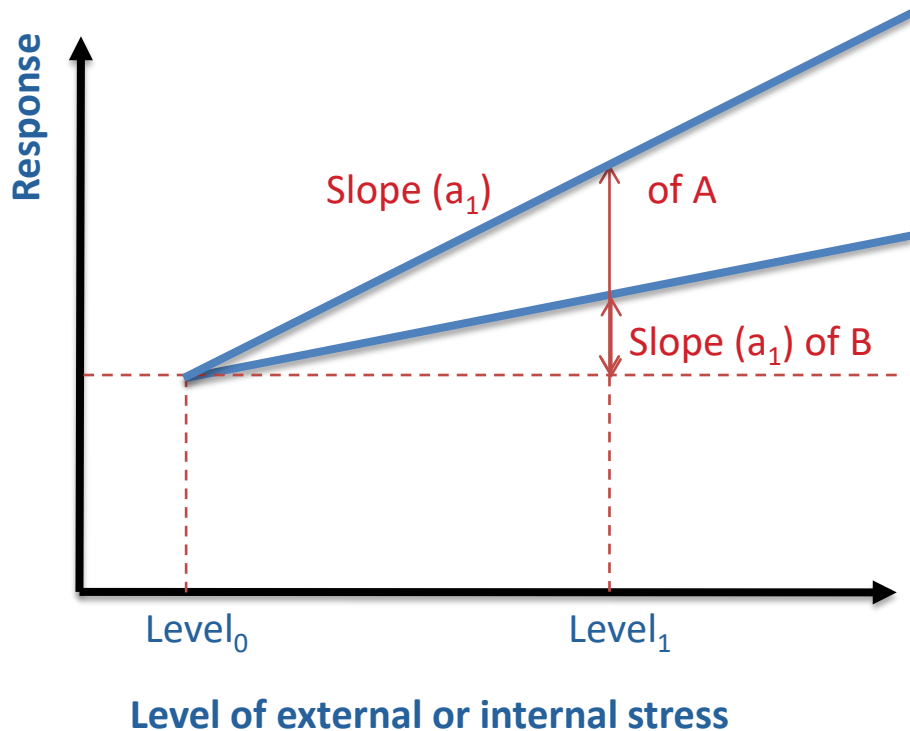
# Reaction Norm



# Two Examples

- Reaction of a given response variable to (2 examples):
  - External stress: **Heat Stress**
    - Response to a given level of temperature-humidity (THI)
  - Internal stress: **Gestation**
    - Response to a given length of gestation
- Leads to the 3<sup>rd</sup> question:
  - **How to pass from individual phenotypic responses to indicators of genetic robustness to external and internal stress factors**

# Animal A vs Animal B



- Hypothesis:
  - **Animals that react less are more resilient**
- Therefore:
  - **Larger slope indicating stronger reactions**
- In this figure:

Slope A > Slope B



**Resilience A < Resilience B**

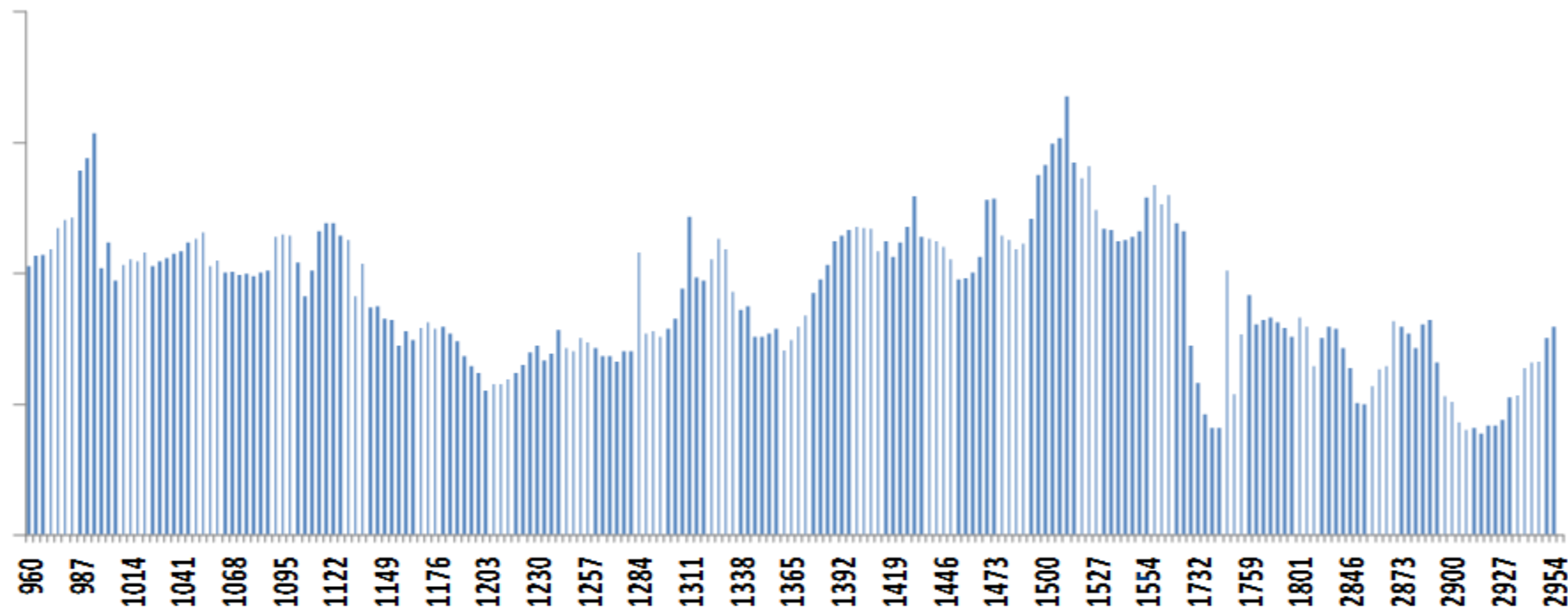
# Genetic Reaction Norm Models

- $y_{ij}$  = common factors ...+  $a_{0i}$  +  $f(j)$  x  $a_{1i}$  +.... where
  - Common factors = other needed fixed and random effects
  - $y_{ij}$  = response j of animal i
  - $a_{0i}$  and  $a_{1i}$  = random genetic effects of animal i
  - $f(j)$  in our 2 examples:
    - $f(j) = \text{THI}(\text{TD}_j) - 62$  if  $\text{THI}(\text{TD}_j) > 62$   
= 0 if  $\text{THI}(\text{TD}_j) \leq 62$
    - $f(j) = \text{days carried calf at TD}_j$  if pregnant  
= 0 if not-pregnant

# External Stress: Heat Stress

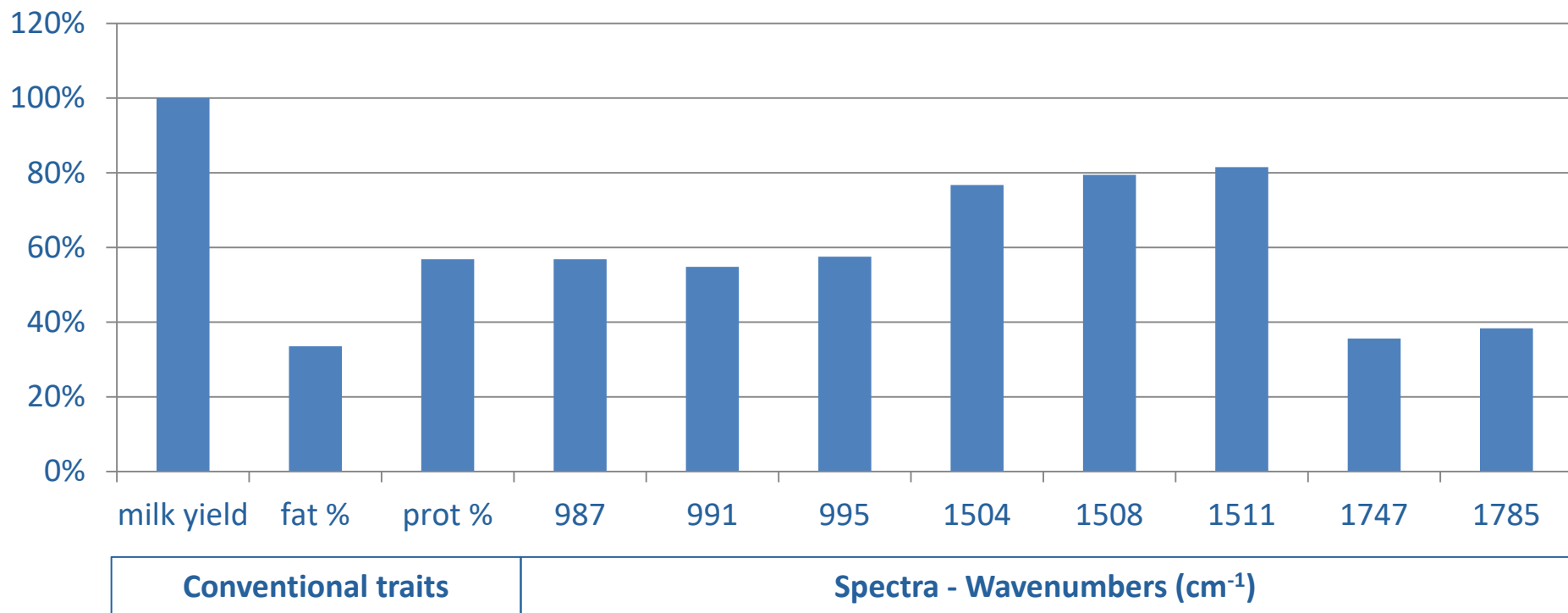
- **Continuation of studies done by Hedi Hammami**
  - Results here primers on material in the pipeline
- **Data**
  - 205,987 TD records
    - Milk yield, fat%, protein% and 1060 wavenumbers
  - THI values of 3-d lag correspondant to each TD
  - 29,467 primiparous Walloon Holstein cows

# Ratio of Slope / Intercept Variances for Wavenumbers



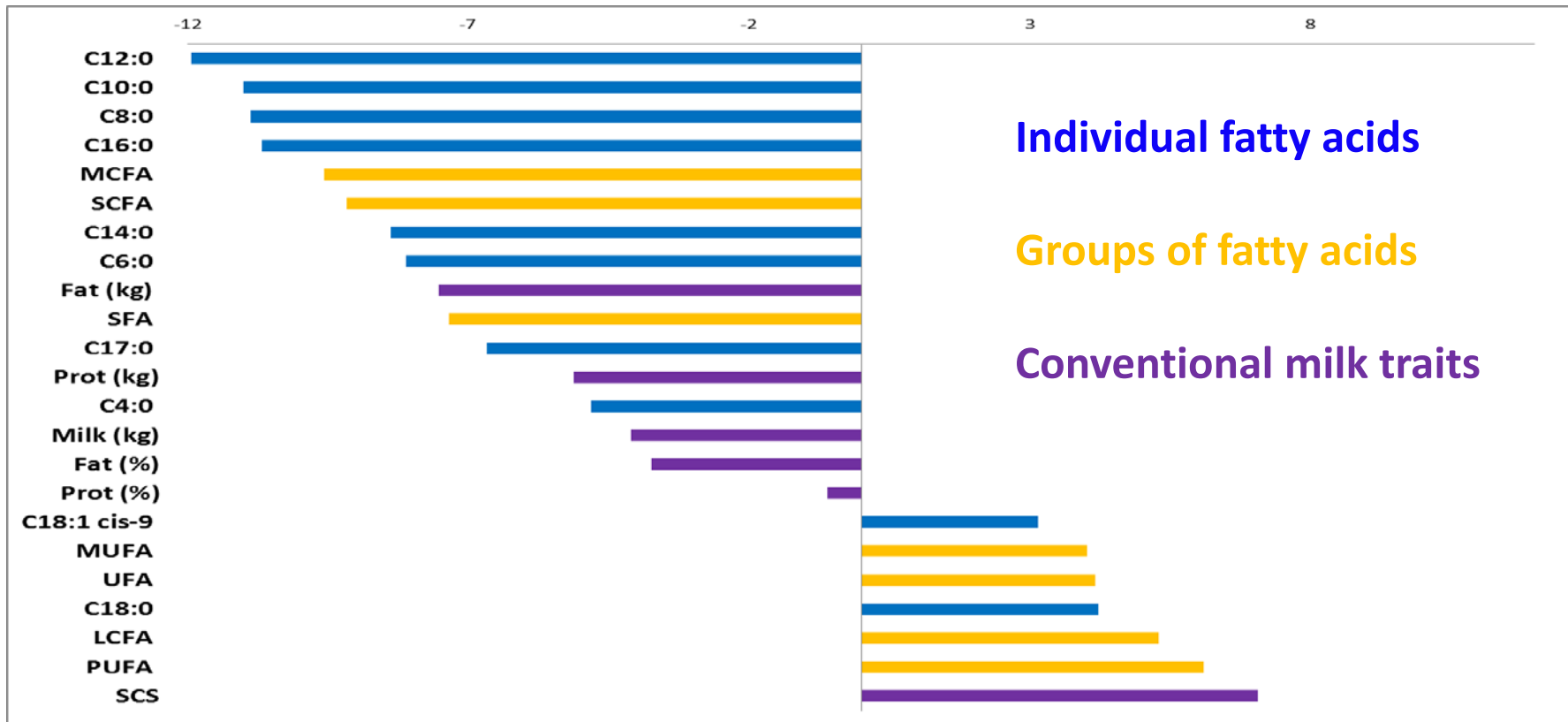
Spectra - Wavenumbers (cm<sup>-1</sup>)

# Relative Ratio of Slope / Intercept Variances





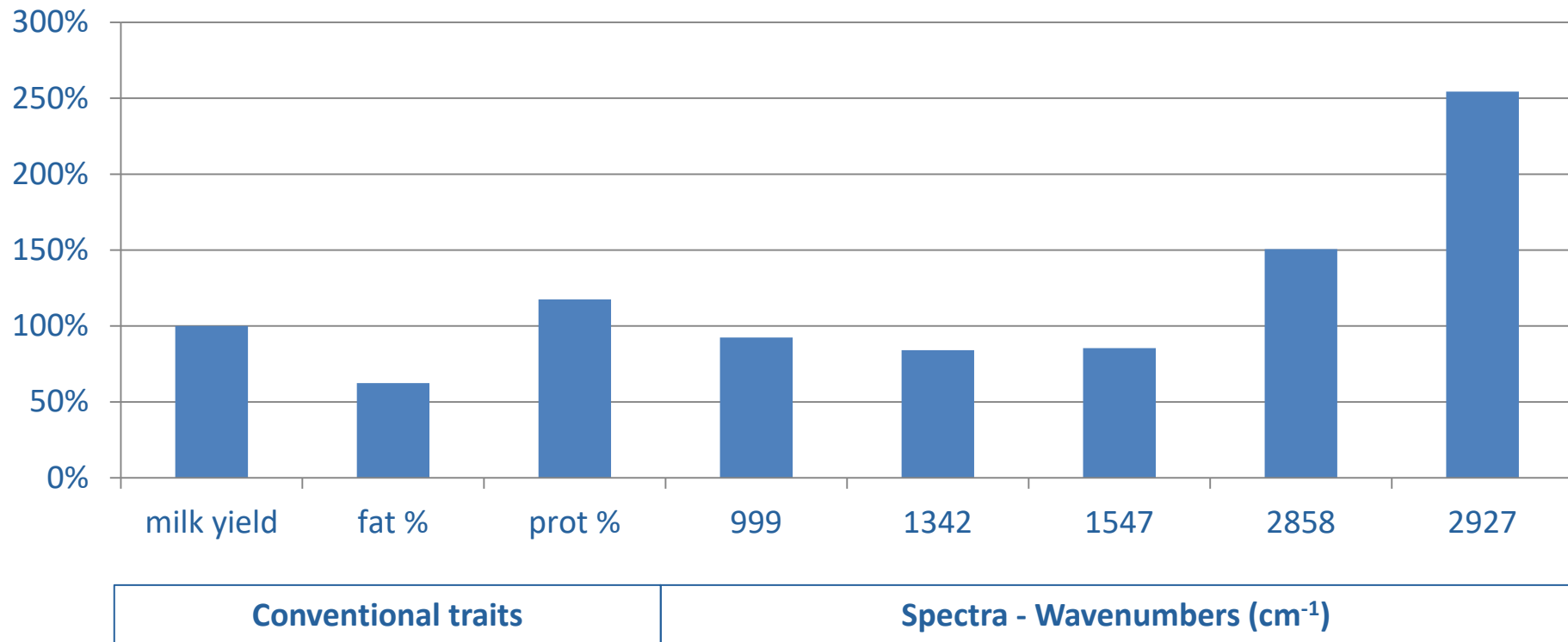
# Other Opportunities (HS+ vs HS-) !



# Internal Stress: Gestation

- **Continuation of studies done by Aurélie Lainé**
  - Results here primers on material in the pipeline
- **Data**
  - **56,902 TD records**
    - **Milk yield, fat%, protein% and 5 wavenumbers, identified for showing highest phenotypic response**
  - **Confirmed gestations → confirmed days carried calf**
  - **9,757 primiparous Walloon Holstein cows**

# Relative Ratio of Slope / Intercept Variances



# Conclusions - I

- Examples showed alternative “model based” definition of MIR spectra based “phenotypes”
  - Reaction to “stress”

**Novel class of “model-based” biomarkers**

# Conclusions - II

- ❑ **First results of on-going studies**
- ❑ **Comparison of MIR wavenumbers with yield and traditional components showed potential**
- ❑ **Heat-stress:**
  - **Optimizing MIR signal necessary (and possible)**
- ❑ **Gestation:**
  - **Some wavenumbers showed stronger signals than conventional traits**

# Next Steps

- **Validation of basic hypothesis**
  - **Are animals reacting less also more resilient ?**
- **Moving models to genomics → single-step GBLUP**
  - **Straight forward for “model based” phenotypes**
- **Developing correct use of this novel class of phenotypes (biomarkers):**
  - **Transferring genetic slopes into EBV for resilience (specific and/or general)**
  - **Using EBV directly or indirectly (most likely) in breeding programs (and dairy cattle management)**

# Acknowledgements

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