

# Constructing gene networks underlying traits routinely recorded in dairy cattle

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#### 1. Motivation

- 2. Data
- 3. Gene selection
- 4. Gene network
- 5. Results
- 6. Conclusions

#### **Motivation**

#### major genes

# identification of genes with medium effects

#### number of genes

gene effect

MOTIVATION

DATA GENE

**GENE SELECTION** 

GENE NETWORK

RESULTS

CONCLUSIONS

polygenes

#### **Motivation**

#### bovine genome sequence

## identification of genes with medium effects

#### genomic selection

MOTIVATION

DATA GENE SE

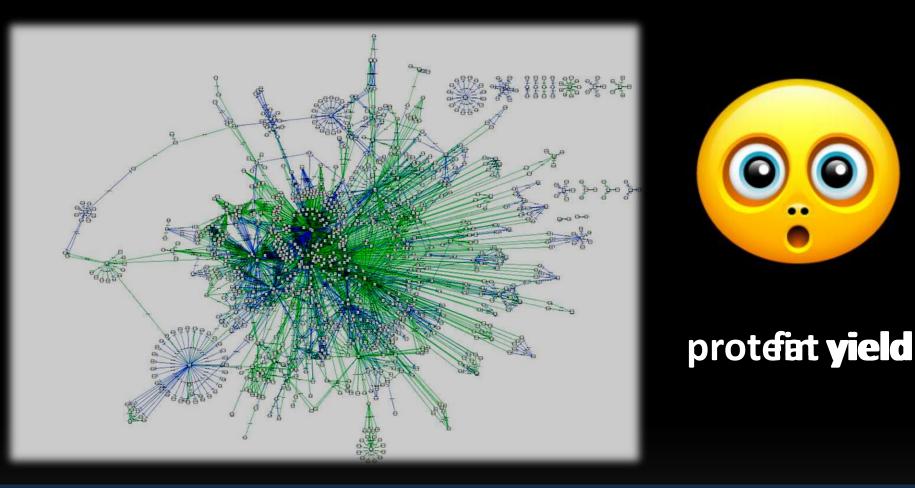
GENE SELECTION

GENE NETWORK

RESULTS

#### **Motivation**

## gene regulatory network anchored on known genes



MOTIVATION

GENE SELECTION

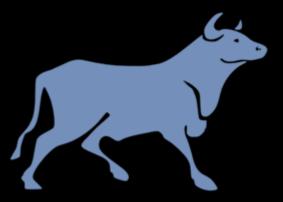
DATA

CTION GEN

**GENE NETWORK** 

RESULT

#### Data set



# 2461 HF bulls

## genotypes: Illumina 50K <u>chip</u>

## phenotypes: EBV for 29 traits

MOTIVATION

DATA G

**GENE SELECTION** 

**GENE NETWORK** 

RESULT

#### Gene selection procedure: 1. SNP effect estimation

 $y = \mu + Zq + e$ 

- y deregressed EBV
- μ general mean

• q SNP ~ 
$$N(0, \mathbf{I}\sigma_q^2)$$

• Z  $\in$  {-1, 0, 1 }

estimates of 46 267 additive effects of 29 traits

• e residual

DATA

MOTIVATION

GENE SELECTION

GENE NETWORK

RESULTS

#### **Gene selection procedure: 2. SNP selection**

q SNP ~  $N(0, I\sigma_a^2)$ 



#### CV for $\alpha$ =0.20



Bonferroni N=46 267

MOTIVATION

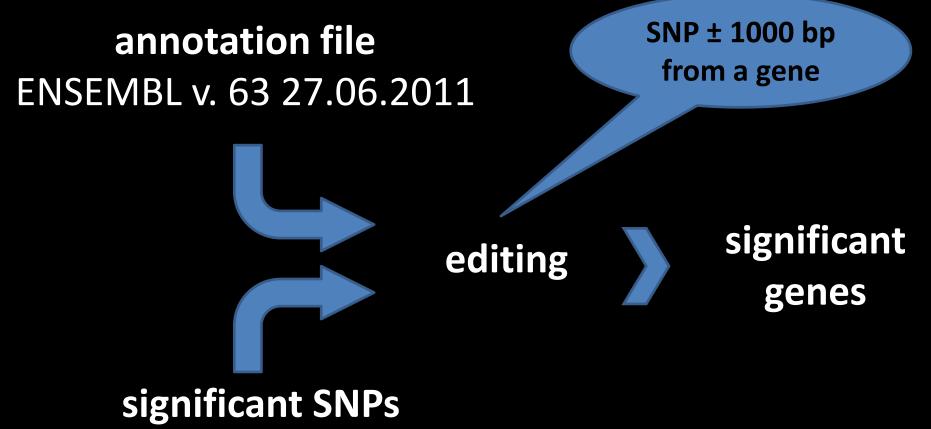
GENE SELECTION

DATA

GENE NETWORK

ORK RE

#### Gene selection procedure: 3. SNP annotation



genomic evaluation 04.2011

DATA

MOTIVATION

**GENE SELECTION** 

GENE NETWORK

#### **Gene network construction**

### gene list



#### Cytoscape

Cytoscape: An Open Source Platform for Complex Network Analysis and Visualization



#### Bisogenet

Martin et al. 2010 BMC Bioinformatics

• NCBI

UniProt

- KEGG pathway
- Gene Ontology
- protein interaction
- gene interaction







#### human data used

MOTIVATION

GENE SELECTION

DATA

**GENE NETWORK** 

RESULTS

### **Results: protein yield**



- 5 significant SNP identified
- BTA: 1, 5, 6, 25
- 2 SNPs annotated within bovine genes
  - $\rightarrow$  1 locus unknown
  - $\rightarrow$  1 locus no interactions present

MOTIVATION

DATA GENE SELECTION

GENE NETWORK

RESULTS

### **Results: fat yield**



- 34 significant SNP identified
- BTA: 2, 3, 7, 14, 26
- 9 SNPs annotated within bovine genes
  - $\rightarrow$  2 loci unknown
  - $\rightarrow$  1 locus no interactions (DGAT1)
  - $\rightarrow$  6 loci interactions found

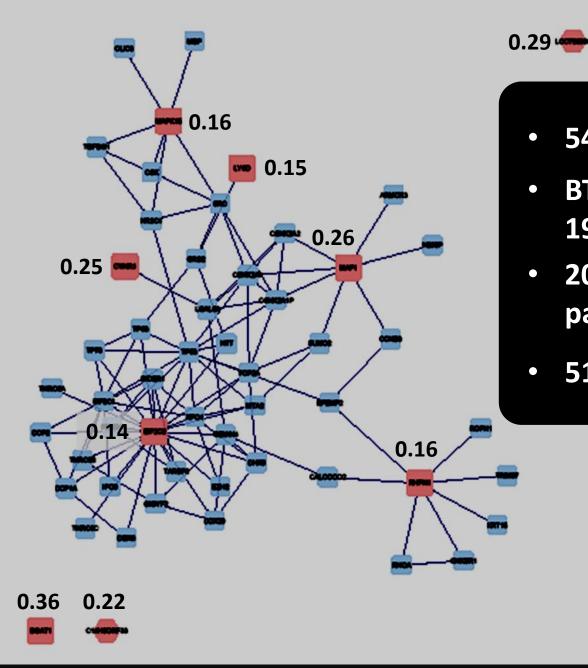
MOTIVATION

DATA GENE SELECTION

ON GENE

**GENE NETWORK** 

RESULTS



## Results: fat yield

- 54 genes
- BTA: 1-7, 10-11, 13-16, 18-19, 21-25, 29
- 20 genes metabolic pathways known
- 51 genes GO terms known

MOTIVATION

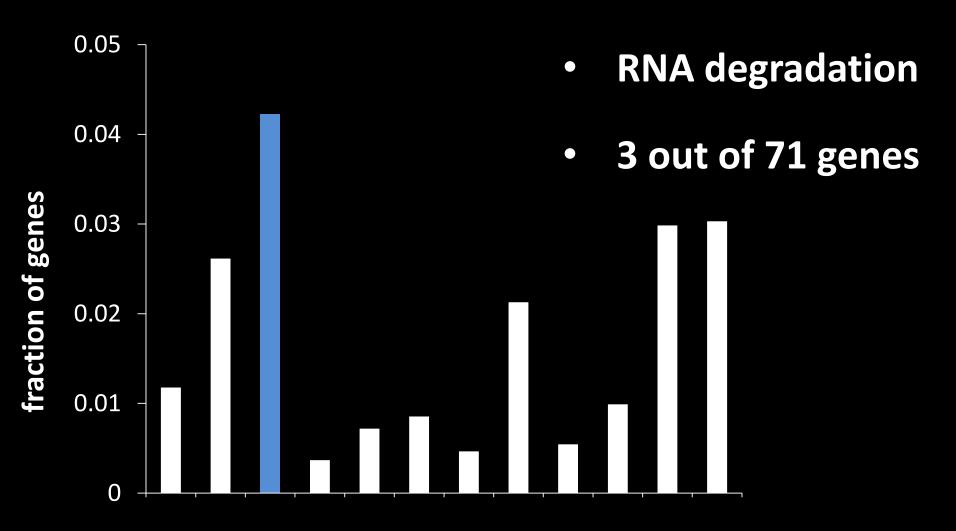
DATA GENE

GENE SELECTION

GENE NETWORK

RESULTS

#### **Results: fat yield, metabolic pathways**



#### **KEGG metabolic pathway**

MOTIVATION

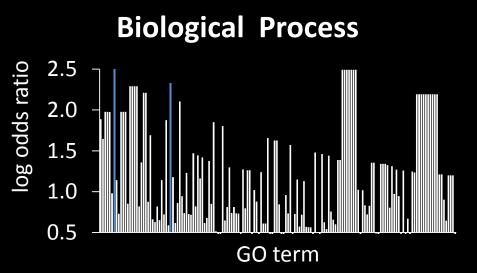
GENE SELECTION

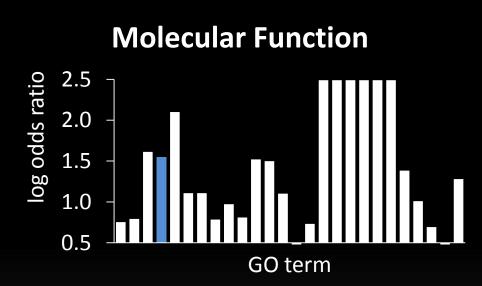
DATA

GENE NETWORK

RESULTS

### Results: fat yield, gene ontology





DATA

- 150 GO with P < 0.05
- gene silencing
- 8 out of 38 genes P < 3<sup>-10</sup>
- RNA interference
- 3 out of 6 genes / 2 out of 4 genes
- 26 GO with P < 0.05
- protein binding
- 44 out of 51 genes P < 9<sup>-5</sup>
- small interfering RNA binding
- 2 out of 7 genes

MOTIVATION

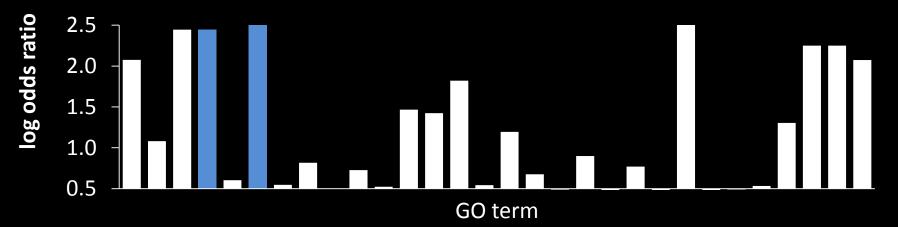
GENE SELECTION

**GENE NETWORK** 

RESULTS

### Results: fat yield, gene ontology

**Cellular Component** 



- 29 GO with P < 0.05
- cytoplasmic mRNA processing body
- 8 out of 38 genes P < 5<sup>-11</sup>

DATA

- RNA-induced silencing complex / micro-ribonucleoprotein complex
- 5 out of 10 genes / 2 out of 4 genes

MOTIVATION

GENE SELECTION

GENE NETWORK

RESULTS

#### Conclusions

- 1. Fat yield regulated by RNA genes ???
- 2. Poor resolution with 50K chip
  - many SNPs outside genes
  - 777K better
- 3. No data for Bos taurus

MOTIVATION

DATA GENE SELECTION

GENE NETWORK

RESULTS

#### Questions

## **1. SNP choice**

- how many SNPs
- consider LD
- 0
- correct for multiple testing

## 2. Network validation

- individual genotyping expensive
- Individual sequencing even more expensive
- permutation

DATA

• replication across different (national) data sets

MOTIVATION

GENE SELECTION

GENE NETWORK

RK RESULTS

