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# Power and robustness of three whole genome association mapping approaches in selected populations

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#### Introduction

- selection and consequentially small effective population size in livestock populations
  - spurious associations: associations between two loci which are not closely linked

→ can affect results of mapping experiments

- whole genome association mapping
  - ➔ no prior knowledge about QTL position
  - no possibility to decide if significant SNP is correct or false positive
- → suitable methods should combine sufficient power with an acceptable number of false positive signals

#### **Simulation overview I**

**1000 unrelated individuals** (500 3, 500 2) 1000 generations with N = 1000 (random mating) **Bottleneck:** 100 individuals (50 3, 50 9) chosen randomly 10 generations with N = 100 (random mating) 1 generation with N = 1000 (random mating) **1000 individuals** (so-called "founder generation")

#### **Simulation overview II**

→ 500 individuals (250 3, 250 2) chosen randomly out of the founder generation (sample differing in each replicate)

**15 generations** (N = 500) → different scenarios



### Simulation

- Animals for whole genome association mapping:
  2500 individuals of the last five generations
  Jull pedigree, genotypic and phenotypic information
- 10,000 SNPs on 10 chromosomes of each 1 Morgan length
- 50 biallelic QTL
  - → only additive effects
- Set of SNPs and QTL was the same in all replicates.
- Heritability was assumed to be approximately 0.3.

#### **Approaches**

- Single Marker Regression (SMR)
  - simple linear regression of phenotypes on genotypes of single marker
  - ➔ no correction for family effects
- Genomewide Rapid Association Using Mixed Model and Regression (GRAMMAR) (Aulchenko et al., 2007)
- Quantitative Transmission Disequilibrium Test applied to the Mendelian Sampling Term (MTDT) (Simianer and Pimentel, 2009)

#### **Approaches**

- Single Marker Regression (SMR)
- Genomewide Rapid Association Using Mixed Model and Regression (GRAMMAR) (Aulchenko et al., 2007)
  - → previously estimated residual terms (free of family correlations) as dependent variable in a single marker regression
- Quantitative Transmission Disequilibrium Test applied to the Mendelian Sampling Term (MTDT) (Simianer and Pimentel, 2009)

#### **Approaches**

- Single Marker Regression (SMR)
- Genomewide Rapid Association Using Mixed Model and Regression (GRAMMAR) (Aulchenko et al., 2007)
- Quantitative Transmission Disequilibrium Test
  applied to the Mendelian Sampling Term (MTDT)
  (Simianer and Pimentel, 2009)
  - estimated Mendelian sampling terms derived from the estimated breeding values
  - estimated Mendelian sampling terms used as phenotypic information for a QTDT



#### **Detected QTL - Power**



## Empirical false positive rate –

**Bonferroni corrected significance threshold** 



### **Empirical false positive rate –**

standardized conditions (number of detected QTL=5)



### Conclusions

- **SMR:** results should be considered with great caution
- GRAMMAR and MTDT avoid false positive signals
  suitable for genome scans in livestock populations
- **GRAMMAR:** efforts have to be made to find an appropriate significance threshold
- Suggestion:
  - use of a fast approach (GRAMMAR or MTDT) for a first screen of the genome
  - use of more refined methods (both for modelling and for determining the significance threshold) in candidate regions

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#### Thank you for your attention!

#### **References**

Aulchenko, Y. S., D.-J. de Koning, and C. Haley, 2007. Genomewide Rapid Association Using Mixed Model and Regression: A Fast and Simple Method For Genomewide Pedigree-Based Quantitative Trait Loci Association Analysis. Genetics 177: 577-585.

Simianer, H., and E. C. G. Pimentel, 2009. Robust QTL fine mapping by applying a quantitative transmission disequilibrium test to the Mendelian sampling term. J. Anim. Breed. Genet. (accepted)

#### **Definitions**

• 100 intervals per chromosome each of one cM length



Detected False Associations

