

# IMPLEMENTATION OF PREDICTIVE MODELS BASED ON METABOLOMICS-DERIVED BIOMARKERS

**Gaud DERVILLY-PINEL**

**S. CHÉREAU, A. GICQUIAU,  
S. PRÉVOST, F. MONTEAU, B. LE BIZEC**

# International Symposium on Food Safety and Quality: Applications of Nuclear and Related Techniques

10-13 November 2014, Vienna, Austria



Laboratoire d'Étude des Résidus et Contaminants dans les Aliments (LABERCA)

USC INRA 1329, Oniris, LUNAM Université

BP 50707, 44307 Nantes Cedex 3, France - [www.laberca.org](http://www.laberca.org)



- I. Need for alternative screening strategies
- II. Metabolomics models
- III. Assessment of model performances
- IV. Implementation

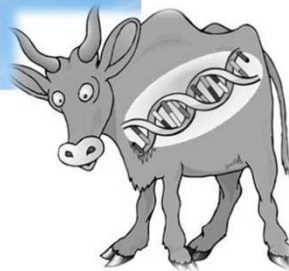


- I. Need for alternative screening strategies
- II. Metabolomics models
- III. Assessment of model performances
- IV. Implementation





**DESIGNER  
DRUGS**

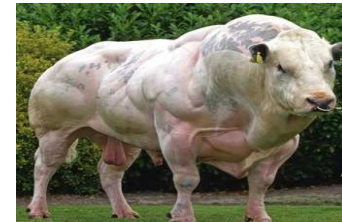


### CLASSICAL APPROACH



**TARGETED  
MEASUREMENTS**

### EMERGING STRATEGIES



**EFFECT BASED  
MEASUREMENTS**



*Pinel et al. TRAC 2010; 29(11), 1269.*

*Dervilly-Pinel et al., Drug Testing & Analysis, 2012; 4(1):1-11*





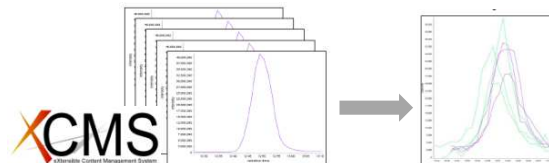
**SAMPLE PREPARATION**



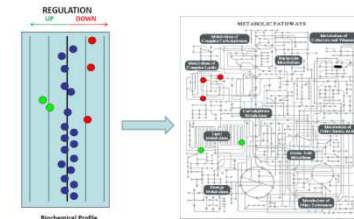
**FINGERPRINTING**



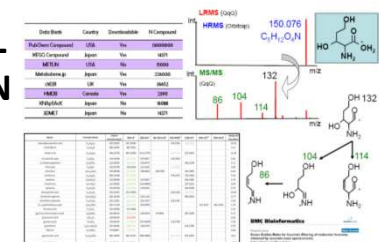
**DATA PROCESSING**



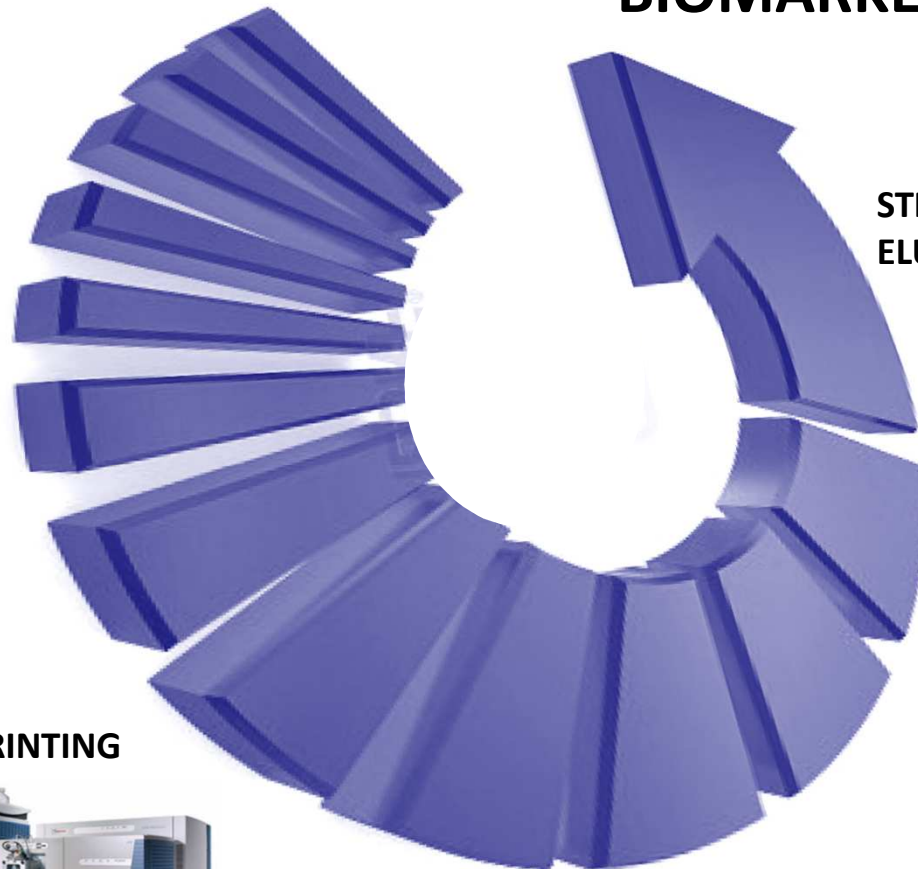
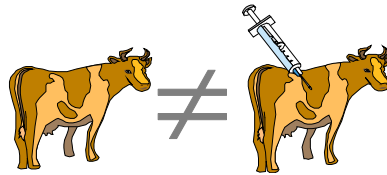
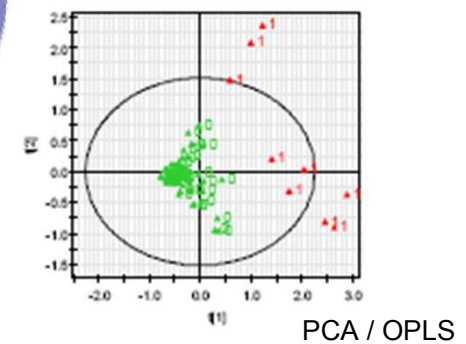
**CANDIDATE  
BIOMARKERS**



**STRUCTURAL  
ELUCIDATION**

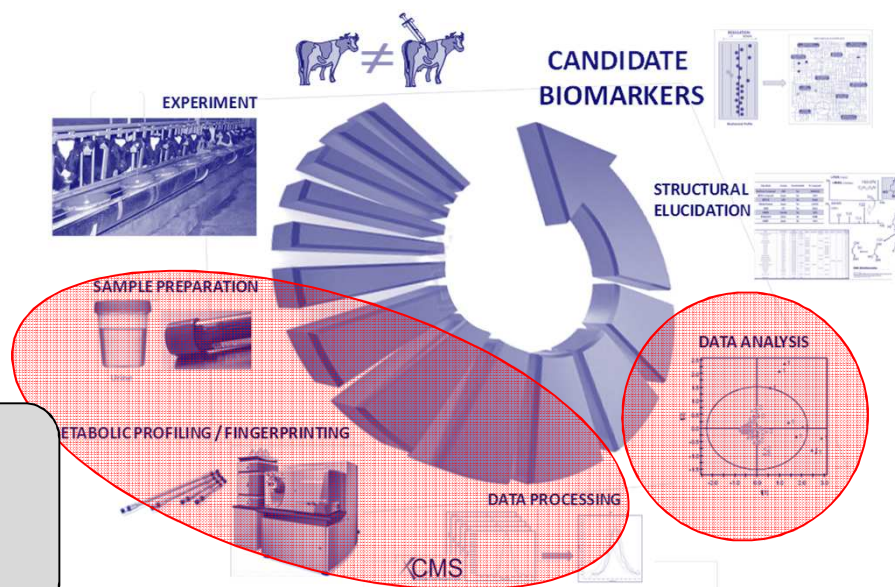
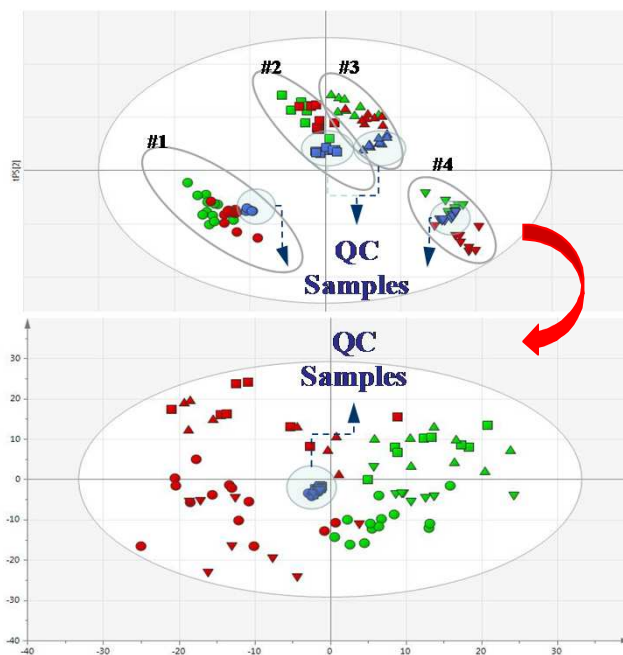


**DATA ANALYSIS**



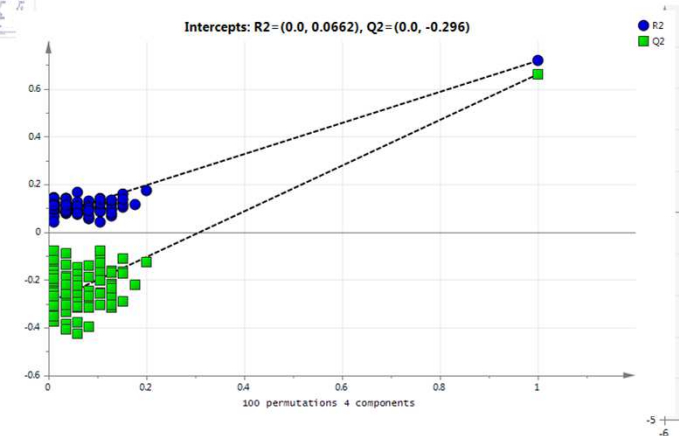
## ANALYTICAL VALIDATION

- Internal standards ( $R_t$ ,  $I$ ,  $\Delta ppm$ )
- QC samples (Removal of between-batch offsets and drifts)
- Peaks selection ( $CV < 30\%$ )



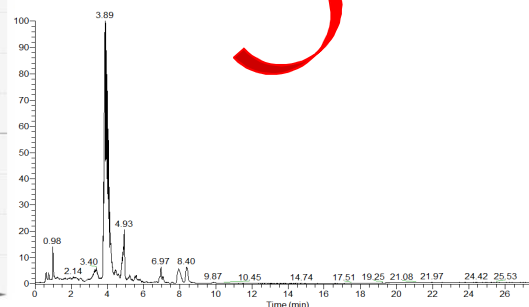
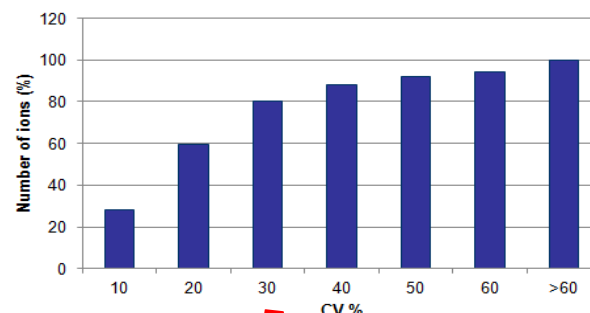
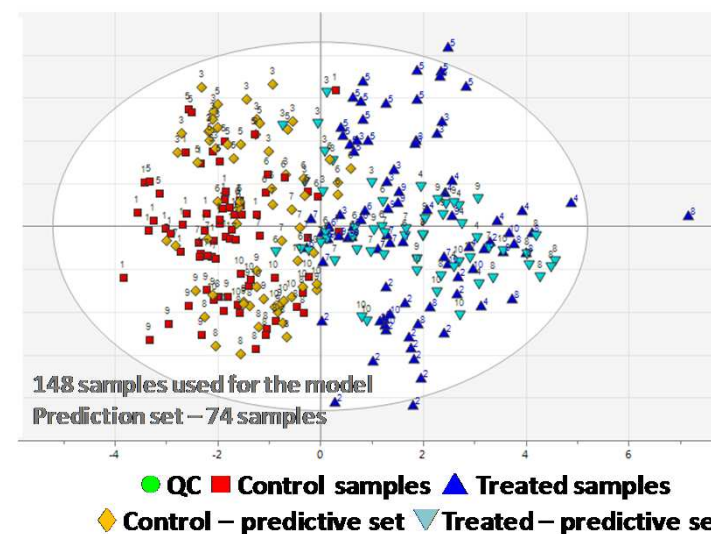
## STATISTICAL VALIDATION

## Permutation test



Permutation Test shows that  $R^2(Y)$  and  $Q^2(Y)$  values decrease upon 100 permutations

## Cross-validation



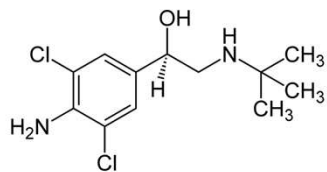
- I. Need for alternative screening strategies
- II. Metabolomics models**
- III. Assessment of model performances
- IV. Implementation



## Experiment 1



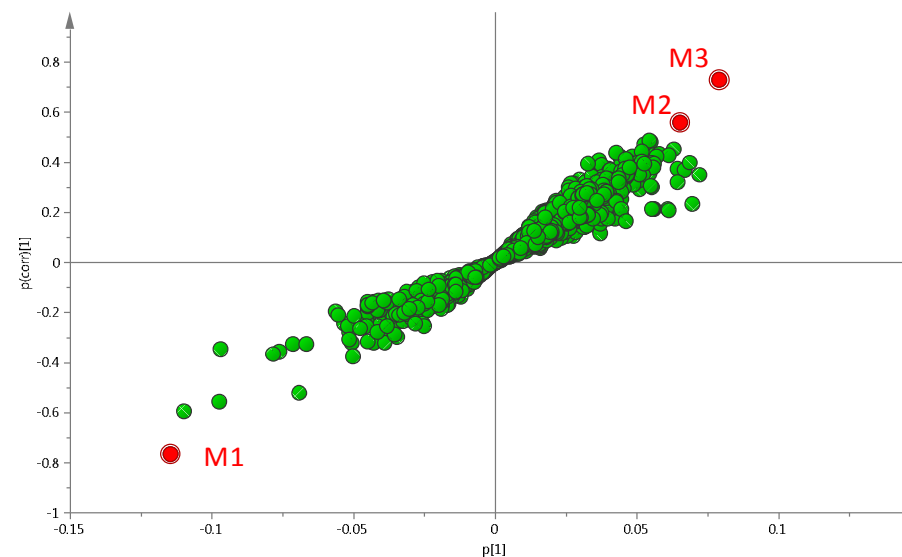
18 calves  
Holstein  
80 days old



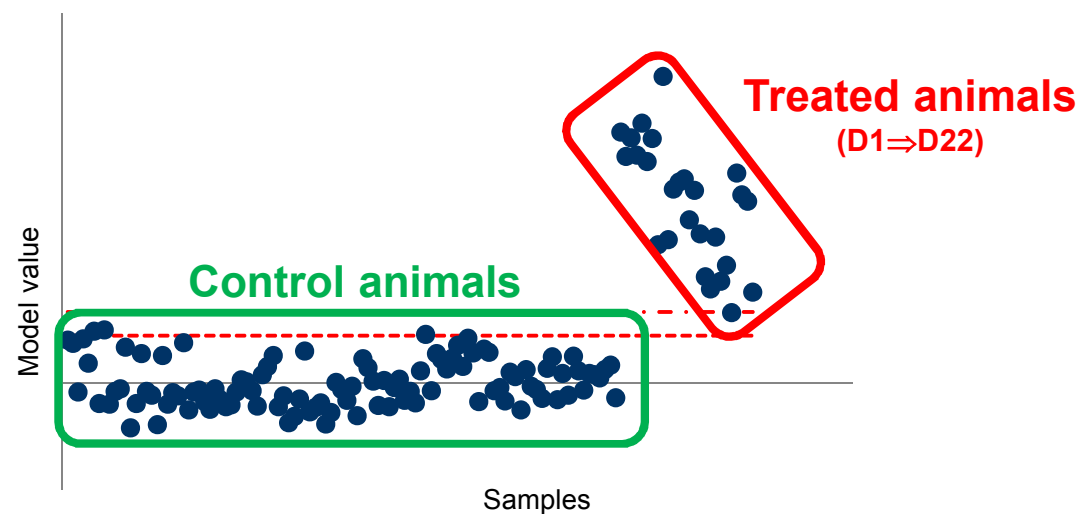
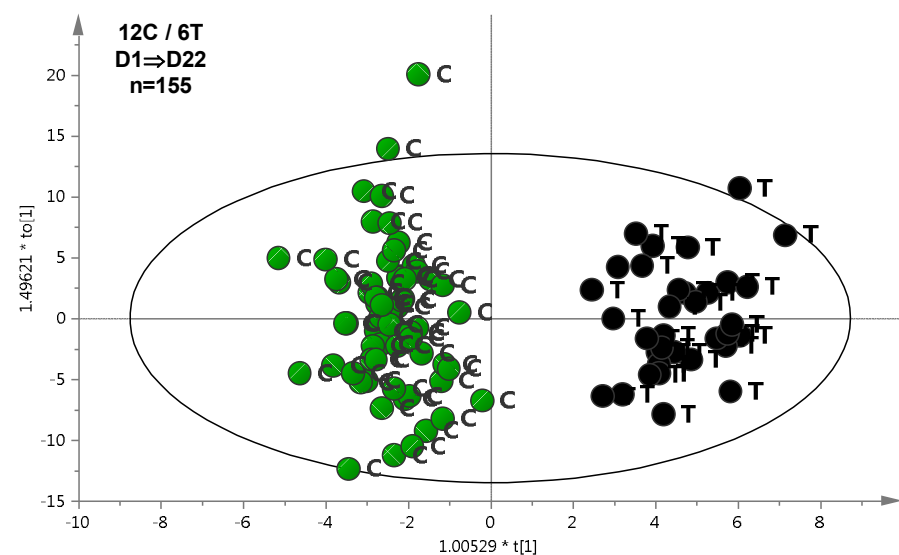
Clenbuterol



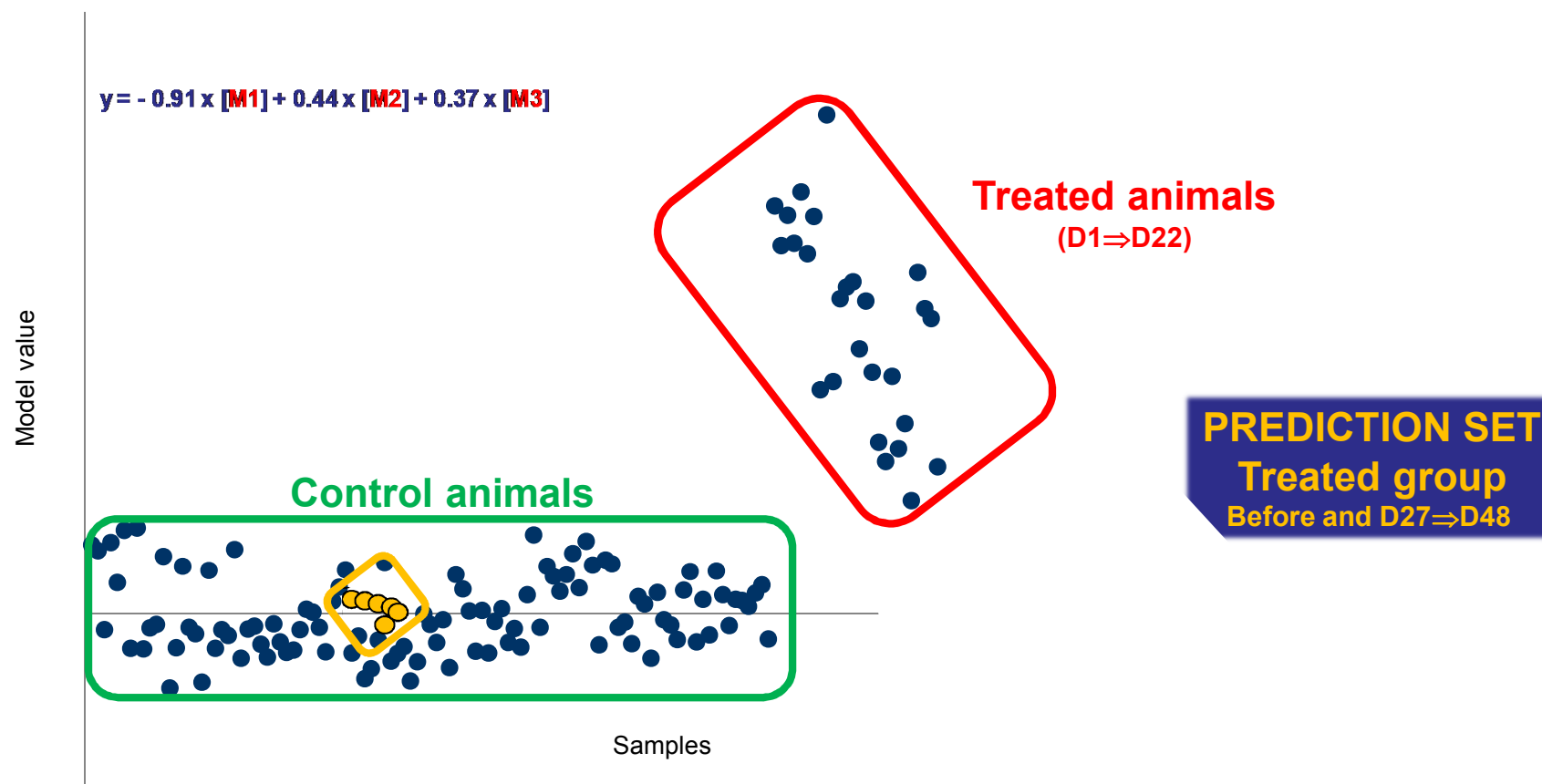
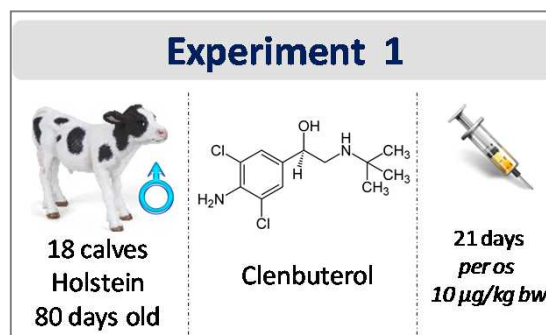
21 days  
*per os*  
10 µg/kg bw



$$y = -0.91 \times [\text{M1}] + 0.44 \times [\text{M2}] + 0.37 \times [\text{M3}]$$



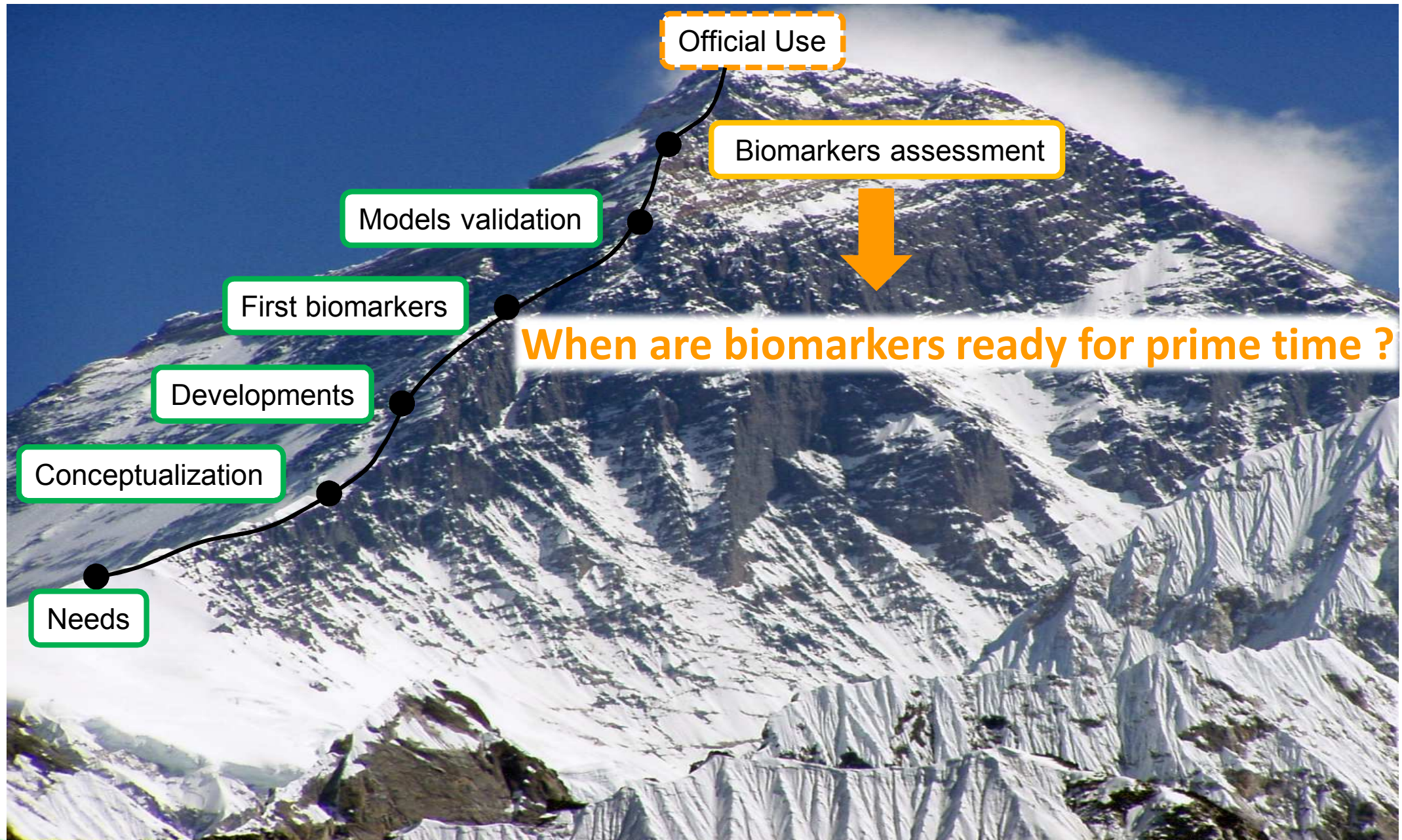




- I. Need for alternative screening strategies
- II. Metabolomics models
- III. Assessment of model performances
- IV. Implementation







#### ☐ **SELECTIVITY**

- Different drugs / same family
- Other growth promoters (steroids, GH, ...)
- Veterinary drugs (antibiotics, ...)



#### ☐ **SENSITIVITIES**

- Low dose treatments
- Detection time window
- Analytical performances



#### ☐ **ROBUSTNESS**

- Large scale testing
- Within / Ext. reproducibility

#### ☐ **PERFORMANCES**

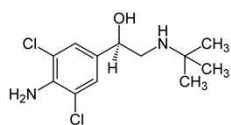
(false pos./neg. results)

#### ☐ **REGULATORY ISSUE**



## Experiment 3

## Experiment 4



17 calves  
Holstein  
80 days old



**6 days**  
*per os*  
**5  $\mu$ g/kg bw**

### Low dose cocktail

3 calves  
Holstein  
80 days old



**5 days**  
*per os*  
**1 µg/kg bw**  
**(each)**

- **Clenbuterol**

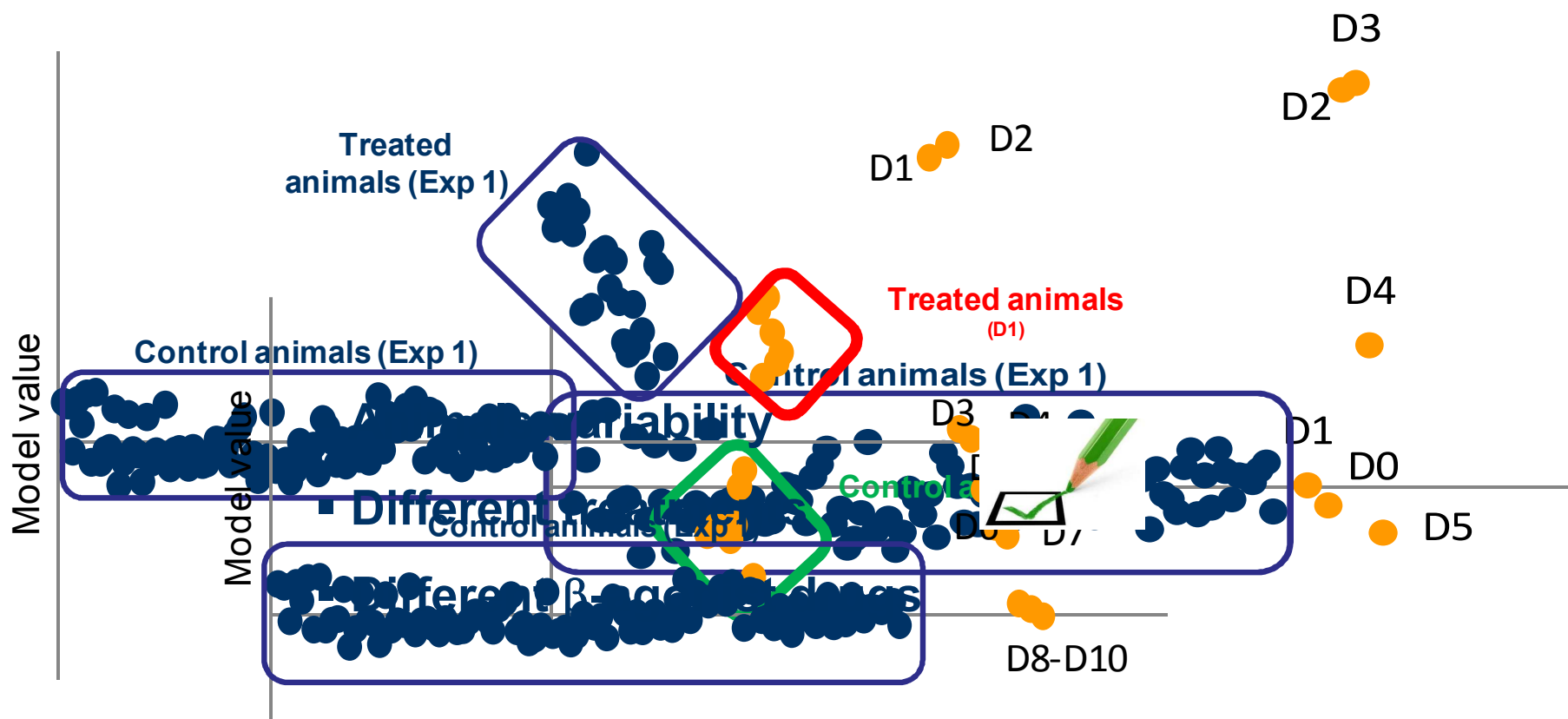
- Ractopamine

- Cocktail  
Clenbu + Racto

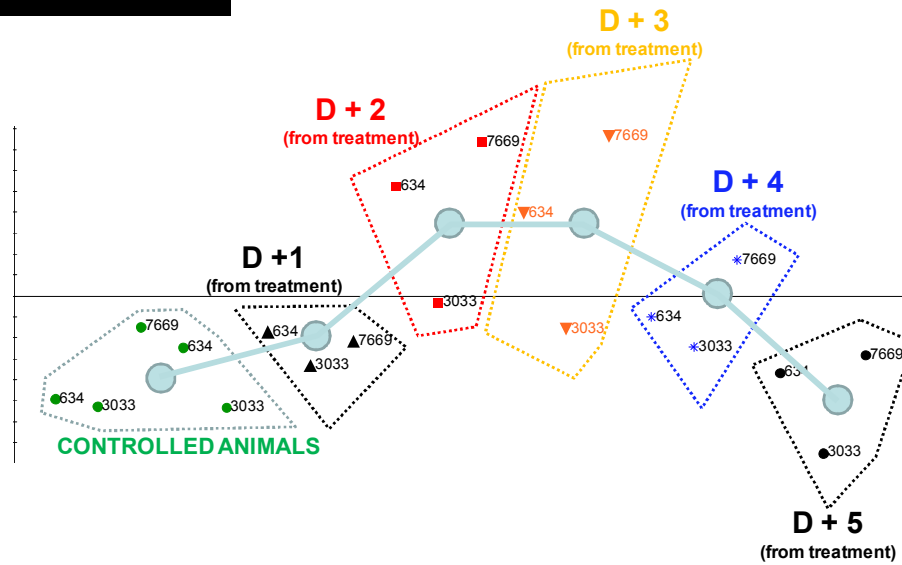


3 cows  
Holstein  
>36 month old

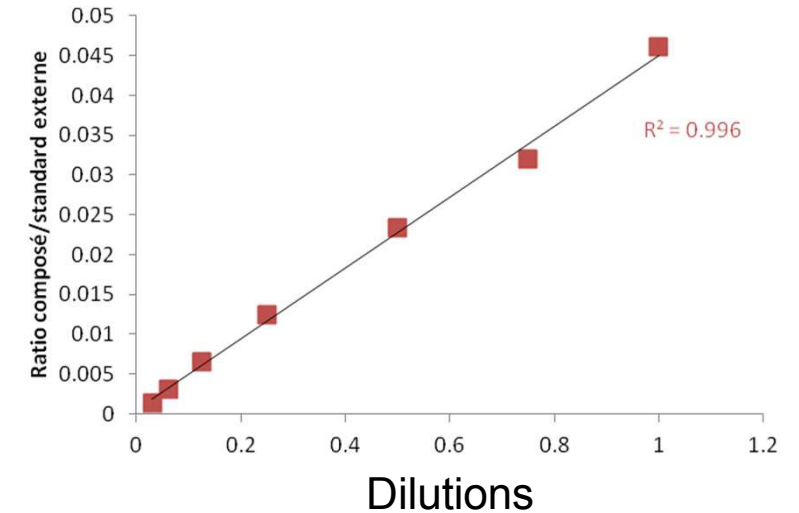
**1 day**  
*per os*  
**1-200  $\mu\text{g/kg bw}$**



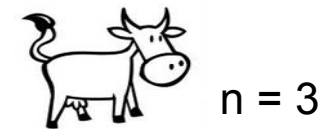
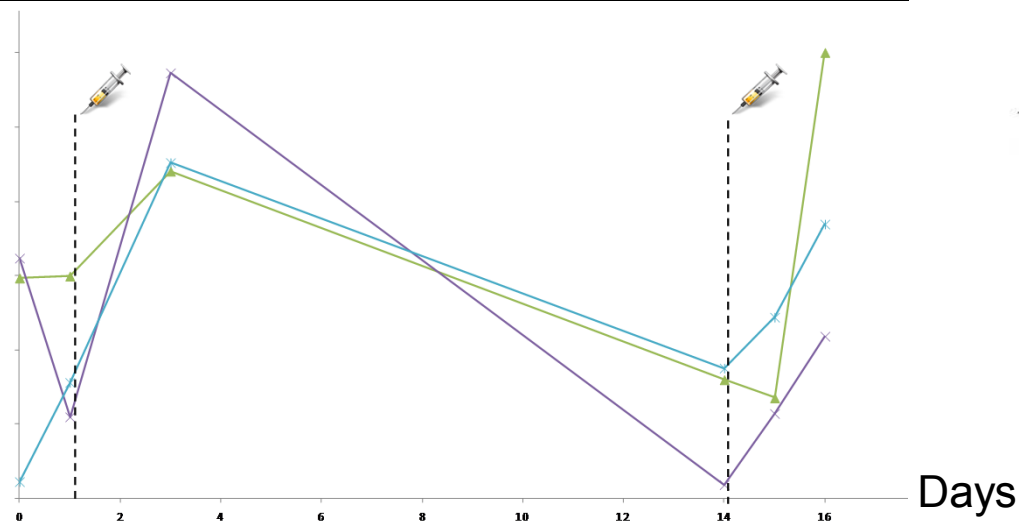
## TIME WINDOW



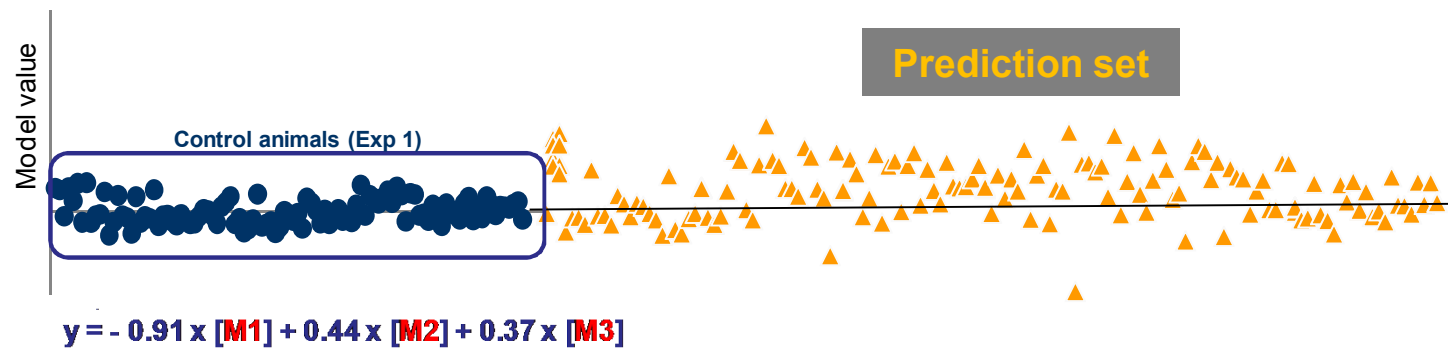
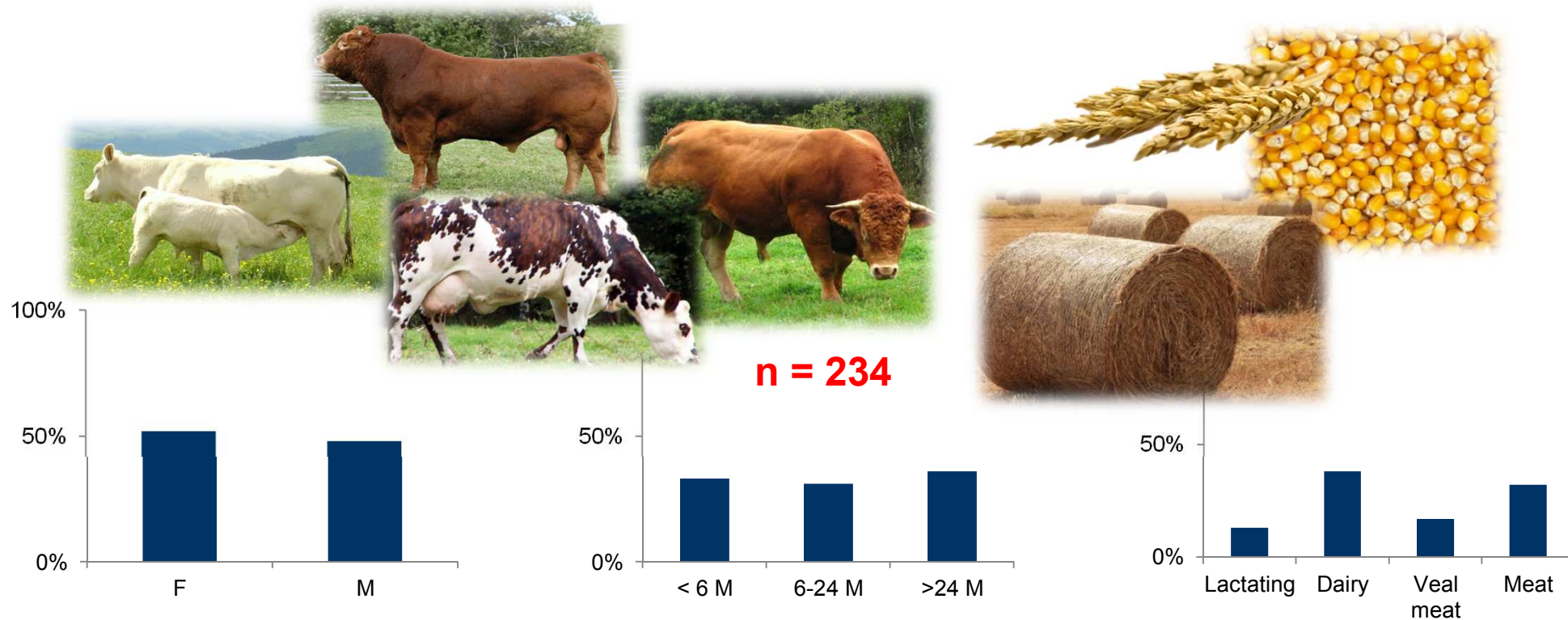
## ANALYTICAL SENSITIVITY

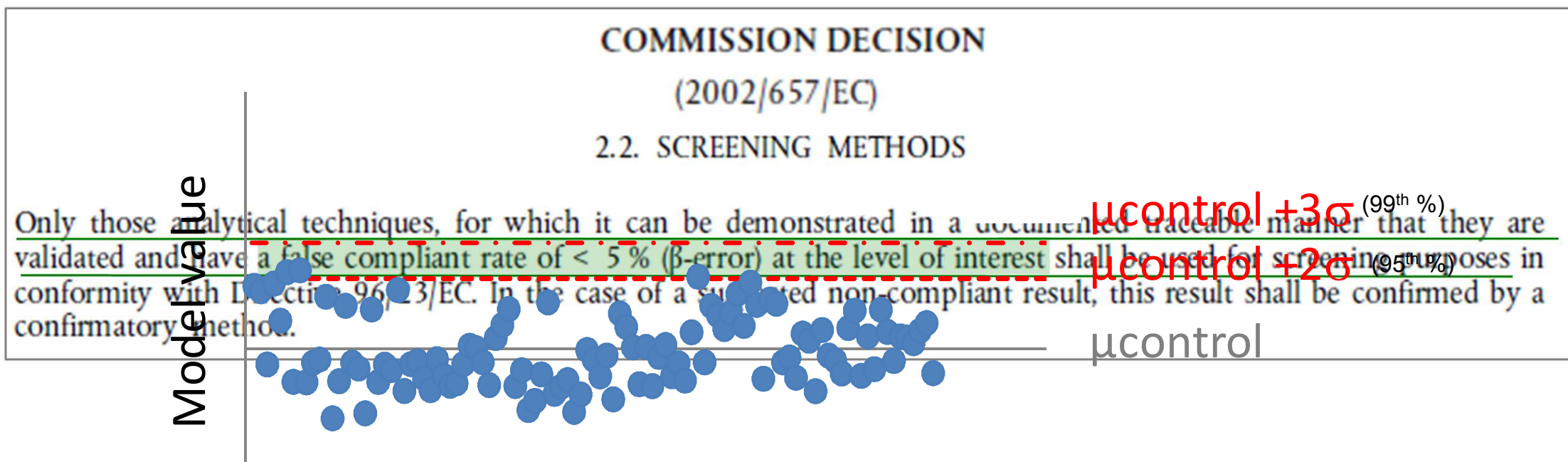


## DIFFERENT ANABOLIC TREATMENTS



**19-NTD+E2Bz**

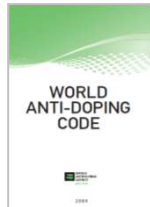




			95 <sup>th</sup> perc.	99 <sup>th</sup> perc.
Whole population	n=534	% False Compliant	0.2	1.3
		% False non Compliant	20	15



## Human



### Article 2.1.2

Sufficient proof of an anti-doping rule violation is established either by the presence of a prohibited substance, its metabolites or **markers** [...]

**WADA's Executive Committee approved WADA's Athlete Biological Passport Operating Guidelines on December 1, 2009.**

## Horses

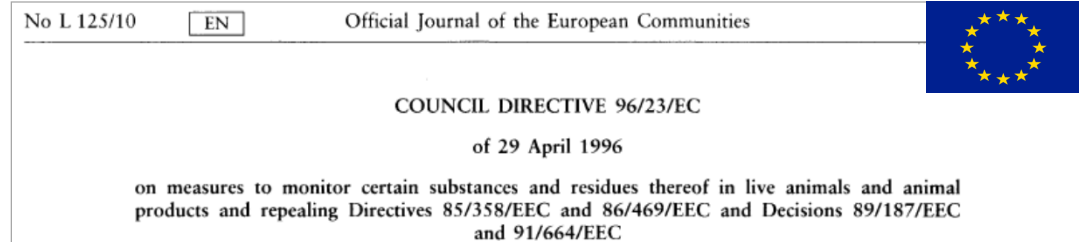


### Article 6, §11

[...] The finding of **any scientific indicator** of administration or other exposure to a prohibited substance is also equivalent to the finding of the substance [...]

**New version approved in April 2009 "International Agreement on Breeding, Racing and Wagering"**

## Live animals, animal products, their feed



### Article 1

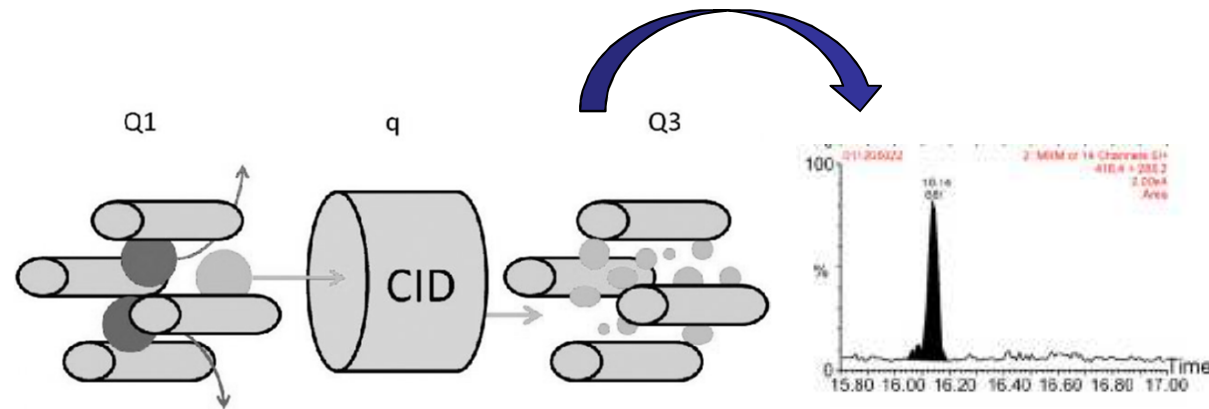
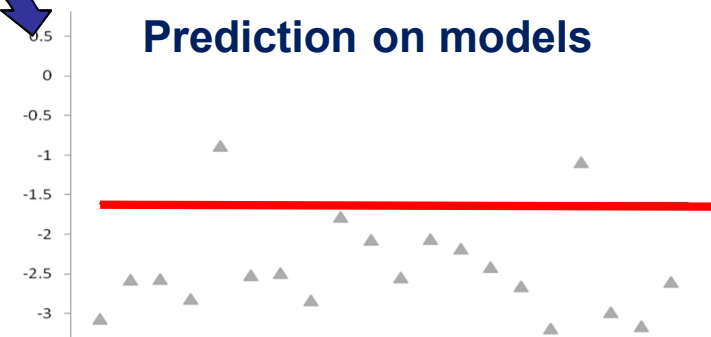
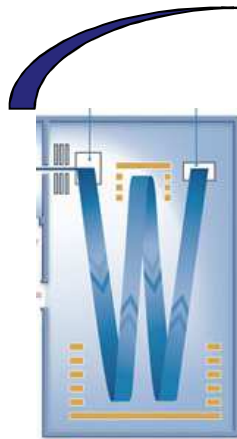
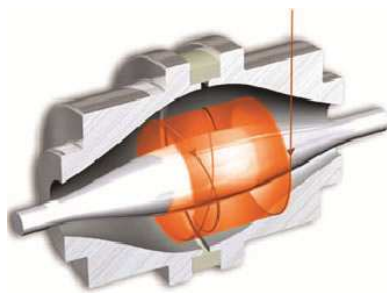
This Directive lays down measures to monitor the substances and groups of **residues** listed in Annex I.

### Article 2

'residue' shall mean a residue of substances having a pharmacological action, of **their metabolites** and of other substances transmitted to animal products and likely to be harmful to human health;

- I. Need for alternative screening strategies
- II. Metabolomics models
- III. Assessment of model performances
- IV. Implementation**



**IDENTIFIED & LIMITED NUMBER OF GENERIC BIOMARKERS****SET OF NON IDENTIFIED BIOMARKERS**



### ■ SCREENING REQUIREMENTS ?



### ■ IS IT IMPLEMENTABLE ON A LARGE SCALE ?

Strategy added since 2013 in the French National Monitoring Plan



### ■ IS IT ACCREDITABLE ?



### ■ IS THE STRATEGY TRANSFERABLE TO SMEs ?

EU FP7 project DeTECH 21 (2013-2015)



**ANSWERS HUMAN HEALTH/FOOD SAFETY ISSUES**



# ACKNOWLEDGEMENTS



<http://www.laberca.org>  
<http://www.saraf-educ.org>



AND YOU FOR  
YOUR ATTENTION !

# IMPLEMENTATION OF PREDICTIVE MODELS BASED ON METABOLOMICS-DERIVED BIOMARKERS

Gaud DERVILLY-PINEL

S. Chéreau, A. Gicquiau,  
S. Prévost, F. Monteau, B. Le Bizec

**International Symposium on  
Food Safety and Quality:  
Applications of Nuclear and  
Related Techniques**

10-13 November 2014, Vienna, Austria



Laboratoire d'Étude des Résidus et Contaminants dans les Aliments (LABERCA)

USC INRA 1329, Oniris, LUNAM Université

BP 50707, 44307 Nantes Cedex 3, France - [www.laberca.org](http://www.laberca.org)