

# **Towards novel selection strategies to improve production and fertility by integrating expression profiles and high throughput genotyping in cattle**

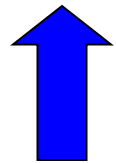
**Eduardo Pimentel, M. Tietze, H. Simianer, F. Reinhardt ,  
S. Bauersachs, E. Wolf and S. König**

Department of Animal Sciences  
Animal Breeding and Genetics Group  
Georg-August-University Göttingen, Germany

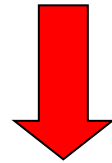


# Motivation

---



Production



Fertility

- “Phenotypic” level:  
(e.g. Holtsmark *et al.* 2008, König *et al.* 2009)
- Genomic level:  
(e.g. ???)

# Motivation

---



**Gene expression profiling of bovine endometrium during the oestrous cycle: detection of molecular pathways involved in functional changes**

S Bauersachs<sup>1,2</sup>, S E Ulbrich<sup>3</sup>, K Gross<sup>1</sup>, S E M Schmidt<sup>1</sup>, H H D Meyer<sup>3</sup>, R Einspanier<sup>4</sup>, H Wenigerkind<sup>5</sup>, M Vermehren<sup>6</sup>, H Blum<sup>2</sup>, F Sinowatz<sup>6</sup> and E Wolf<sup>1,2</sup>

**Dynamic changes in messenger RNA profiles of bovine endometrium during the oestrous cycle**

Katrin Mitko<sup>1,2</sup>, Susanne E Ulbrich<sup>3</sup>, Hendrik Wenigerkind<sup>4</sup>, Fred Sinowatz<sup>5</sup>, Helmut Blum<sup>2</sup>, Eckhard Wolf<sup>1,2</sup> and Stefan Bauersachs<sup>1,2</sup>

## Candidate genes

- Increased expression in luteal phase
- Regulation by progesterone (P4)
- Preparation of for implantation

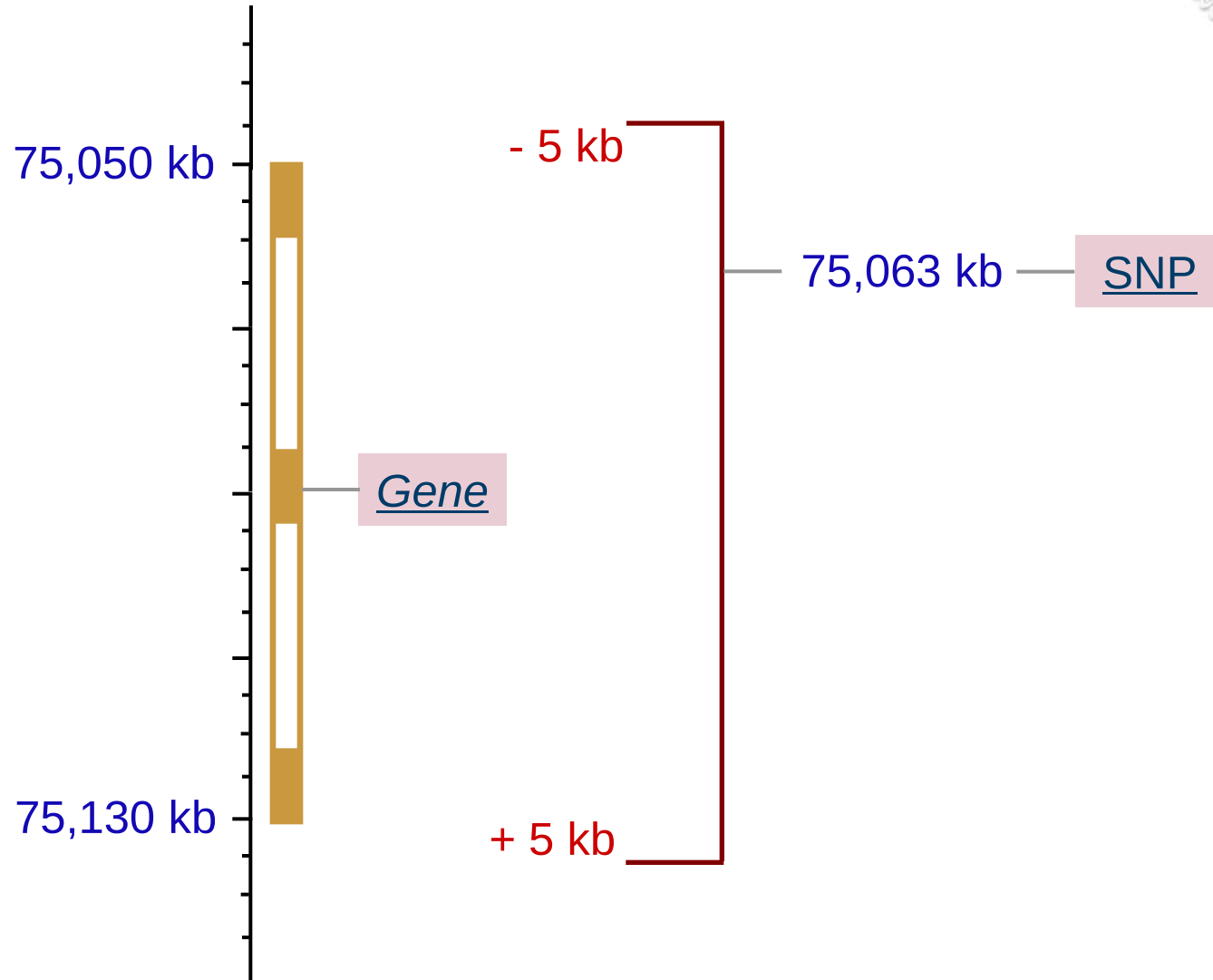
# Material

---



- 170 candidate genes
- 2294 Holstein bulls (call rate  $> 0.97$ )
- 39557 SNPs (Illumina BovineSNP50 BeadChip)
  - call rate  $> 0.95$
  - MAF  $> 0.05$
  - known position
  - no missing (imputed with fastPHASE)

# Material



# Material

---



- Production traits:
  - milk yield (Mkg)
  - fat yield (Fkg)
  - protein yield (Pkg)
  - fat percentage (Fpr)
  - protein percentage (Ppr)
  - somatic cell score (SCS)





- Fertility traits:
  - non-return rate to 56 days:
    - in heifers (**NRh**)
    - in cows (**NRc**)
  - interval from first to successful insemination:
    - in heifers (**FLh**)
    - in cows (**FLc**)
  - interval from calving to first insemination (**CFc**)
  - days open (**DOc**)

# Methods



- Statistical model:

$$\mathbf{y} = \mathbf{X}\mathbf{b} + \mathbf{Z}\mathbf{u} + \mathbf{e}$$

EBV       $\mu + \text{marker effect}$       polygenic effect

$$\mathbf{e} \sim \mathbf{N}(\mathbf{0}, \mathbf{R}\sigma_e^2)$$

diag( $1/r_i$ )

$$\mathbf{u} \sim \mathbf{N}(\mathbf{0}, \mathbf{G}\sigma_a^2)$$

marker | pedigree

- Significance threshold: 5% FDR

# Methods

---



- Marker-based kinship coefficients
  - Hayes & Goddard (2008)

$$S_{xy,l} = 1/4[I_{11} + I_{12} + I_{21} + I_{22}]$$

where  $I_{ij}$  is an indicator variable which is 1 when allele  $i$  on locus  $l$  in the first individual and allele  $j$  on the same locus in the second individual are identical, otherwise it is 0.

# Methods

---



- Marker-based kinship coefficients
  - Hayes & Goddard (2008)

$$S_{xy,l} = 1/4[I_{11} + I_{12} + I_{21} + I_{22}]$$

where  $I_{ij}$  is an indicator variable which is 1 when allele  $i$  on locus  $l$  in the first individual and allele  $j$  on the same locus in the second individual are identical, otherwise it is 0.

The similarity index was averaged over loci.

# Methods

---



- Marker-based kinship coefficients
  - Hayes & Goddard (2008)

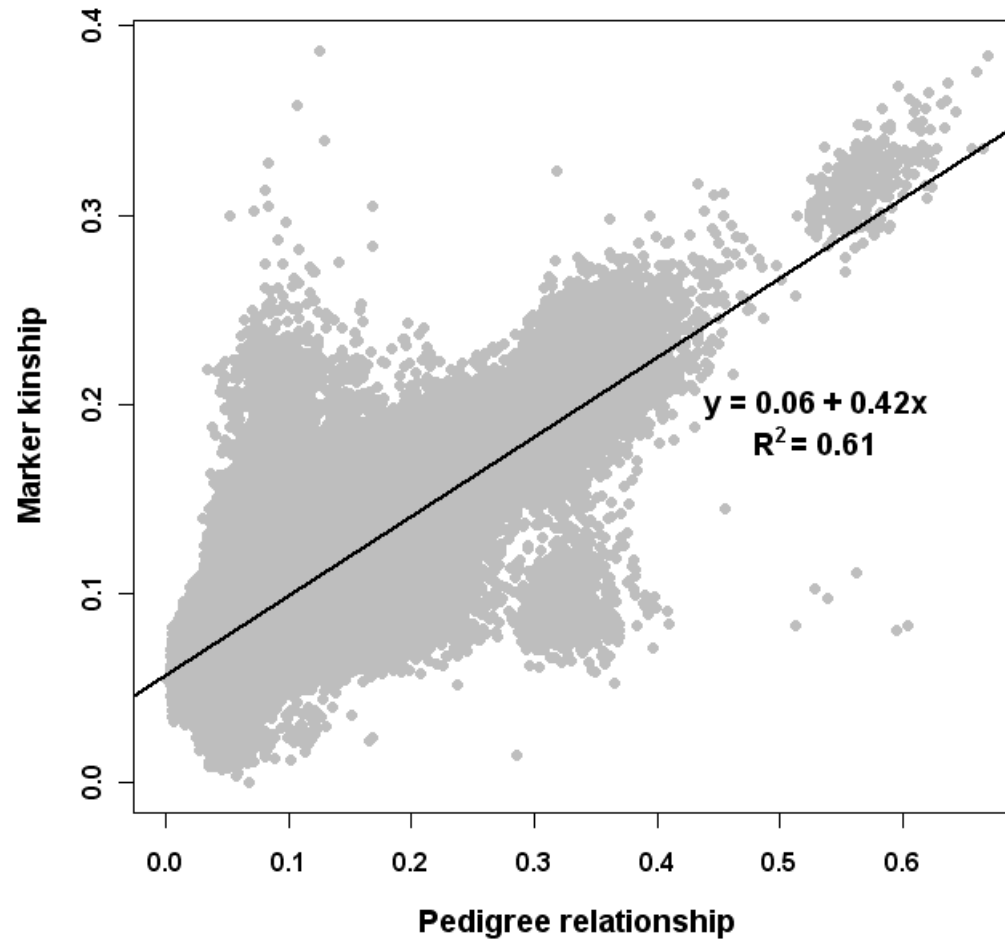
$$S_{xy,l} = 1/4[I_{11} + I_{12} + I_{21} + I_{22}]$$

where  $I_{ij}$  is an indicator variable which is 1 when allele  $i$  on locus  $l$  in the first individual and allele  $j$  on the same locus in the second individual are identical, otherwise it is 0.

The similarity index was averaged over loci.

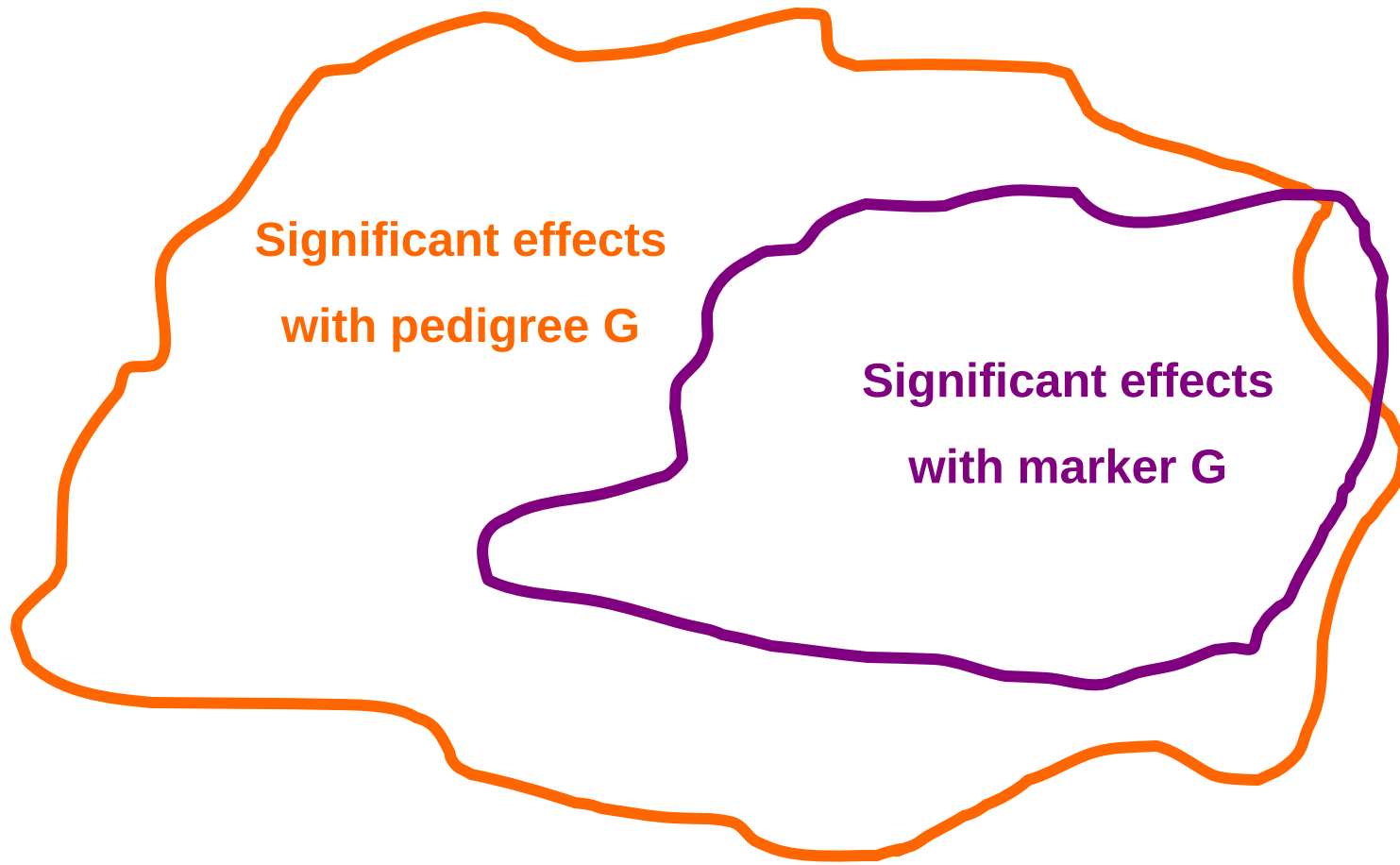
$(S_{xy} - \min) / (1 - \min)$ , where  $\min$  is the minimum relationship in the matrix

# Results



# Results

---



# Results

---



- 111 markers located within gene regions
- 16 significantly associated with at least one production plus one fertility trait
- 15 significantly associated with Mkg, Fpr and Ppr

# Results



| Chr | Gene symbol      | Trait   |        |        |        |        |       |
|-----|------------------|---------|--------|--------|--------|--------|-------|
|     |                  | Mkg     | Fkg    | Pkg    | Fpr    | Ppr    | SCS   |
| 2   | <i>CYP27A1</i>   | 52.025  | NS     | 1.101  | -0.020 | -0.007 | 0.878 |
| 2   | <i>IDH1</i>      | -37.881 | -0.763 | -1.046 | 0.009  | 0.002  | NS    |
| 3   | <i>UGT1A6</i>    | -18.877 | 0.870  | NS     | 0.019  | 0.006  | NS    |
| 4   | <i>MRPL32</i>    | 21.533  | NS     | NS     | -0.012 | -0.009 | NS    |
| 5   | <i>ACO2</i>      | -38.976 | NS     | NS     | 0.023  | 0.008  | NS    |
| 5   | <i>BCAT1</i>     | 65.064  | NS     | 1.062  | -0.038 | -0.011 | NS    |
| 5   | <i>GABARAPL1</i> | -93.189 | -0.796 | -1.848 | 0.035  | 0.015  | NS    |
| 5   | <i>MGP</i>       | 52.051  | -3.505 | NS     | -0.063 | -0.016 | 1.241 |
| 13  | <i>TGM2</i>      | -29.947 | NS     | -0.712 | 0.016  | 0.004  | NS    |
| 17  | <i>MTMR3</i>     | -18.565 | -1.815 | -1.050 | -0.013 | -0.005 | NS    |
| 17  | <i>OAS1</i>      | -51.017 | NS     | -1.121 | 0.019  | 0.007  | NS    |
| 21  | <i>LGMN</i>      | -37.049 | NS     | NS     | 0.019  | 0.008  | NS    |
| 21  | <i>SERPINA14</i> | 30.829  | NS     | NS     | -0.014 | -0.006 | NS    |
| 26  | <i>LIPA</i>      | 35.818  | 1.046  | NS     | -0.007 | -0.010 | NS    |
| 28  | <i>ARID5B</i>    | -65.214 | NS     | -1.641 | 0.023  | 0.006  | NS    |

# Results



| Chr | Gene symbol      | Trait   |       |        |        |        |       |
|-----|------------------|---------|-------|--------|--------|--------|-------|
|     |                  | Mkg     | Fkg   | Pkg    | Fpr    | Ppr    | SCS   |
| 2   | <i>CYP27A1</i>   | 52.025  | NS    | 1.101  | -0.020 | -0.007 | 0.878 |
| 2   | <i>IDH1</i>      |         |       |        | 0.009  | 0.002  | NS    |
| 3   | <i>UGT1A6</i>    |         |       |        | 0.019  | 0.006  | NS    |
| 4   | <i>MRPL32</i>    |         |       |        | 0.012  | -0.009 | NS    |
| 5   | <i>ACO2</i>      |         |       |        | 0.023  | 0.008  | NS    |
| 5   | <i>BCAT1</i>     |         |       |        | 0.038  | -0.011 | NS    |
| 5   | <i>GABARAPL1</i> |         |       |        | 0.035  | 0.015  | NS    |
| 5   | <i>MGP</i>       |         |       |        | 0.063  | -0.016 | 1.241 |
| 13  | <i>TGM2</i>      |         |       |        | 0.016  | 0.004  | NS    |
| 17  | <i>MTMR3</i>     |         |       |        | 0.013  | -0.005 | NS    |
| 17  | <i>OAS1</i>      |         |       |        | 0.019  | 0.007  | NS    |
| 21  | <i>LGMN</i>      |         |       |        | 0.019  | 0.008  | NS    |
| 21  | <i>SERPINA14</i> |         |       |        | 0.014  | -0.006 | NS    |
| 26  | <i>LIPA</i>      | -55.818 | 1.040 | NS     | -0.007 | -0.010 | NS    |
| 28  | <i>ARID5B</i>    | -65.214 | NS    | -1.641 | 0.023  | 0.006  | NS    |

+ is 'good'

- is 'bad'

# Results



| Chr | Gene<br>symbol | Trait    |        |        |         |         |       |  |  |
|-----|----------------|----------|--------|--------|---------|---------|-------|--|--|
|     |                | Mkg      | Fkg    | Pkg    | Fpr     | Ppr     | SCS   |  |  |
| 2   | CYP27A1        | + 52.025 | NS     | 1.101  | - 0.020 | - 0.007 | 0.878 |  |  |
| 2   | IDH1           | - 37.881 | -0.763 | -1.046 | + 0.009 | + 0.002 | NS    |  |  |
| 3   | UGT1A6         | - 18.877 | 0.870  | NS     | + 0.019 | + 0.006 | NS    |  |  |
| 4   | MRPL32         | + 21.533 | NS     | NS     | - 0.012 | - 0.009 | NS    |  |  |
| 5   | ACO2           | - 38.976 | NS     | NS     | + 0.023 | + 0.008 | NS    |  |  |
| 5   | BCAT1          | + 65.064 | NS     | 1.062  | - 0.038 | - 0.011 | NS    |  |  |
| 5   | GABARAPL1      | - 93.189 | -0.796 | -1.848 | + 0.035 | + 0.015 | NS    |  |  |
| 5   | MGP            | + 52.051 | -3.505 | NS     | - 0.063 | - 0.016 | 1.241 |  |  |
| 13  | TGM2           | - 29.947 | NS     | -0.712 | + 0.016 | + 0.004 | NS    |  |  |
| 17  | MTMR3          | - 18.565 | -1.815 | -1.050 | - 0.013 | - 0.005 | NS    |  |  |
| 17  | OAS1           | - 51.017 | NS     | -1.121 | + 0.019 | + 0.007 | NS    |  |  |
| 21  | LGMN           | - 37.049 | NS     | NS     | + 0.019 | + 0.008 | NS    |  |  |
| 21  | SERPINA14      | + 30.829 | NS     | NS     | - 0.014 | - 0.006 | NS    |  |  |
| 26  | LIPA           | + 35.818 | 1.046  | NS     | - 0.007 | - 0.010 | NS    |  |  |
| 28  | ARID5B         | - 65.214 | NS     | -1.641 | + 0.023 | + 0.006 | NS    |  |  |

# Results



| Chr       | Gene symbol         | Trait    |               |        |        |          |              |          |              |       |
|-----------|---------------------|----------|---------------|--------|--------|----------|--------------|----------|--------------|-------|
|           |                     |          | Mkg           | Fkg    | Pkg    |          | Fpr          |          | Ppr          | SCS   |
| 2         | <i>CYP27A1</i>      | +        | 52.025        | NS     | 1.101  | -        | 0.020        | -        | 0.007        | 0.878 |
| 2         | <i>IDH1</i>         | -        | 37.881        | -0.763 | -1.046 | +        | 0.009        | +        | 0.002        | NS    |
| 3         | <i>UGT1A6</i>       | -        | 18.877        | 0.870  | NS     | +        | 0.019        | +        | 0.006        | NS    |
| 4         | <i>MRPL32</i>       | +        | 21.533        | NS     | NS     | -        | 0.012        | -        | 0.009        | NS    |
| 5         | <i>ACO2</i>         | -        | 38.976        | NS     | NS     | +        | 0.023        | +        | 0.008        | NS    |
| 5         | <i>BCAT1</i>        | +        | 65.064        | NS     | 1.062  | -        | 0.038        | -        | 0.011        | NS    |
| 5         | <i>GABARAPL1</i>    | -        | 93.189        | -0.796 | -1.848 | +        | 0.035        | +        | 0.015        | NS    |
| 5         | <i>MGP</i>          | +        | 52.051        | -3.505 | NS     | -        | 0.063        | -        | 0.016        | 1.241 |
| 13        | <i>TGM2</i>         | -        | 29.947        | NS     | -0.712 | +        | 0.016        | +        | 0.004        | NS    |
| <b>17</b> | <b><i>MTMR3</i></b> | <b>-</b> | <b>18.565</b> | -1.815 | -1.050 | <b>-</b> | <b>0.013</b> | <b>-</b> | <b>0.005</b> | NS    |
| 17        | <i>OAS1</i>         | -        | 51.017        | NS     | -1.121 | +        | 0.019        | +        | 0.007        | NS    |
| 21        | <i>LGMN</i>         | -        | 37.049        | NS     | NS     | +        | 0.019        | +        | 0.008        | NS    |
| 21        | <i>SERPINA14</i>    | +        | 30.829        | NS     | NS     | -        | 0.014        | -        | 0.006        | NS    |
| 26        | <i>LIPA</i>         | +        | 35.818        | 1.046  | NS     | -        | 0.007        | -        | 0.010        | NS    |
| 28        | <i>ARID5B</i>       | -        | 65.214        | NS     | -1.641 | +        | 0.023        | +        | 0.006        | NS    |

# Results



| Chr      | Gene symbol    | Trait         |        |        |        |        |              |
|----------|----------------|---------------|--------|--------|--------|--------|--------------|
|          |                | Mkg           | Fkg    | Pkg    | Fpr    | Ppr    | SCS          |
| <b>2</b> | <b>CYP27A1</b> | <b>52.025</b> | NS     | 1.101  | -0.020 | -0.007 | <b>0.878</b> |
| 2        | IDH1           | -37.881       | -0.763 | -1.046 | 0.009  | 0.002  | NS           |
| 3        | UGT1A6         | -18.877       | 0.870  | NS     | 0.019  | 0.006  | NS           |
| 4        | MRPL32         | 21.533        | NS     | NS     | -0.012 | -0.009 | NS           |
| 5        | ACO2           | -38.976       | NS     | NS     | 0.023  | 0.008  | NS           |
| 5        | BCAT1          | 65.064        | NS     | 1.062  | -0.038 | -0.011 | NS           |
| 5        | GABARAPL1      | -93.189       | -0.796 | -1.848 | 0.035  | 0.015  | NS           |
| <b>5</b> | <b>MGP</b>     | <b>52.051</b> | -3.505 | NS     | -0.063 | -0.016 | <b>1.241</b> |
| 13       | TGM2           | -29.947       | NS     | -0.712 | 0.016  | 0.004  | NS           |
| 17       | MTMR3          | -18.565       | -1.815 | -1.050 | -0.013 | -0.005 | NS           |
| 17       | OAS1           | -51.017       | NS     | -1.121 | 0.019  | 0.007  | NS           |
| 21       | LGMN           | -37.049       | NS     | NS     | 0.019  | 0.008  | NS           |
| 21       | SERPINA14      | 30.829        | NS     | NS     | -0.014 | -0.006 | NS           |
| 26       | LIPA           | 35.818        | 1.046  | NS     | -0.007 | -0.010 | NS           |
| 28       | ARID5B         | -65.214       | NS     | -1.641 | 0.023  | 0.006  | NS           |

# Results



Chr Gene  
symbol

## **NDRG4:**

1 *TNFSF10*  
2 *IFIH1*  
2 *IGFBP2*  
3 *HFM1*  
4 *PARP12*  
4 *SCRN1*  
6 *IGFBP7*  
8 *APBA1*  
10 *IRF9*  
17 *KSR2*  
18 *CNOT1*  
18 *NDRG4*  
19 *BAIAP2*  
20 *CCNB1*  
23 *CCND3*  
24 *NPC1*

**Fkg**  
**-0.831**

**Pkg**  
**-0.747**

**CFc**  
**+0.945**

**DOc**  
**+0.867**



(in units of standard deviations of the trait)

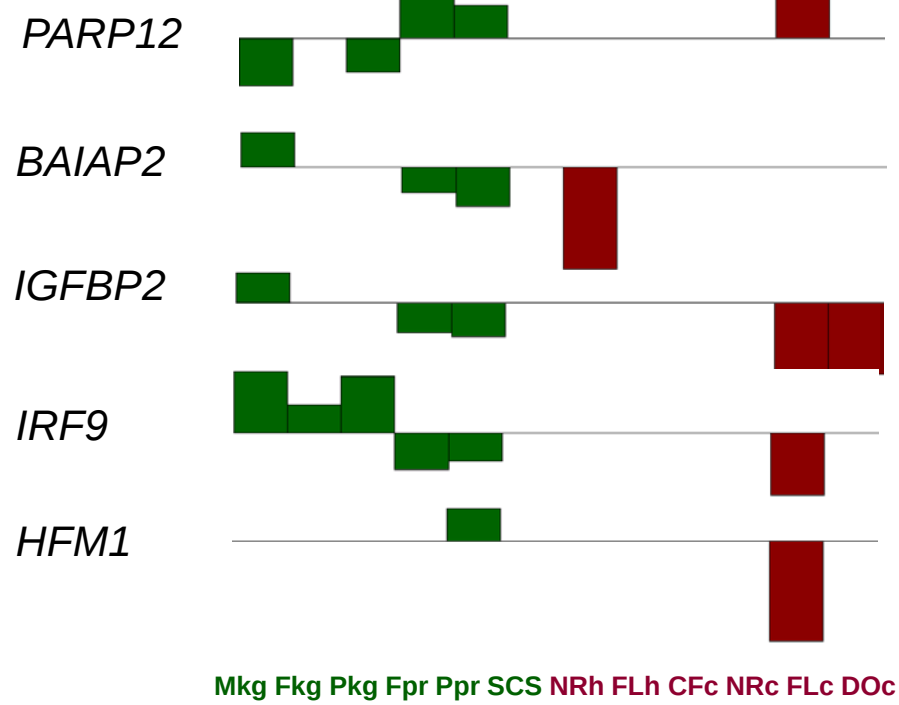
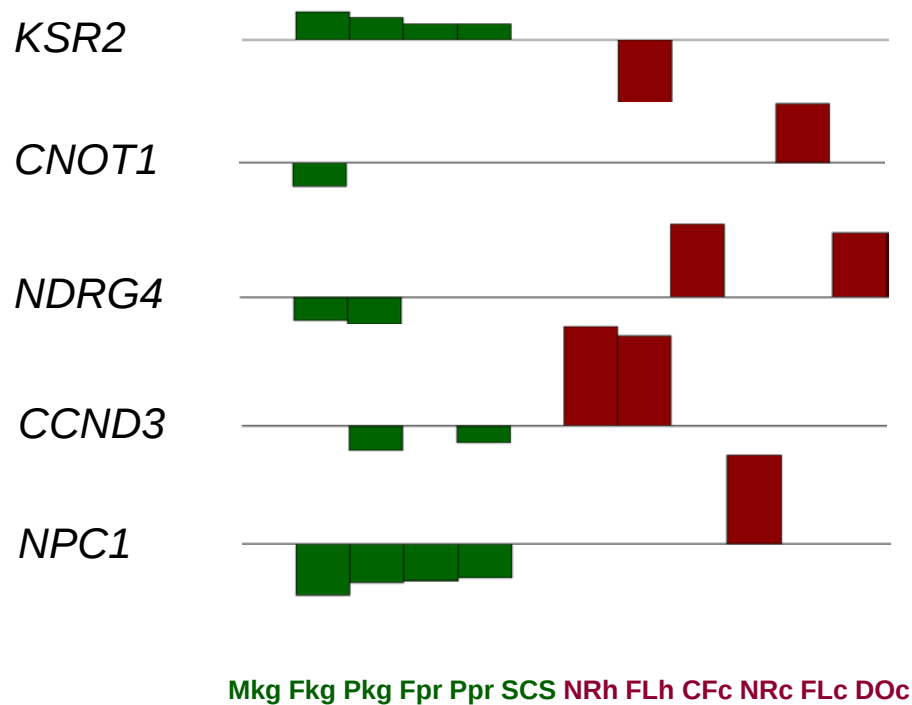


**Mkg Fkg Pkg Fpr Ppr SCS NRh FLh CFc NRc FLc DOc**

# Results



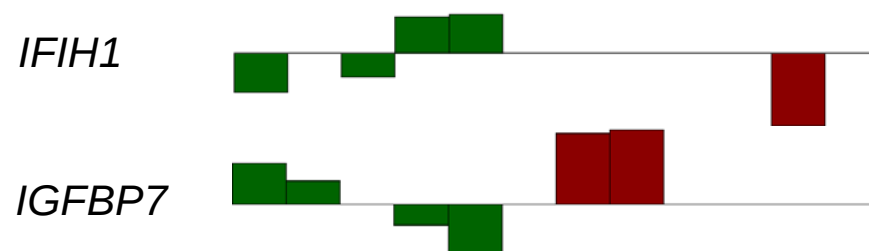
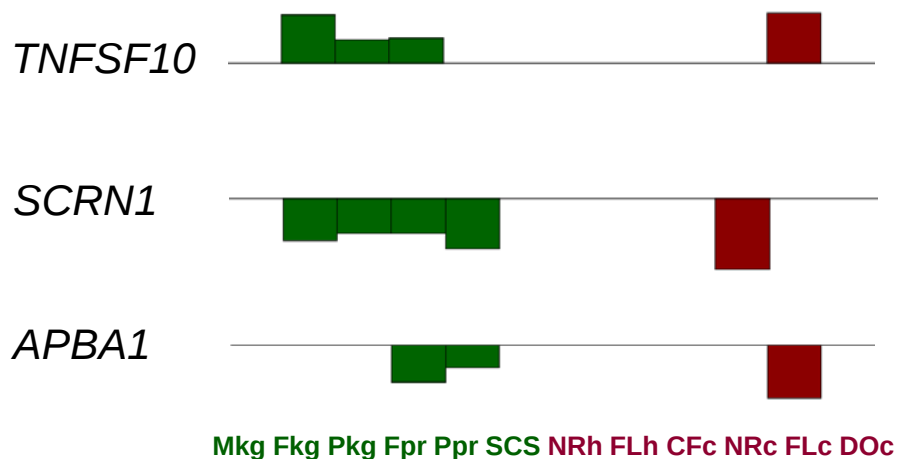
## Production and fertility in opposite directions:



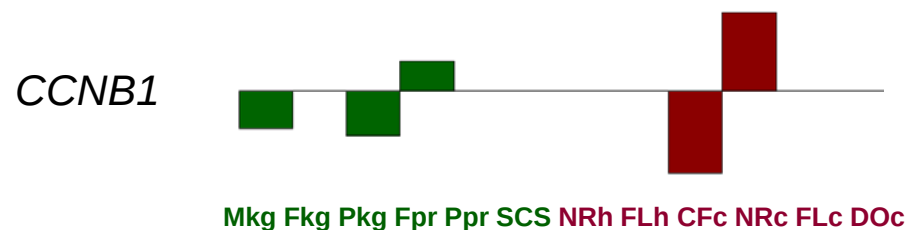
# Results



Production and fertility in the same direction:



-CFc and +NRc:



# Conclusions

---



- The majority of the SNP with effects on both classes of traits showed antagonism between production and fertility
- Antagonistic relationships were also observed between milk yield and percentage traits

# Conclusions

---



- Selection strategies enhanced by focus on specific SNP may help finding a compromise between production and fertility
- Input from gene expression studies may be useful in identifying such markers

# Acknowledgments

---



This study is part of the projects FUGATO-plus GenoTrack, FUGATO Fertalink and COMPEDIUM and was financially supported by the German Ministry of Education and Research, BMBF, the Förderverein Biotechnologieforschung e.V. (FBF), Bonn, and Lohmann Tierzucht GmbH, Cuxhaven.



Bundesministerium  
für Bildung  
und Forschung



**LOHMANN**  
TIERZUCHT

# Thank you

---



Georg-August-Universität Göttingen

Eduardo Pimentel  
Manfred Tietze  
Henner Simianer  
Sven König



Ludwig-Maximilians-Universität München

Stefan Bauersachs  
Eckhard Wolf



Vereinigte Informationssysteme Tierhaltung w.V.

Friedrich Reinhardt