

Prof. Hélène Soyeurt
Dr. Anthony Tedde

Predictions of dairy related phenotypes using milk mid infrared spectral data



SimBa workshop – 12 May 2023

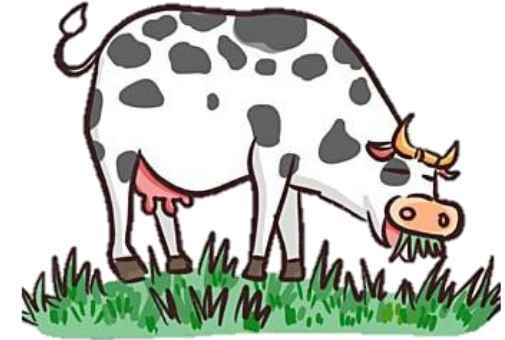




Body Weight - BW



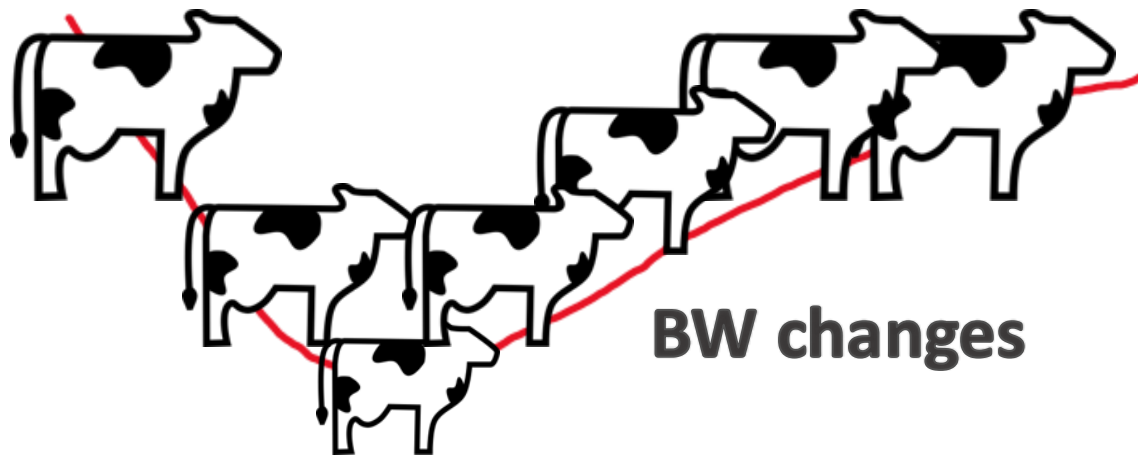
Grazing probability



Intensification level

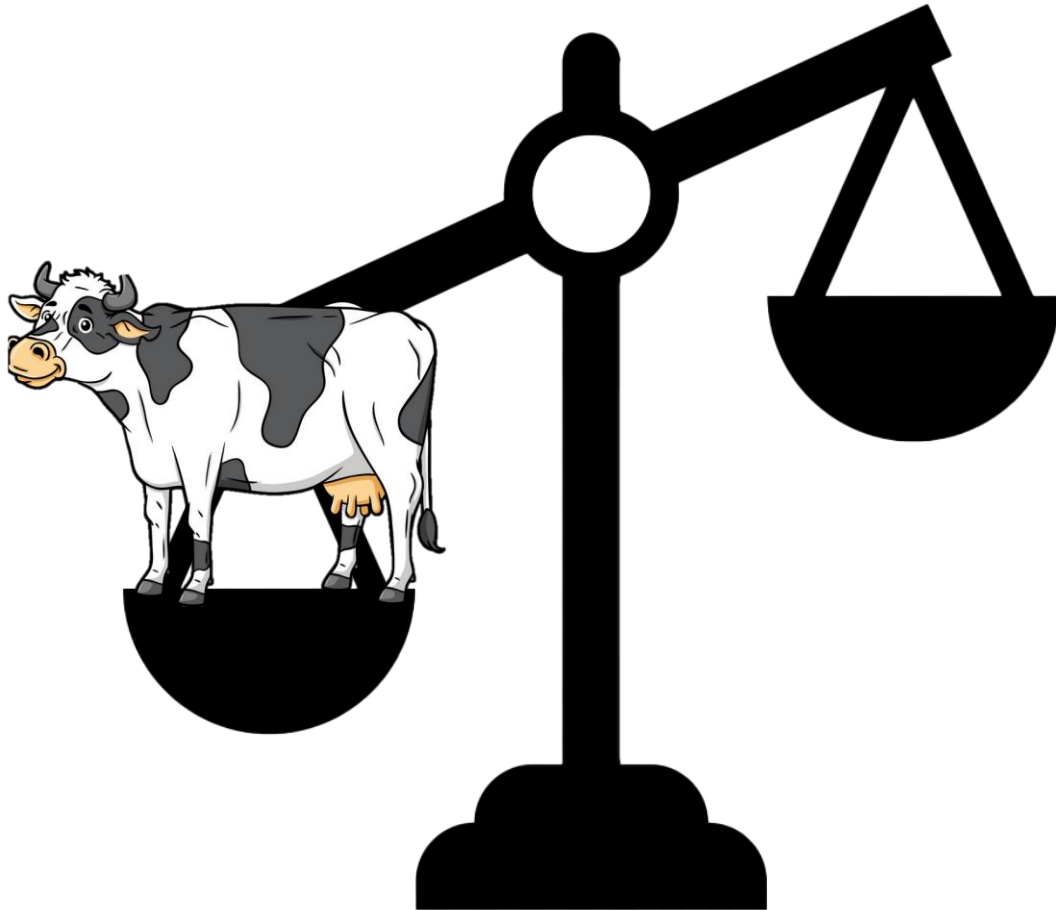


Dalcq *et al.* (2020), PhD thesis





Body weight



Farm management (Thorup *et al.*, 2012),

Disease detection (Berry *et al.*, 2007),

Reproduction performance (Van Straten *et al.*, 2009) ,

Methane production (Herd *et al.*, 2014)

Dry matter intake (National Research Council, 2001)

Dry matter intake

- **Methane production** (Blaxter and Clapperton, 1965; Pelchen and Peters, 1998)
- **Feeding efficiency**
- **Farm management**
- **Body weight** (National Research Council, 2001)



Grazing probability

- Farm management
- Feeding efficiency
- Body weight
- Label for Protected Product
- Consumer's health



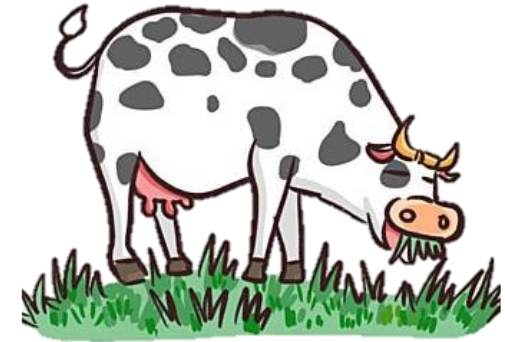


Degree of production intensification

- Decision tool
- Simulation tool
- **Grazing**
- **Economic indicateur**
 - market
 - Milk quality
- **Farm resilience**



Grazing probability



Direct measure

Precision

Cost

Limited scale

Time

Not standardized

Dalcq *et al.* (2020), PhD thesis

Degree of production intensification



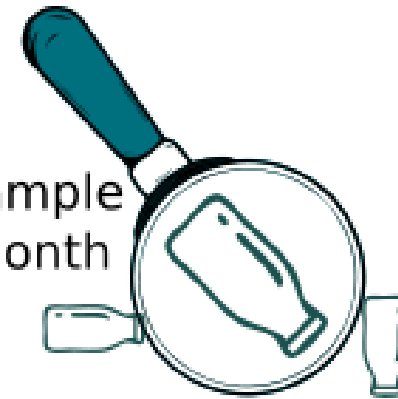
Fast and Cheap Measurements



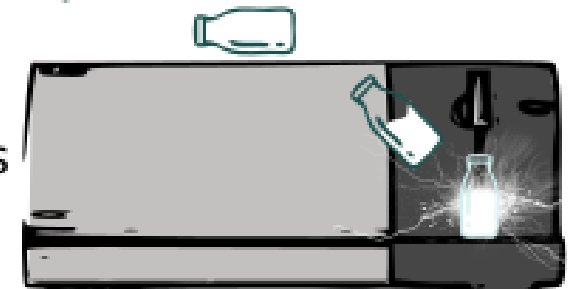


Milk infrared spectrometry

Milk sample
~1 / month

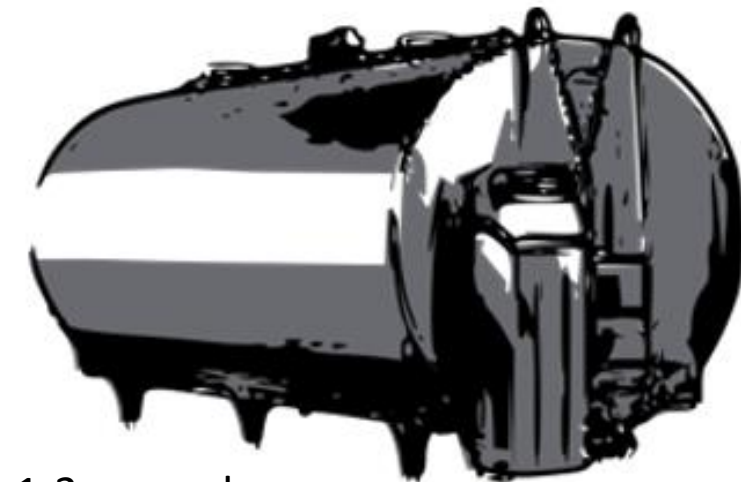
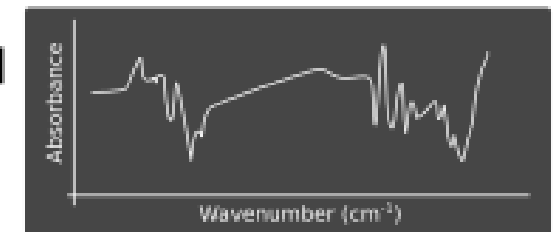


Milk analysis



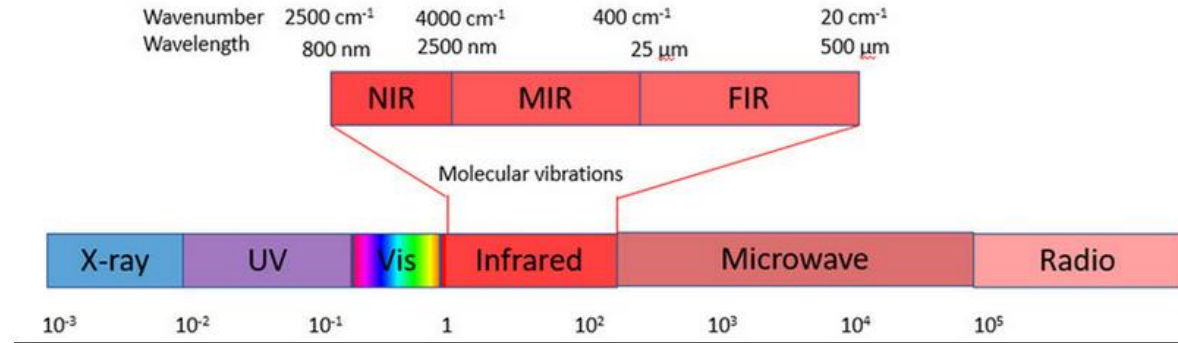
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1	0	1	0	1	1	0	1	0		1	1	0	0	1	1	1
1	1	1		1	1	0	1	1		1	1	0	1	1	1	1
0	0	0		0		1	0	0		0	0	1	0	0	0	0
1	1			1		0		1		1		0	1		1	
0	1			0		1		1				1	1		0	
1				1				1				1	1		1	

Mid infrared
spectrum
data



1-3 every day

Milk Analysis

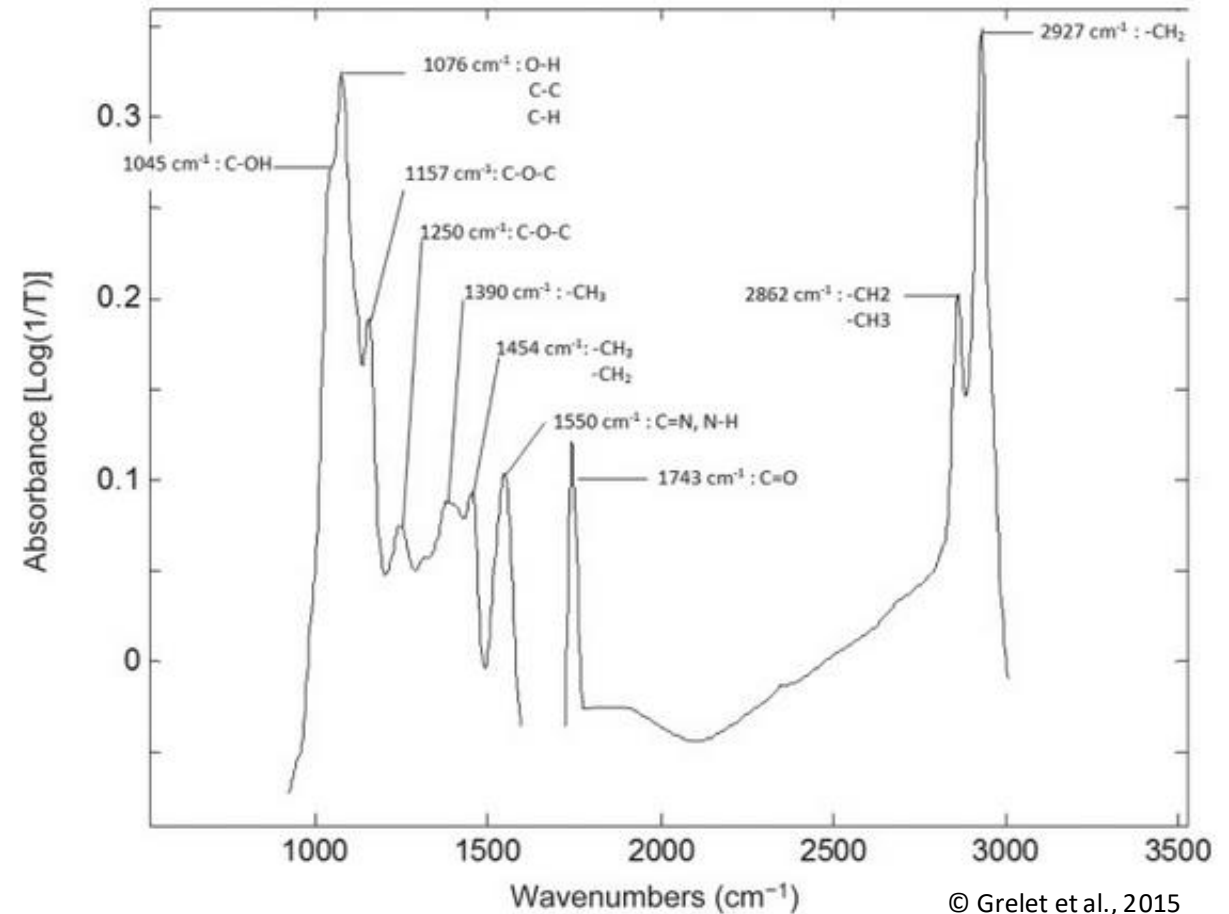


© Foss

Milk MIR spectrum

=

Absorption of infrared ray at frequencies related to the vibrations of specific chemical bounds in milk

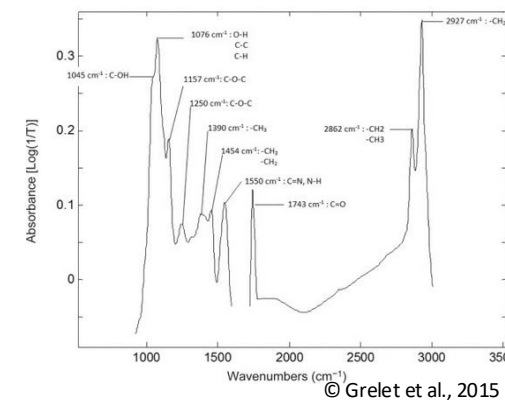
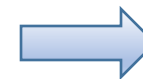


© Grelet et al., 2015

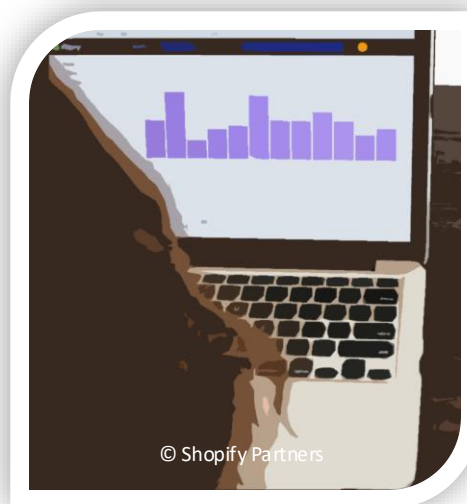
Milk Analysis



Milk samples



Predictive model = Equation



What exists ?



Consumption
index, nitrogen
efficiency ...

Sustainability

Nutritional
quality

Fat, protein,
lactose, fatty
acids, Ca,
lactoferrin,...

Technological
properties

Cheese yield,
yoghurt yield,
butter yield,
spreadability ...



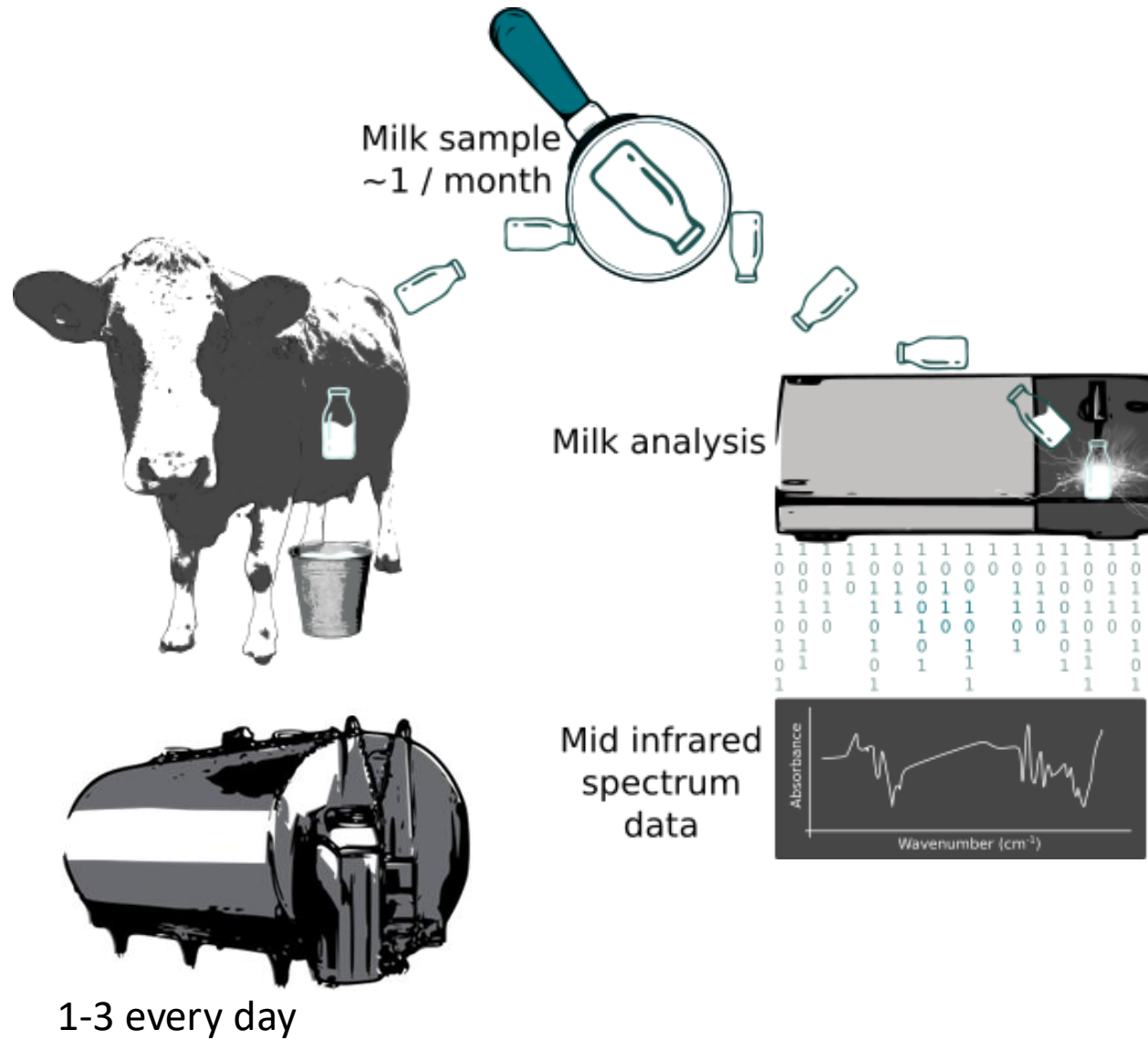
Methane, P,
urea ...

Environmental
fingerprint

Animal Health

Na, lactoferrin,
Energy balance,
acetone, BHB,
citrate ...

Abnormal milk samples



Cheap

Routine

Historical data

Large scale

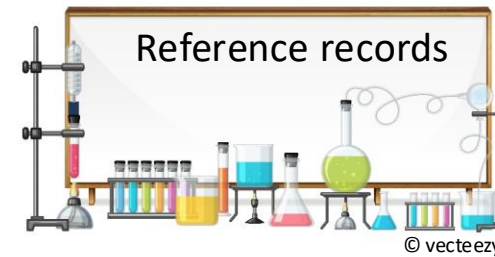
Indirect measure

Precision

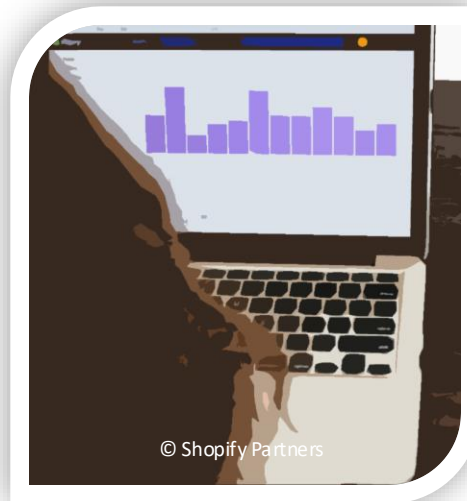
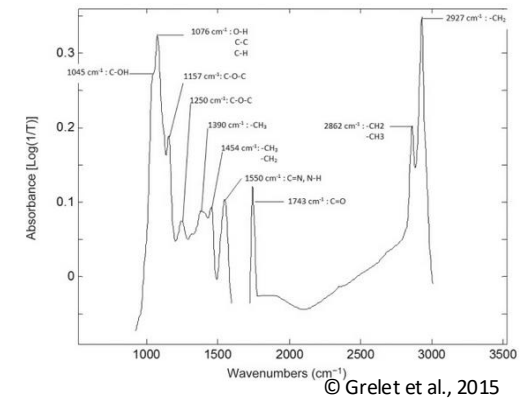
Milk Analysis

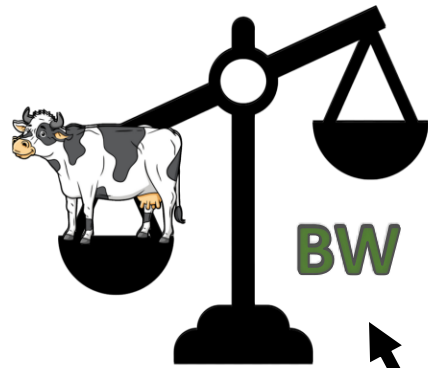


Additional traits = new equations !



Predictive model = Equation



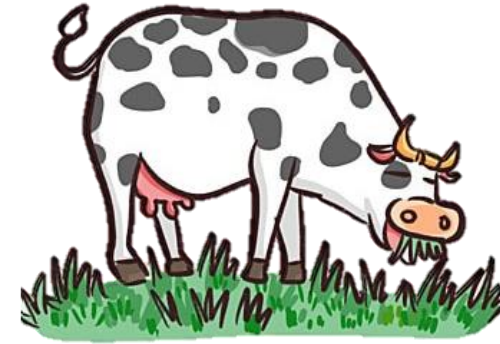


BW

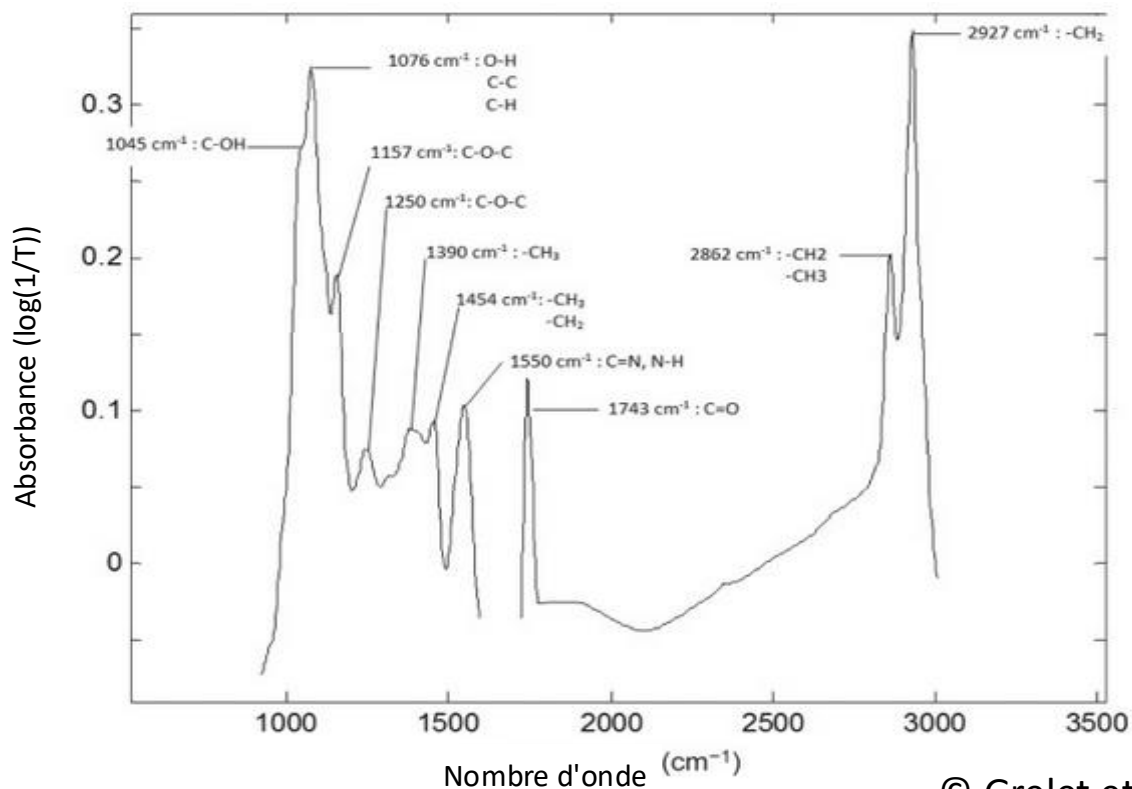


Dry matter intake

Grazing probability



Degree of production intensification



© Grelet et al., 2015



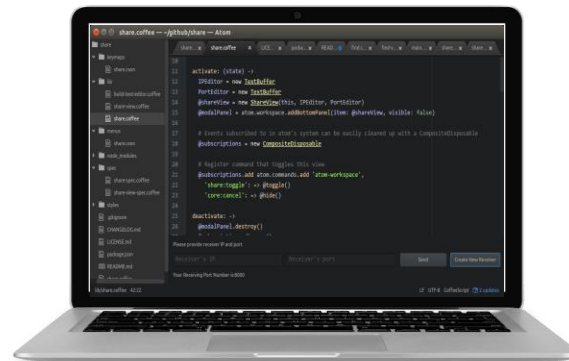
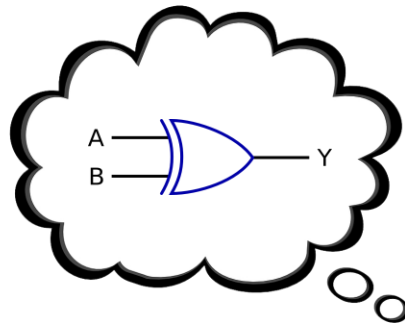
Create new
equations



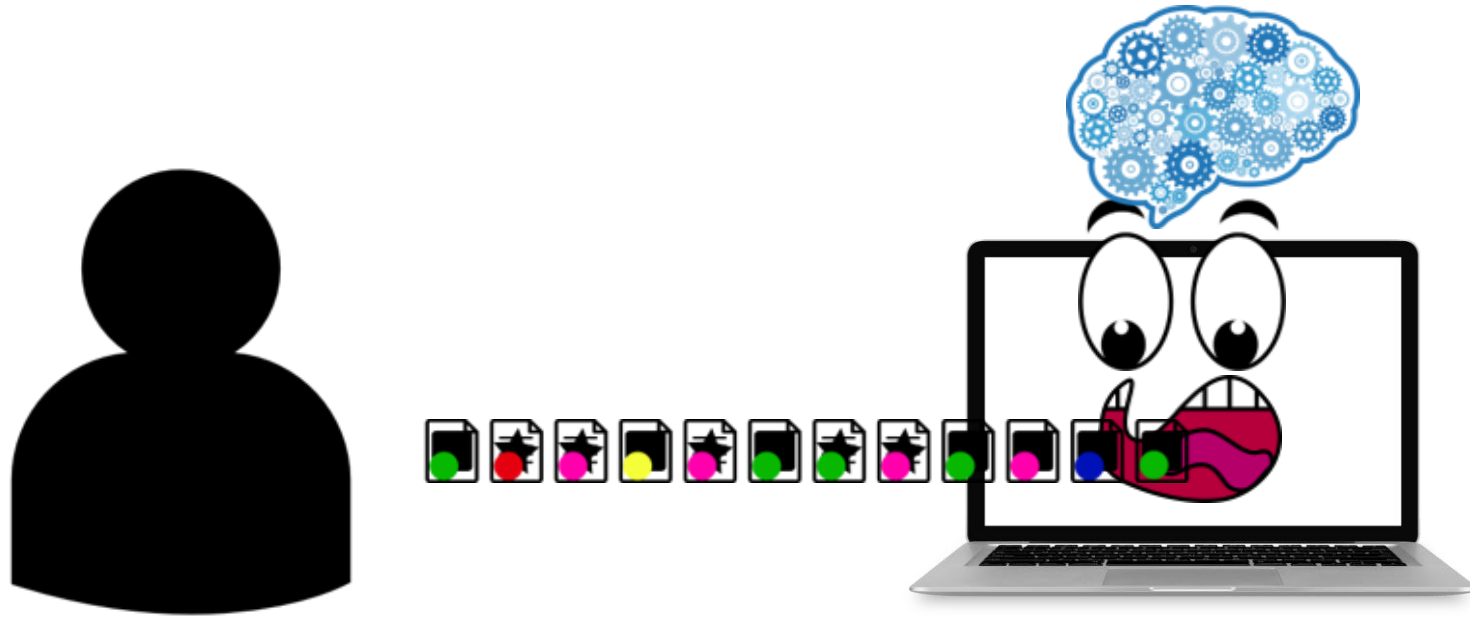
Prediction: automatic learning



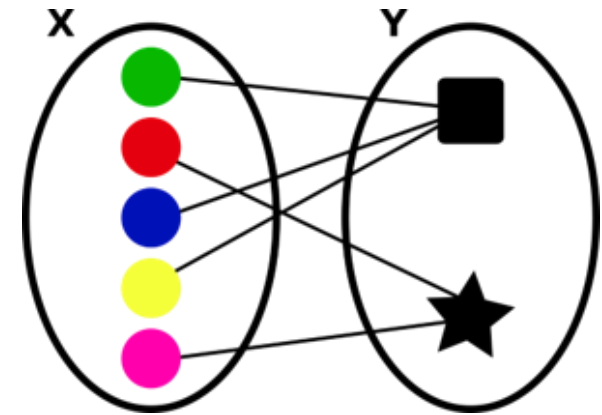
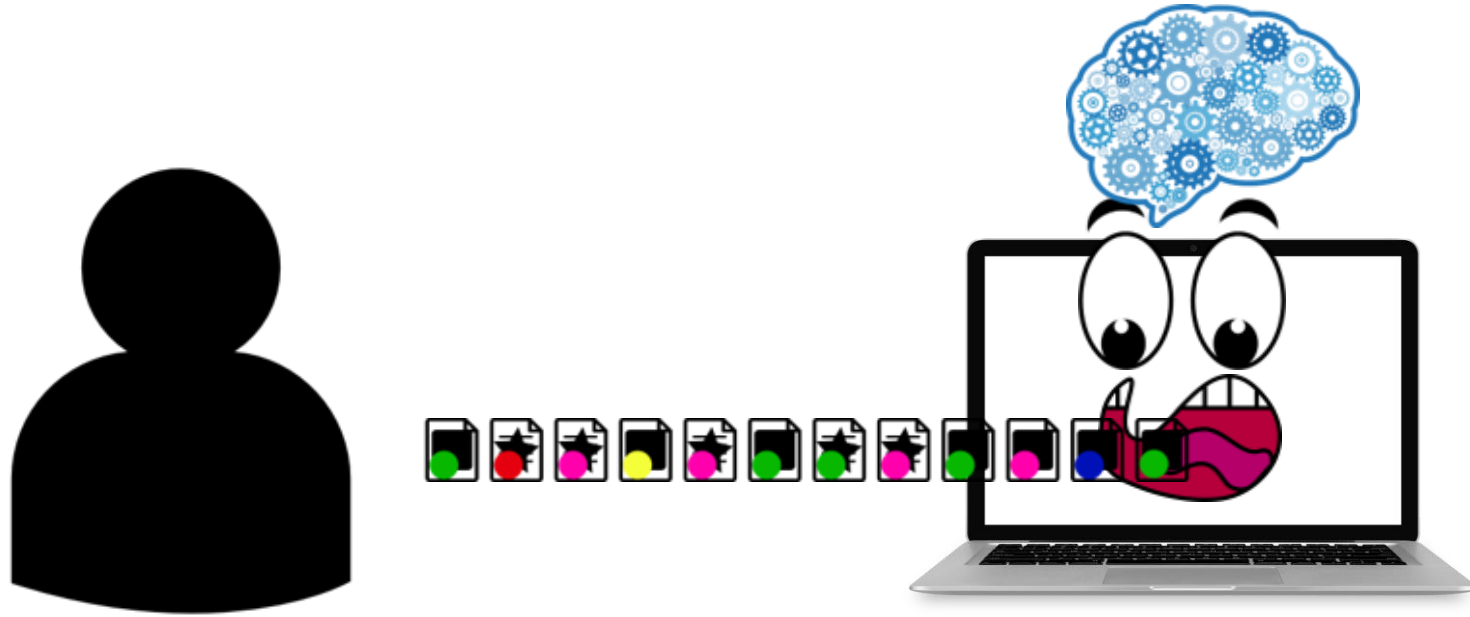
If **A** or **B** then **Y**



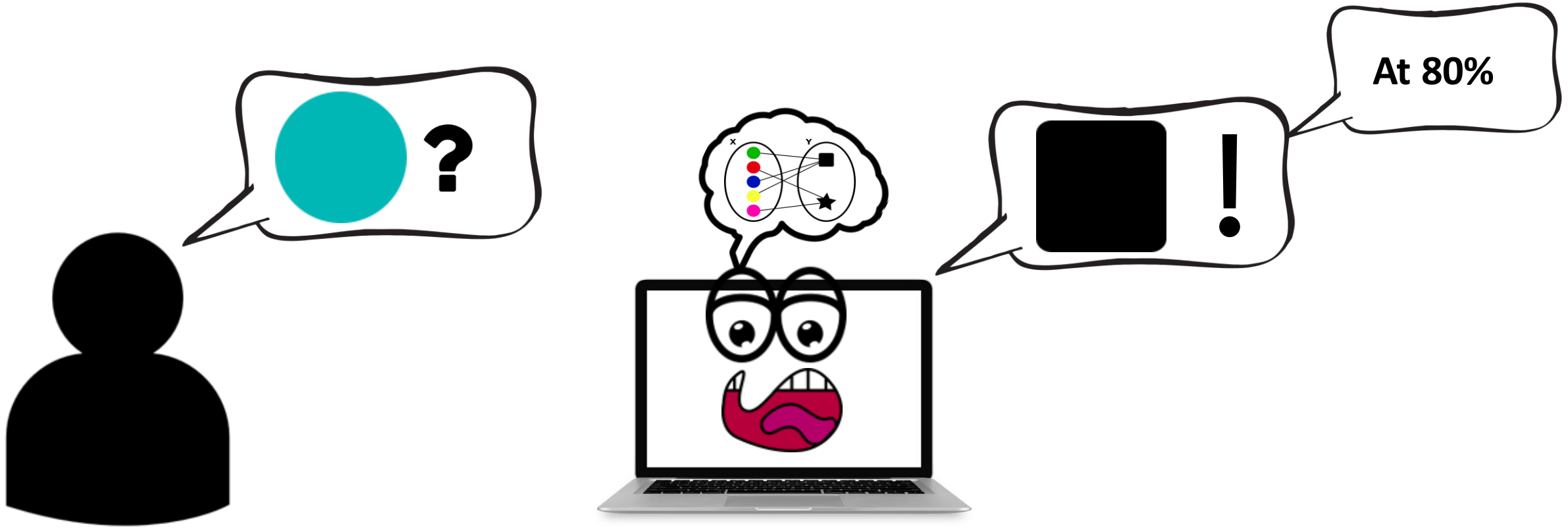
Prediction: automatic learning



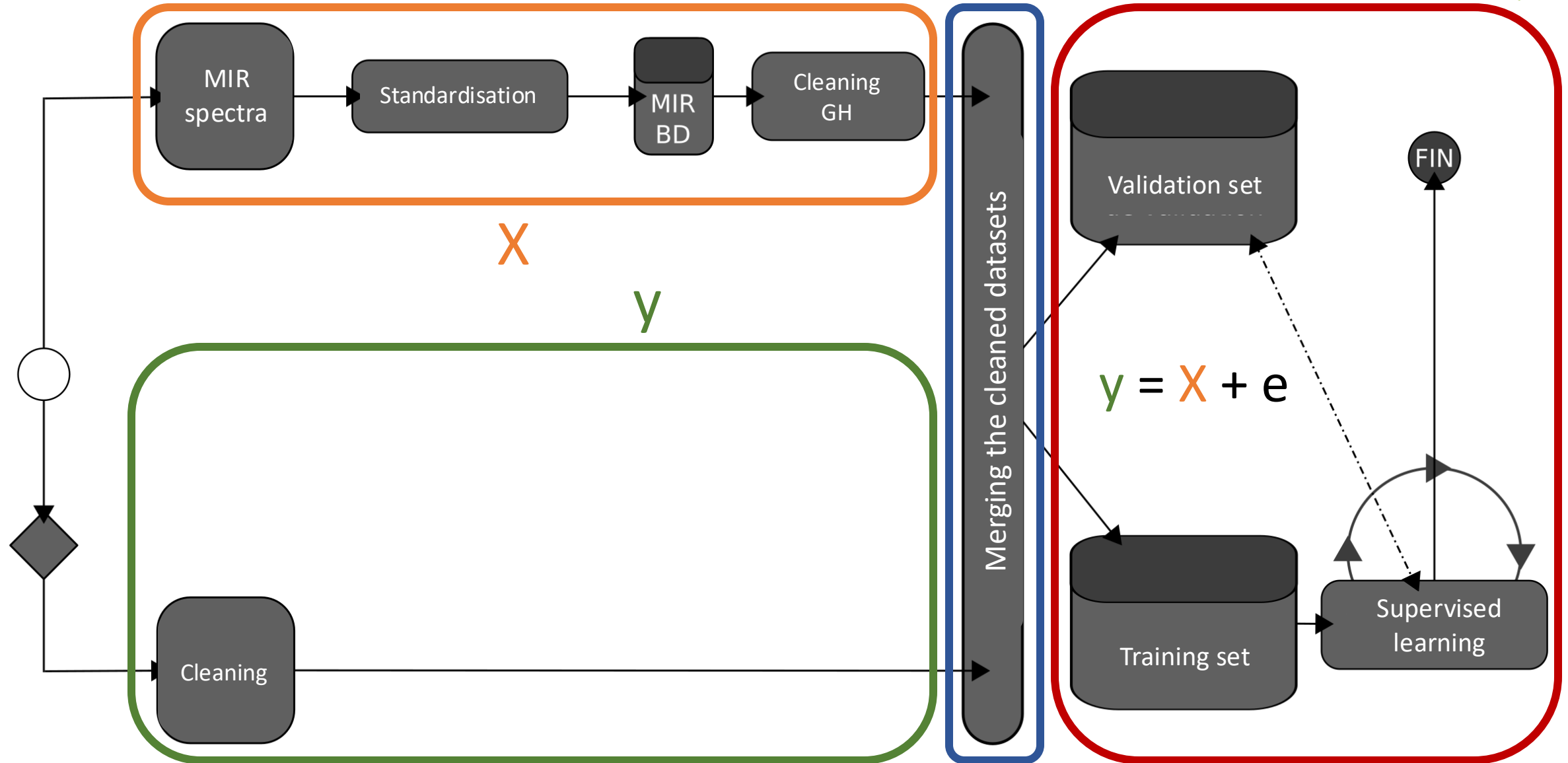
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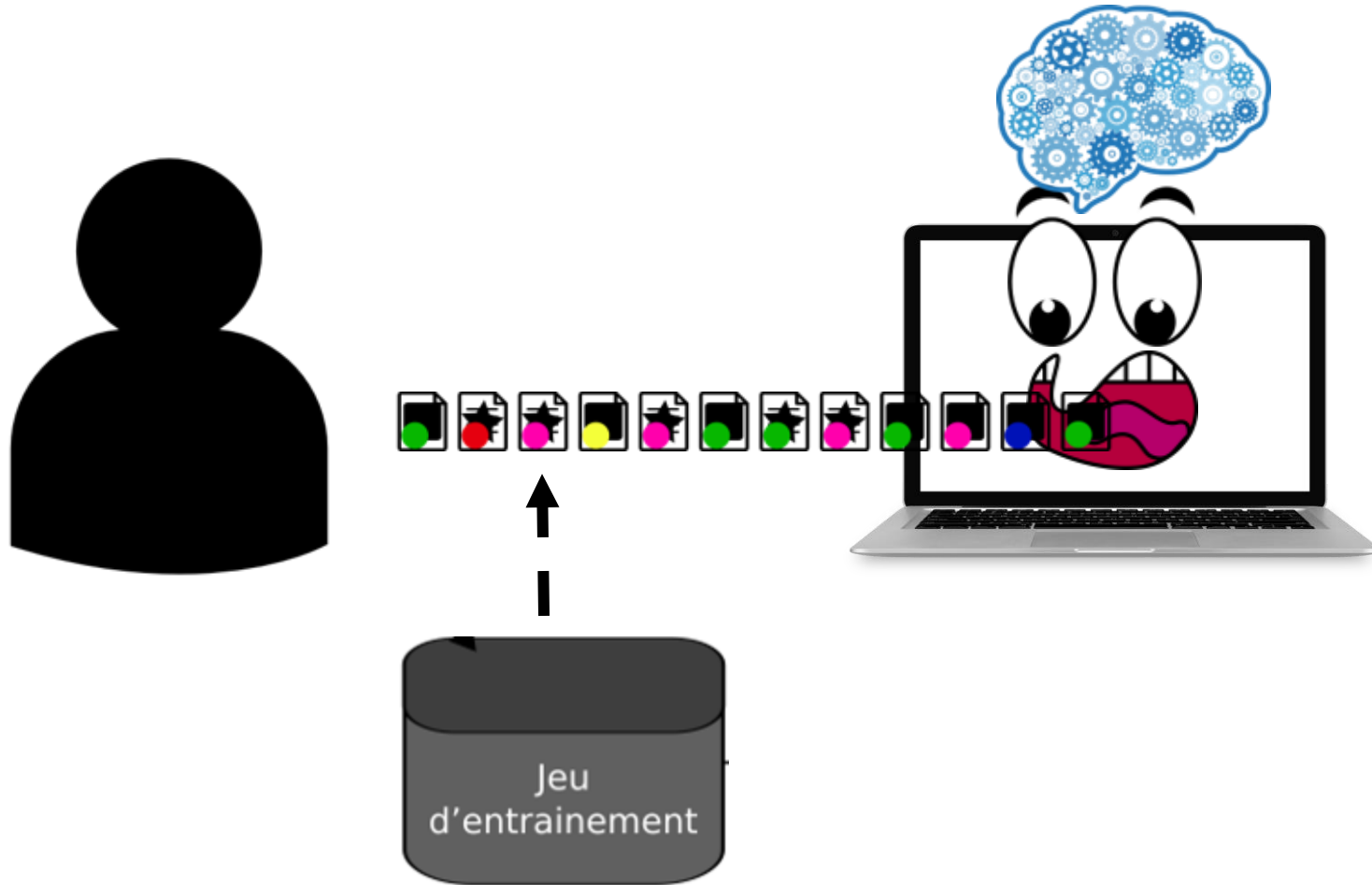
Prediction: automatic learning



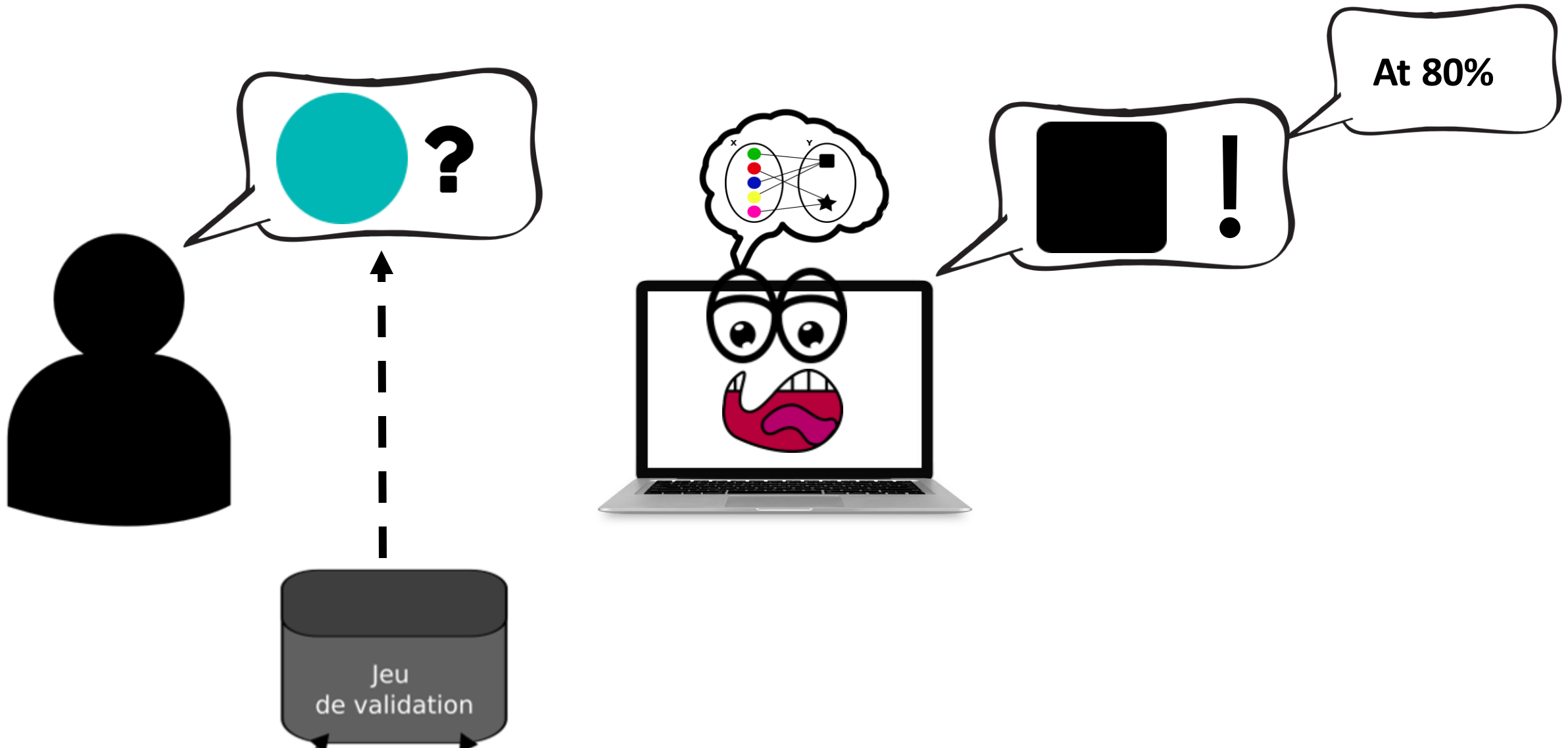
Modeling : Usual practises



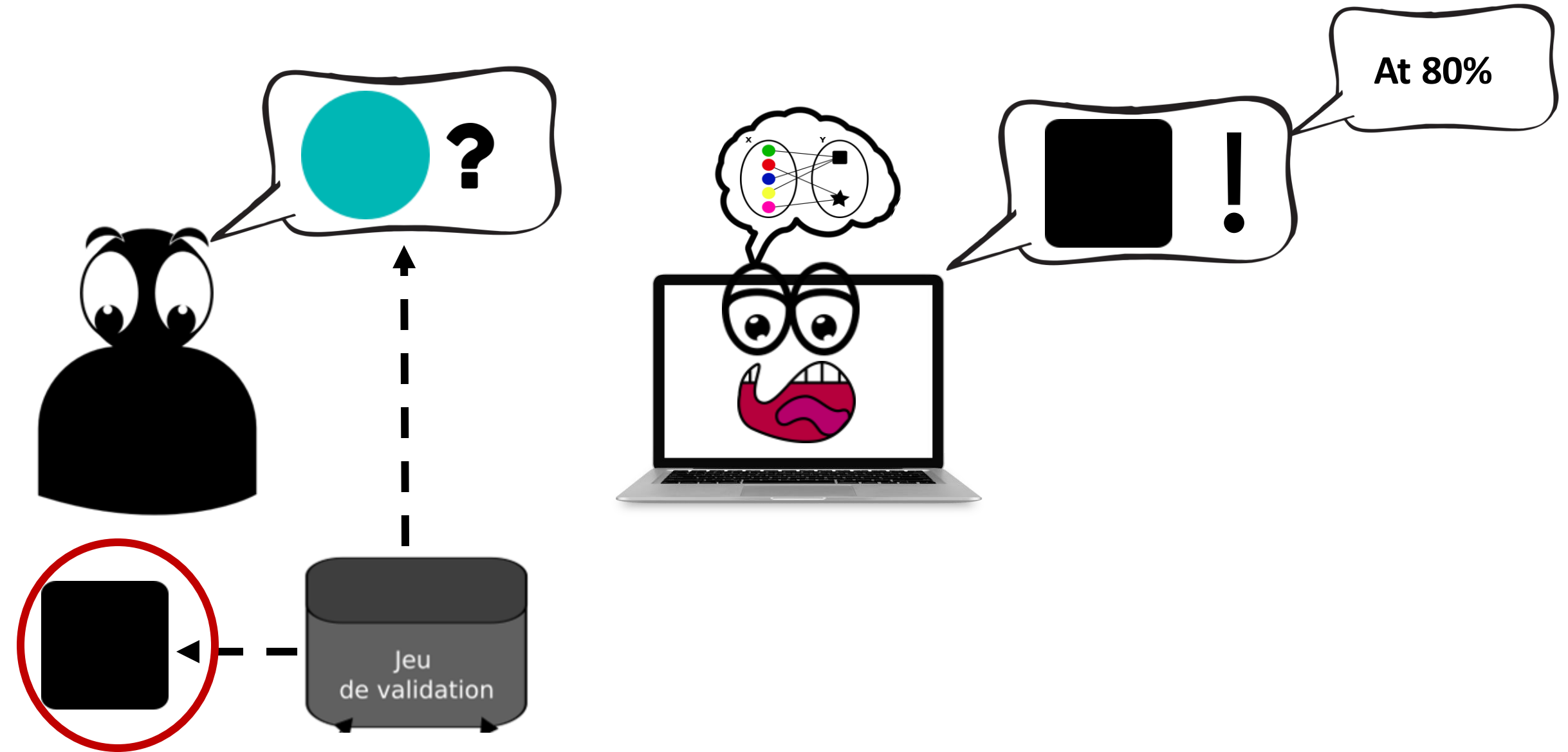
Prediction: automatic learning



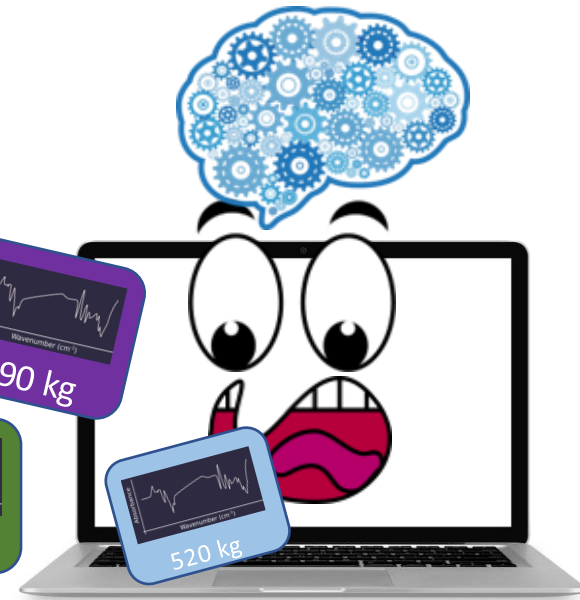
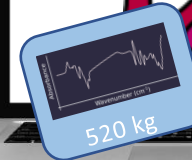
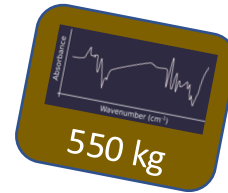
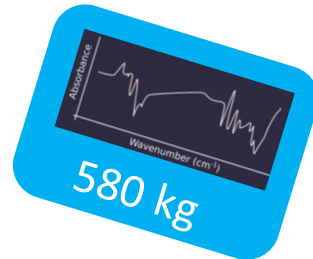
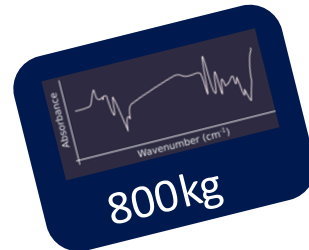
Prediction: automatic learning



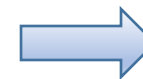
Prediction: automatic learning



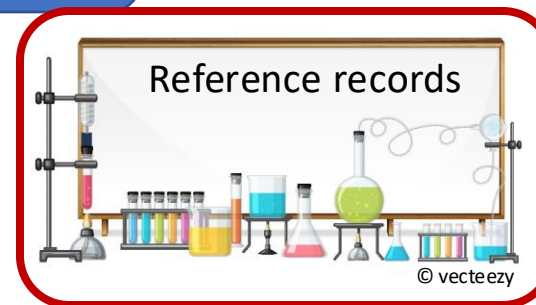
Same idea, for instance ...



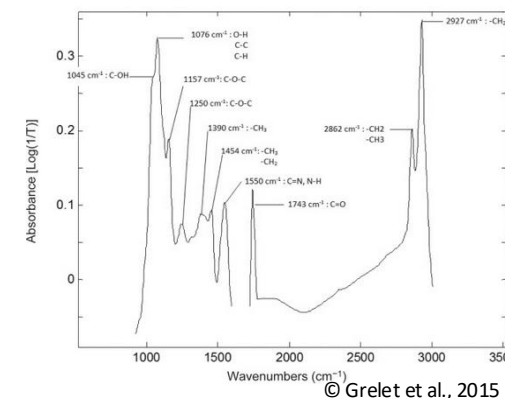
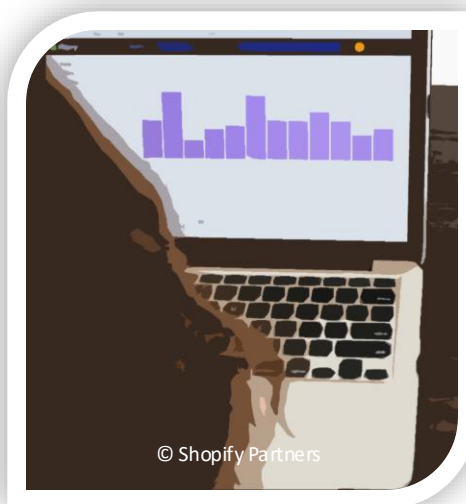
Milk Analysis



Additional traits = new equations !



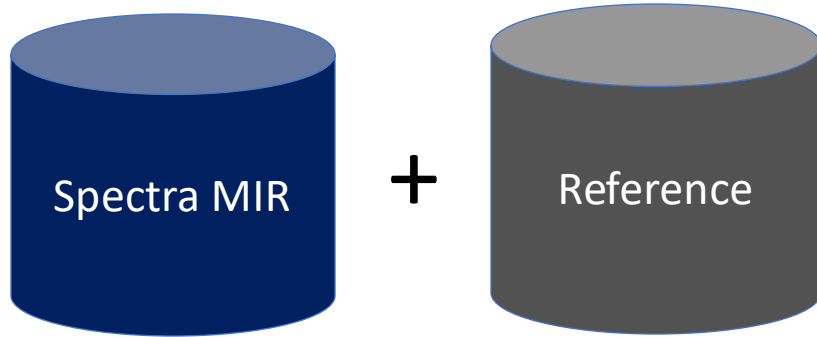
Predictive model = Equation



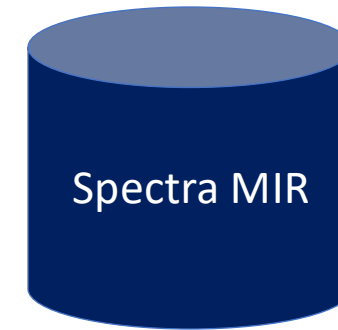
Information level : 3 cases in the SimBa project



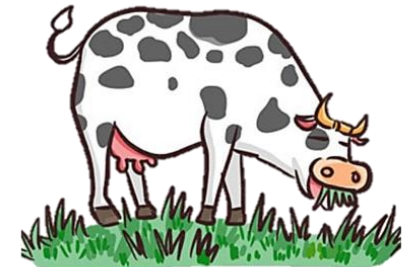
Complete references



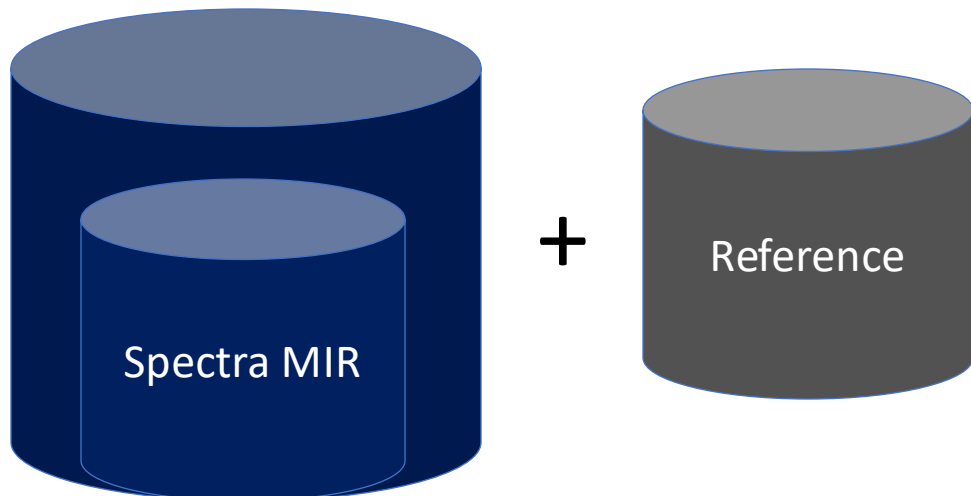
No reference values



Grazing probability



Semi-complete references



Degree of production intensification



Complete references

Strength

Many different methodologies

Weakness

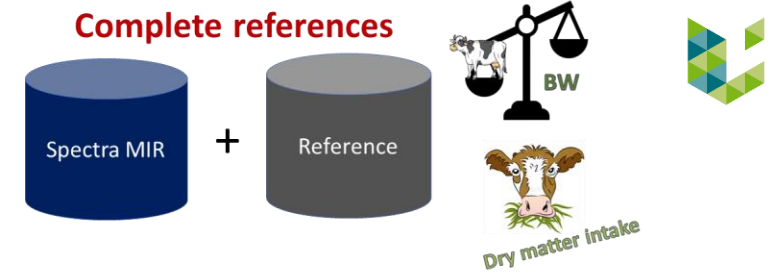
Fiability of reference values

Opportunity

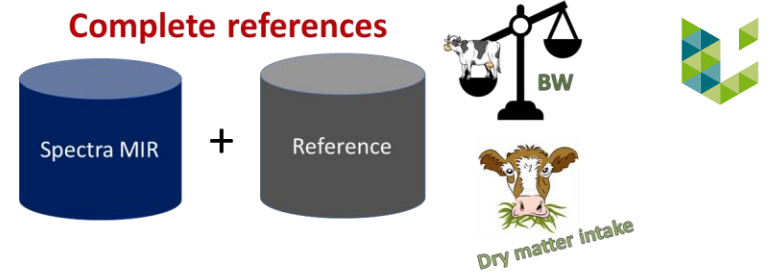
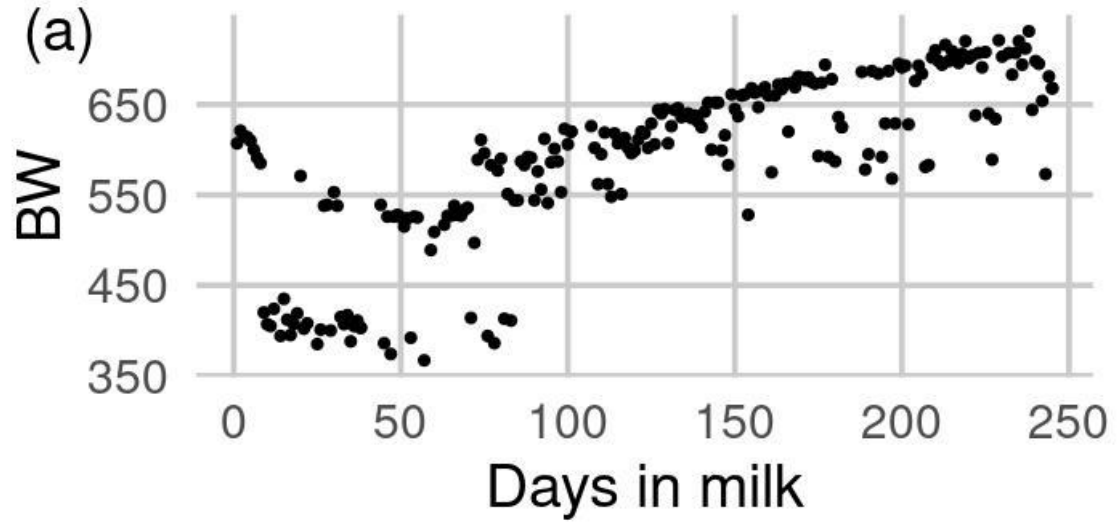
Improving existing equations

Threat

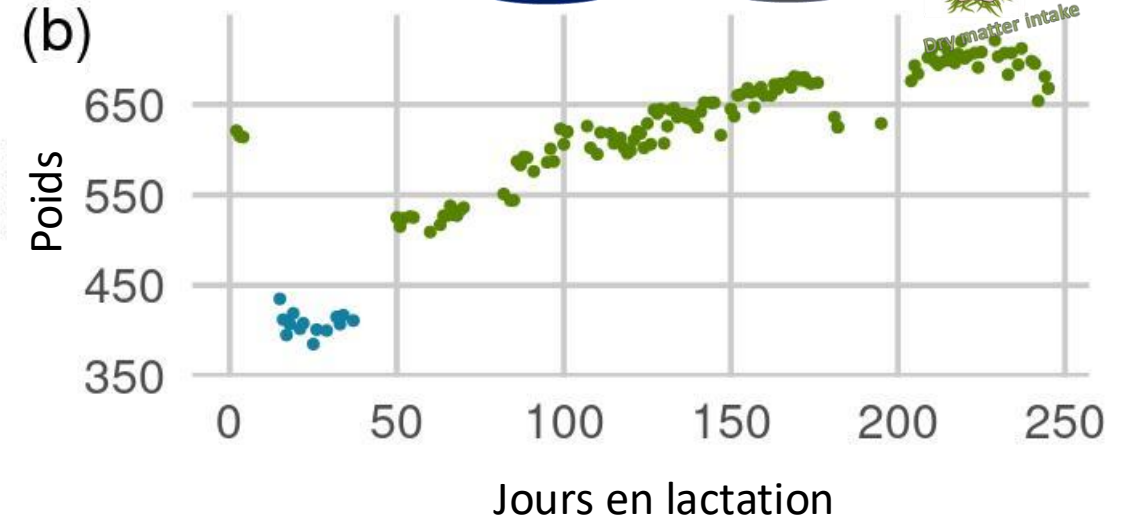
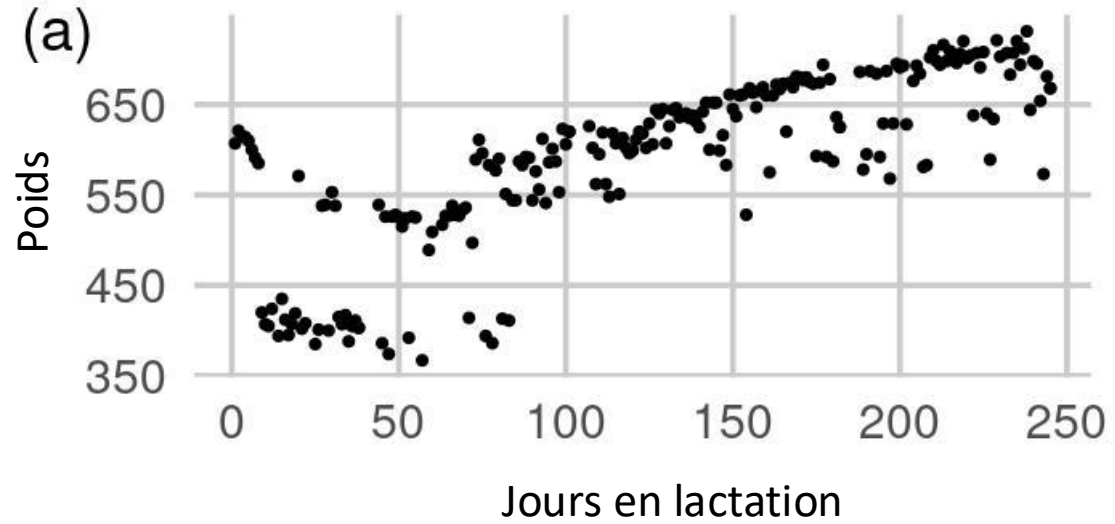
- Lack of explanatory analysis
- Over-confidence



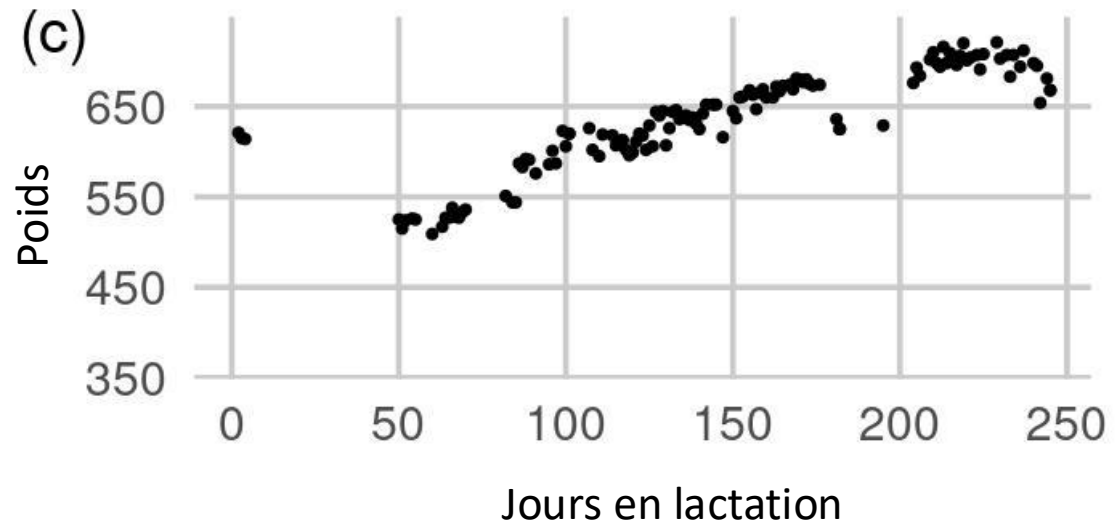
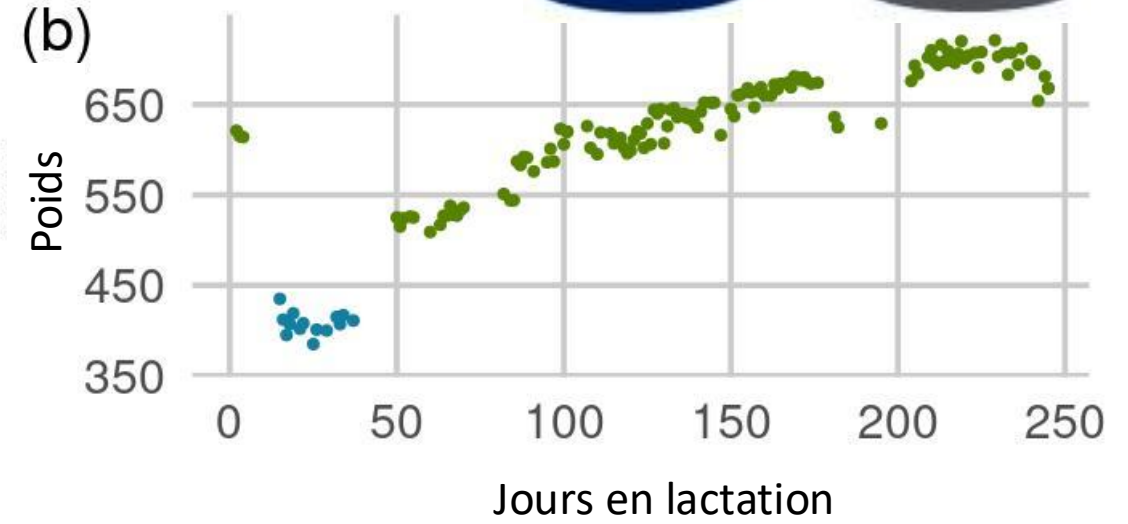
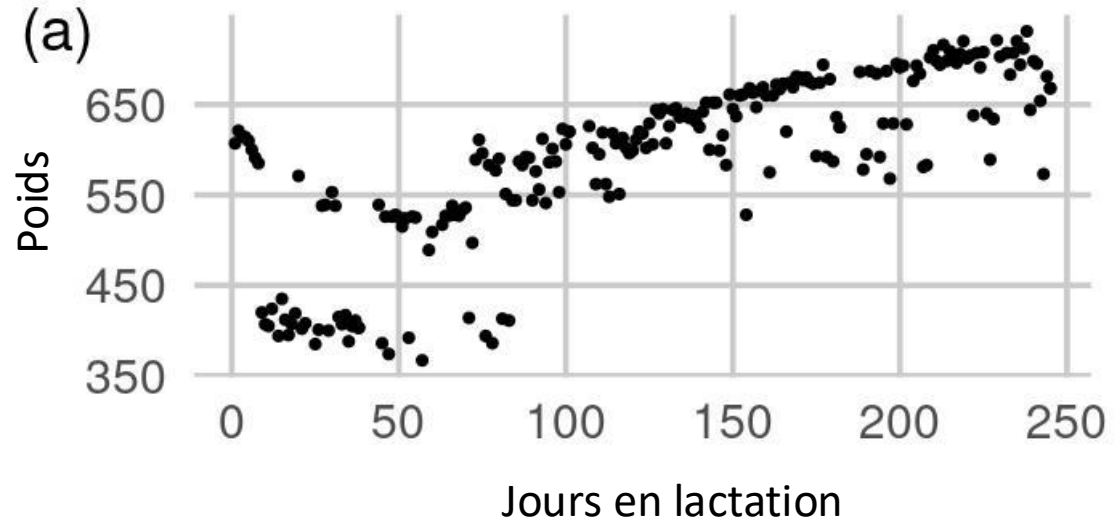
Complete references



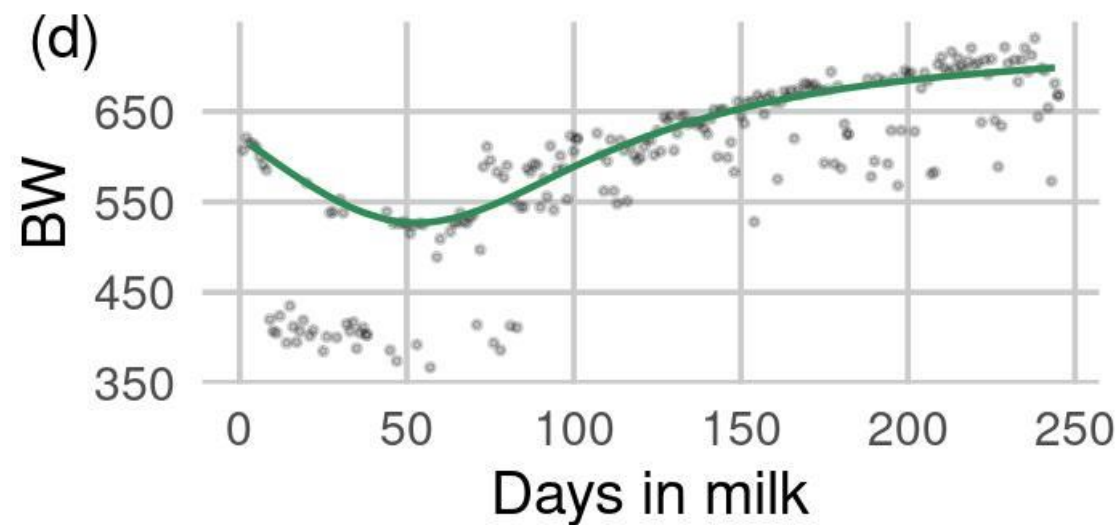
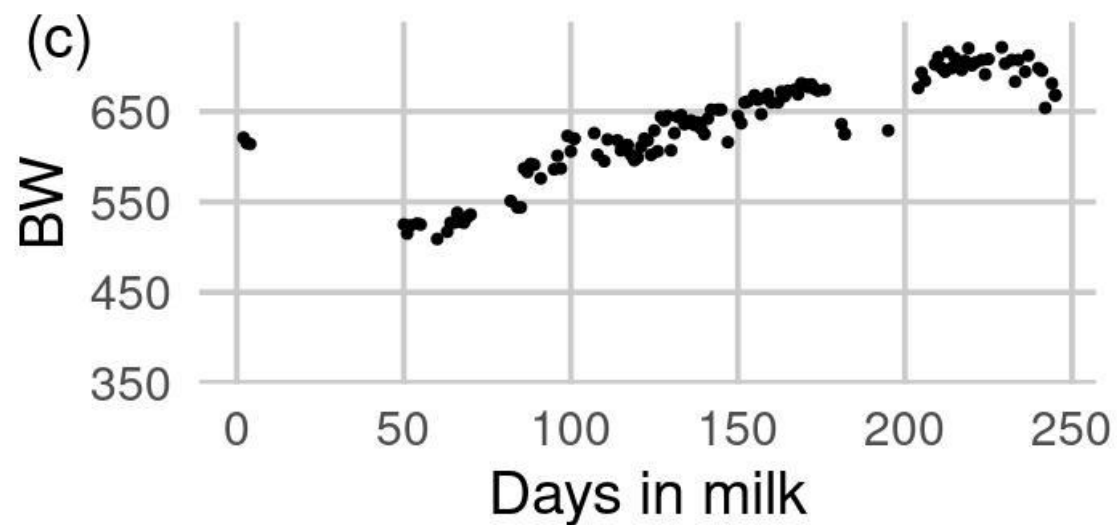
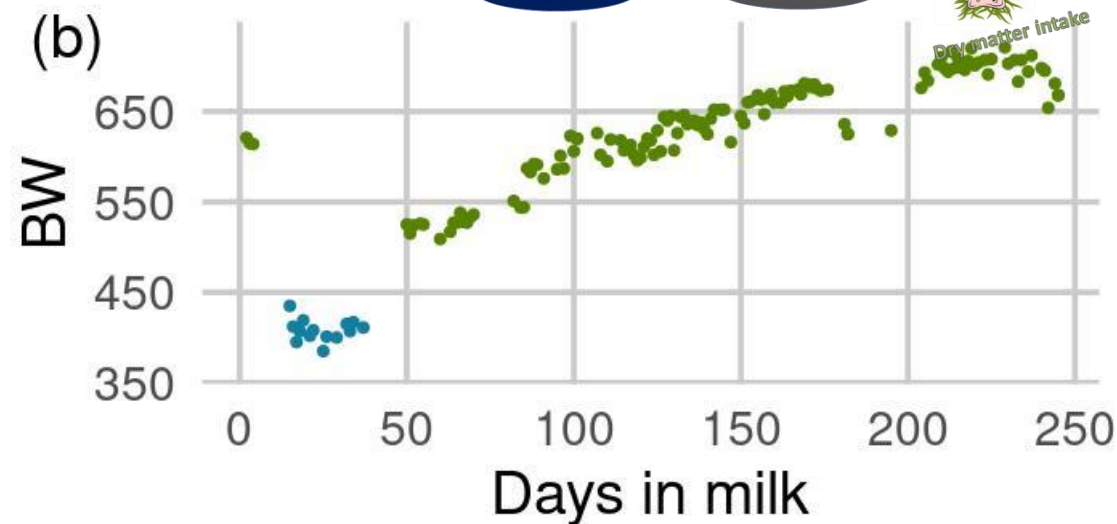
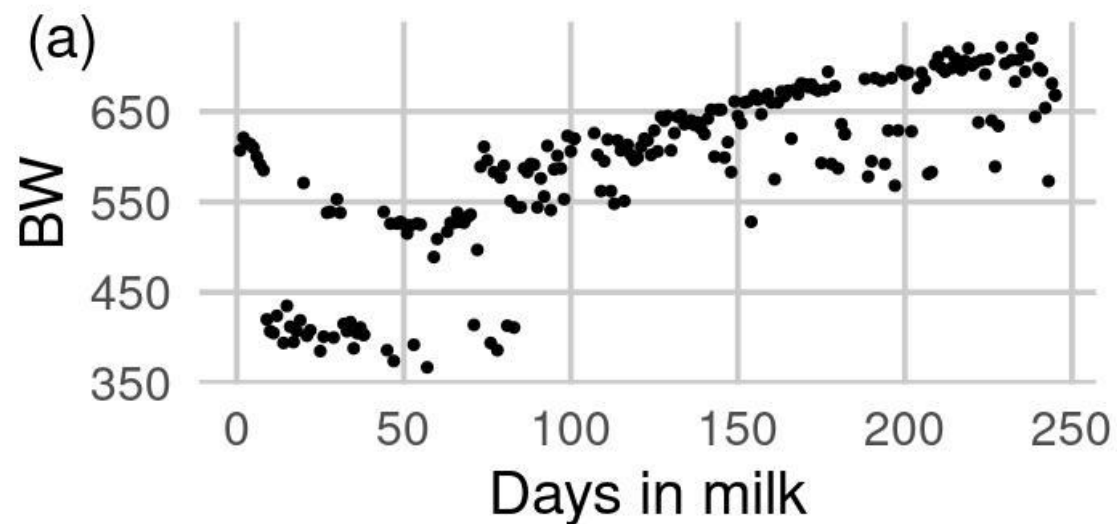
Références complètes



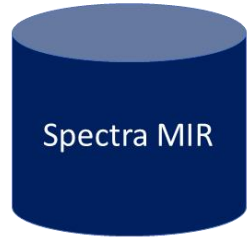
Références complètes



BW is a good example

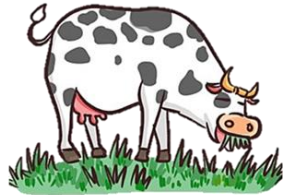


No reference values



+

Grazing probability

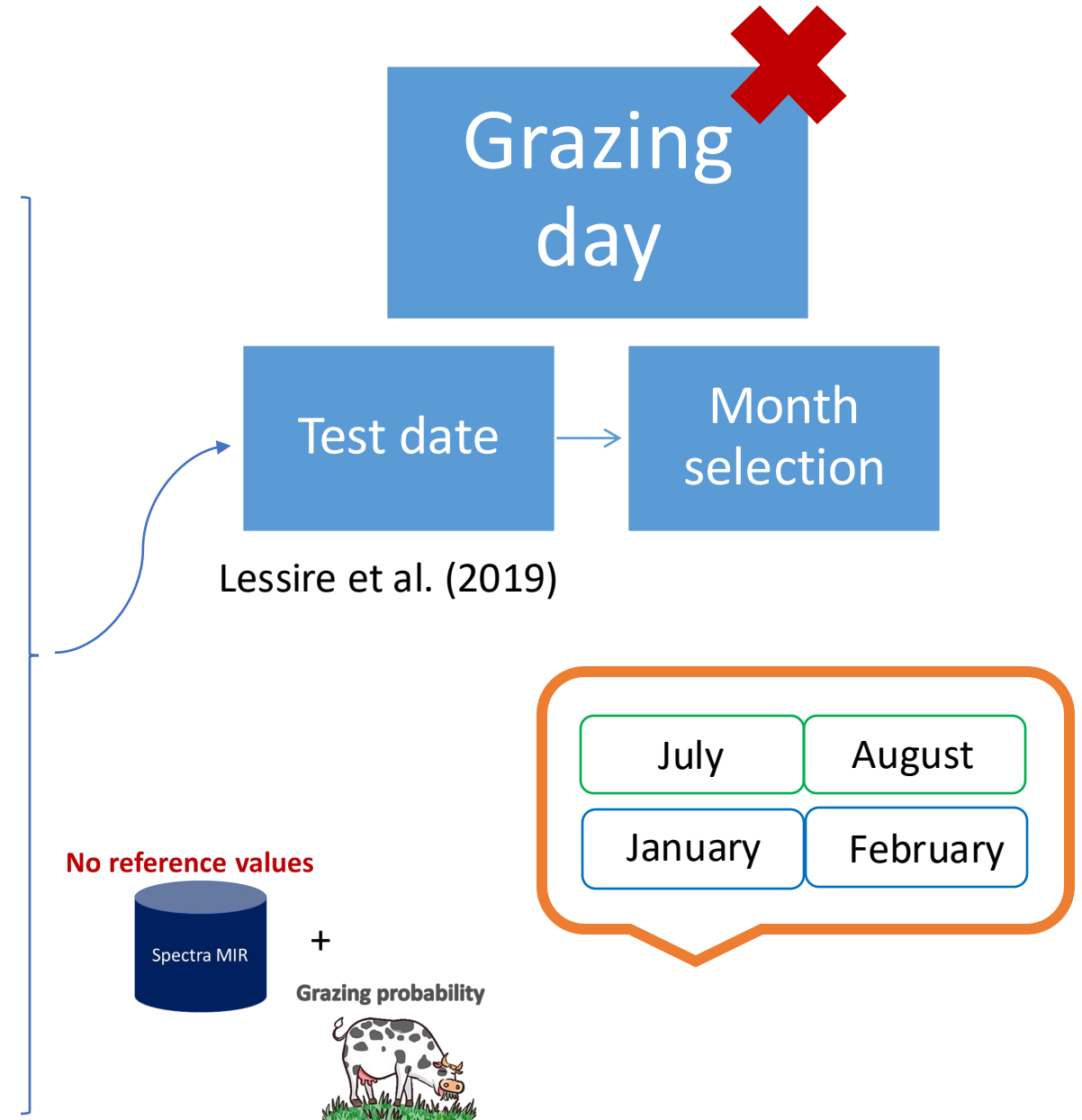
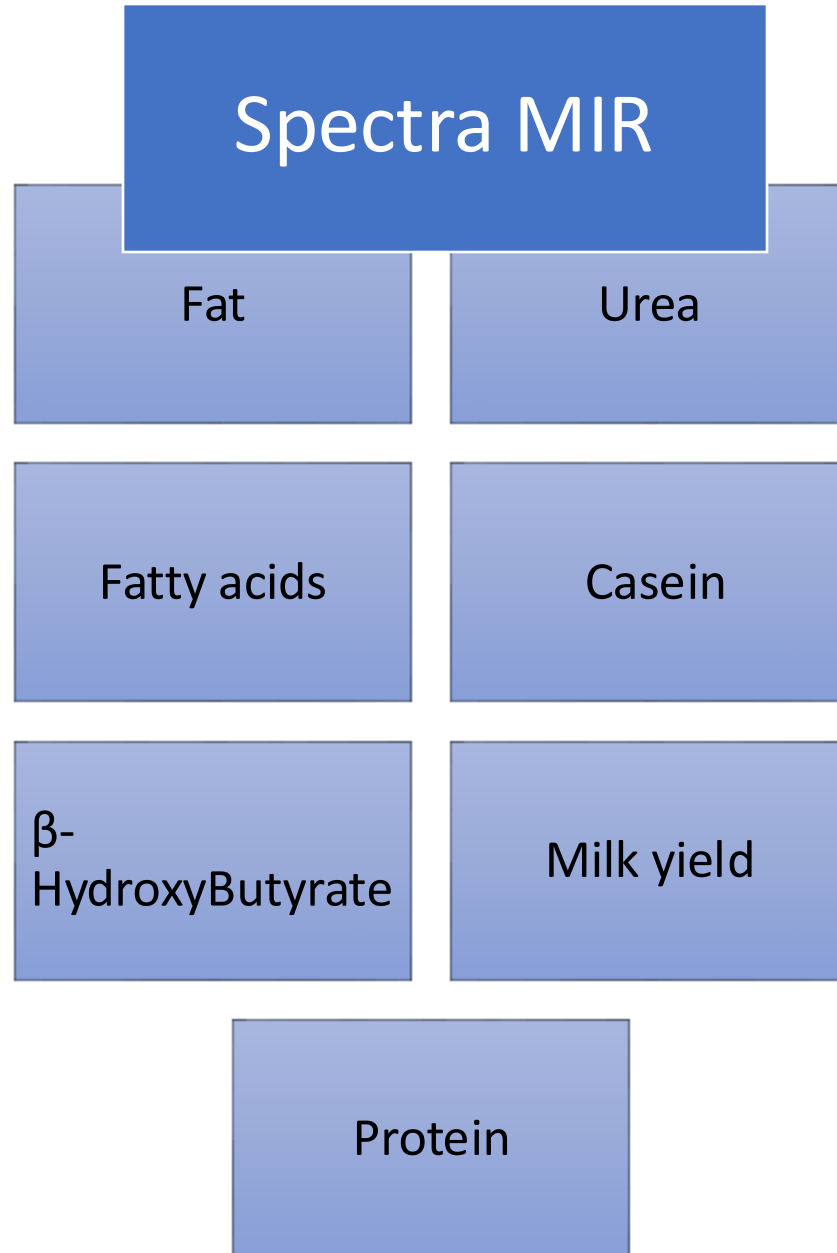


Spectra
MIR

~~Grazing
day~~



Grazing probability



Complete references

Strength

- Strongly dependent of the studied population
- Need to a data structure

Weakness

- Wrong references
- Bias can be present

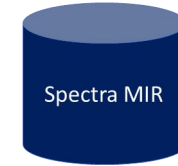
Opportunity

Creation of new phenotypes

Threat

Model having a weak generalisation

No reference values

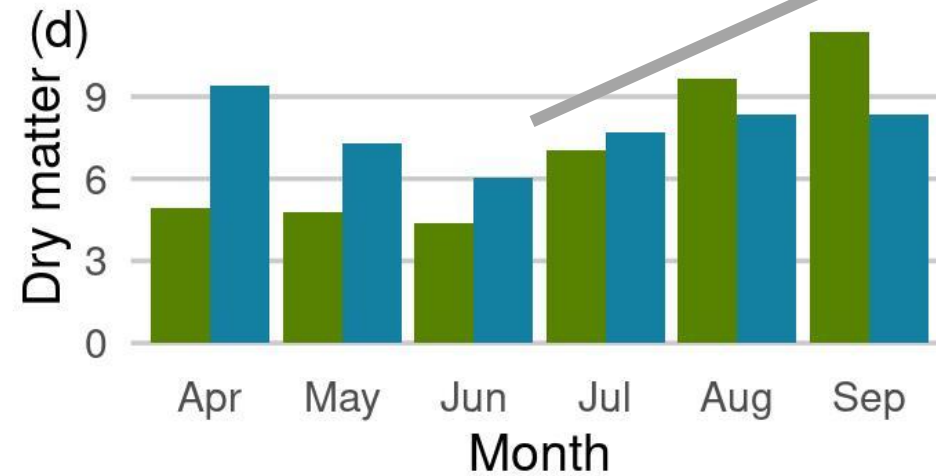
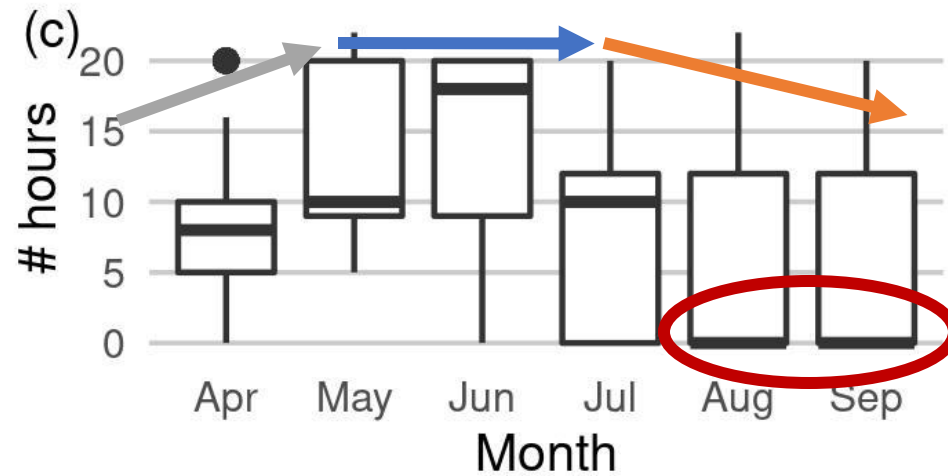
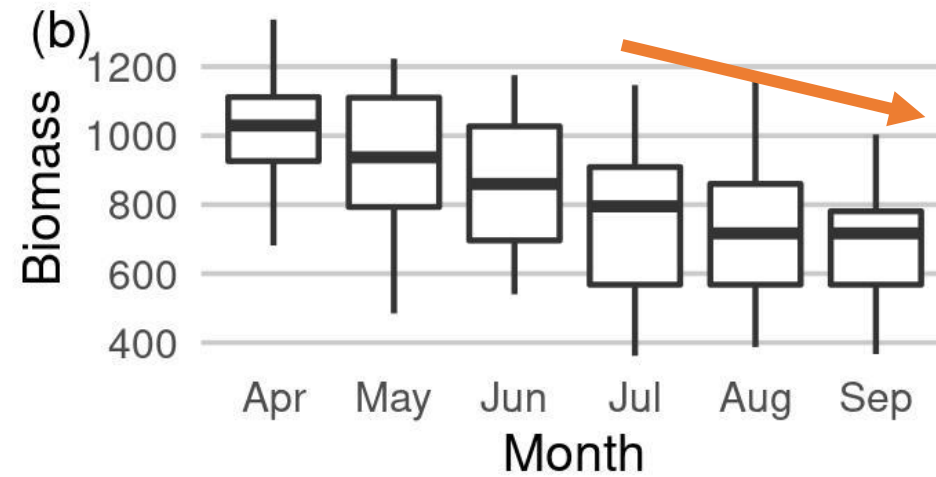
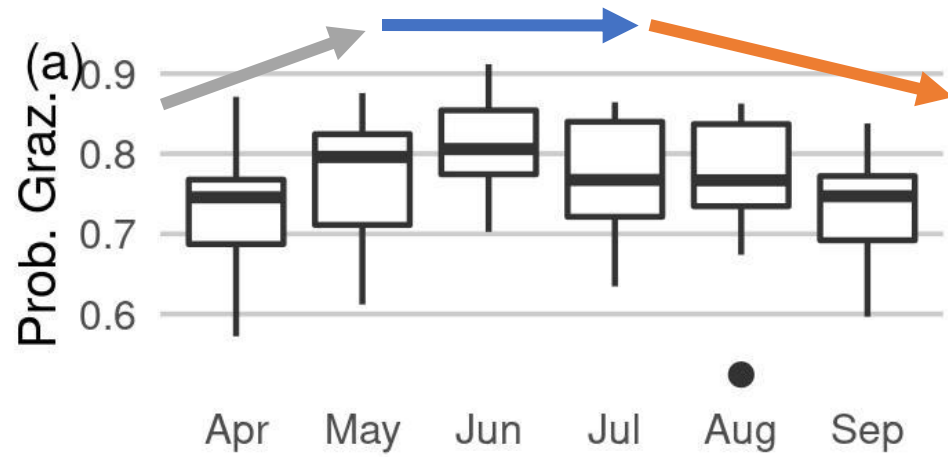


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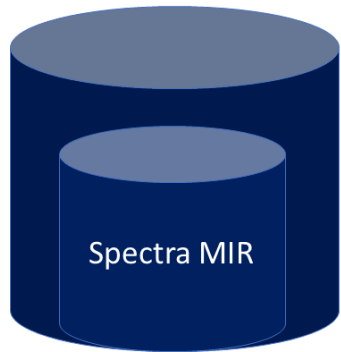
Grazing probability



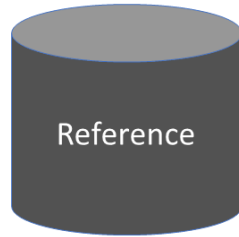
A validation is highly needed



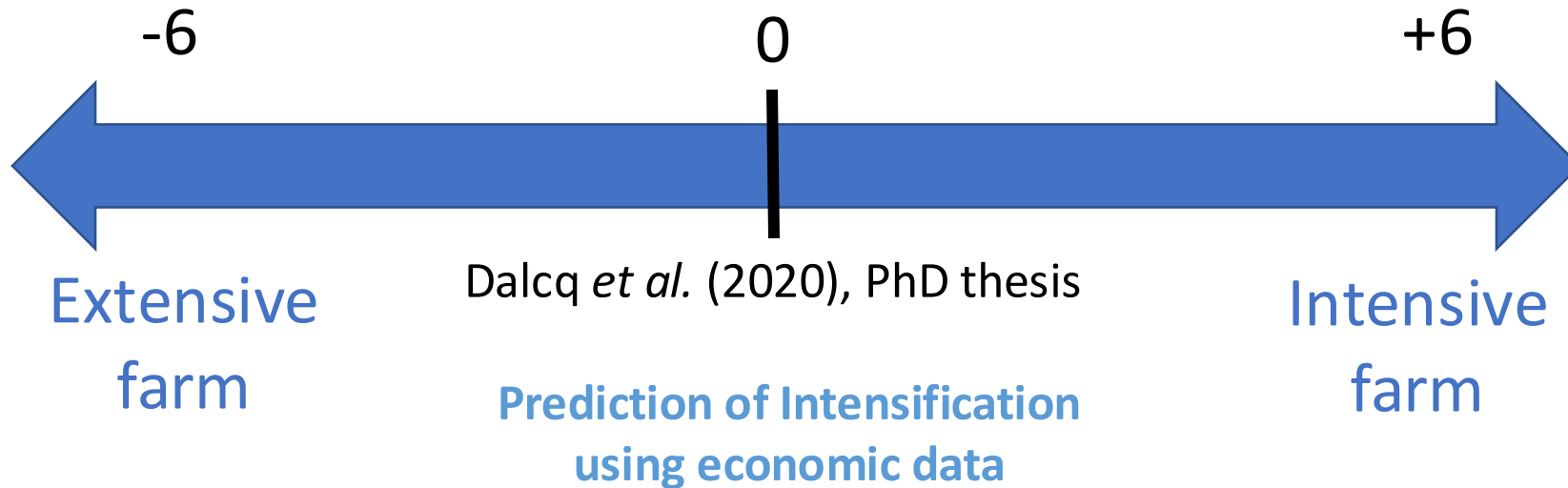
Semi-complete references



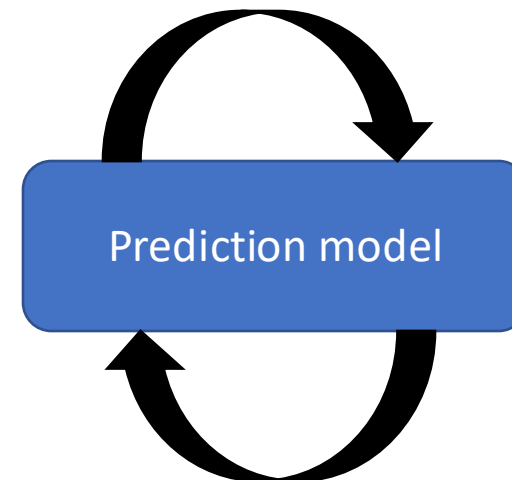
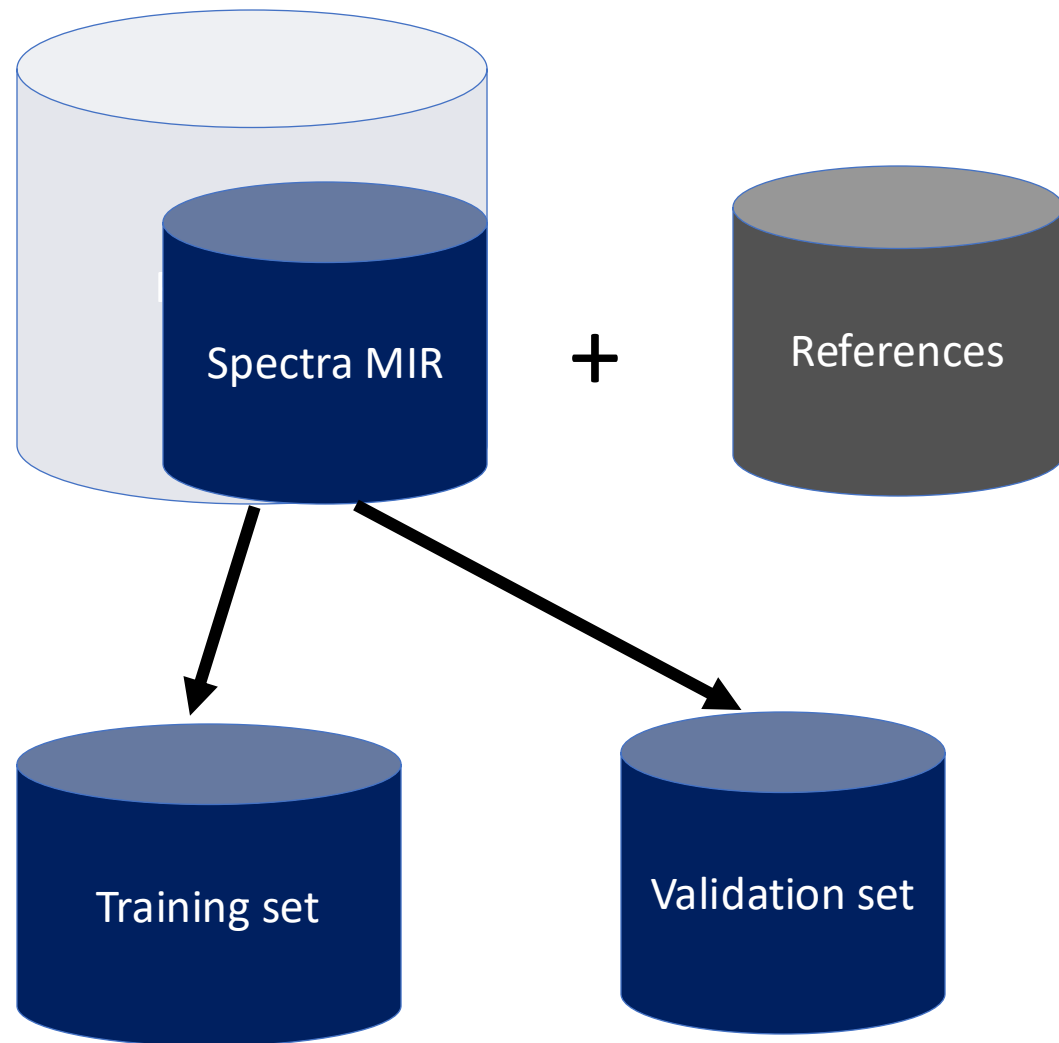
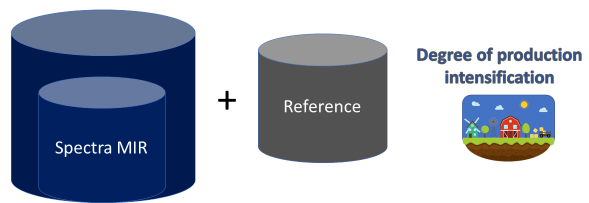
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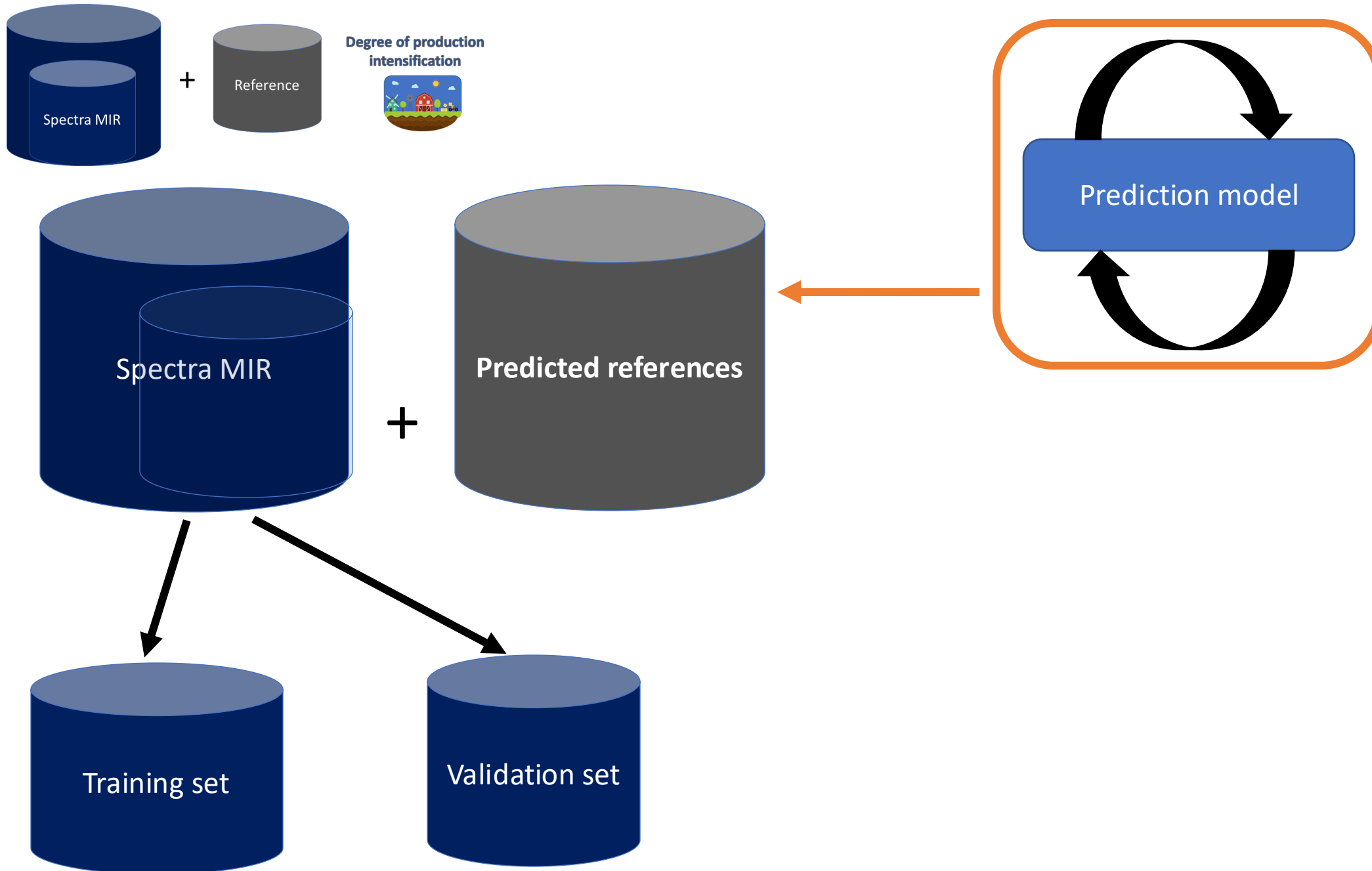
Degree of production intensification



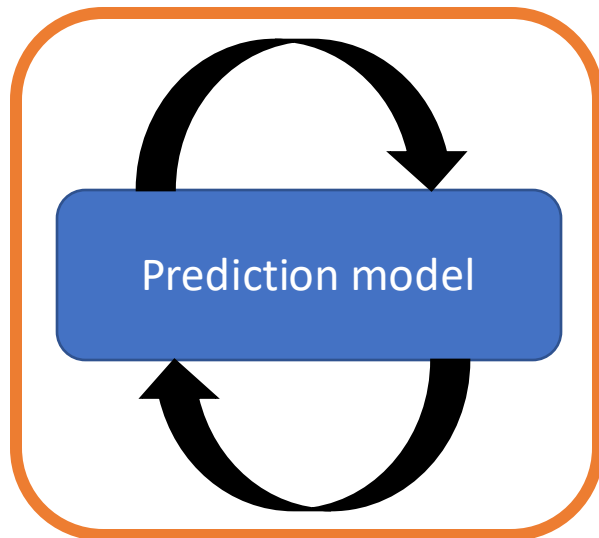
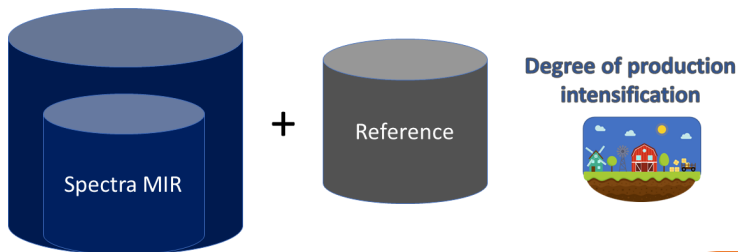
Semi-complete references



Semi-complete references



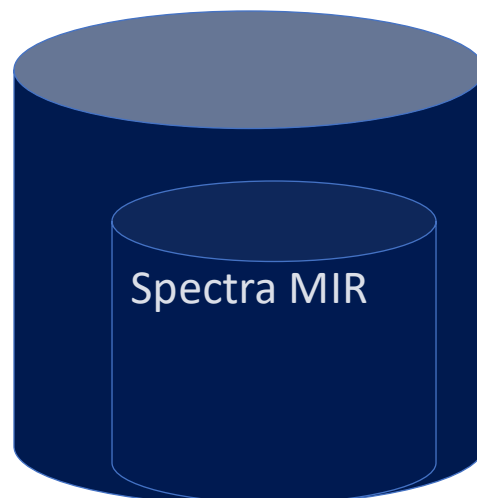
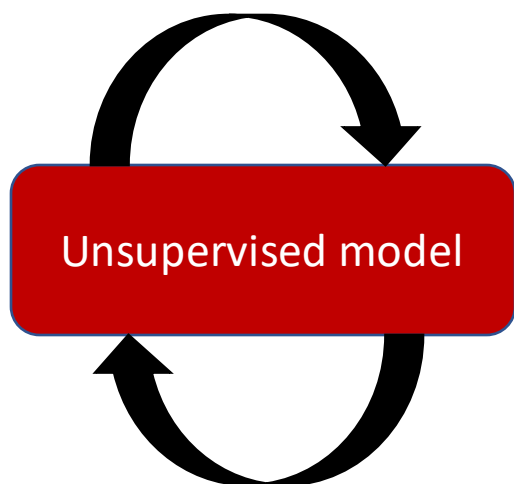
Semi-complete references



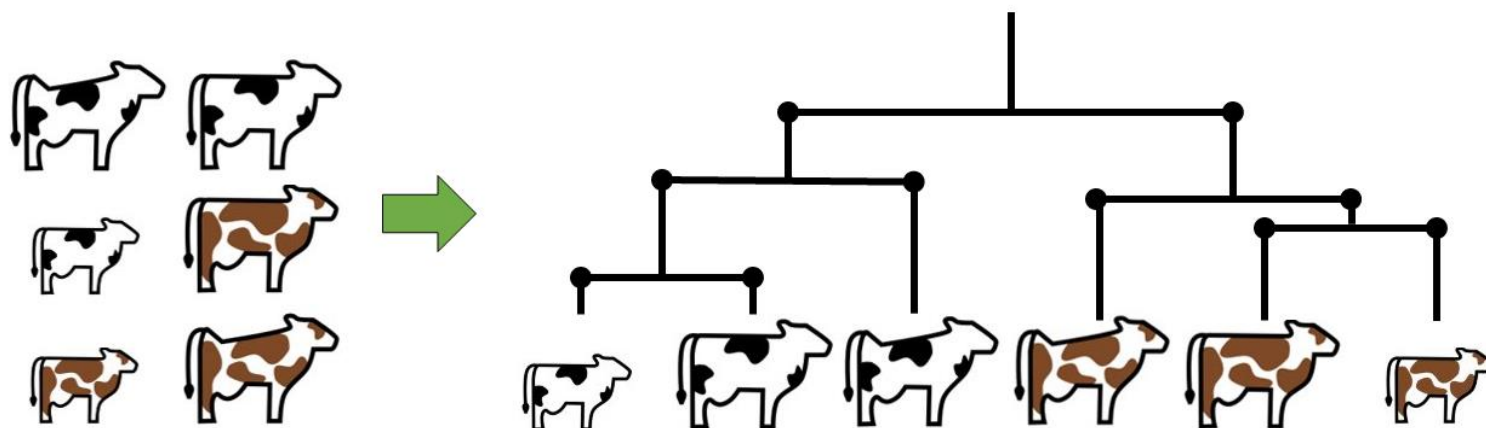
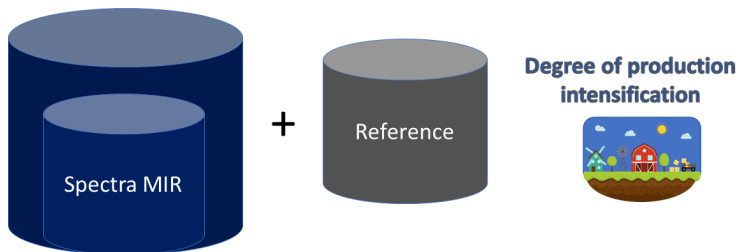
Extraction of knowledge:

Extraction of knowledge results (indicated by an orange arrow from the Prediction model):

- C10:0** (Autumn and winter),
- C12:0** (Autumn and winter),
- C18:2 cis 9 cis 12** (Autumn),
- Glucose in blood** (Autumn and winter),
- K20** (Winter),
- Lactalbumin** (Winter),
- acetone** (Winter),
- glucose in milk** (Winter),
- IGF-1** (Autumn and winter),
- BHB** (Winter),
- and **C18:1 trans total** (Summer)

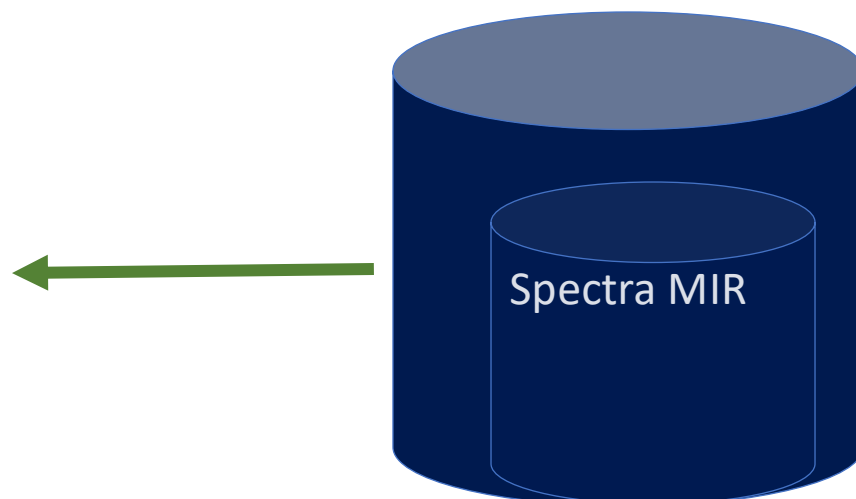
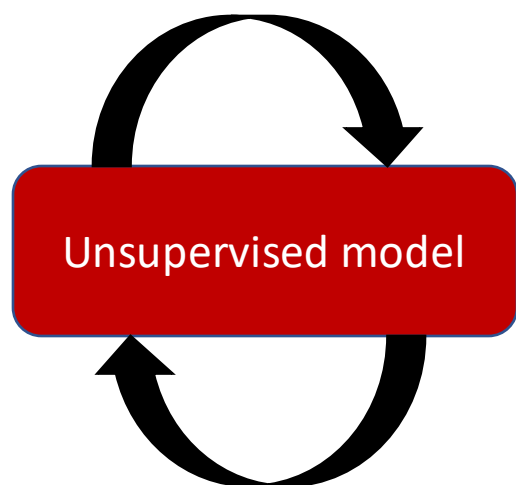


Semi-complete references

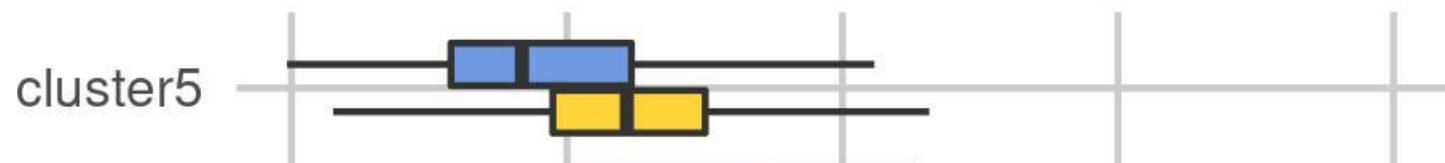
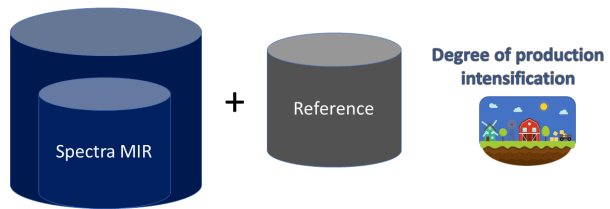


Extraction of knowledge:

C10:0 (Autumn and winter),
C12:0 (Autumn and winter),
C18:2 cis 9 cis 12 (Autumn),
Glucose in blood (Autumn and winter),
K20 (Winter),
Lactalbumin (Winter),
acetone (Winter),
glucose in milk (Winter),
IGF-1 (Autumn and winter),
BHB (Winter),
and **C18:1 trans total** (Summer)



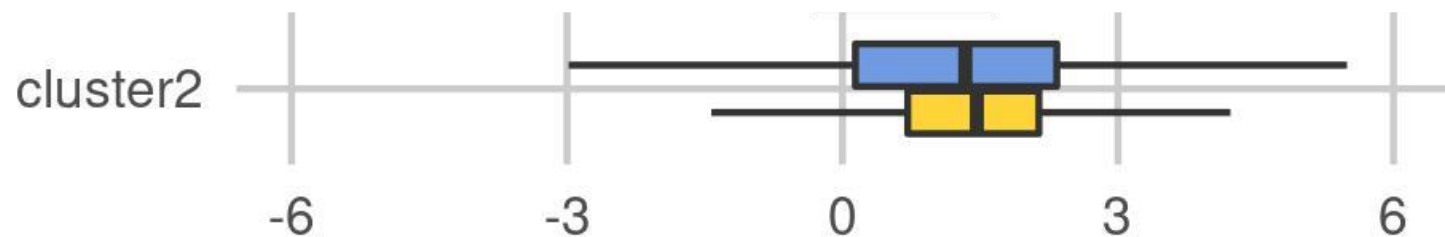
Semi-complete references



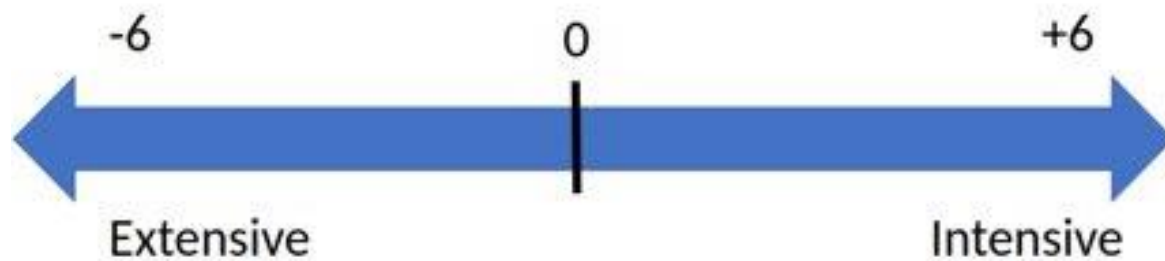
Prediction from large DB



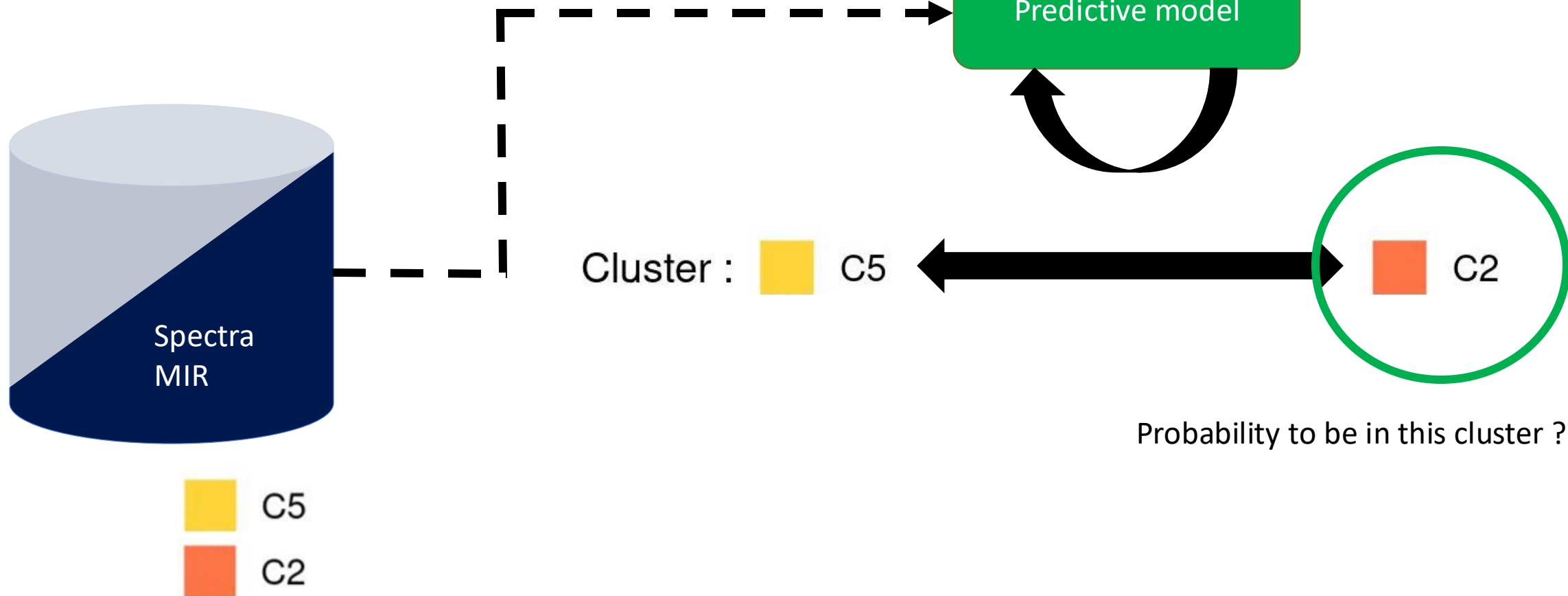
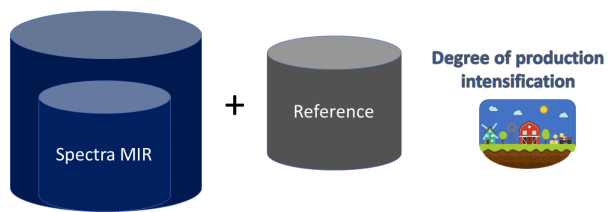
Prediction from small DB



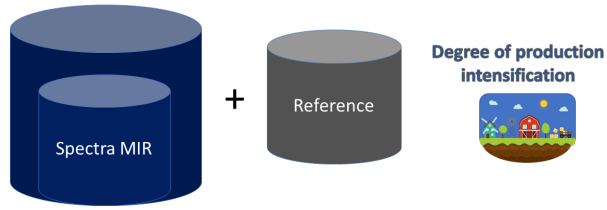
Gradients



Semi-complete references



Semi-complete references



Strength

A limited reference database exists

Opportunity

Extraction of knowledge (features) from the limited database

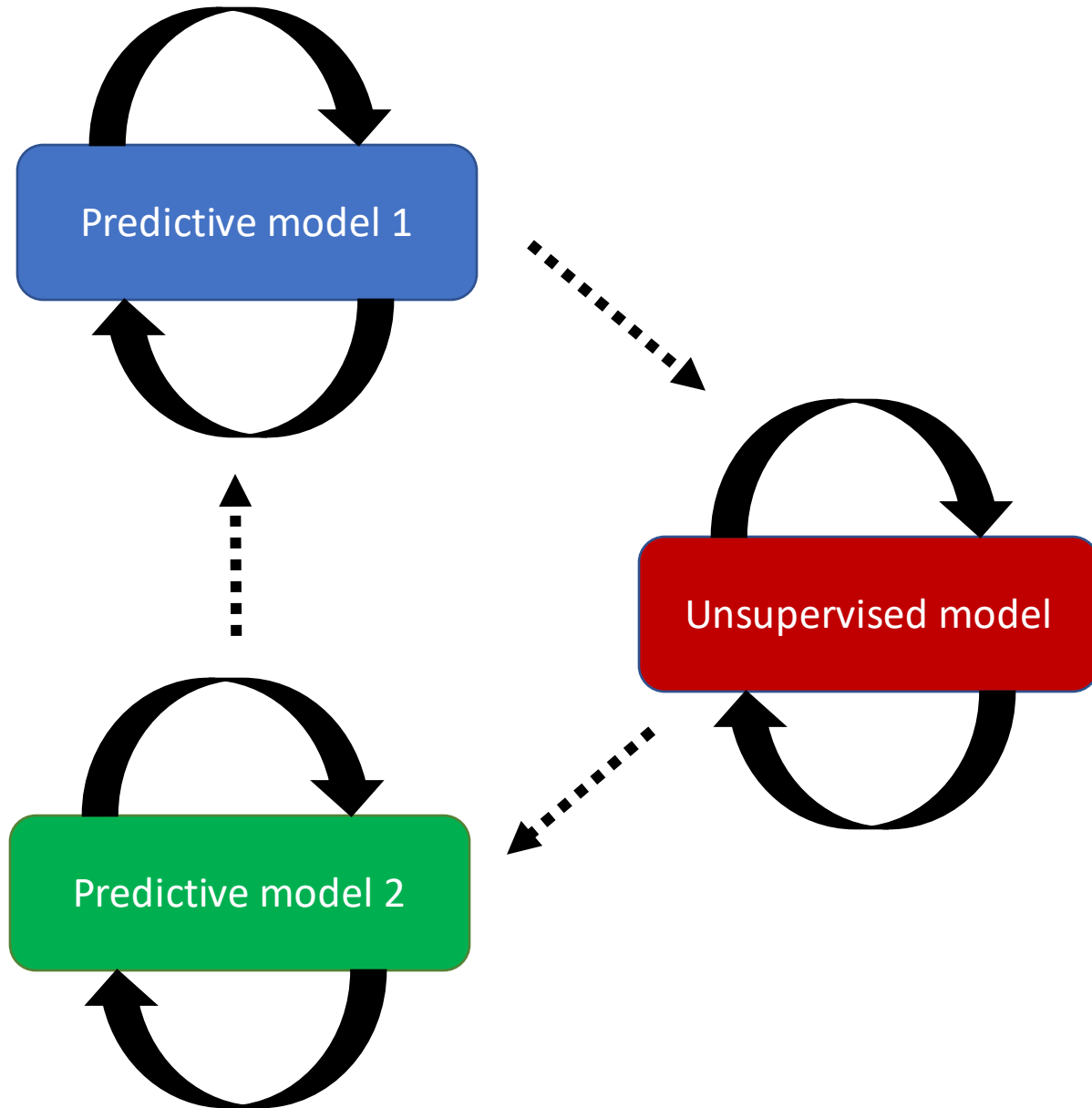
Weakness

Potential under-representation of records

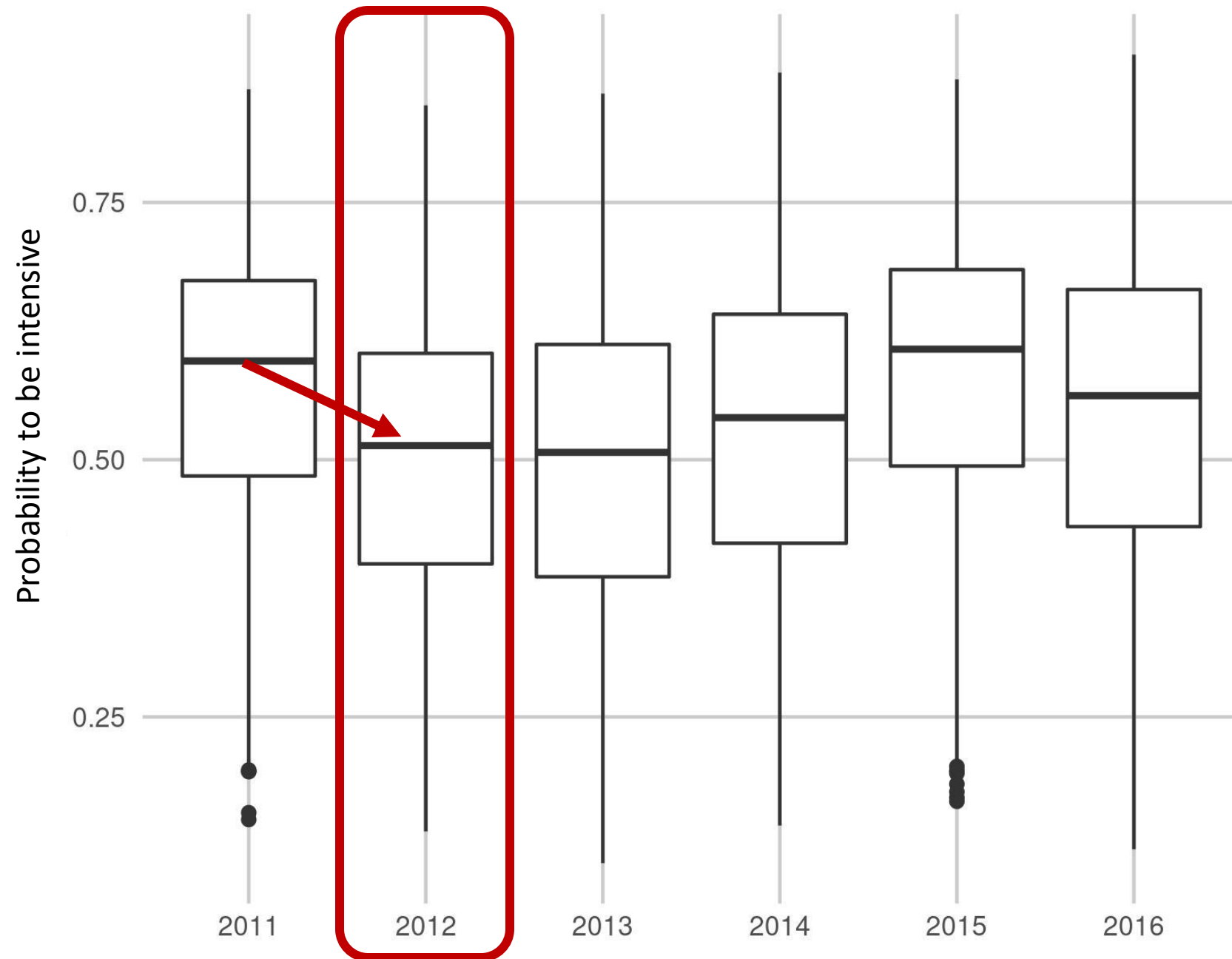
Threat

Potential circular validation

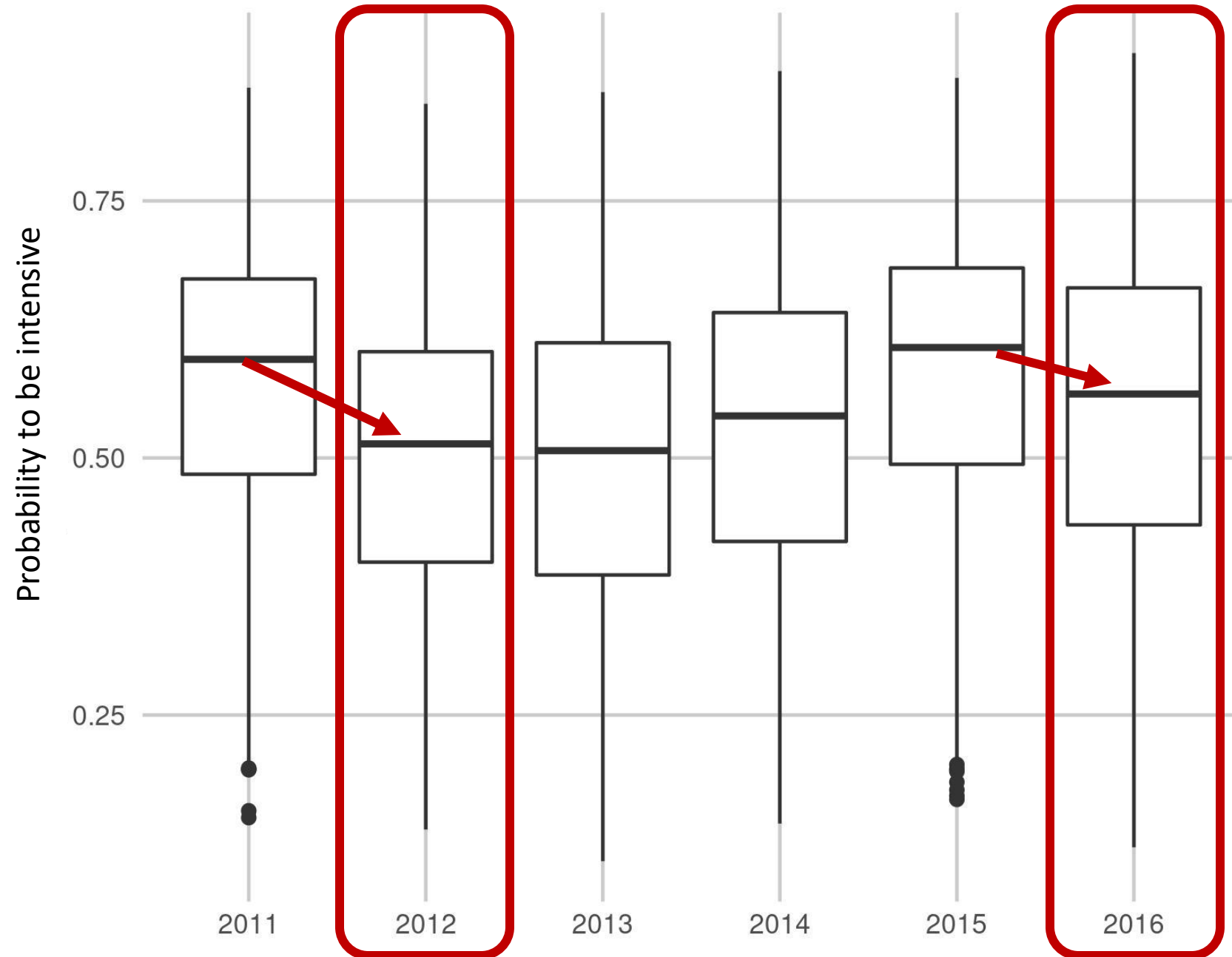
Circular validation



External validation
based on historical
events



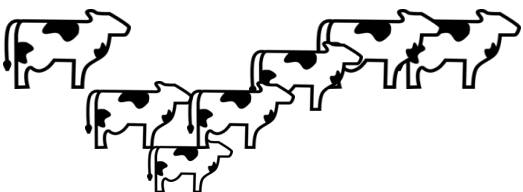
- Crisis ?



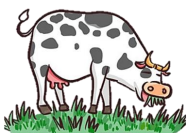
- Crisis ?



Concrete applications of
the developed model






Grazing probability

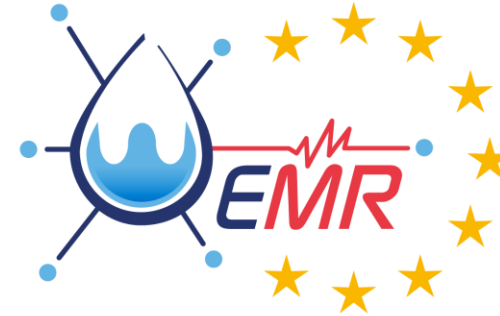


Degree of production intensification



Reference value	From existing equations	Can be used on field ?	Can be used in simulation studies?
		 50 kg	
		 Yes if more records	
		 5 kg	
		 +/- 90%	
		 +/- 90%	

Thank you !



Prof. Hélène Soyeurt
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Predictions of dairy related phenotypes using milk mid infrared spectral data

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SimBa workshop – 12 May 2023

