

Can rumen microbes improve prediction of metabolic traits in Dairy cows?

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Metagenomics Project
REMRUM Project

And With Special Thanks To



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Erasmus
Mundus

Background

- **Phenotype = Genes + Environment**
- For many traits this is not the case
- Rumen microbes form a key part of the engine!
- Feed utilization and methane
 - Completely dependent on rumen microbes
 - Produce VFAs: acetate, propionate and butyrate



Background

- Phenotype = Genes x Microbes x Environment
- Changing diet E \longrightarrow M
- Rumen bacteria & archaea h^2 G \longrightarrow M
- If G & M contribute to P
- One unit under natural selection

Zilber-Rosenberg and Rosenberg, 2008;

Bordenstein & Theis, 2015



Photo: Yokoyama & Cobos

Ketosis

- Metabolic disease
- High yielding dairy cows susceptible
- Severe NEB, mobilized fat exceeds capacity of liver
- Increased ketone bodies in milk, blood and urine
 - Biomarkers: Milk Acetone and BHB
 - Decreased ruminal propionate production
- Lowly heritable ($h^2 = 0.02 - 0.14$)

Research Questions

- 1) Do rumen microbes explain variation in
Ketosis?
- 2) Can rumen microbial information improve
prediction of Ketosis?

Rumen Samples



OTU	SampleA	SampleB	SampleC
OTU_1	0	12	8
OTU_2	1	22	0
OTU_3	6	0	2

- Rumen Flora Scoop
- 16S rRNA gene amplicon sequencing & assembly
- Alignment & assembly: 'bins' 97% similarity = OTU
- OTU ~ relative counts of different **bacterial** and **archaeal** species

Data

- 277 lactating Holsteins 3 herds - **E**
- Milk metabolites NMR:
 - BetaHydroxyButyrate(**BHB**)
 - Acetone(**ACE**)
- Rumen Bacterial (4030) & Archaeal (203) OTU's
- Illumina BovineSNP50 BeadChip > HD



Analysis

- Variance components estimation (DMU)

GBLUP

MBLUP

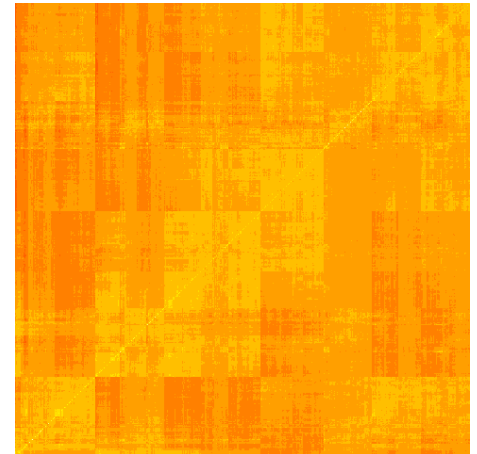
$$Y = Xb + Zg + e$$

$$Y = Xb + Wm + e$$

- Microbial relationship matrix

$$h^2 = \frac{Vg}{Vp}$$

$$m^2 = \frac{Vm}{Vp}$$



16S rRNA bacterial & archaeal abundance intra-class correlation
Microbiability (m^2)
 coefficient

Results

	heritability	microbiability
Acetone	0.10	0.15
BHB	0.03	0.15

Prediction reliabilities

- Five fold validation (20%)
- Reliability computed as correlation between:

MBLUP: $\text{corr}(cY; MV)/m^2$ GBLUP: $\text{corr}(cY; EBVs)/h^2$

Results

	G reliability	M reliability
Acetone	0.25	0.35
BHB	0.02	0.55

Conclusions

- m^2 - a tool for identifying and quantify M contributions to complex phenotypes
- M explains more variation in Ace and BHB than G
- Prediction reliabilities of MBLUP exceeds GBULP
- Microbes - Correlation is not necessarily causation