

74<sup>th</sup> Annual Meeting of the European Federation of Animal Science – Lyon, France – 28/09/2023

Session 19 - "Advances in nutritional modelling and feeding systems (in memory of Daniel Sauvant)"

# Systemic modelling of nutrient partitioning: from the seed sown by D. Sauvant to future prospects

#### Puillet L.

UMR MoSAR, Paris







#### 74<sup>th</sup> Annual Meeting of the European Federation of Animal Science Lyon, France - 28/09/2023

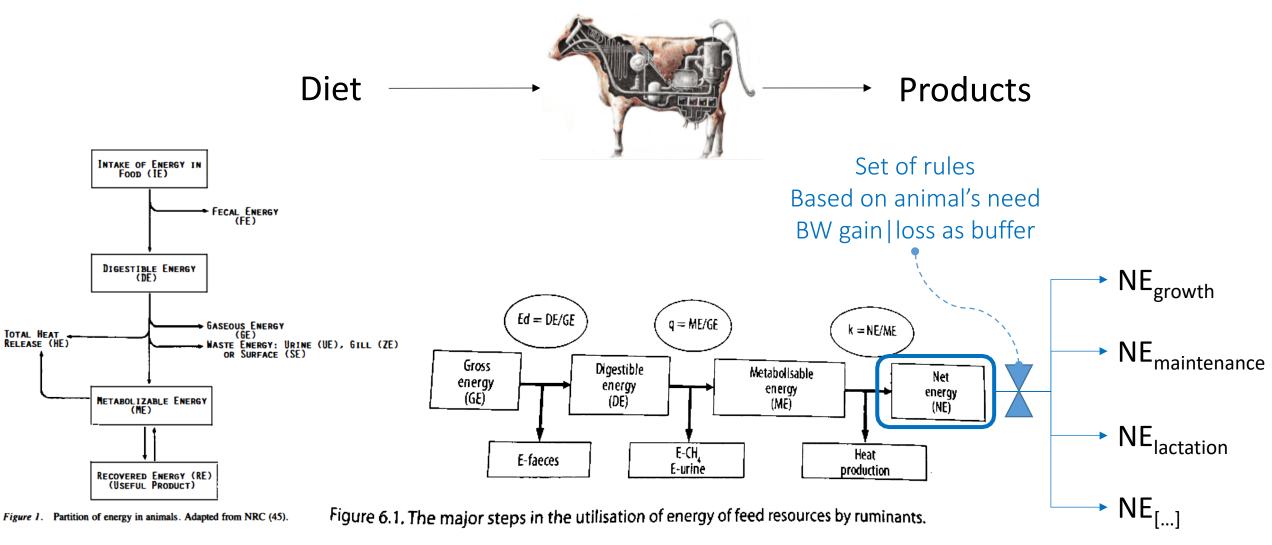
Session 19 - "Advances in nutritional modelling and feeding systems (in memory of Daniel Sauvant)"

Systemic modelling of nutrient partitioning: from the seed sown by D. Sauvant to future prospects

#### <u>Puillet L.</u>

UMR MoSAR, Paris

#### Nutrient partitioning: feeding systems



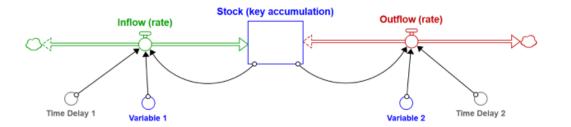
#### Baldwin and Bywater, 1984

INRAE, 2018

# Nutrient partitioning: dynamics of feed utilization

- Development of mechanistic models
  - Accumulated experimental knowledge
  - Computing capacities
  - Systems thinking
- Incorporating regulations
  - Inherent to dynamic models
    - Metabolic capacity | rate, hormonal signal
  - Properties of living systems
    - Homeostasis (HS) and homeorhesis (HR)
    - Short-term vs long-term
    - Targeted trajectory

#### See Tedeschi, 2019

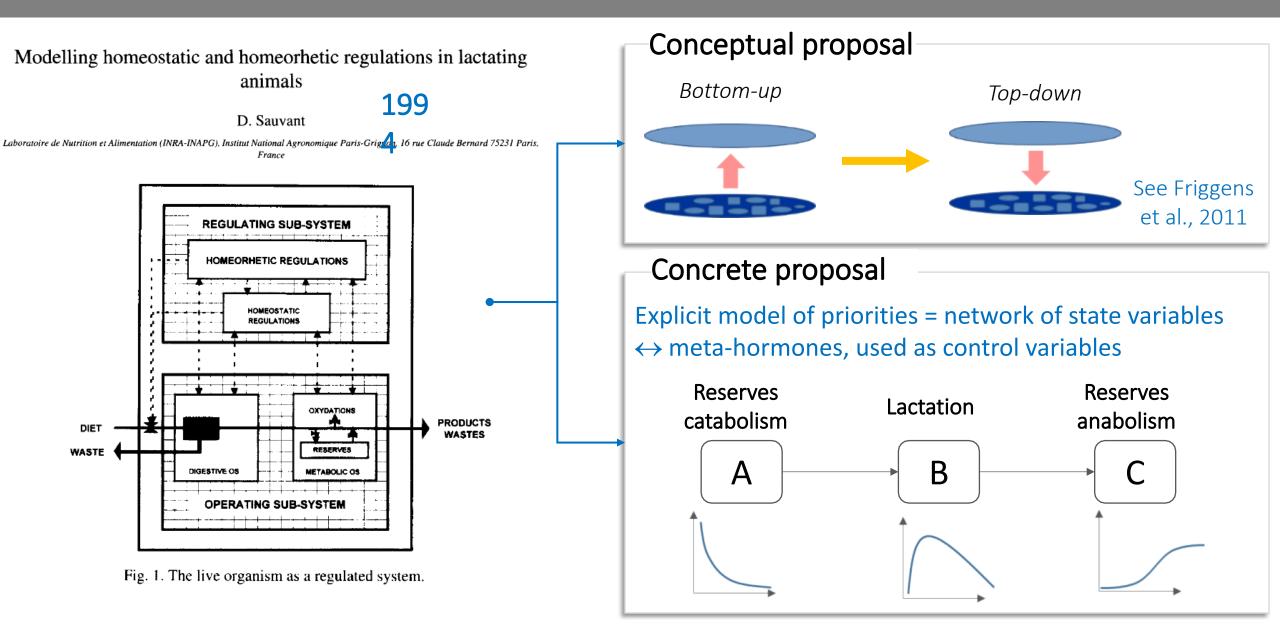


HOMEORHESIS - Orchestrated changes for the priorities of a physiological state, *i.e.* coordination of metabolism in various tissues to support a physiological state.

Figure 2. Types of regulation in partitioning of nutrients to various body tissues.

#### Bauman and Currie, 1980

## Nutrient partitioning: Daniel's view on regulations



Outline



Priorities among functions as drivers of nutrient partitioning



#1 Implementing priorities in animal simulation model #2 Interpreting time-series data

#3 Implementing acquisition allocation framework

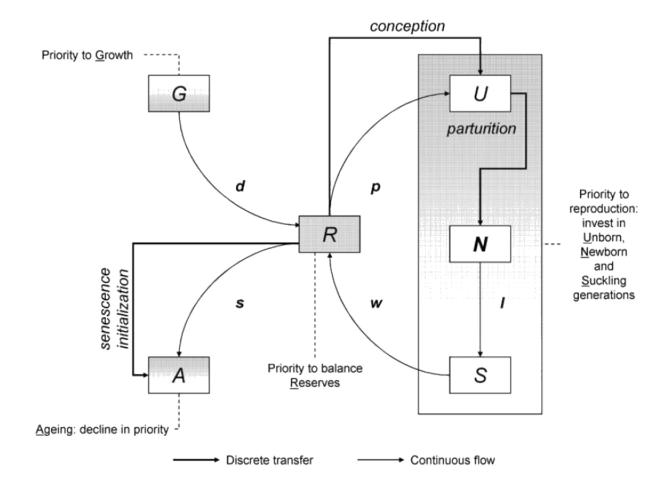
#### • Model of priorities : GARUNS (Martin and Sauvant, 2010)

A teleonomic model describing performance (body, milk and intake) during growth and over repeated reproductive cycles throughout the lifespan of dairy cattle. 1. Trajectories of life function priorities and genetic scaling

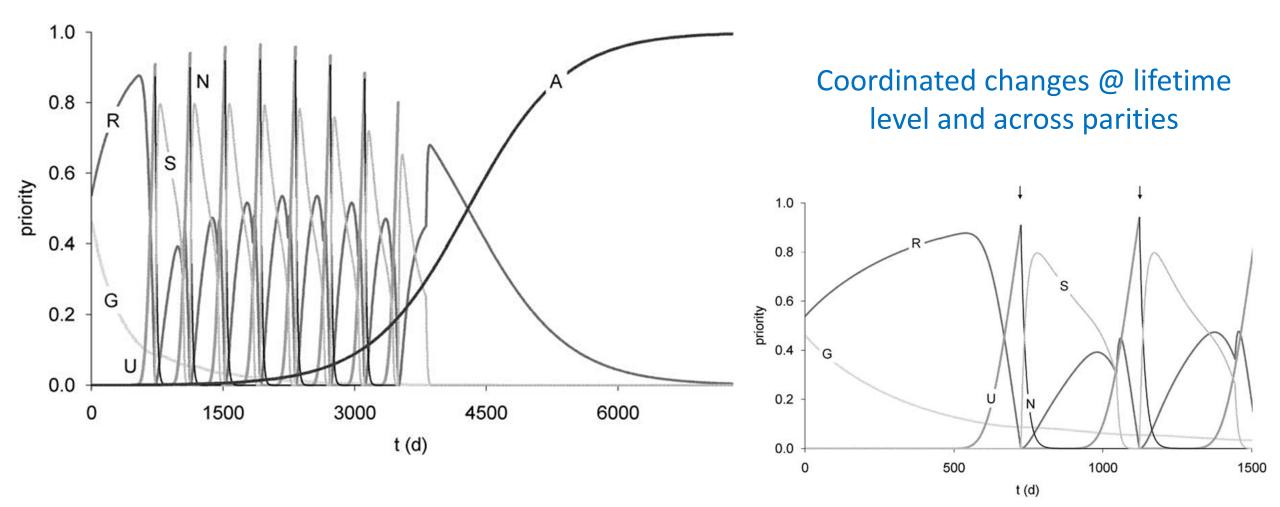
O. Martin<sup>†</sup> and D. Sauvant

UMR Modélisation Systémique Appliquée aux Ruminants (MoSAR), INRA-AgroParisTech, 16, rue Claude Bernard, 75231 Paris cedex 05, France

- System of priorities = virtual dimensionless quantity of 1 flowing in a network of compartments ~ biological functions
- Body reserves as a function
- Dynamics @ lifetime level

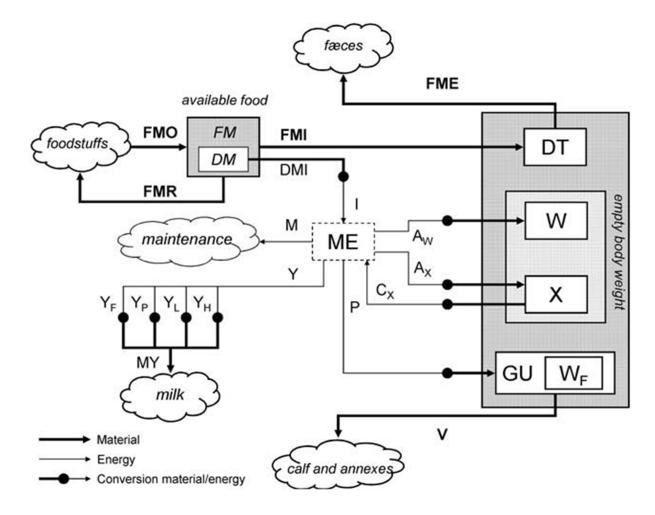


• Model of priorities : GARUNS (Martin and Sauvant, 2010)

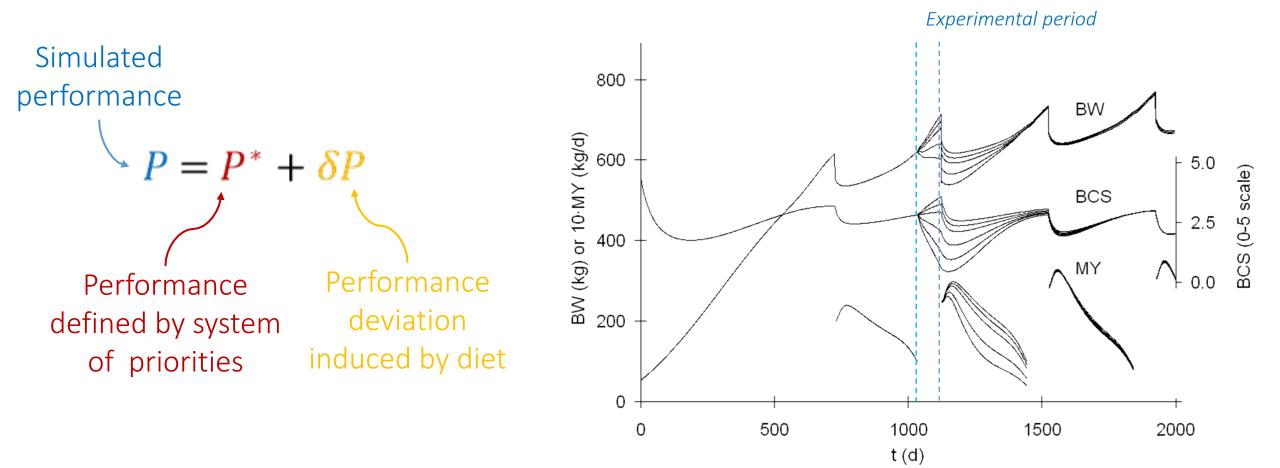


• Transmission to a "classical" operational system

- Conversion energy | material based on existing nutritional knowledge
- Flow = Flow<sub>GARUNS</sub> + Deviation<sub>Intake</sub>

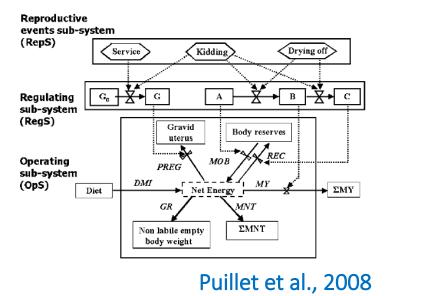


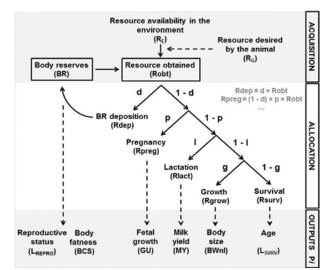
#### • Simulation = set of phenotypic trajectories



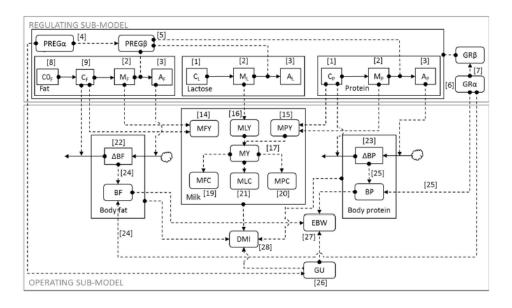
Virtual experiment based on Garnsworthy and Topps, 1992

#### • Some "cousins" in the family





Douhard et al., 2014



#### Daniel et al., 2018

#### • So what with GARUNS model?

• Extending with reproduction (Martin et al., 2018)

Coupling a reproductive function model to a productive function 900 model to simulate lifetime performance in dairy cows BCS 800 2 O. Martin<sup>1†</sup>, P. Blavy<sup>1</sup>, M. Derks<sup>1,2,3a</sup>, N.C. Friggens<sup>1</sup> and F. Blanc<sup>2</sup> - 1 700 600 50 DMI, MY (kg/d) 40 30 500 BW (kg) 20 10 400 -0 -50 -100 -150 -200 300 200 pregnant ЛП - non pregnant ∟ 1 E2 .... ittilli աստաների ...III للبين all 100 ٥ -1 P4 лШ MW Ŵ MM L o 0 500 1000 1500 2000 2500 3000

Age (d)

- Up-scaling @ n+1
  - [GARUNS x RFM] = virtual animal model
  - Building-block for herd level (IBM)  $\rightarrow$  InSiliCow

Toward a digital twin of dairy cow herd

- Down-scaling @ n-1
  - Integrating metabolism | organs  $\rightarrow$  HS regulations

[HR x HS] altering reference pattern

In revision

Dynamic model of the lactating dairy cow metabolism

O. Martin<sup>†</sup> and D. Sauvant

INRA, UMR Physiologie de la Nutrition et Alimentation, 16 rue Claude Bernard, 75231 Paris Cedex 05, France

FLiver: nutrient Fluxes across and within the Liver

A novel approach combining meta-analysis with mechanistic modeling to predict net

hepatic nutrient fluxes in ruminants

L. Bahloul\*, §, D. Sauvant#1, C. Loncke#, M. Chartoire#, J. Vernet\*, H. Lapierre\*, P. Nozière\*

and I. Ortigues-Marty\*

Outline



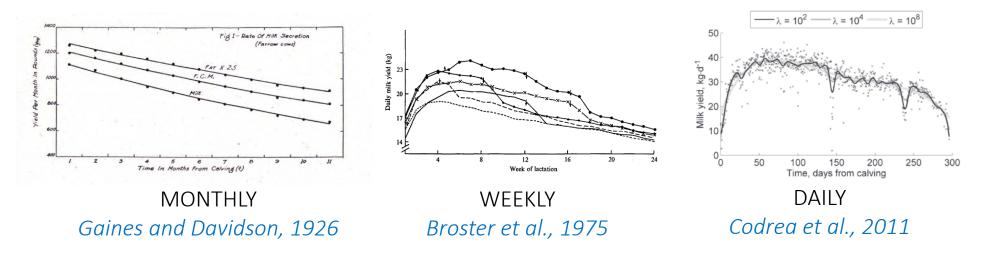
Priorities among functions as drivers of nutrient partitioning



#1 Implementing priorities in animal simulation model

#2 Interpreting time-series data #3 Implementing acquisition allocation framework

• From "small" to "big" data



More frequent
Longer period
More animals

- Need phenotyping tool : raw information  $\rightarrow$  indicators
  - A playground for statistical tools (smoothing, ...)
  - Interpretation can be difficult (lack of biological meaning)
  - Especially @ lifetime level

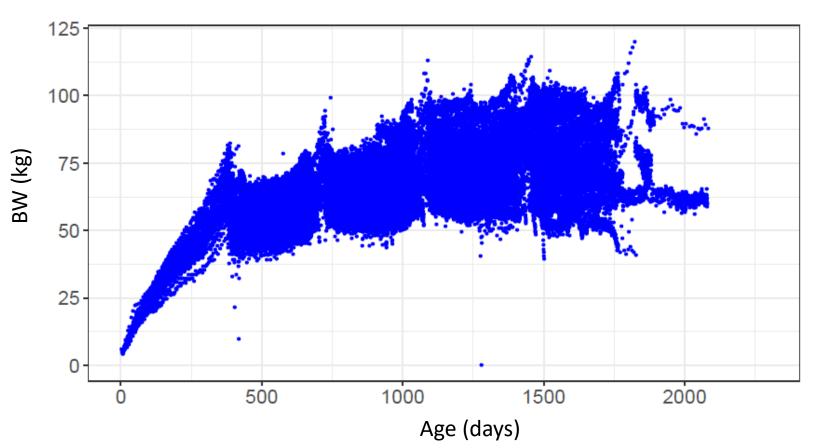
• GRUM model

A dynamic model as a tool to describe the variability of lifetime body weight trajectories in livestock females<sup>1</sup>

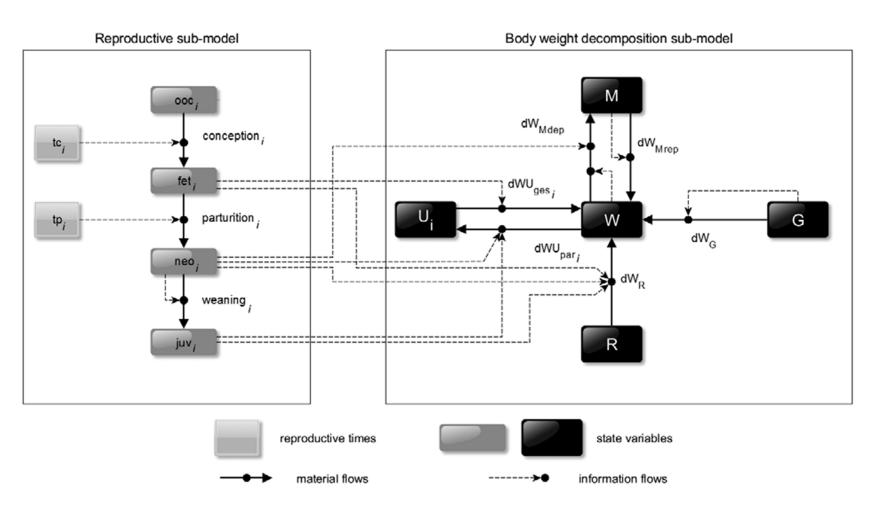
A tool for body weight data

L. Puillet<sup>2</sup> and O. Martin

UMR Modélisation Systémique Appliquée aux Ruminants, INRA, AgroParisTech, Université Paris-Saclay, 75005, Paris, France



• H<sub>0</sub>: BW changes reflect changes in female's priorities

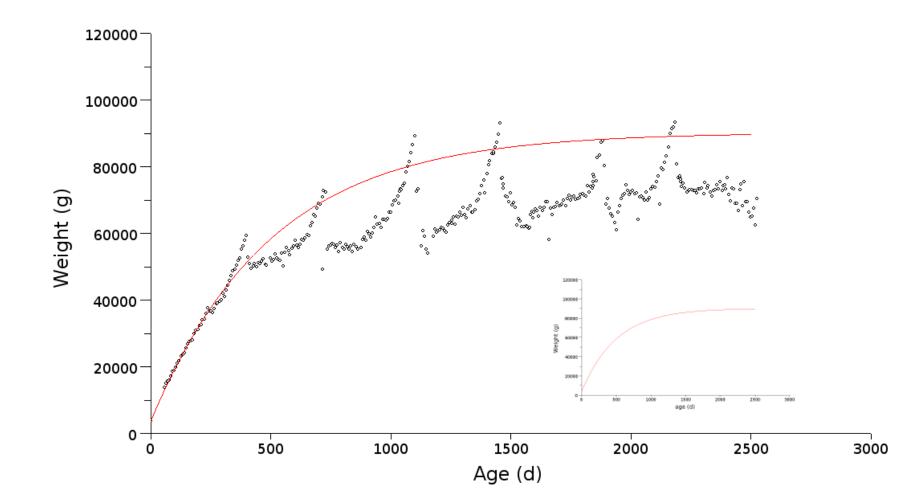


- Elementary variations of
   BW ~ priorities
- Compartmental model
- Adjusted on individual data (1 fitting/animal)

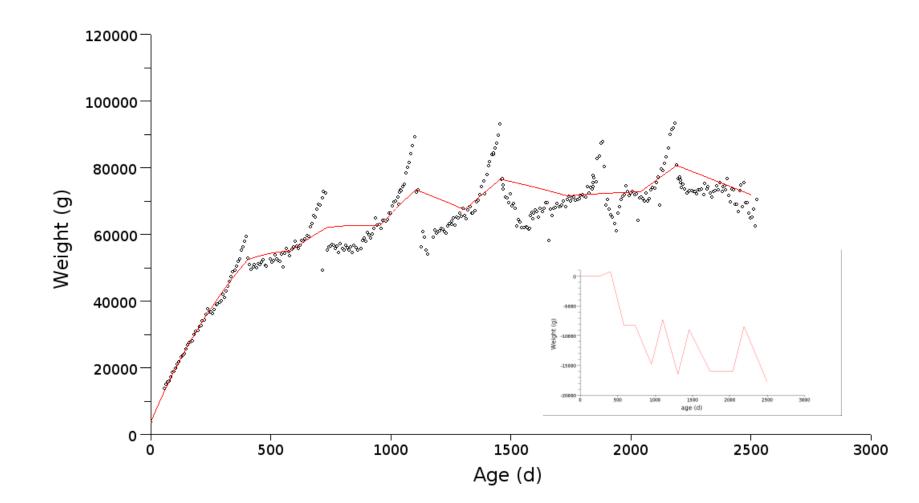
 $dW/dt = dW_{\rm G} + dW_{\rm R} + dW_{\rm u_i} + dW_{\rm M}$ 

Growth Reserve balance Uterine load Maternal investment

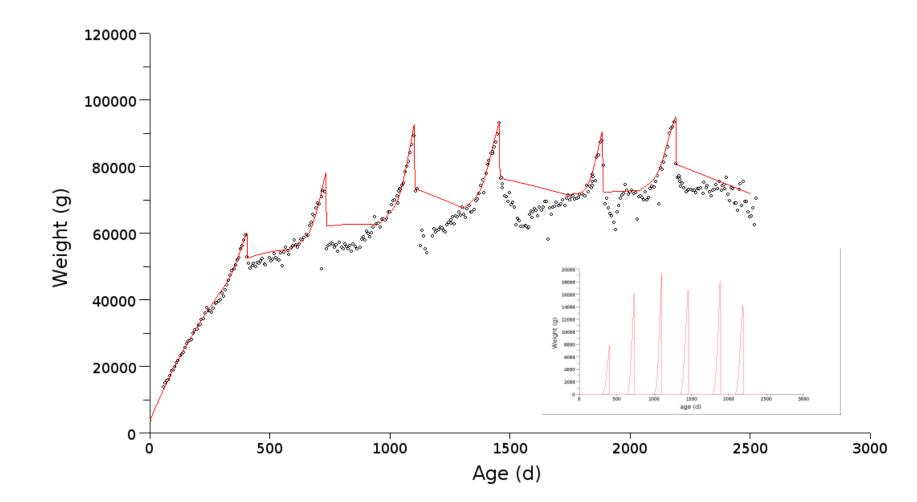
• Sequential fitting: G



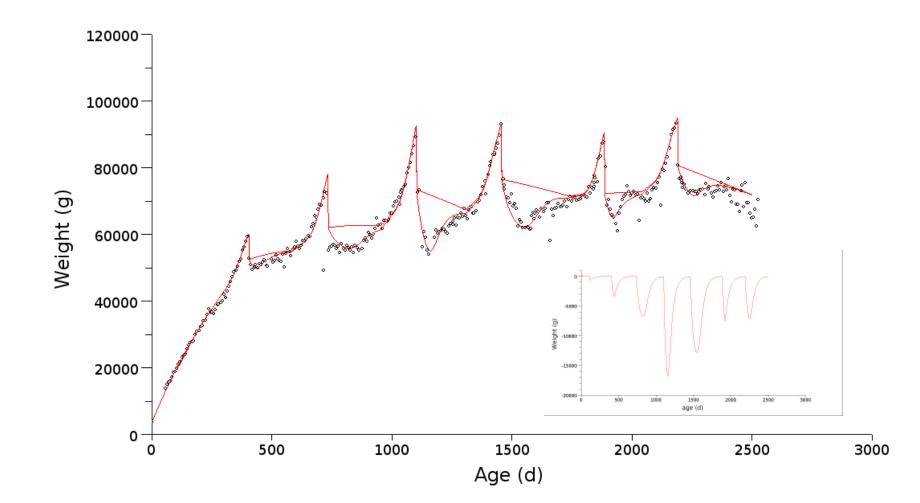
• Sequential fitting: GR



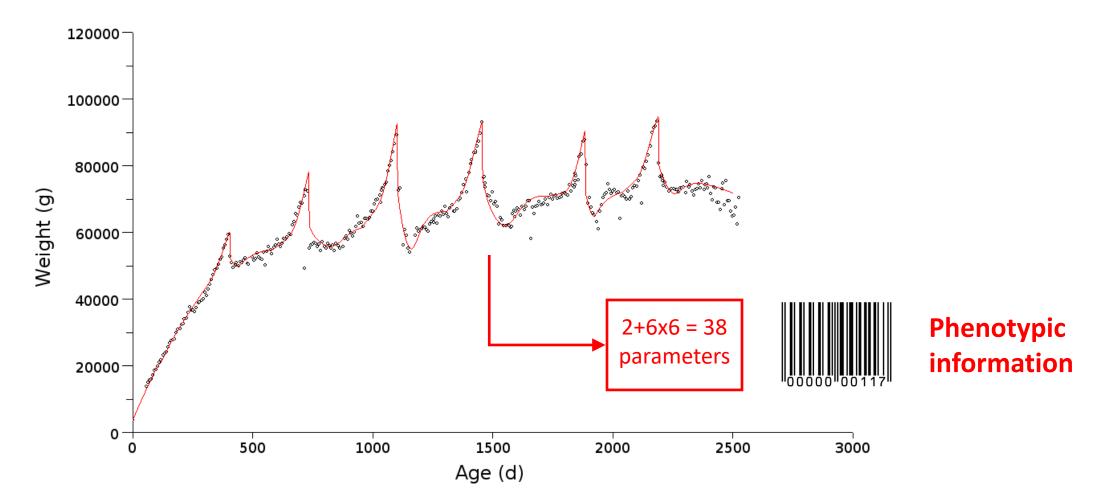
• Sequential fitting: GRU



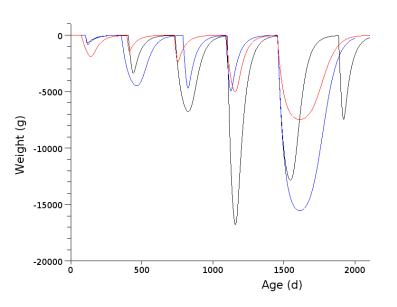
• Sequential fitting: GRUM



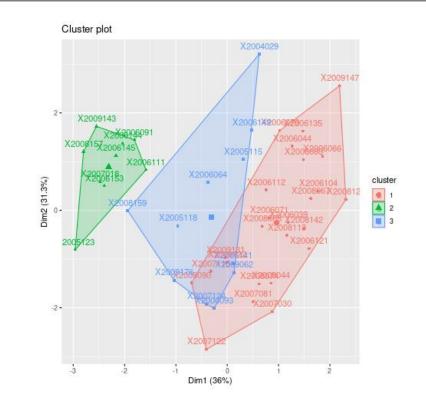
• Sequential fitting: GRUM



- Work with GRUM fitted parameters
  - Comparing individuals, parities
  - Combining with other traits



nbpart	kg	G0	WO	kr_1	kr_2	kr_3	kr_4	kr_5	kr_6	
r	Corr: -0.243	Corr: 0.194	Corr: 0.008	Corr: 0.158	Corr: -0.353*	Corr: -0.090	Corr: -0.071	Corr: -0.131	Corr: -0.167	nopart
	$\sim$	Corr: -0.860**	Corr: -0.040	Corr: 0.333*	Corr: 0.764***	Corr: 0.633***	Corr: 0.626***	Corr: 0.702*	Corr: 0.304	Ŋ
i.	A	$   \sum $	Corr: -0.104	Corr: -0.415**	Corr: 0.829***	Corr: 0.672***	Corr: 0.536**	Corr: -0.660*	Corr: -0.357	GD
<b>.</b>			کر	Corr: 0.106	Corr: 0.180	Corr: 0.269.	Corr: -0.071	Corr: 0.133	Corr: 0.109	VIV
	d)	÷.,	. 1	$\sim$	Corr: 0.151	Corr: 0.362*	Corr: 0.114	Corr. 0.158	Corr: -0.306	1_24
!!!!"		h.,	-	.0	Λ	Corr: 0.505***	Corr: 0.491**	Corr: 0.660*	Corr: 0.041	N 2
1		hi.	<u>, e</u>	33	*	Л	Corr: 0.111	Corr: 0.472	Corr: 0.766	5_24
1.	i and	Þ.;		5	· R	1	$\wedge$	Corr: -0.010	Corr: -0.031	W_4
				;;.	į,		2.	$\checkmark$	Corr: -0.116	C_IN



Generic tool for mammal, under development in a GALAXY pipeline Outline



Priorities among functions as drivers of nutrient partitioning



#1 Implementing priorities in animal simulation model

#2 Interpreting time-series data #3 Implementing acquisition allocation framework

- Breeding for feed efficiency in a sustainable way
  - No detrimental impacts on other functions and resilience
  - Adaptation to various (limiting) environments
- Dealing with complex traits
  - Difficult to measure
  - Made of sub-traits
  - Time dependant
  - Trade-offs

A more agro-ecological view animal (MoSAR) nutritional models as good "phenotypic" candidates Simulation approach

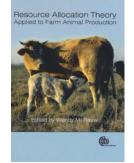
Feed conversion mechanisms

Lifetime trajectory

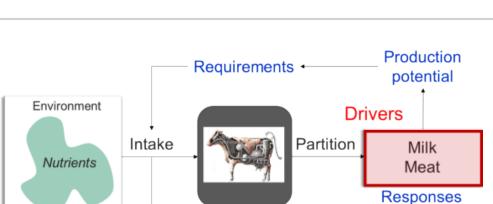
Nutrient partitioning



- How do we affect intake and partition?
- Does it generate trade-offs?



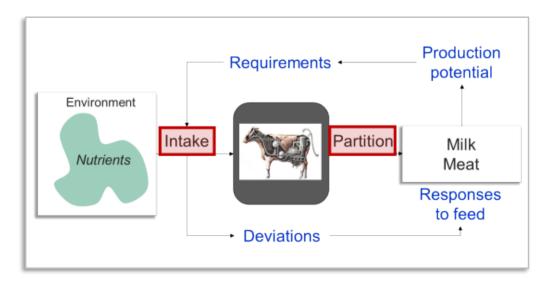
Rauw et al., 2009



Deviations

#### From a phenotypic potential

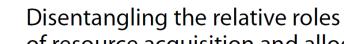
#### To an acquisition allocation potential



Changing the way to generate different animals (genotypes)

to feed

AQAL model (Puillet et al., 2016)



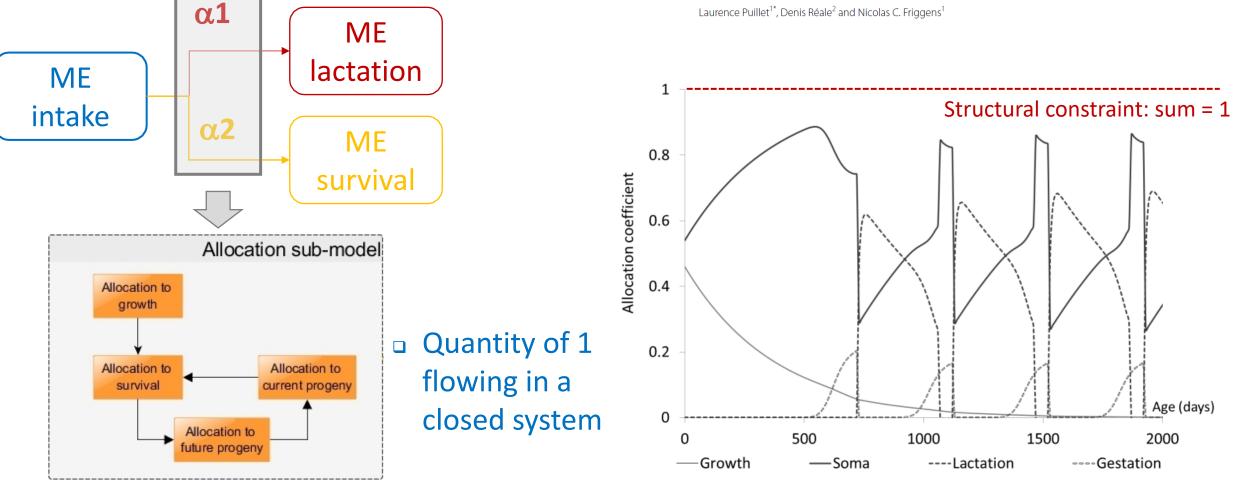
**RESEARCH ARTICLE** 

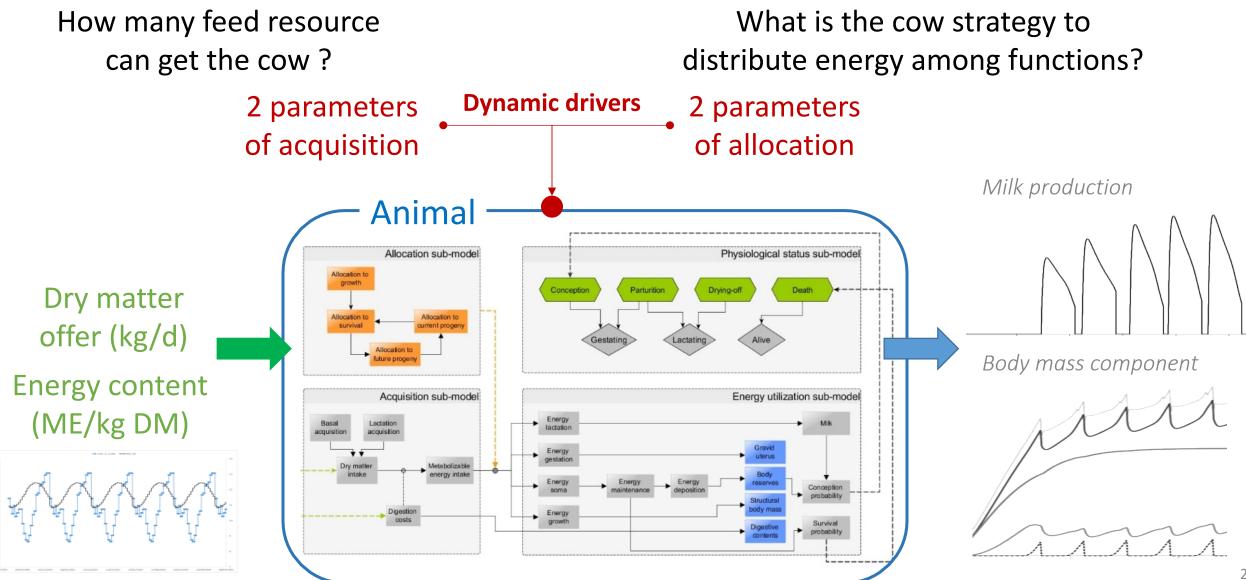
of resource acquisition and allocation on animal feed efficiency: insights from a dairy cow model

**Open Access** 

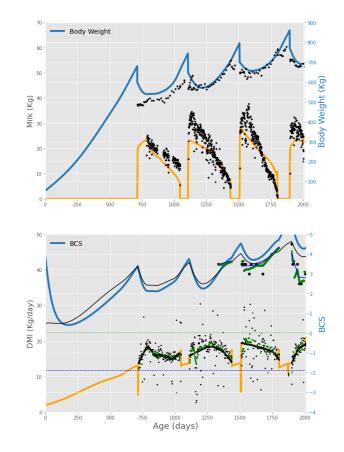
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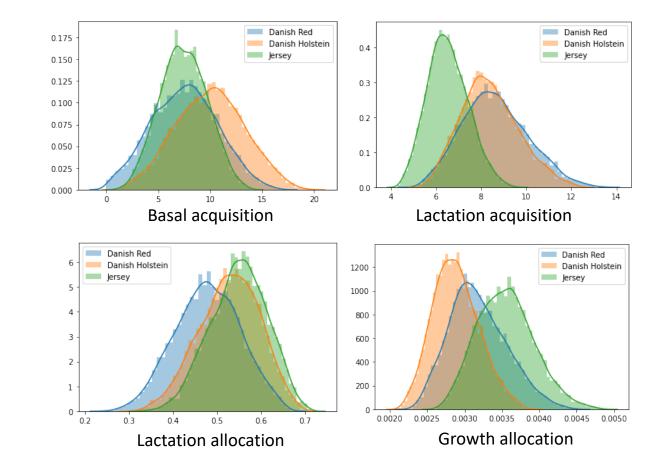
Laurence Puillet<sup>1\*</sup>, Denis Réale<sup>2</sup> and Nicolas C. Friggens<sup>1</sup>





 Determining parameter values → finding out individual acquisition and allocation strategies

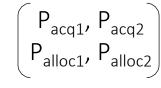




#### e.g. breed differences

- Looking at long-term effects of selection strategies
  - Genetic variation= sire population

4 genetic-scaling parameters for acquisition | allocation





 Virtual experiment: same population in scenarios

Feed resource

Management rules



Management rules

 □ Comparing genetic parameters across environments → GxE

Simulated traits in environment X

Cow	Sire	Efficiency	Longevity	MY		
1	1					
2	1	Ger	netic para	met	ers	
3	1					

#### Simulated traits in environment Y

Cow	Sire	Efficiency	Longevity	MY		
1	1					
2	1	Ger	netic para	met	ers	
3	1					



High and stable	2 <sup>nd</sup> lactation production	2 <sup>nd</sup> lactation efficiency	Lifetime efficiency	BW at 2 <sup>nd</sup> calving	Body reserves at 2 <sup>nd</sup> calving	Delay to 2 <sup>nd</sup> conception
п	17945	17945	17945	18171	18171	18171
2 <sup>nd</sup> lactation production	0.301					
2nd lactation efficiency	0.697	0.348				
Lifetime efficiency	0.708	0.854	0.123			
BW at 2nd calving	0.265	-0.425	-0.394	0.396		
Body reserves at 2 <sup>nd</sup> calving	0.136	-0.225	0.184	0.366	0.307	
Delay to 2nd conception	0.126	0.432	0.080	-0.251	-0.473	0.008

When feed resource became limited (low-input pastoral system)

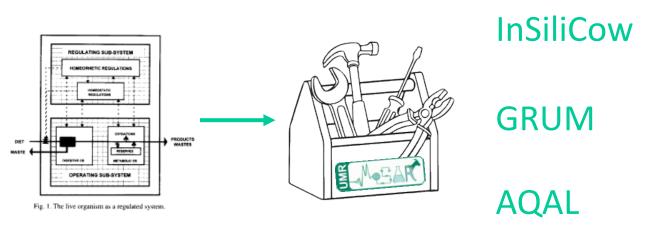
r<sub>G</sub> between lactation and life efficiency decreased

r <sub>G</sub>	between life efficiency and
	body reserves increased

Importance of a balanced breeding goal

Low and stable						
п	13640	13640	13640	17019	17019	17019
2 <sup>nd</sup> lactation production	0.185					
2nd lactation efficiency	0.983	0.311				
Lifetime efficiency	0.526	0.477	0.211			
BW at 2nd calving	-0.528	-0.598	-0.768	0.390		
Body reserves at 2 <sup>nd</sup> calving	0.011	-0.139	0.616	0.015	0.263	
Delay to 2nd conception	0.241	0.402	-0.314	-0.285	-0.862	0.011

#### Where do we come from



Interactions [feeding x reproduction] herd management

Phenotyping tool (PLF)

Population simulation within a genetic selection context

Responses to E<sub>nutri</sub>

Lifetime level

Central role of reserves

Individual variability

Efficiency Resilience Robustness

#### ... and where are we going with nutrient partitioning

- Including other functions
  - Health, reproduction, thermoregulation, longevity
- Including other nutrients
  - Proteins, minerals

- Hybrid approaches
  - Concept and data-driven models

• Systemic modelling spirit, combining scales, increasing complexity

#### Advertising sequence...

#### ADSA Discover Conference on Food Animal Agriculture:

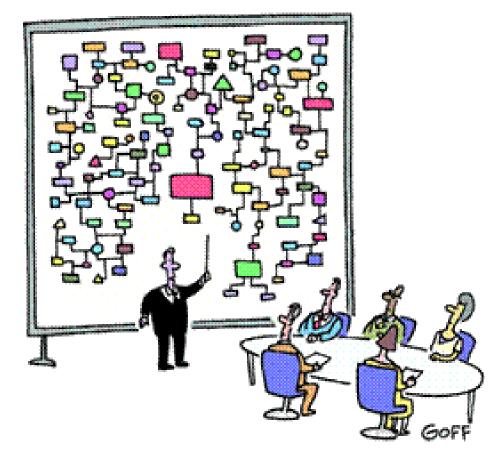


## Dairy Cattle Lifespan: New Perspectives

October 23-26, 2023 Eaglewood Resort & Spa in Itasca, IL Hosted by the American Dairy Science Association<sup>®</sup> For complete conference information, including the latest program and registration materials, go to: https://www.adsa.org/Meetings/45th-Discover-Conference Thanks to EAAP organizers for this session in memory to Daniel Sauvant

Thanks to Daniel for providing the sparks and the encouragement

Thanks for your attention



"And that's why we need a computer."