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## Inferring relationships between health and fertility in Norwegian Red cows using recursive models

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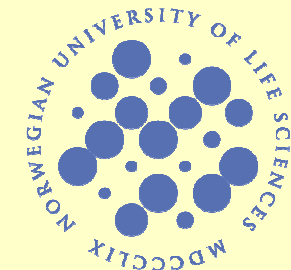
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**geno**



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## Simultaneous or recursive models

- Health and fertility are complex traits
- Causal effects between phenotypes
  - ➔ disease in early lactation may impair a cow's ability to show heat and to conceive after insemination
- Causal relationships between phenotypes can be mutual (**simultaneous**)  
or  
one-way, i.e. a variable affects another but the reciprocal effect does not exist (**recursive**)

## Simultaneous or recursive models

- Gianola and Sorensen (Genetics, 2004):  
extended quantitative genetics models to handle simultaneous or recursive (**SIR**) effects between phenotypes in a multivariate system.
- Wu et al. (JDS 2007; GSE 2008):  
developed software for Bayesian implementation of SIR models.

## Objective

Infer phenotypic and genetic relationships between health and fertility in Norwegian Red cows using recursive models.

# Traits

## Fertility:

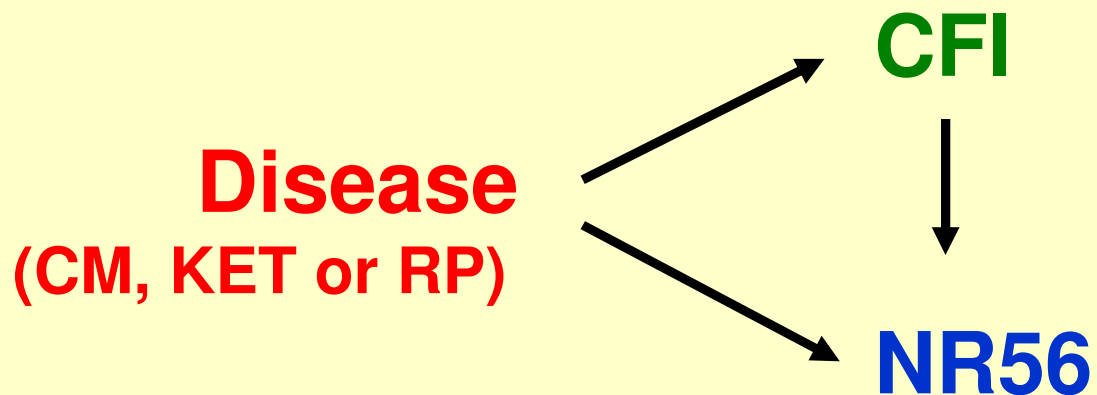
- Interval from 1<sup>st</sup> calving to 1<sup>st</sup> insemination (**CFI**)
- Non-return rate within 56 days after 1<sup>st</sup> insemination (**NR56**)

## Disease:

- Clinical mastitis (**CM**)
- Ketosis (**KET**)
- Retained placenta (**RP**)

## Recursive effects between fertility and disease

Disease in early lactation may affect both the cows ability to show heat (CFI) and to conceive after insemination (NR56).



## Data

- 55,568 first lactation cows
  - Daughters of 1,577 Norwegian Red sires
- 
- |                  |    |
|------------------|----|
| • Mean CFI, days | 77 |
| • Mean NR56, %   | 67 |
| • Mean CM, %     | 10 |
| • Mean KET, %    | 4  |
| • Mean RP, %     | 2  |



# Recursive Gaussian threshold model

$$\begin{bmatrix} \Lambda \mathbf{y}_1 \\ \Lambda \mathbf{y}_2 \\ \vdots \\ \Lambda \mathbf{y}_n \end{bmatrix} = \mathbf{X}\boldsymbol{\beta} + \mathbf{Z}_h \mathbf{h} + \mathbf{Z}_s \mathbf{s} + \mathbf{e}$$

where  $\Lambda = \begin{bmatrix} 1 & \lambda_{12} & \lambda_{13} \\ \lambda_{21} & 1 & \lambda_{23} \\ \lambda_{31} & \lambda_{32} & 1 \end{bmatrix}$  is a matrix of structural coefficients between traits 1 (CFI),

2 (NR56), and 3 (disease),  $\lambda_{ij}$ , which describes the rate of change in trait  $i$  with respect to trait  $j$ ;

$\mathbf{y}_1, \mathbf{y}_2, \dots, \mathbf{y}_n$  are vectors of CFI observations and liabilities of NR56 and disease (CM, KET or RP) for the  $n = 55,568$  cows,  $\mathbf{y}_1 = [y_{CFI_1} \quad l_{STC_1} \quad l_{CM_1}]$ ;

$\boldsymbol{\beta}$ : trait-specific systematic effects (age, month-year, double insemination, year-season),

$\mathbf{h}$ : herd-5-year of calving effects (2909 levels);

$\mathbf{s}$ : sire effects;

$\mathbf{e}$ : residuals, and  $\mathbf{X}$ ,  $\mathbf{Z}_h$ , and  $\mathbf{Z}_u$  are the corresponding incidence matrices.

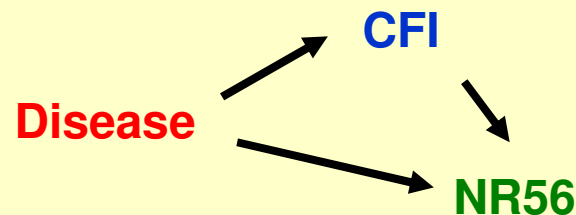


$$\Lambda = \begin{bmatrix} 1 & 0 & \lambda_{13} \\ \lambda_{21} & 1 & \lambda_{23} \\ 0 & 0 & 1 \end{bmatrix}$$

matrix of structural coefficients between traits 1 (CFI) , 2 (NR56), and 3 (disease),

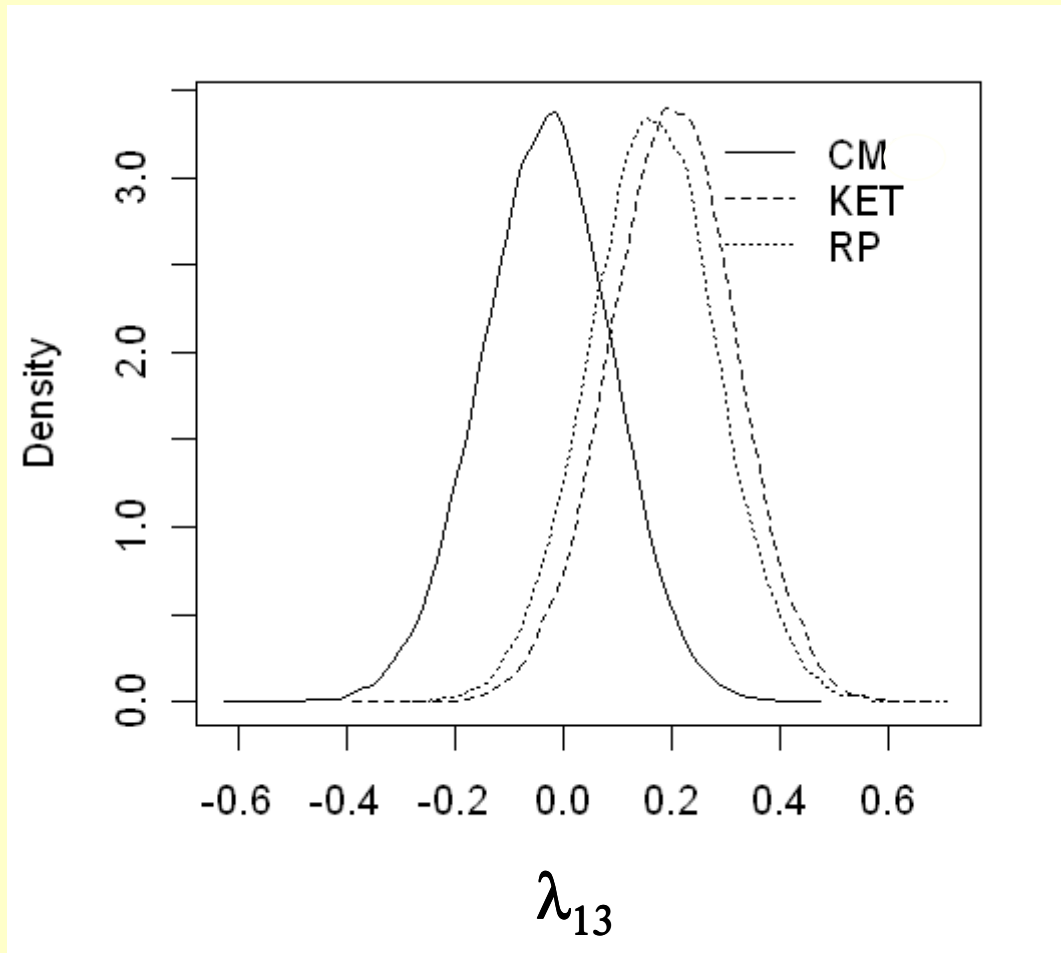
$\lambda_{ij}$  = rate of change in trait  $i$  with respect to trait  $j$ .

Disease affects CFI ( $\lambda_{13}$ ), disease affects NR56 ( $\lambda_{23}$ ), CFI affects NR56 ( $\lambda_{21}$ ), and all other  $\lambda_{ij}$ 's were set to 0



- Bayesian analysis
- Markov chain Monte Carlo (MCMC) methods
- SirBayes package

# Results



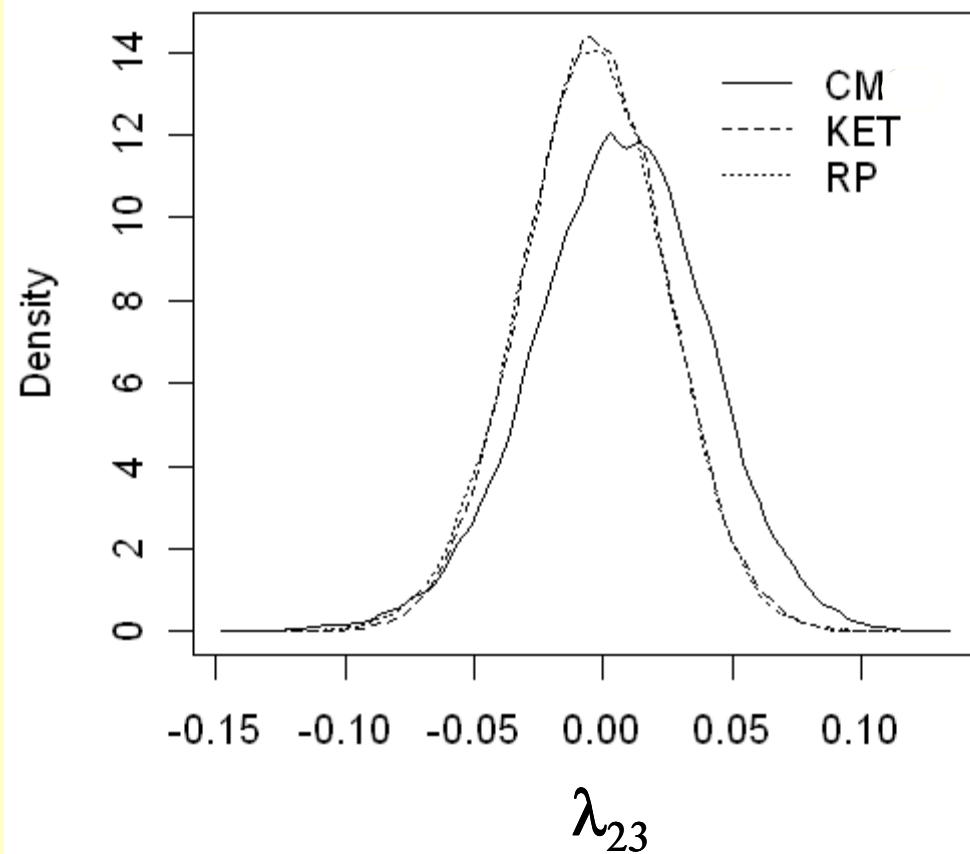
Posterior mean

CM: -0.03

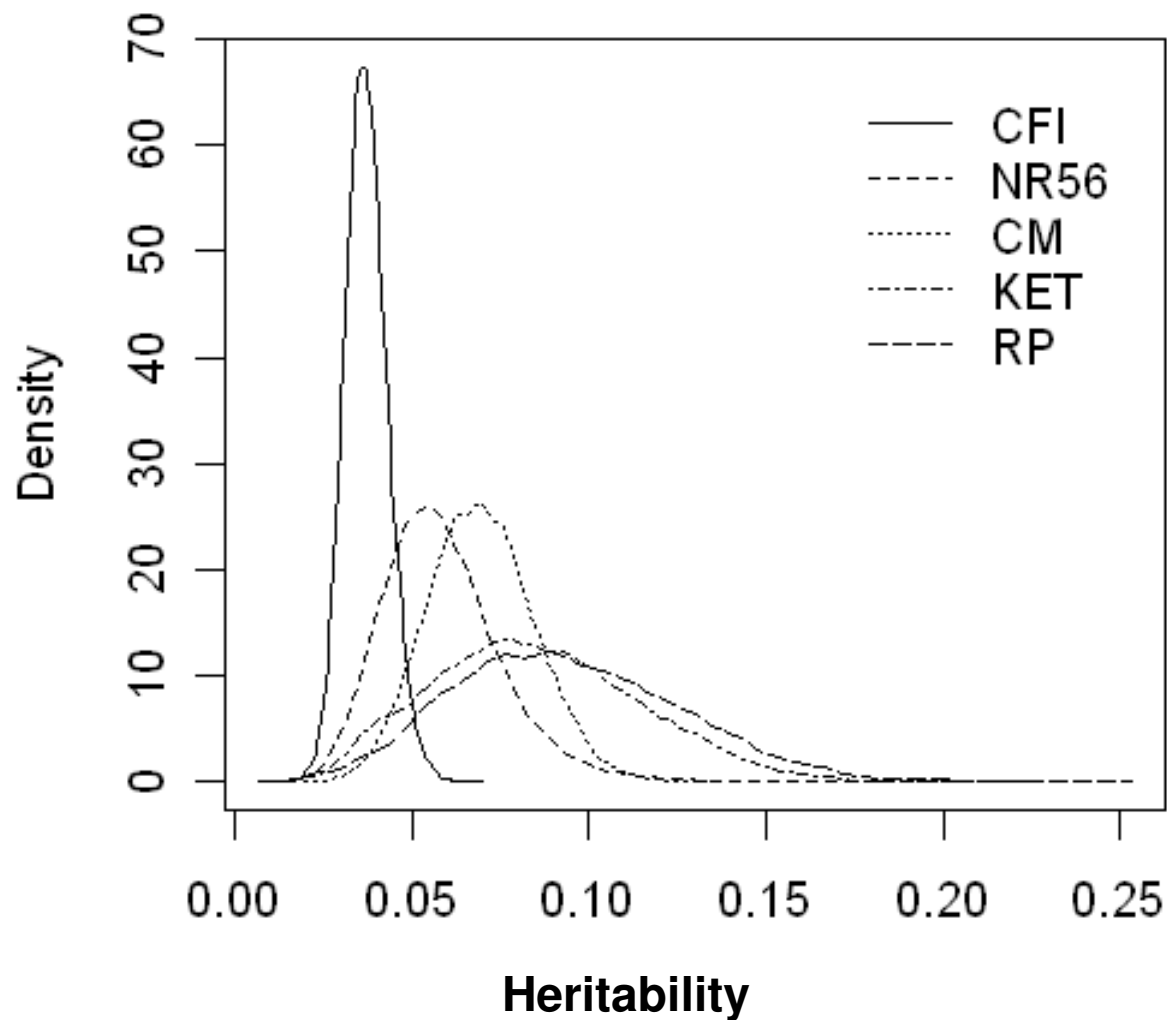
RP: 0.17

KET: 0.20

**Figure 1.** Posterior distributions of recursive effects from liability to disease (CM, KET, or RP) to CFI.

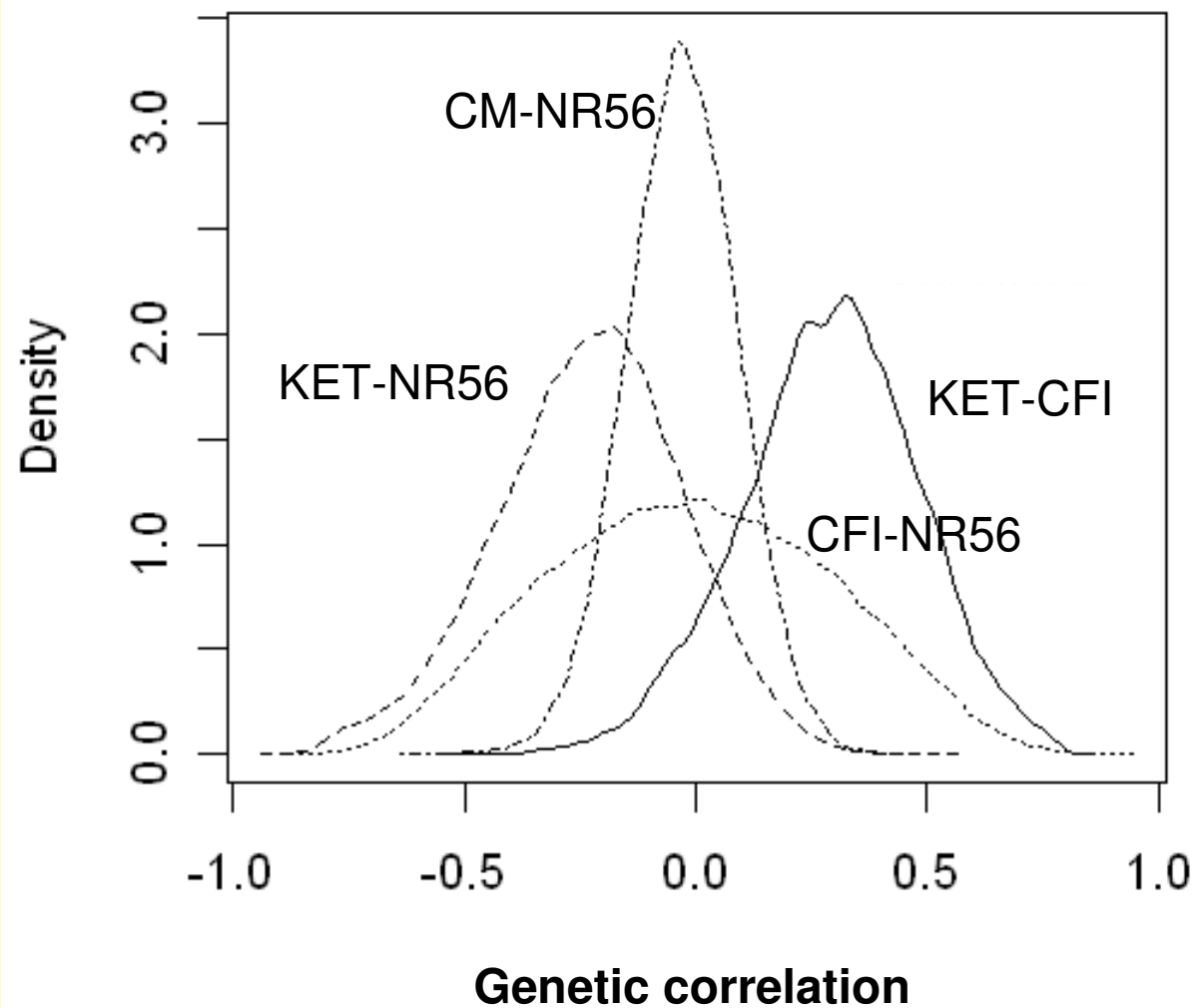


**Figure 2.** Posterior distributions of recursive effects from liability to disease (CM, KET, or RP) to NR56.



Posterior mean  
CFI: 0.04  
NR56 0.06  
CM: 0.07  
RP: 0.09  
KET: 0.09

**Figure 3.** Posterior distributions of (from the left) heritability of CFI and of liability to NR56, CM, KET and RP.



**Figure 4.** Posterior distributions of genetic correlations between health and fertility.

## Conclusions

- Increased liability to KET or RP elevates CFI
- No causal effects from mastitis to fertility
- Recursive effects from disease to NR56, and from CFI to NR56 were close to zero
- Low to moderate, favorable genetic correlations between health and fertility
  - selection against disease expected to result in a small improvement of fertility as a correlated response

# Conclusions

## Structural-equation models

- distinguishing between causal effects between phenotypes and genetic relationships between traits
- may be useful to attain better understanding of complex relationships between traits.

