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QUALITAS⁺



Genomic prediction in cattle based on sequence data

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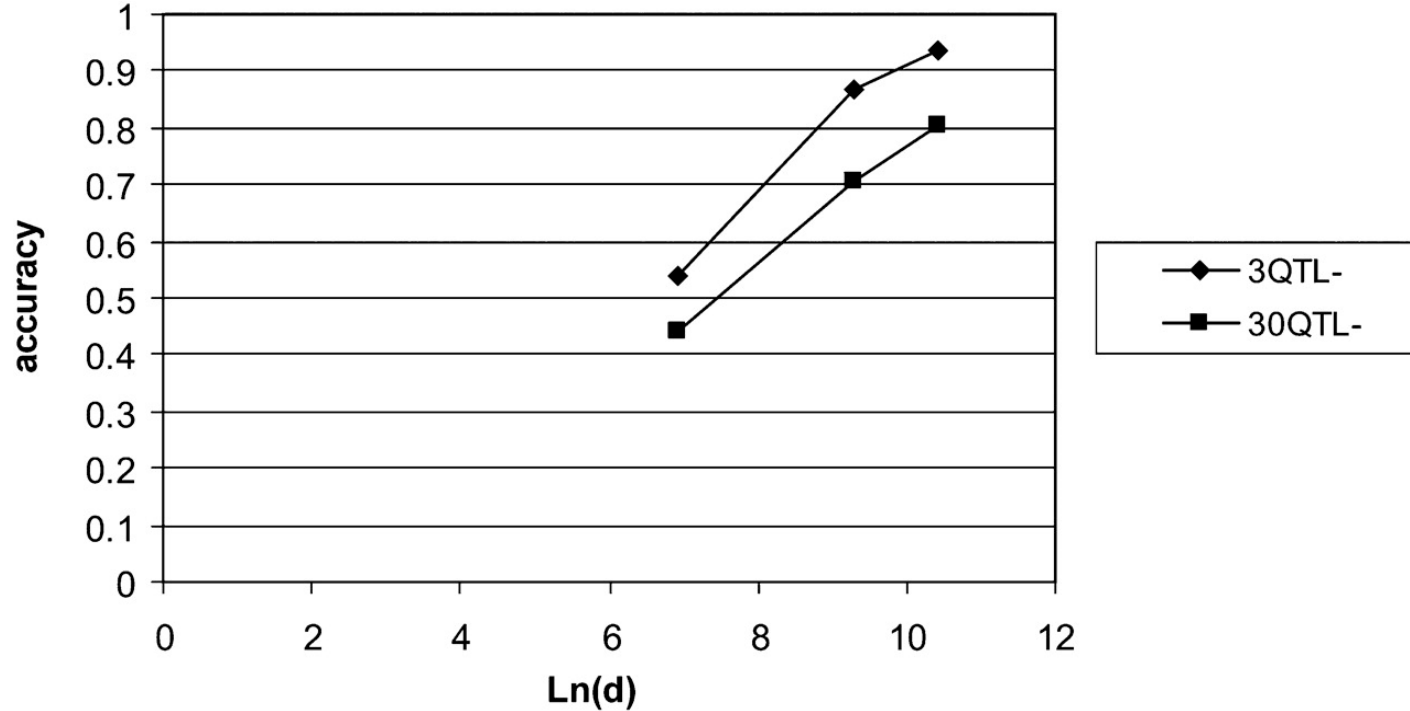
EAAP 2016

Belfast

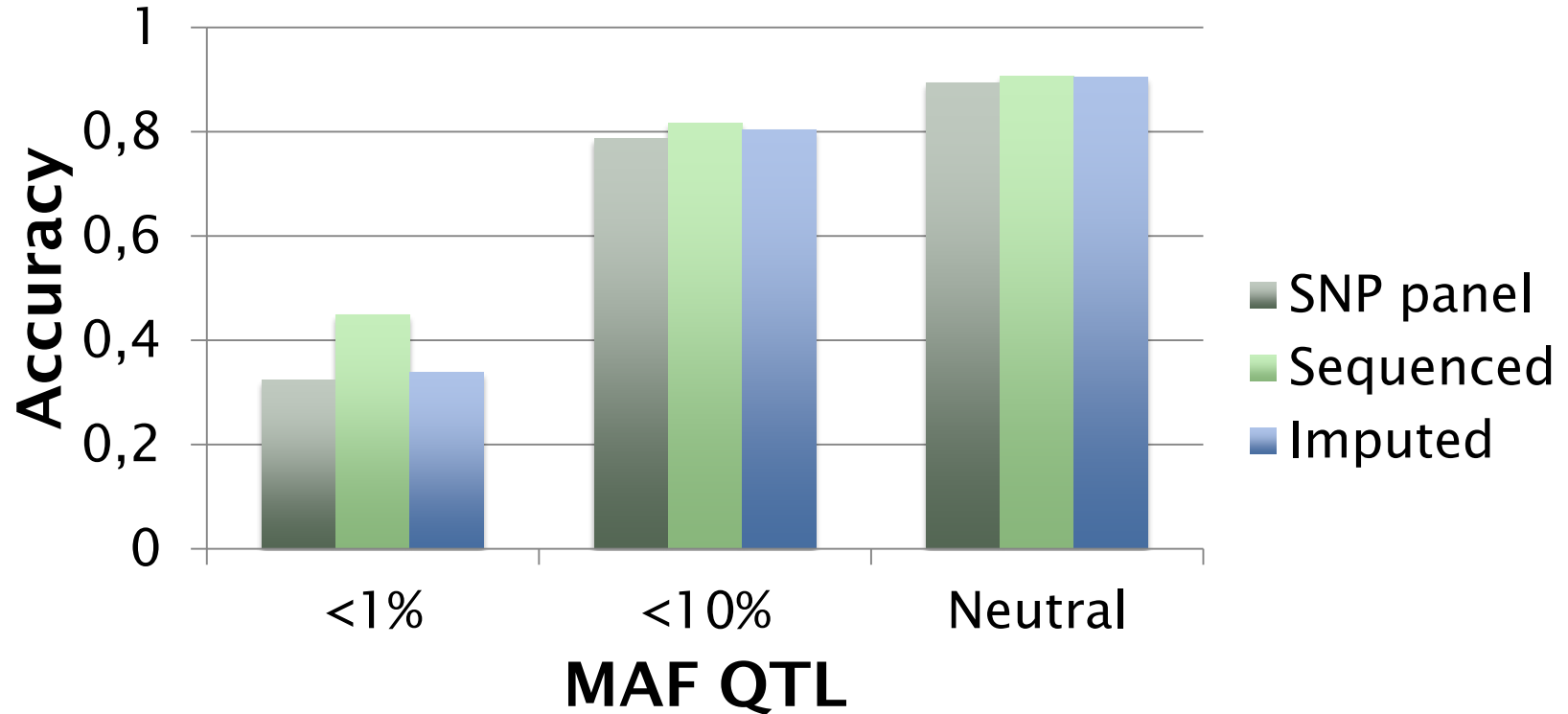
Overview

- ▶ Introduction: Simulation studies
- ▶ Material & Methods
- ▶ Results:
 - ▶ 50k GenSel
 - ▶ 50k and Sequence gbcpp
 - ▶ LD-pruned sequence gbcpp
 - ▶ Other densities: missense variants and top variants from GWAS
- ▶ Conclusion

Genomic prediction: Simulation studies



Another simulation study



Modified after Druet et al. 2014 *Heredity*

And now with real data ...

We have...

- ▶ ... Genotypes of 23,000 Brown Swiss (imputed to sequence level)
- ▶ ... 3 traits investigated

	Non-return rate 56 heifer (NRH)	Somatic cell score (SCS)	Stature (STA)
Reference	2,018	4,786	5,294
Validation	240	560	596

Algorithms

- ▶ Softwares/ Algorithms
 - ▶ BayesC implemented in GenSel (R. Fernando and D. Garrick, 2008)

$$\mathbf{y} = \mathbf{1}'\mu + \mathbf{X}\beta + \mathbf{e}$$

$$\beta_i \begin{cases} = 0 \text{ with probability } \pi \\ \sim N(0, \sigma_{SNP}^2) \text{ with probability } (1 - \pi) \end{cases}$$

Algorithms

- ▶ Softwares/ Algorithm
 - ▶ BayesC-like implemented in gbcpp (T. Meuwissen)

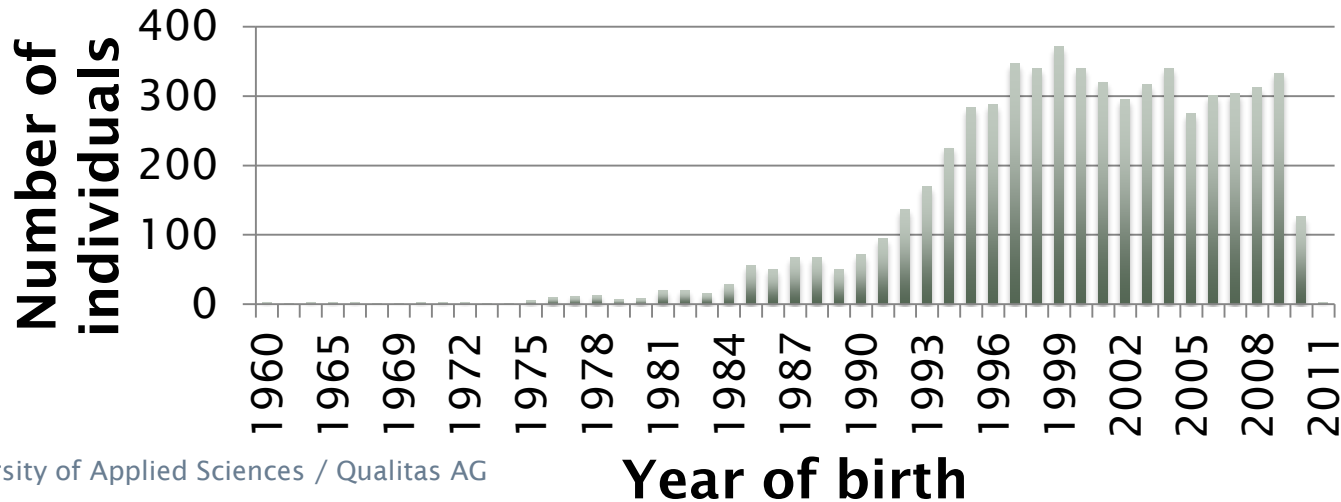
$$y = \mathbf{1}'\mu + \mathbf{Z}g + \mathbf{X}\beta + e$$

$$g \sim N(0, \mathbf{G}\sigma_g^2)$$

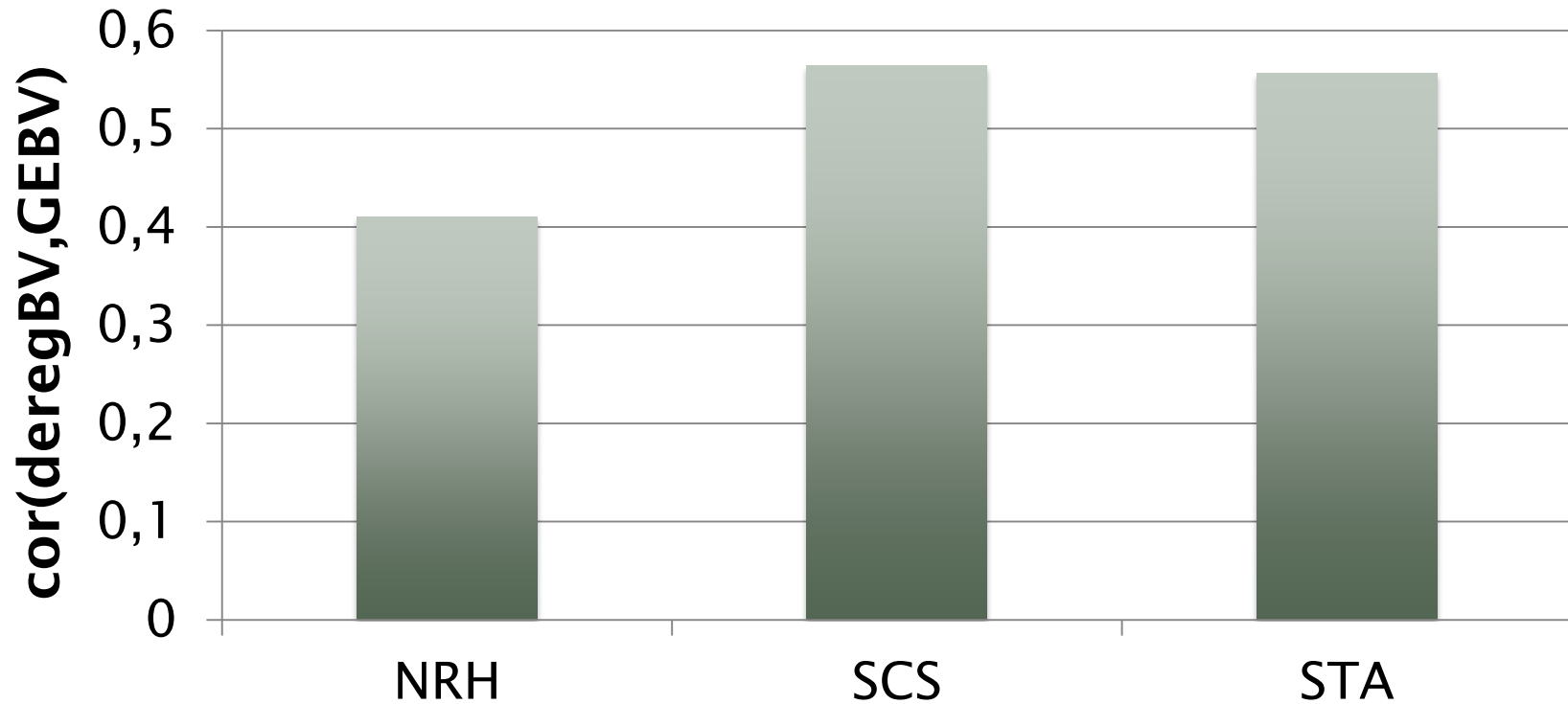
$$\beta_i \begin{cases} = 0 \text{ with probability } \pi \\ \sim N(0, \sigma_{SNP}^2) \text{ with probability } (1 - \pi) \end{cases}$$

Phenotypes

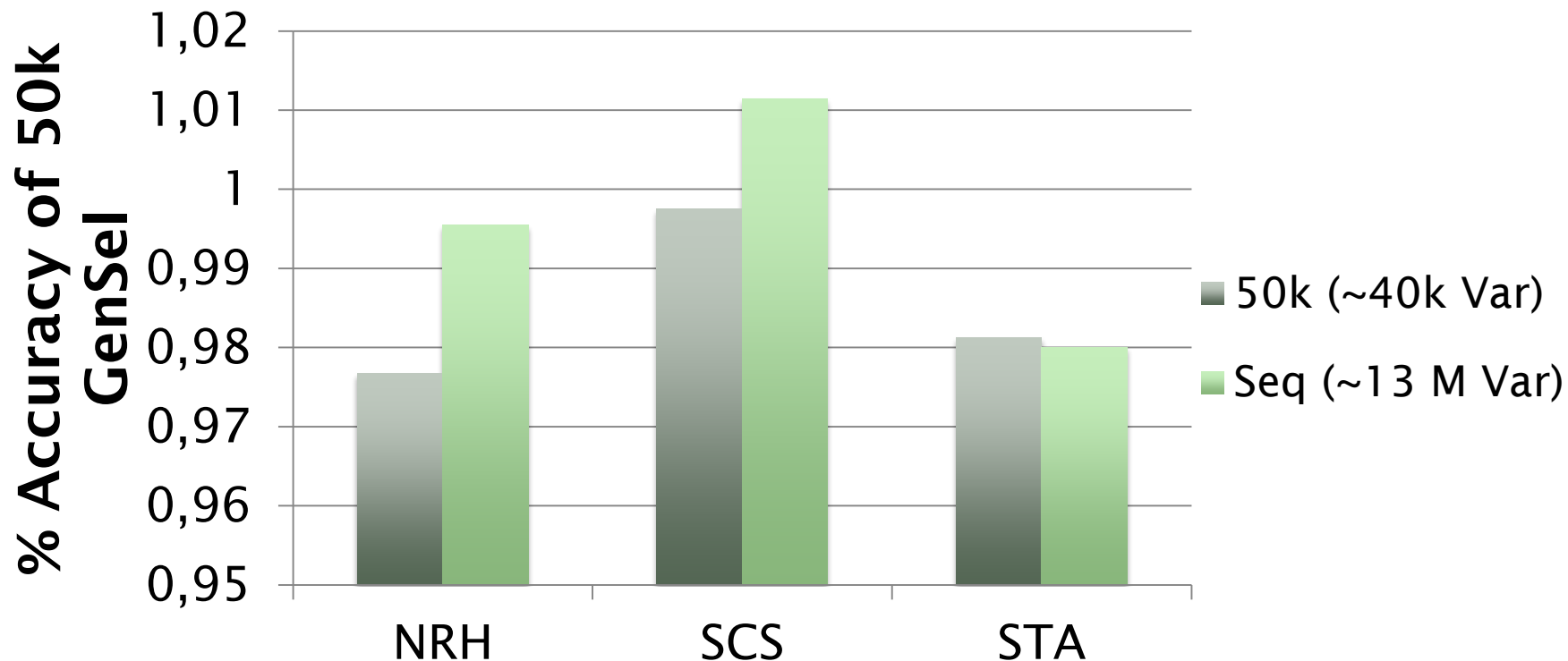
- ▶ Minimal reliability
- ▶ Deregressed BV (Garrick et al., 2009)
- ▶ Youngest bulls as validation
- ▶ Prediction accuracy: $\text{cor}(\text{deregressed BV}, \text{GEBV})$



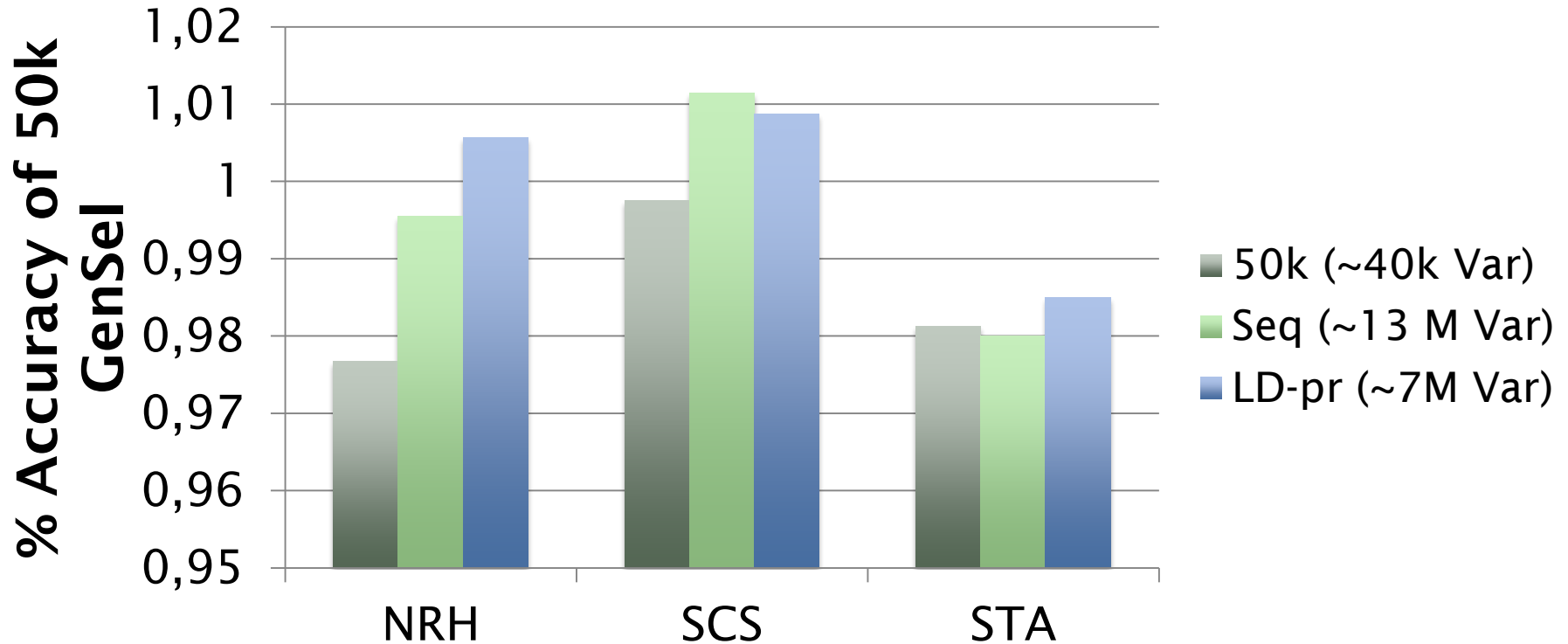
Results -50k GenSel



Results –Sequence data with gbcpp



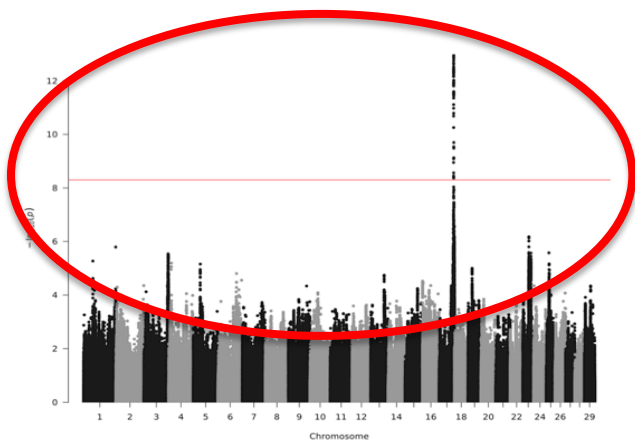
Results – LD-pruned sequence data with gbcpp



Results –Other densities

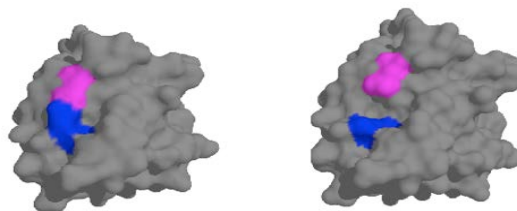
„Top“

- ▶ GWAS results
- ▶ 50,000 Variants



„Missense“

- ▶ Missense variants in protein coding regions
- ▶ About 35,000 Variants



https://en.wikipedia.org/wiki/LMNA#/media/File:LMNA_protein_%281fr%29_mutation_RS27L PMID_22549407_surface_and_cartoon.png

Results - Other densities

Density	NRH	SCS	STA
Top GBCPP	-0.15	-0.08	-0.10
Miss GBCPP	-0.06	-0.05	-0.02
Top GenSel	-0.11	-0.07	-0.09
Miss GenSel	0.01	-0.01	0.01

Conclusion

- ▶ No improvement using sequencing data
- ▶ Also other densities do not improve the accuracy
- ▶ Currently sequence data is not an option for routine evaluation

Acknowledgements



1000 bull genomes project



Thank you for your attention

