

# Feed efficiency in dairy cows

## a data cruncher's perspective



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*“Dairy Girls”*



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# What's the importance of feed efficiency?

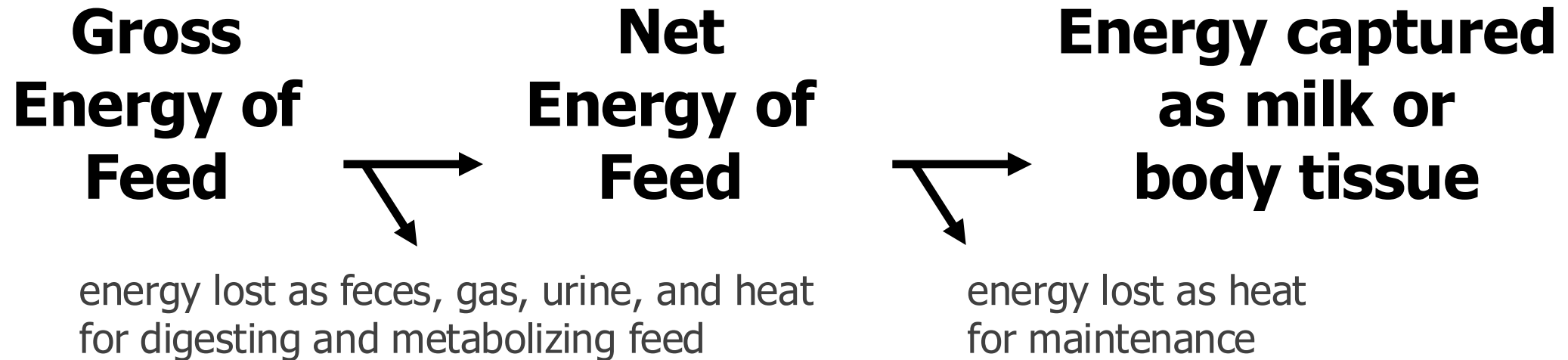


- ❑ feed represents more than 50% of the total production costs
- ❑ benefits of improving feed efficiency:
  - increase farm profitability
  - reduce the environmental impact of dairy farming



# The basics of feed efficiency

Energy flow in a cow

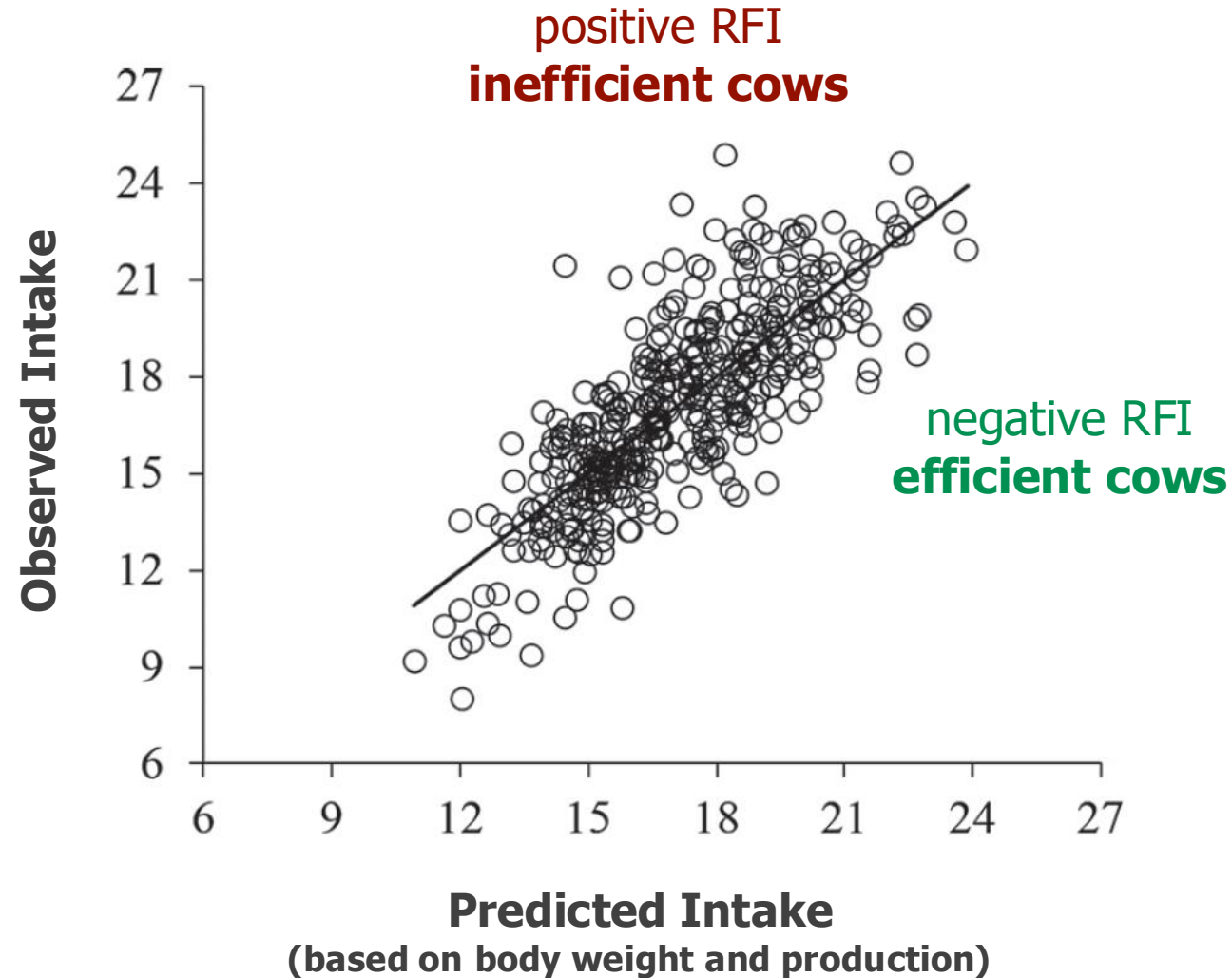


## How can we improve gross feed efficiency?

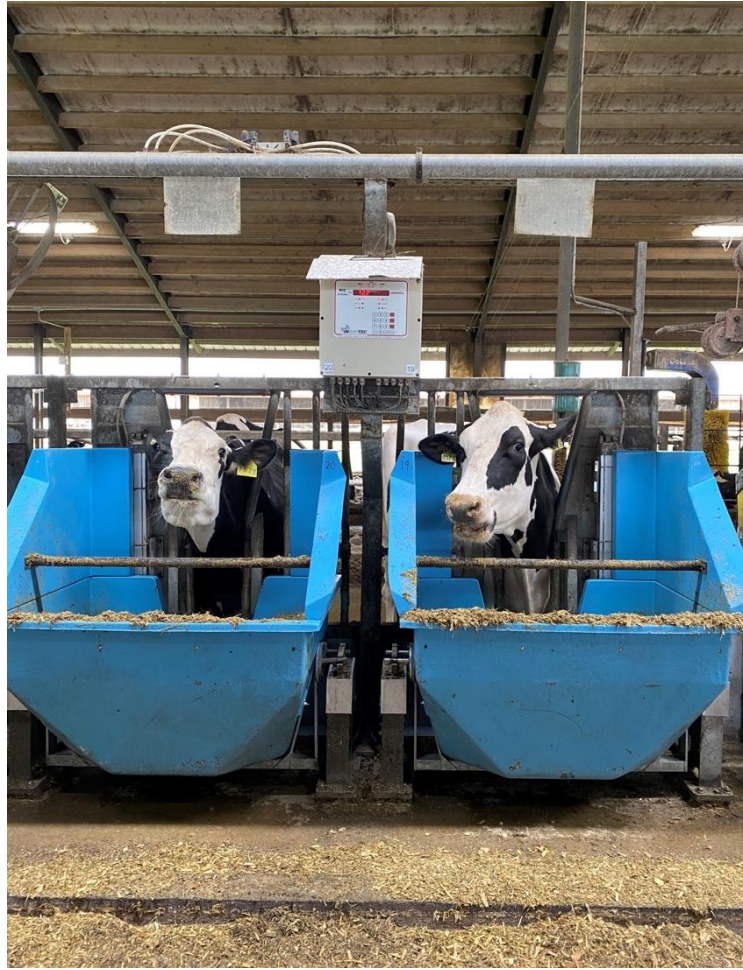
1. increase the conversion of GE to NE
2. increase milk production relative to maintenance

# How do we measure feed efficiency?

Residual feed intake (RFI) = Observed intake – Predicted intake



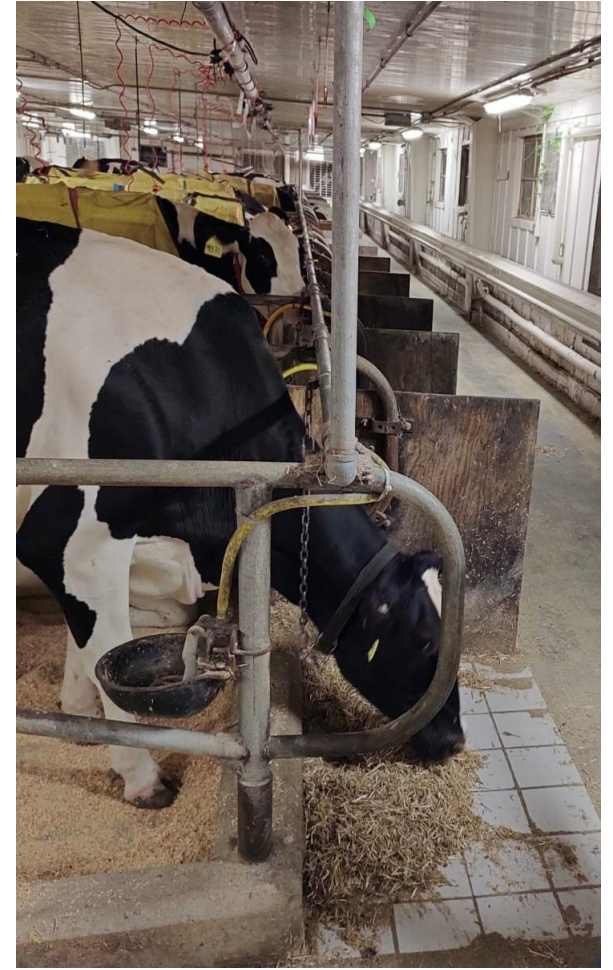
# Individual feed intake recording



**Insentec Gates**



**Calan Gates**



**Tie Stalls**



# Residual feed intake

Residual feed intake (RFI) = Observed intake – Predicted intake

**DMI dry matter intake** (based on feed intake)

**MilkE milk energy** (based on milk production and composition)

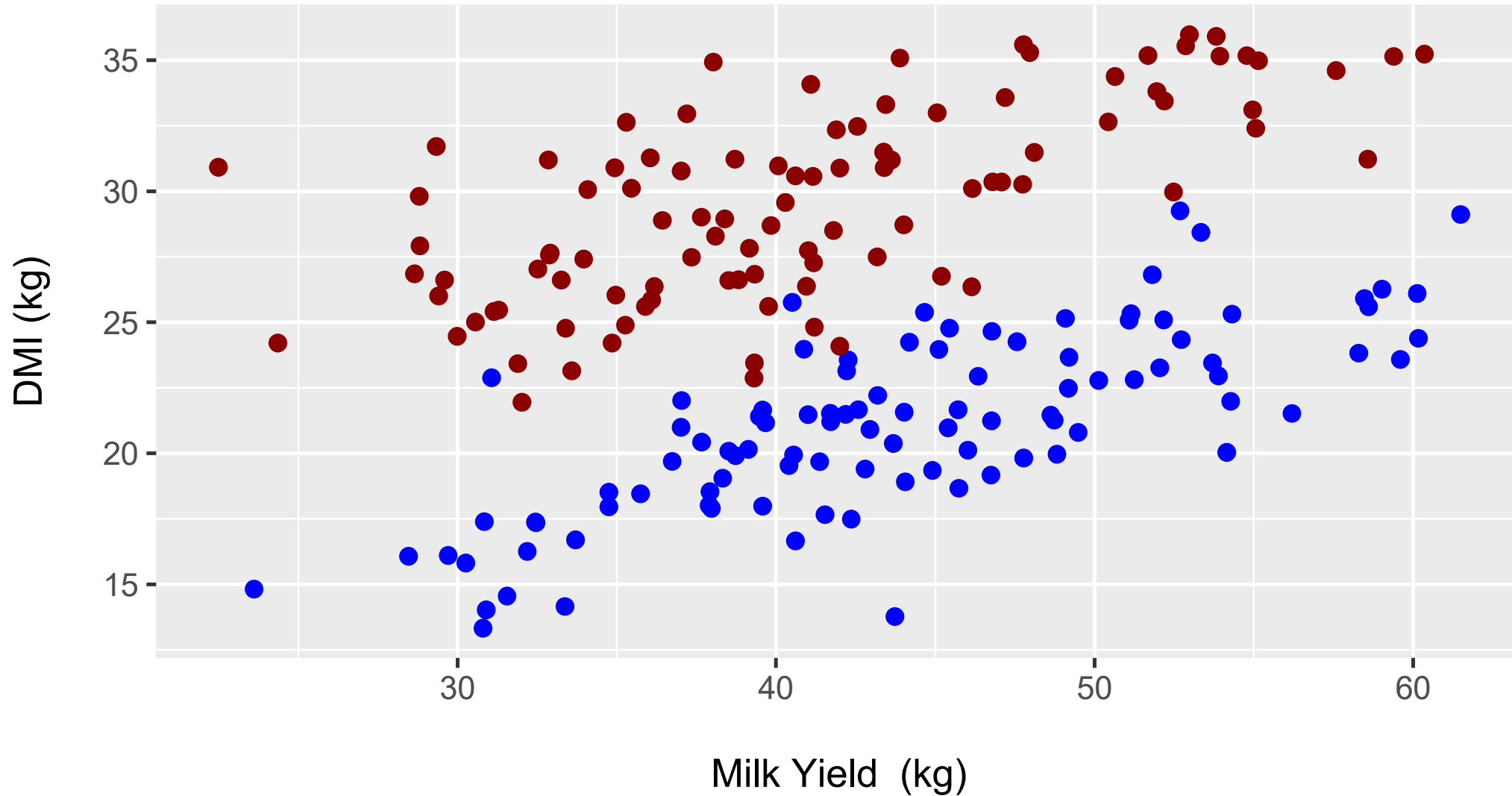
**mBW metabolic body weight** (based on body weight records)

**ΔBW change in body weight** (based on body weight records)

$$\text{DMI} = \text{DIM} + \text{Lact} + \beta_1 \text{MilkE} + \beta_2 \text{mBW} + \beta_3 \Delta \text{BW} + \text{cohort} + \text{week} + e$$

$$e = \text{DMI} - \widehat{\text{DMI}} = \text{residual feed intake}$$

# Most/least efficient cows



**inefficient  
cows**

**efficient  
cows**

# Genetic variation of feed efficiency



Trait	$\sigma_u^2$	$\sigma_{pe}^2$	$\sigma_b^2$	$\sigma_e^2$	$h^2$	$r^2$
DMI (kg)	2.08 ± 0.41	3.24 ± 0.34	1.53 ± 0.39	3.32 ± 0.04	0.20 ± 0.04	0.52 ± 0.02
Milk energy (Mcal)	2.75 ± 0.88	9.82 ± 0.83	4.72 ± 1.14	5.97 ± 0.09	0.12 ± 0.04	0.54 ± 0.03
Metabolic BW (kg <sup>0.75</sup> )	37.62 ± 4.71	23.43 ± 3.25	3.98 ± 1.42	6.11 ± 0.08	0.53 ± 0.05	0.86 ± 0.02
Change in BW (kg)	19.96 ± 2.57	7.39 ± 1.67	224.45 ± 42.79	4.49 ± 0.06	0.08 ± 0.08	0.11 ± 0.02
Residual feed intake (kg)	0.65 ± 0.15	1.40 ± 0.14	—	1.95 ± 0.03	0.16 ± 0.04	0.51 ± 0.01

<sup>1</sup> $\sigma_u^2$  = additive genetic variance;  $\sigma_{pe}^2$  = permanent environmental variance;  $\sigma_b^2$  = block of experiment-treatment variance;  $\sigma_e^2$  = residual variance;  $h^2$  = heritability;  $r^2$  = repeatability.

# Heritability estimates



residual feed intake is more heritable than most fertility, health, and longevity traits!

PTA trait	PTA trait													
	Milk	Fat	Protein	PL	SCS	BWC	Udder	Feet/legs	DPR	CA\$	HCR	CCR	LIV	HTH\$
Milk	<b>0.20</b> <sup>1</sup>	0.43	0.83	0.10	0.02	-0.12	-0.10	-0.02	-0.23	0.19	-0.03	-0.16	0.03	0.03
Fat	0.69	<b>0.20</b>	0.59	0.15	-0.09	-0.05	-0.07	0.01	-0.15	0.13	0.03	-0.10	0.06	0.08
Protein	0.90	0.75	<b>0.20</b>	0.13	0.04	-0.09	-0.14	-0.01	-0.18	0.22	-0.07	-0.15	0.05	0.04
PL	0.15	0.17	0.16	<b>0.08</b>	-0.45	-0.10	0.18	0.14	0.64	0.40	0.32	0.62	0.70	0.56
SCS	-0.10	-0.10	-0.10	-0.40	<b>0.12</b>	-0.10	-0.23	-0.15	-0.27	-0.14	-0.12	-0.25	-0.25	-0.44
BWC	0.06	0.05	0.05	-0.20	-0.11	<b>0.40</b>	0.27	0.38	-0.052	-0.07	-0.01	-0.01	-0.14	-0.26
Udder	-0.02	-0.05	-0.06	0.15	-0.30	0.45	<b>0.27</b>	0.45	0.09	0.10	0.03	0.04	0.08	-0.01
Feet/legs	-0.14	-0.11	-0.18	0.08	-0.02	0.35	0.40	<b>0.15</b>	0.03	-0.01	-0.01	-0.04	0.06	0.02
DPR	-0.10	-0.10	-0.10	0.20	-0.05	0.00	0.00	0.00	<b>0.04</b>	0.41	0.87	0.35	0.43	0.42
CA\$	0.02	0.02	0.02	0.20	-0.03	-0.10	0.00	-0.02	0.09	<b>0.07</b>	0.16	0.34	0.36	0.33
HCR	-0.05	-0.05	-0.05	0.10	-0.04	-0.02	-0.05	-0.05	0.10	0.16	<b>0.01</b>	0.54	0.22	0.18
CCR	-0.10	-0.10	-0.10	0.40	-0.20	-0.10	0.03	-0.04	0.70	0.20	0.45	<b>0.02</b>	0.43	0.36
LIV	0.11	0.13	0.12	0.70	-0.40	-0.20	0.10	0.05	0.40	0.35	0.20	0.15	<b>0.01</b>	0.55
HTH\$	0.02	0.04	0.02	0.28	-0.22	-0.13	0.00	0.01	0.21	0.17	0.09	0.18	0.28	<b>0.01</b>

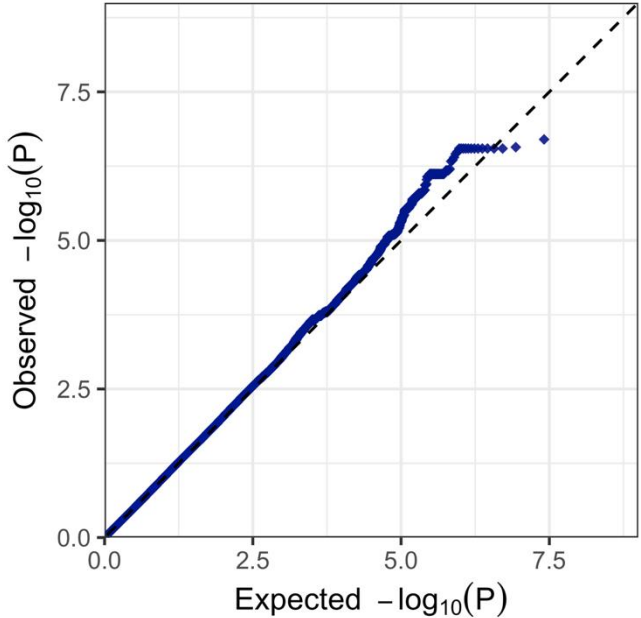
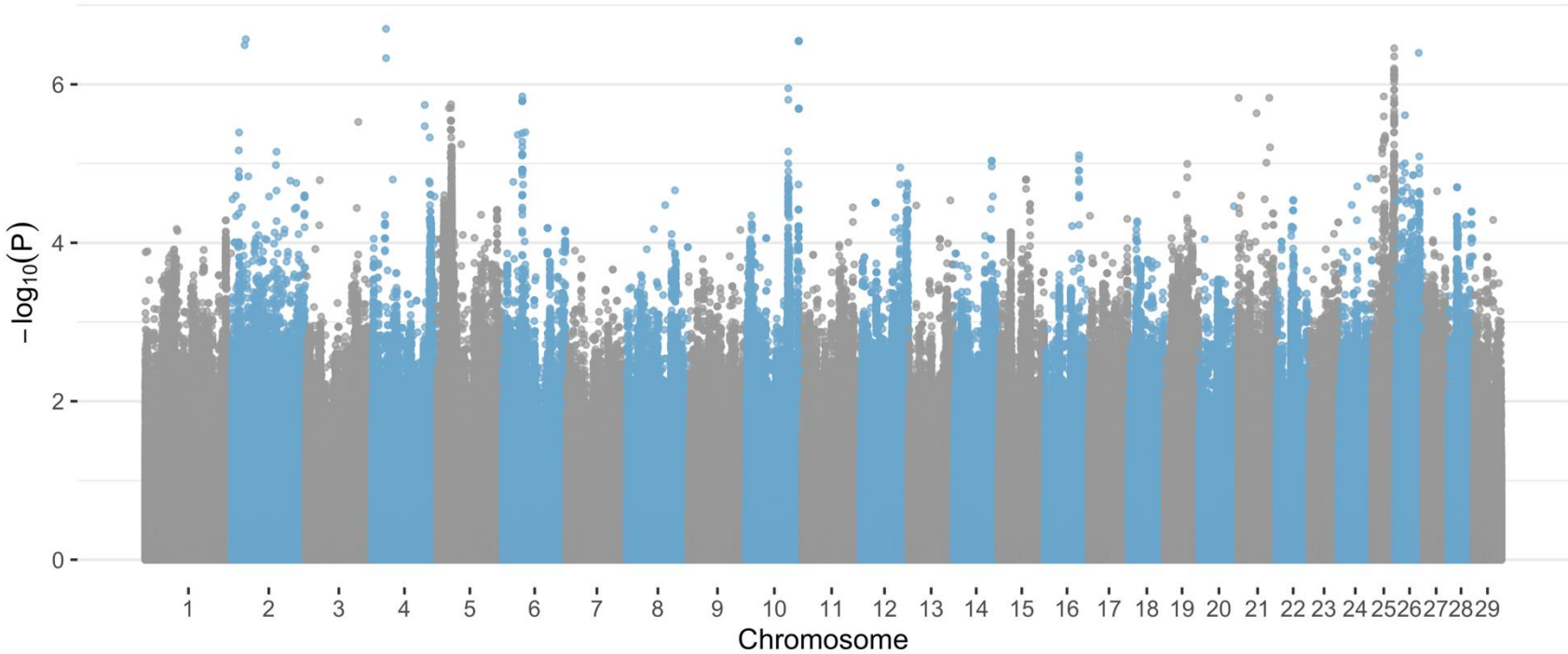
<sup>1</sup>Holstein heritabilities in **orange** on diagonal; heritabilities for other breeds are the same except for BWC (**0.35**), udder (**0.20**), and Jersey and Brown Swiss yield traits (**0.23**).

# Genomic scan for residual feed intake

Data: 8k cows and 13 million genetic variants

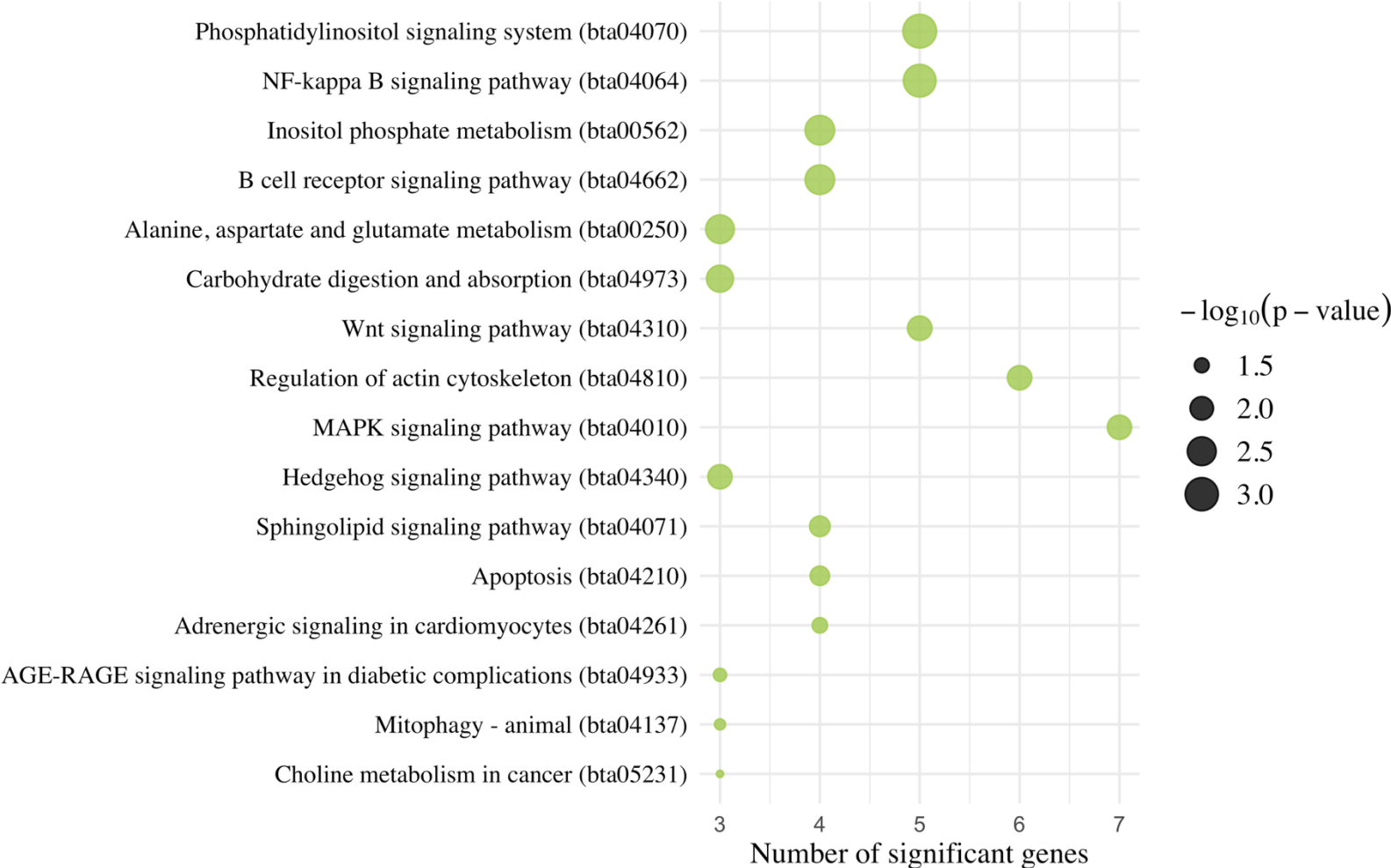


residual feed intake is highly polygenic, many genes with small effects!



# Gene-set analysis for residual feed intake

rationale: go beyond single genes → evaluate sets of genes



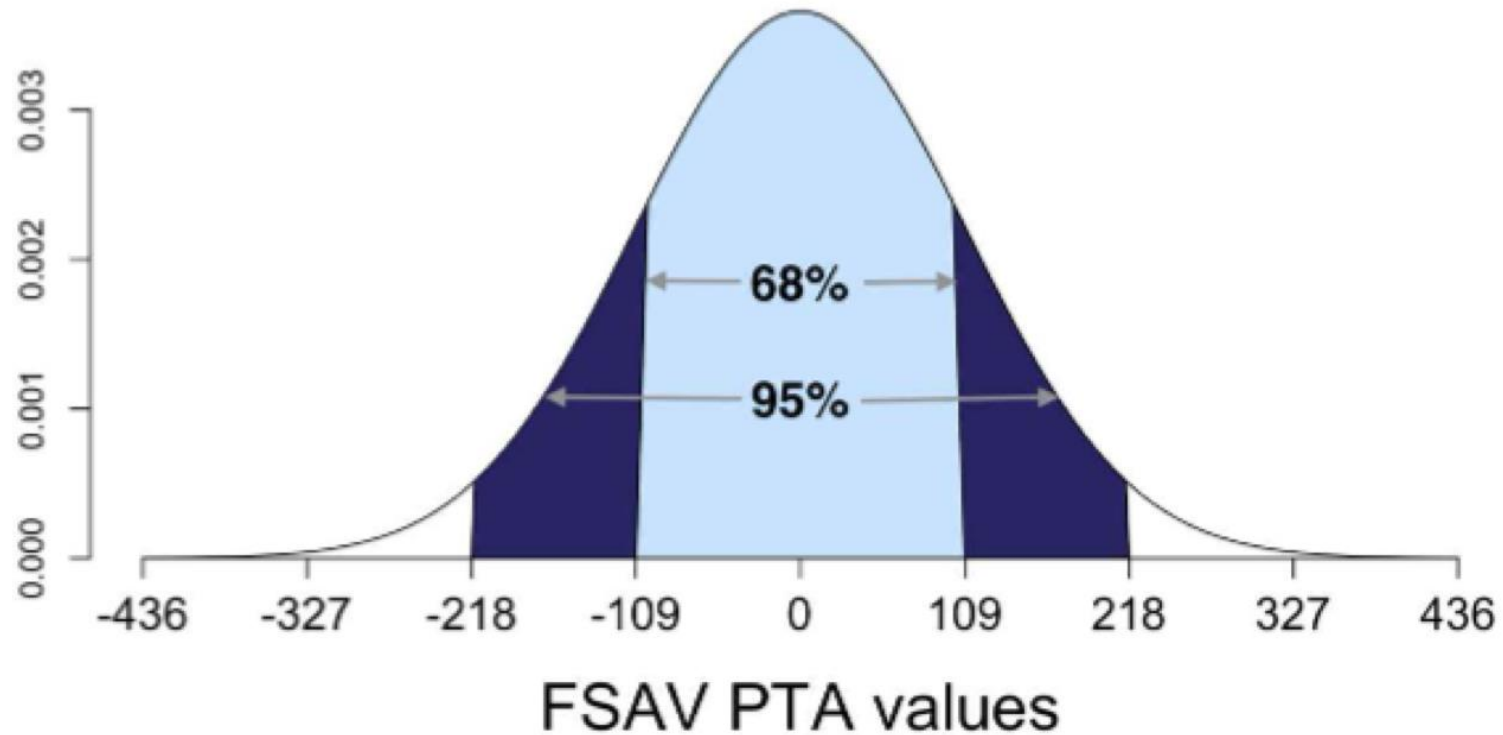
# Current traits under selection



<b>Production</b>	milk yield   protein yield & percentage   fat yield & percentage   milking speed
<b>Fertility</b>	daughter pregnancy rate   heifer/cow conception rate   age at first calving
<b>Longevity</b>	productive life   cow livability   heifer livability
<b>Health</b>	SCS   mastitis   ketosis   retained placenta   metritis   DA   milk fever
<b>Calving ability</b>	calving ease   stillbirth rate   gestation length
<b>Conformation</b>	body weight composite   feet and leg composite   udder composite   type
<b>Feed efficiency</b>	<b>residual feed intake   feed saved</b>

# Trait definition: Feed Saved

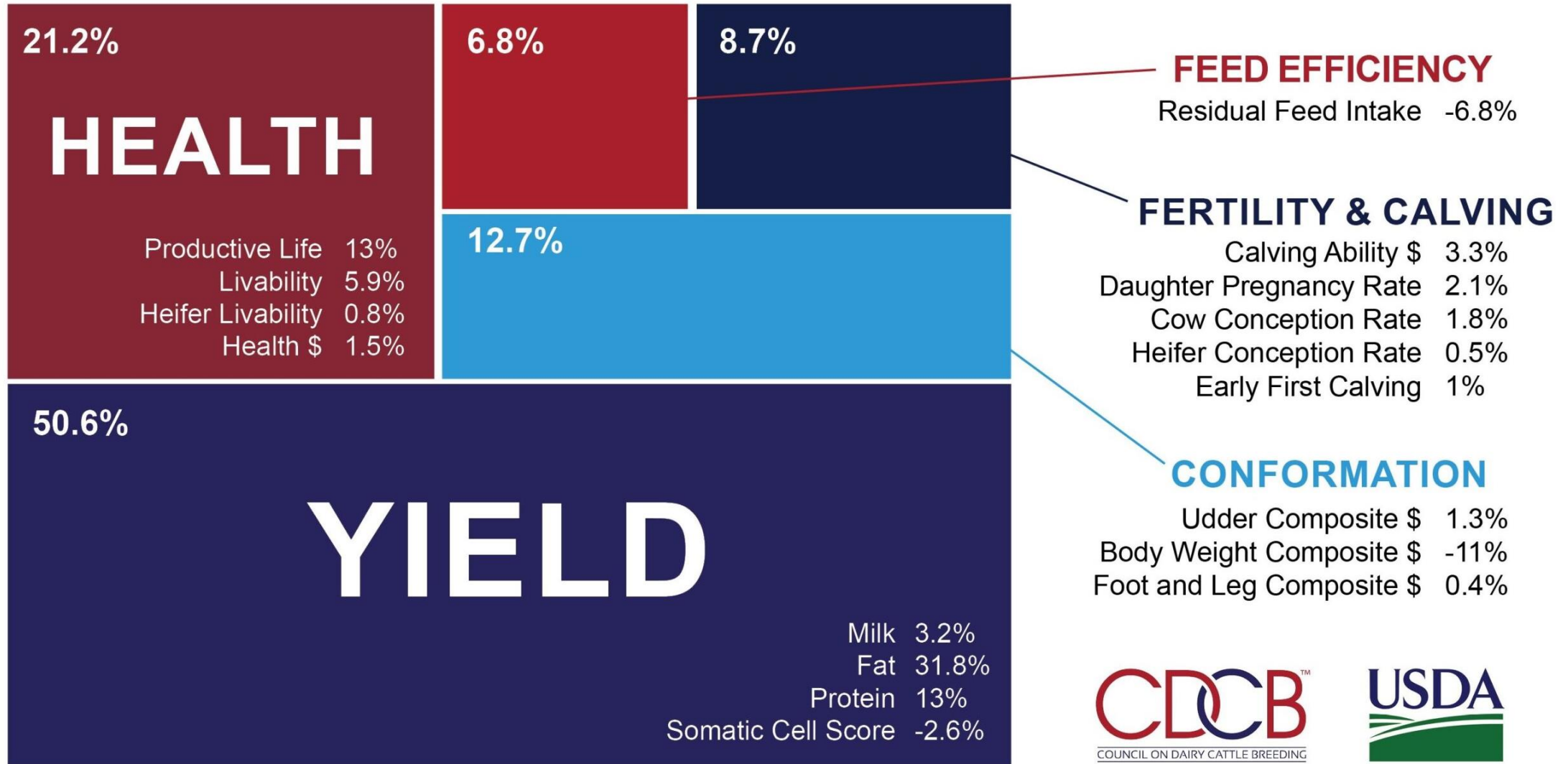
Feed Saved combines Residual Feed Intake + Body Weight Composite



**pounds of feed saved per lactation**  
(larger, positive values are more favorable)

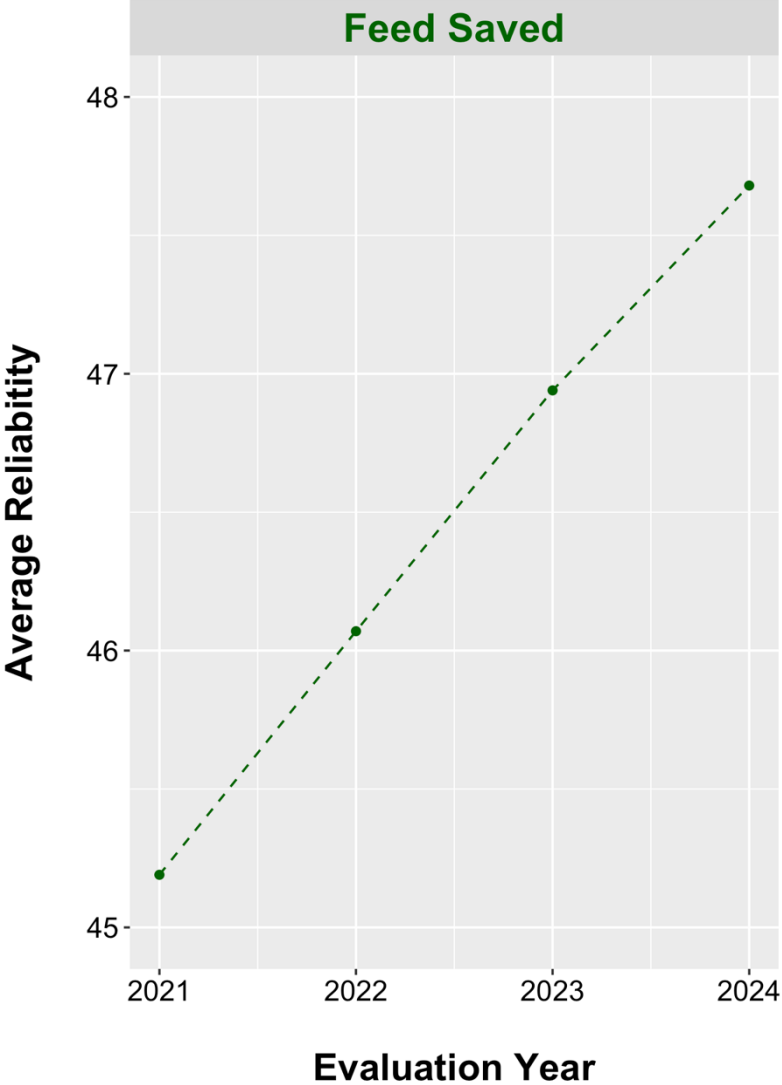
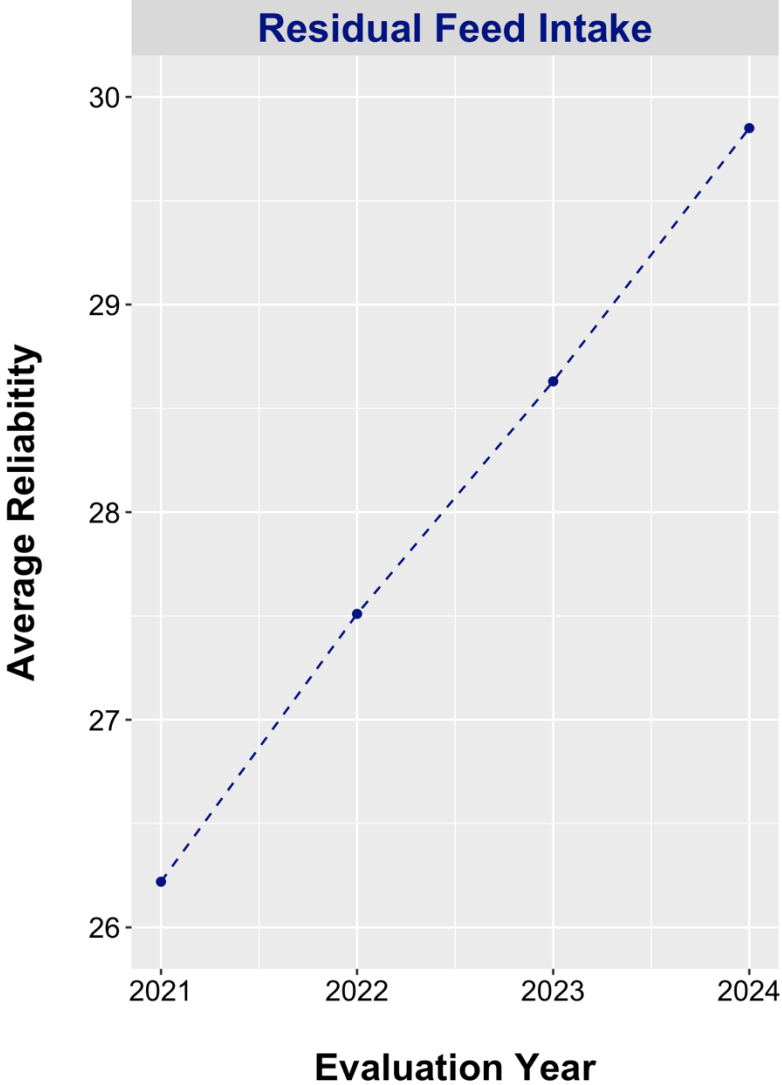
# Index: best selection tool!

Net Merit Index (\$NM)



# Change in reliabilities

Reliabilities are slowly but steadily improving



# The million-dollar question



## Why some cows are more efficient than others?

(some cows need less feed than others of similar body weight and milk production)

**some processes that contribute to feed efficiency:**

- **feeding behavior, feeding patterns**
- **rumination, physical activity, and lying behavior**
- **rumen microbiome composition**
- **thermoregulation**
- **metabolism, mitochondrial function**
- **diet digestibility**

# Feeding behavior



## Insentec Gates

- number of visits/meals per day
- duration of each visit/meal
- intake per visit/meal
- feeding rate per visit/meal





# Feeding behavior

Feeding behavior traits are heritable and repeatable

Feeding behavior trait	$h^2$ (SE)	$r$ (SE)
<b>Number of feeder visits per day</b>	0.16 ± 0.03	0.52 ± 0.02
<b>Number of meals per day</b>	0.09 ± 0.02	0.23 ± 0.01
<b>Duration of each feeder visit</b> (minutes)	0.16 ± 0.03	0.47 ± 0.02
<b>Duration of each meal</b> (minutes)	0.14 ± 0.02	0.31 ± 0.01
<b>Total duration of feeder visits per day</b> (minutes)	0.16 ± 0.03	0.38 ± 0.02
<b>Intake per visit</b> (kg of DM)	0.16 ± 0.03	0.49 ± 0.02
<b>Intake per meal</b> (kg of DM)	0.13 ± 0.02	0.28 ± 0.01
<b>Feeding rate per visit</b> (kg of DM per minute)	0.11 ± 0.02	0.32 ± 0.02
<b>Feeding rate per meal</b> (kg of DM per minute)	0.23 ± 0.03	0.49 ± 0.02
<b>DMI</b> (kg/d)	0.12 ± 0.02	0.31 ± 0.01

# Feeding behavior

Feeding behavior traits are correlated with feed efficiency traits



	Number of visits	Number of meals	Duration of each visit	Duration of each meal	Total duration of visits	Intake per visit	Intake per meal	Feeding rate per visit	Feeding rate per meal
DMI	-0.01	0.14	0.2	0.18	0.29	0.63	0.87	0.69	0.69
Milk energy	0.06	0.38	0.43	0.44	0.62	0.47	0.69	0.21	0.21
Metabolic body weights	-0.13	-0.27	-0.1	-0.17	-0.37	0.47	0.68	0.67	0.67
Change in body weight	0.09	-0.01	-0.09	0.05	0.04	-0.08	0.1	0.03	0.03
Residual feed intake	0.15	0.19	-0.05	0.1	0.2	0.31	0.65	0.47	0.43

# Behavioral traits

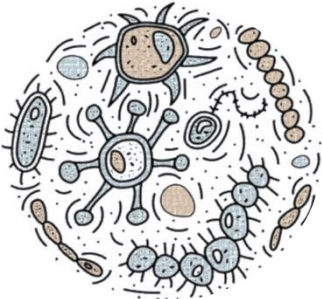


Genetic Correlations	Rumination time (min/d)	Lying time (min/d)	Activity (steps/d)
Dry matter intake (kg/day)	0.47 ± 0.17	-0.07 ± 0.10	0.18 ± 0.20
Milk energy (Mcal/day)	0.42 ± 0.21	0.06 ± 0.16	0.03 ± 0.19
BW change (kg/week)	-0.27 ± 0.73	-0.03 ± 0.43	0.04 ± 0.17
Metabolic BW (kg <sup>0.75</sup> )	0.12 ± 0.13	0.14 ± 0.08	-0.02 ± 0.12
Residual feed intake (kg/day)	<b>0.40 ± 0.19</b>	<b>-0.27 ± 0.11</b>	<b>0.31 ± 0.22</b>

# Microbiome and feed efficiency



Host  
Genome



Microbiome

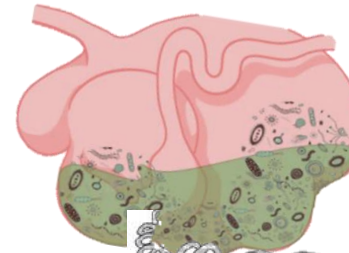
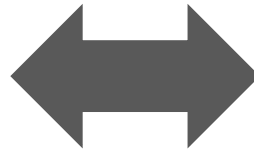


Phenotype

# Microbiome and feed efficiency

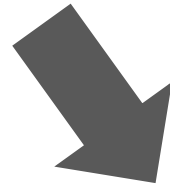


**Cow Genome**  
79K SNP



**Rumen Microbiome**  
16S rRNA gene V4 region

448 lactating  
Holstein cows

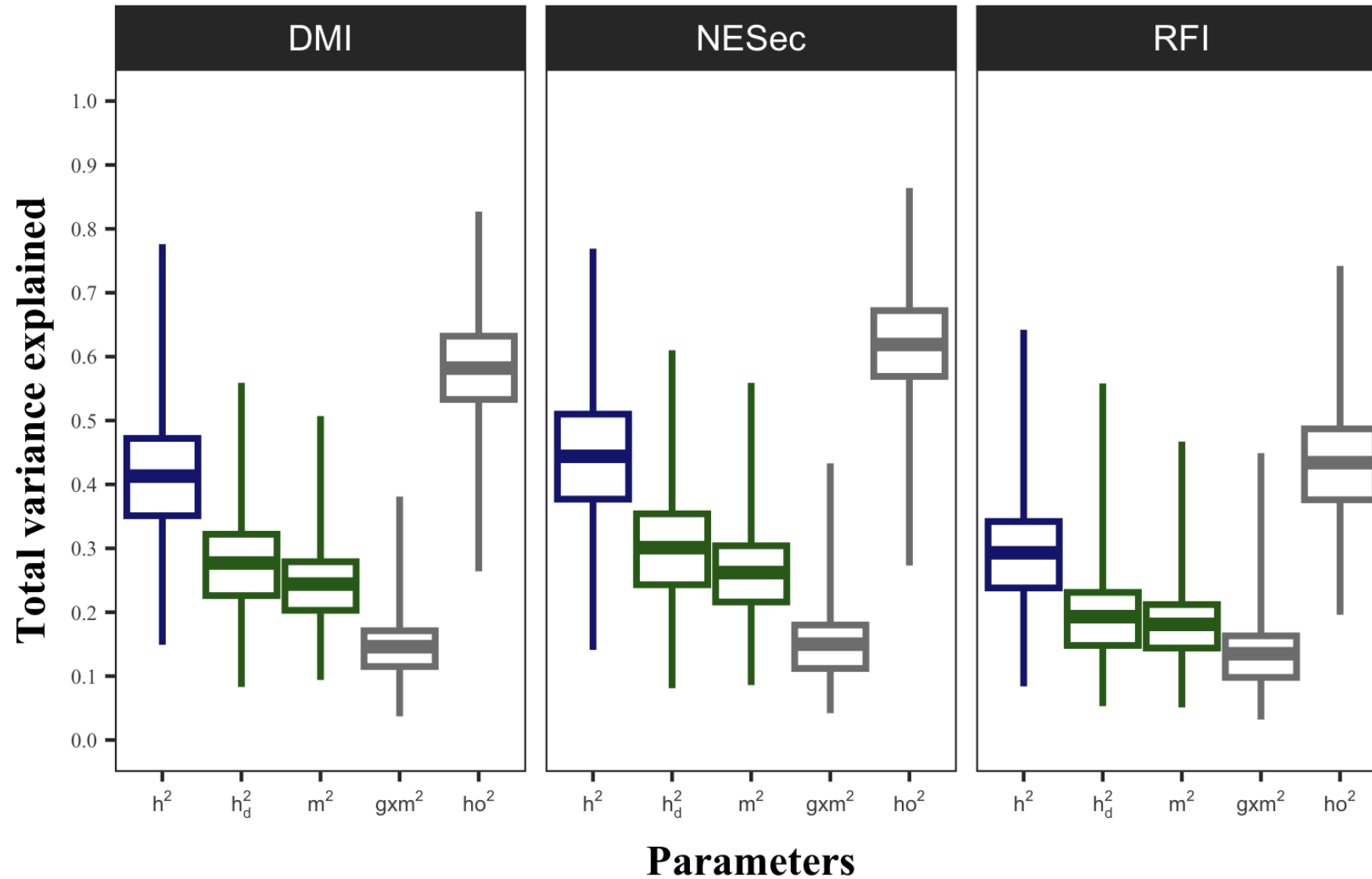


**Phenotype**

Residual feed intake  
Dry matter intake  
Milk energy

# Microbiome and feed efficiency

Rumen microbiome mediates part of the host genetic effects

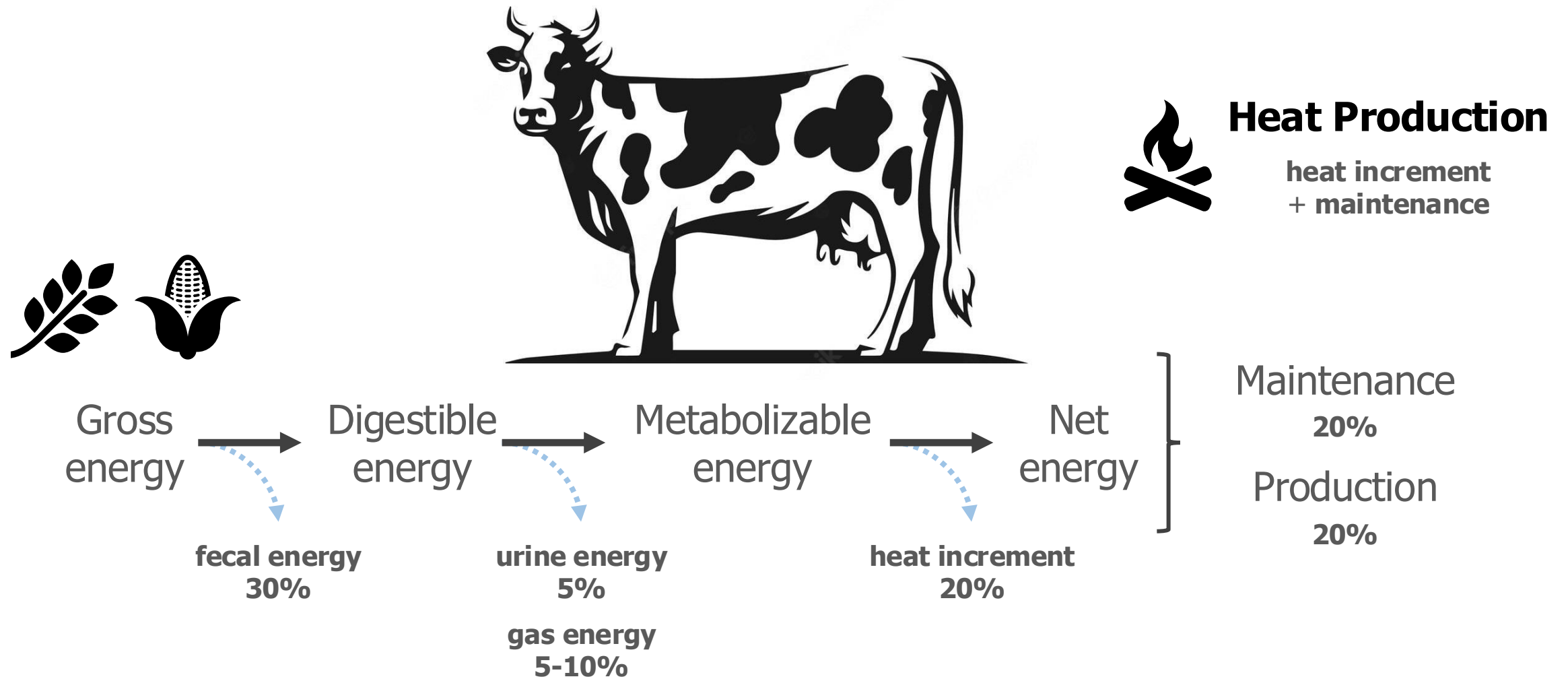




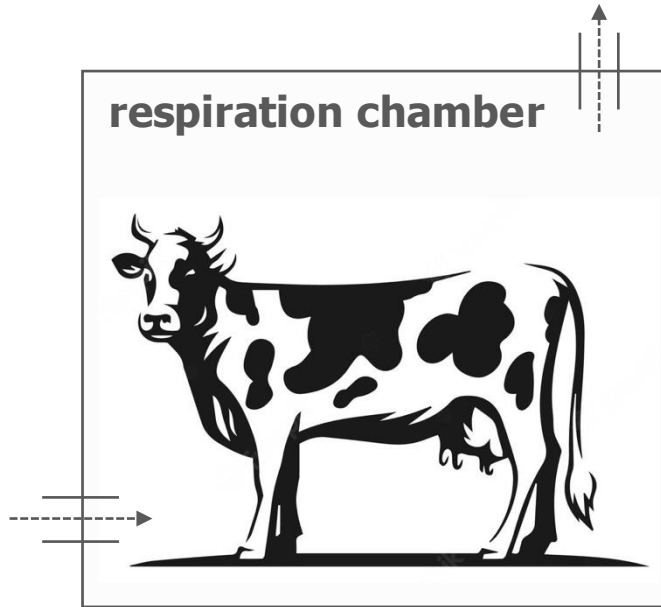
# Residual feed intake

- **feed efficiency impacts production costs and environmental sustainability**
- **residual feed intake:** the most popular index to measure feed efficiency
- **phenotyping RFI is expensive, labor-intensive,** and limited to research facilities
- **RFI does not fully reflect metabolic efficiency**
- **RFI does not fully account for energy partitioning,** maintenance vs production

# How else can we quantify efficiency?

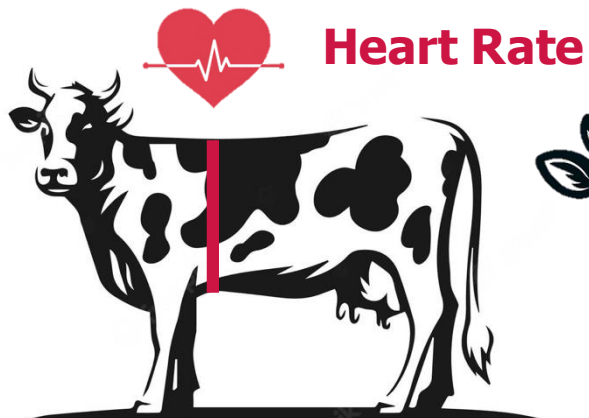


# How can we quantify heat production?



(Brouwer, 1965)

$$\mathbf{HP} = 16.18 \times \mathbf{O}_2 + 5.02 \times \mathbf{CO}_2 - 5.90 \times \mathbf{N} - 2.17 \times \mathbf{CH}_4$$



**Heart Rate**



**Oxygen Rate**

(Brosh, 2007)

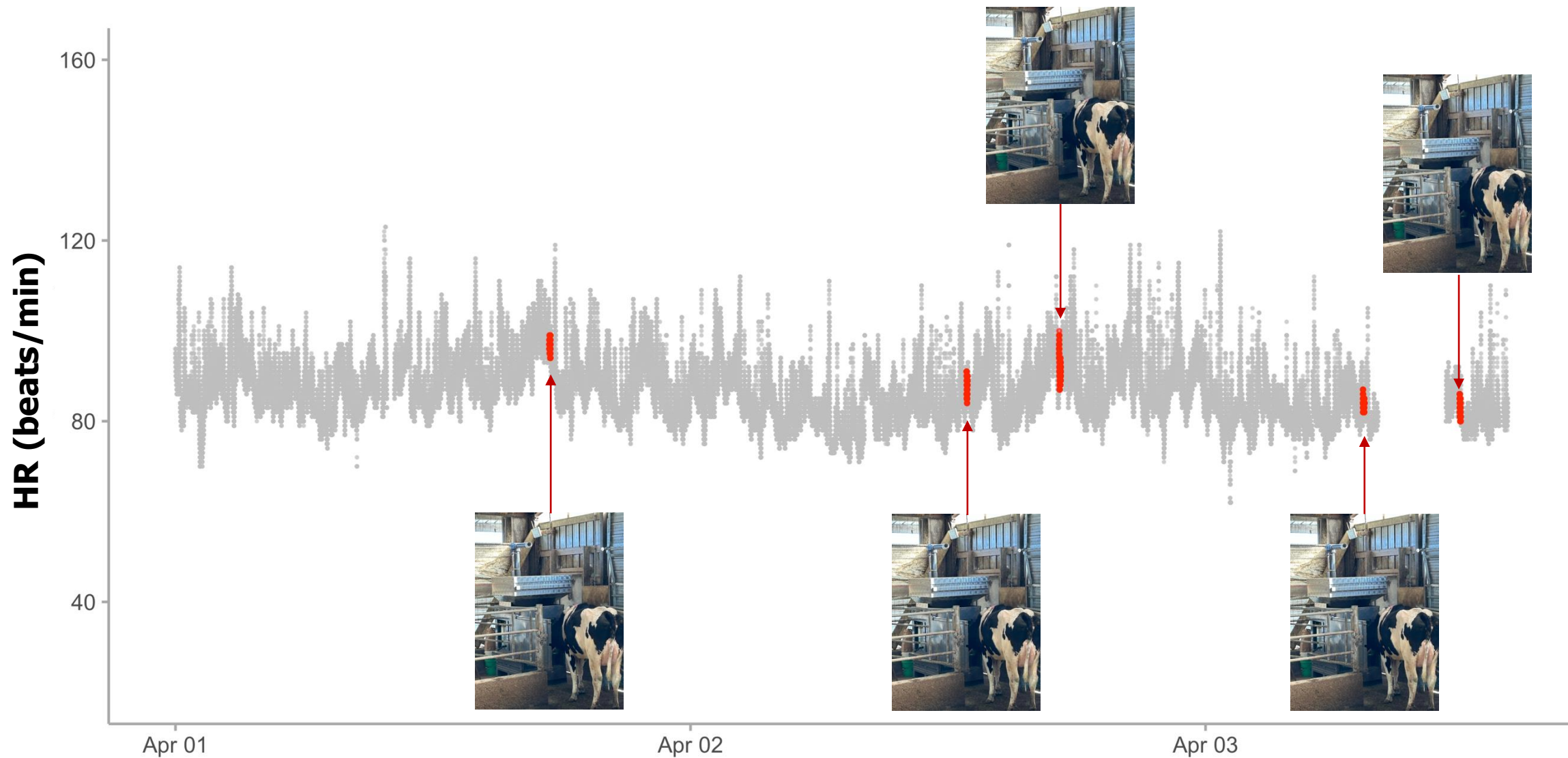
$$\mathbf{HP} = \mathbf{HR} \times \mathbf{O}_2 \text{ pulse} \times \text{constant}$$

(heart beat/d) x (O<sub>2</sub>/heart beat) x 20.47

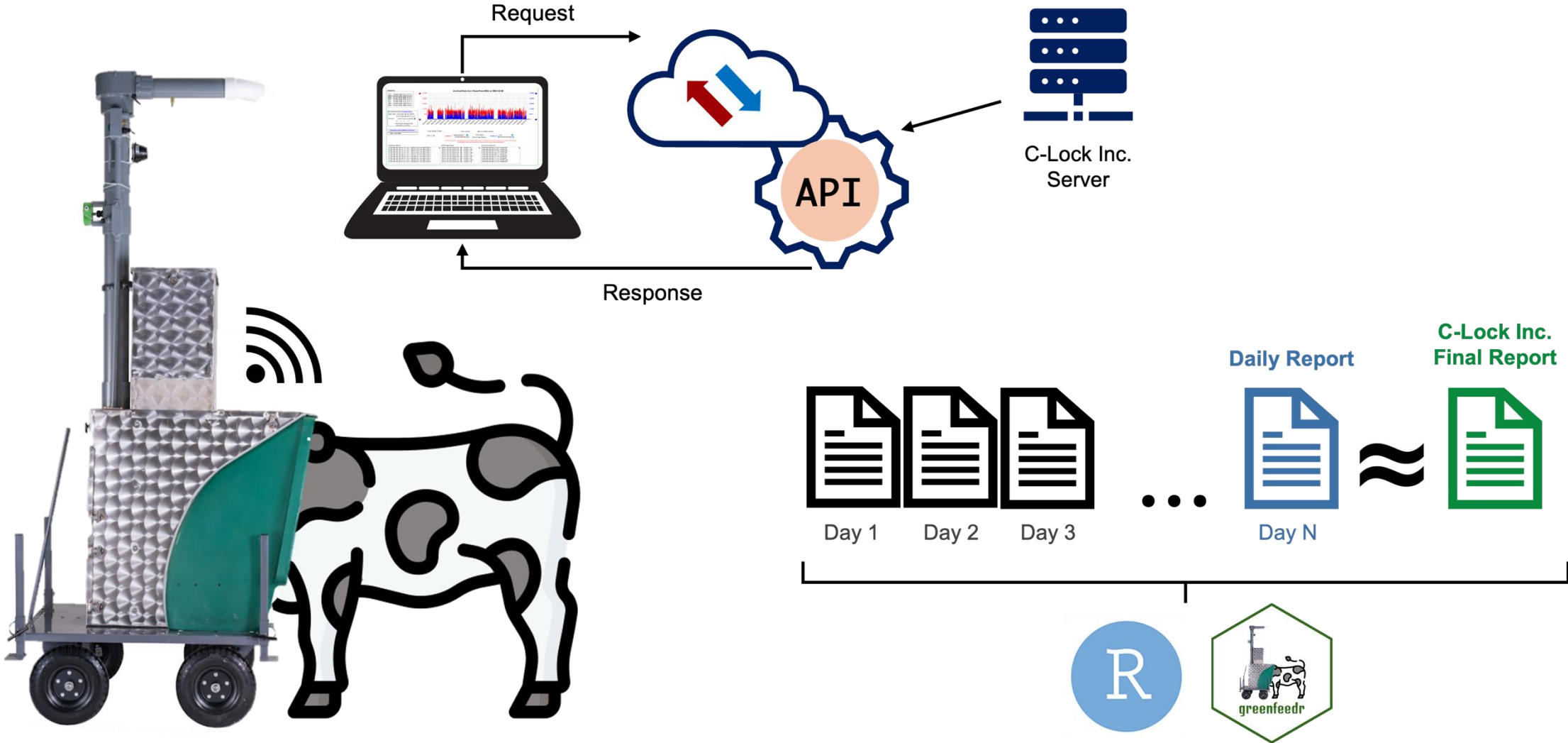
# Validation: GF-Brouwer HR-O2pulse



# Validation: GF-Brouwer HR-O2pulse



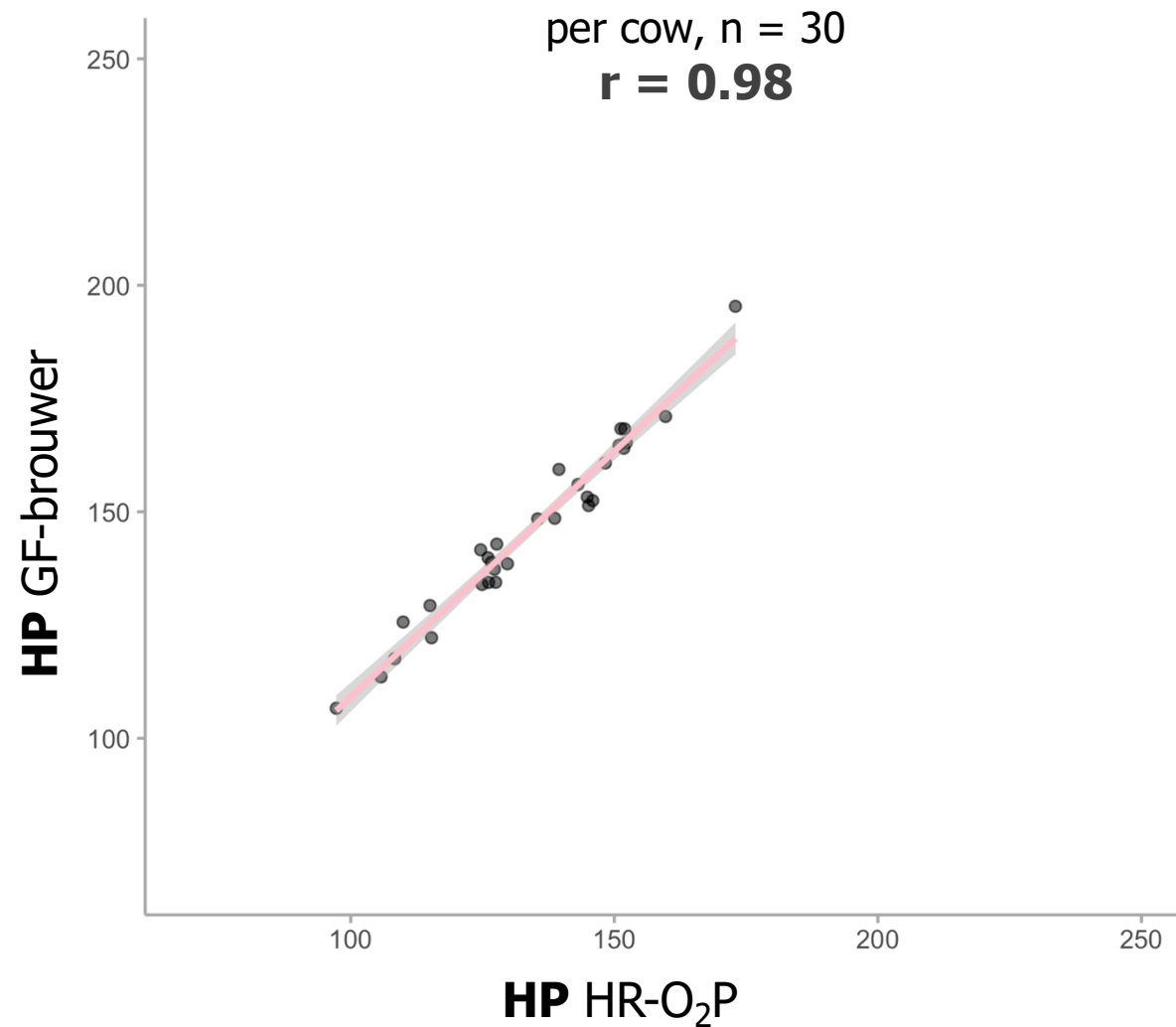
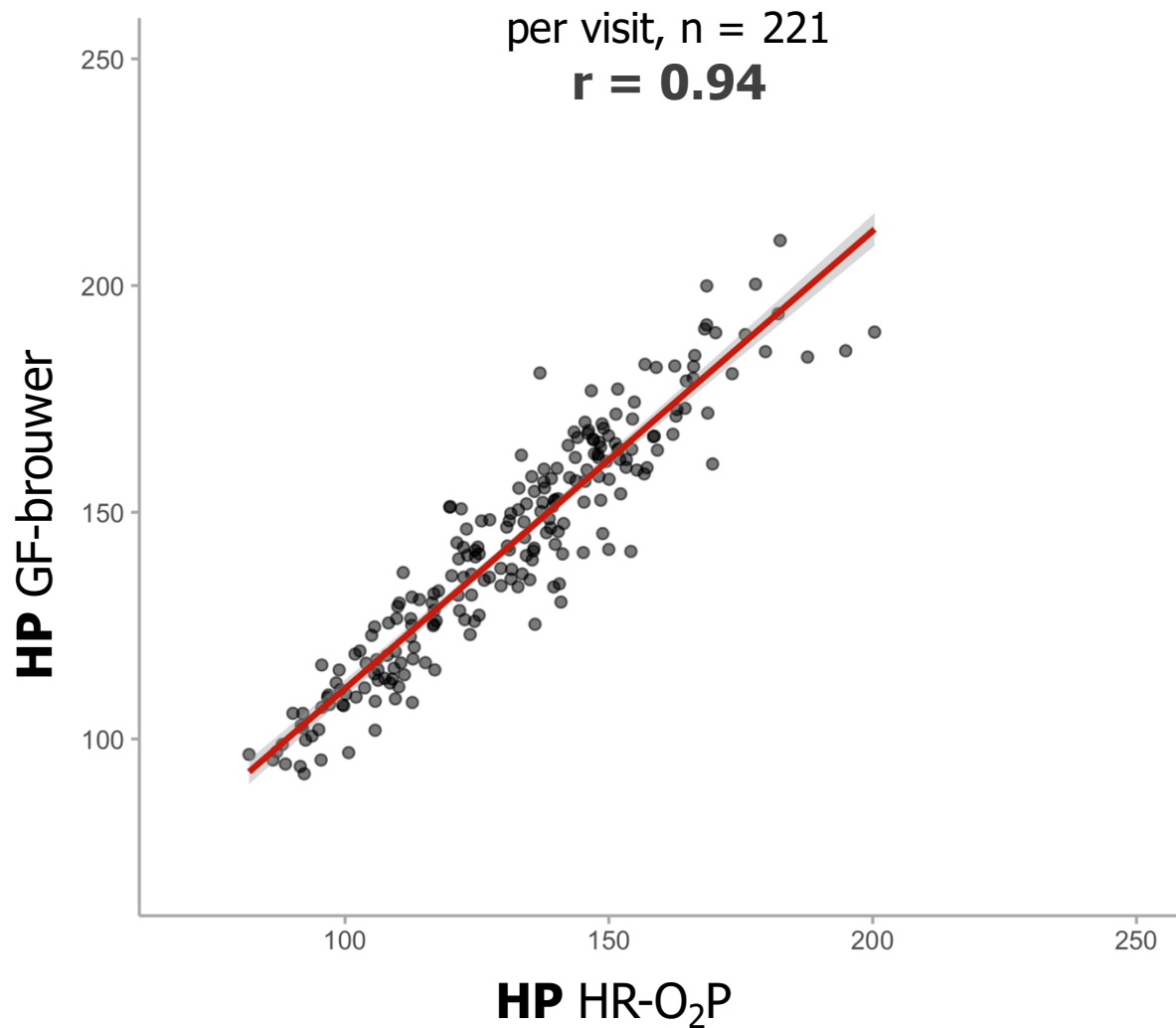
# greenfeedr R-package



GreenFeed (C-Lock Inc.)



# Validation: GF-Brouwer HR-O<sub>2</sub>pulse





# How else can we quantify efficiency?

## Residual Feed Intake vs Residual Heat Production

### Residual Feed Intake

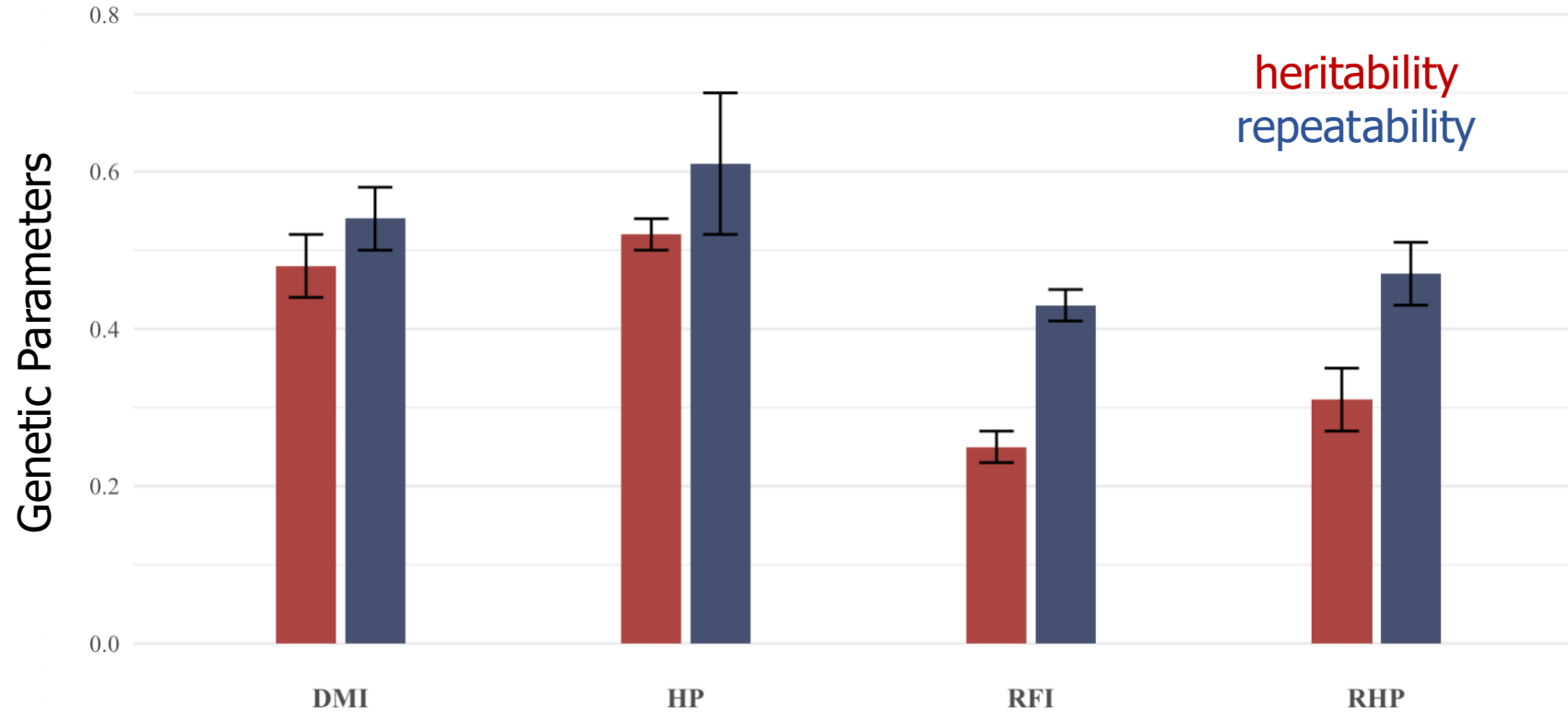
$$\text{DMI} = \text{fixed effects} + \beta_1 \text{MilkE} + \beta_2 \text{mBW} + \beta_3 \Delta\text{BW} + \text{random effects} + \mathbf{e}_{\text{RFI}}$$

### Residual Heat Production

$$\text{HP} = \text{fixed effects} + \beta_1 \text{MilkE} + \beta_2 \text{mBW} + \beta_3 \Delta\text{BW} + \text{random effects} + \mathbf{e}_{\text{RHP}}$$

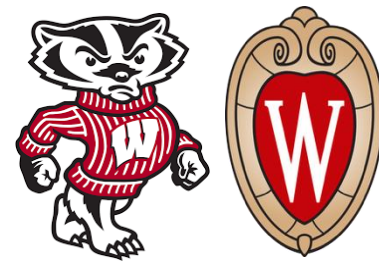
# Efficiency: RFI vs RHP

Data: DMI & RFI 10k cows | HP & RHP 2200 cows



genetic correlations:  $rg_{DMI,HP} = 0.78 \pm 0.09$  and  $rg_{RFI,RHP} = 0.50 \pm 0.09$

# Take home messages



- **feed efficiency is an economically relevant trait**
- **residual feed intake is a heritable trait ( $h^2 \approx 16\%$ )**
- **genetic selection can effectively improve dairy cow feed efficiency**
- **residual feed intake is highly polygenic, many genes with small effects**
- **some mechanisms:** digestion and absorption, metabolism, immunity
- **feeding behavior traits are genetically correlated with feed efficiency traits**
- **behavioral traits are genetically correlated with feed efficiency traits**
- **rumen microbiome affects feed efficiency traits**
- **residual heat production: promising trait to measure efficiency**

# Team



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Emily Tabor



Andre Zambon



Agustín Chasco



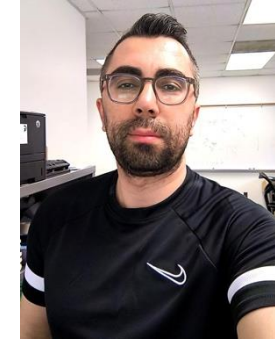
Negin Sheybani



Fiona Guinan



Federica Marín



Ümit Bilginer

# Acknowledgments



# Thanks for your attention!



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