



# Successful genotype imputation from medium to high density in Belgian Warmblood horses



**L. Chapard, R. Meyermans, W. Gorssen, B. Van Mol, F. Pille, N. Buys and S. Janssens**

*Center for Animal Breeding and Genetics, Department of Biosystems, KU Leuven, 3001 Leuven, Belgium*

*Department of Surgery and Anaesthesiology of Domestic Animals, Faculty of Veterinary Medicine, Ghent University, 9820 Merelbeke, Belgium*

Session 90: "Genetics in horses"



**KU LEUVEN**



# SNPs and advantages of genomics

- **SNP** (Single nucleotide polymorphism)
- Medium density (70K) and high density (670K) **SNP arrays are commercially available** in horse breeding
- Genotype data permits to do **genomic selection, GWAS, parentage analysis, genetic diversity studies, etc...**





# Genotype imputation

- **Genotype imputation:**
  - Increases the **density of available genotypes within a population**
  - Showed **great results in livestock species** from medium (MD) to high (HD) density genotypes
  - Can be performed on closely related breeds

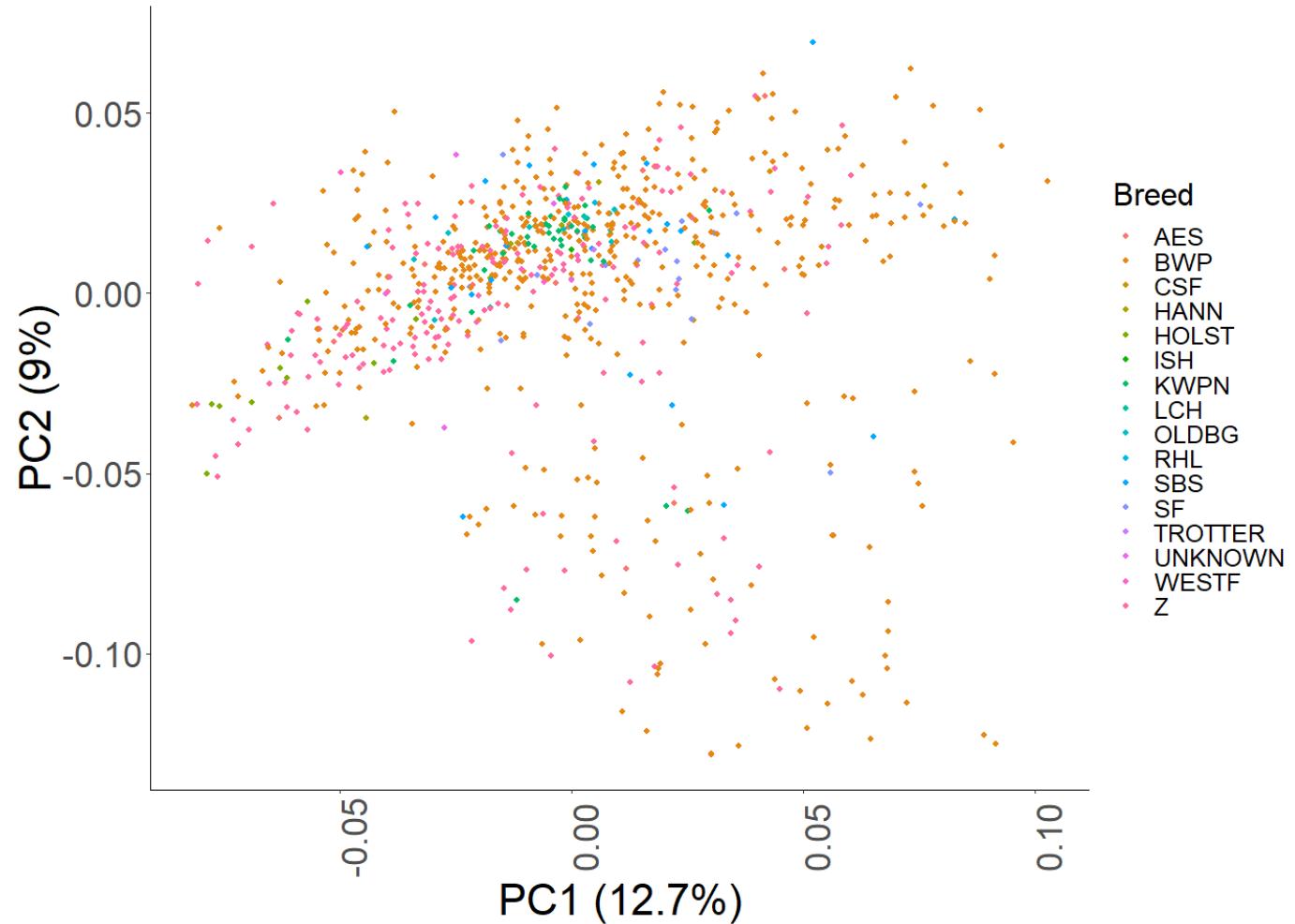


**Process of inferring unobserved genotypes in a sample of individuals using a reference panel**



# Genotype data

- 823 HD genotypes of sport horses:



Breed	n
BWP	490
Z	189
KWPN	41
SBS	24
SF	22
AES	14
HOLST	11
OLDBG	11
WESTF	6
HANN	5
ISH	1
LCH	1
RHL	1
TROTTER	1
UNKNOWN	6



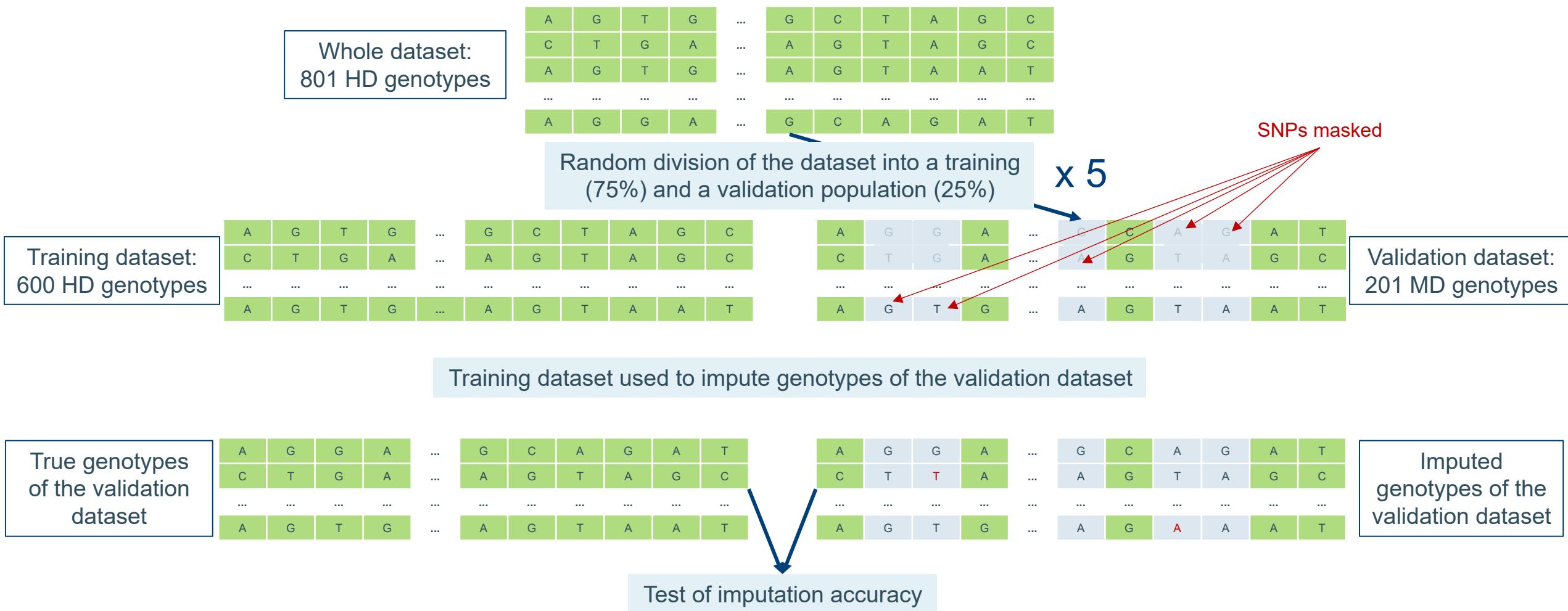
# Methods

- **Quality control steps** (using Plink):
  - SNP positions updated from EquCab 2.0 to EquCab 3.0
  - Merge 4 datasets (248 horses genotyped in 2017, 192 in 2019, 192 in 2022 and 191 in 2023)
  - Keep only autosomes
  - Remove individuals with call-rate  $\leq 0.95$ , outlying heterozygosity  $\geq$  mean heterozygosity  $\pm 3$  sd and duplicated individuals
  - Check population substructure via PCA
  - Remove SNPs with call-rate  $\leq 0.95$
- **55 509 SNPs in common between Affymetrix Axiom Equine 670K and GGP Equine 70K arrays**
- **Cross-validation scheme:** HD dataset divided into a reference panel (75% of the dataset) and a validation set (25% of the dataset) (**X5**)
- **Haplotype phasing and genotype imputation** using Beagle
- **Imputation accuracy** checked for each validating set using R

	<b>n before QC</b>	<b>n after QC</b>
<b>Horses</b>	823	801
<b>SNPs</b>	670 806	513 223



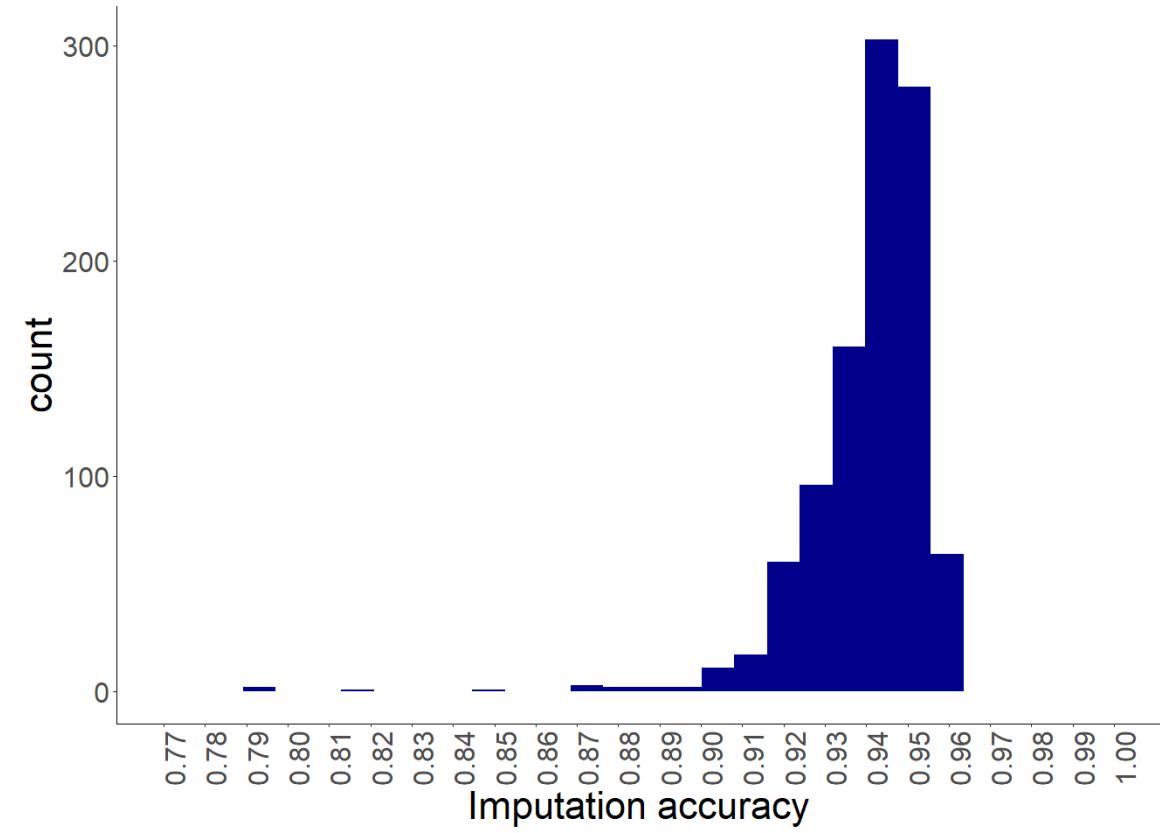
# Cross-validation scheme

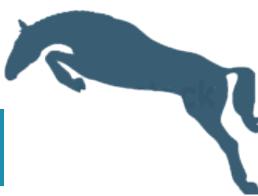




# Genotype imputation accuracy per individual

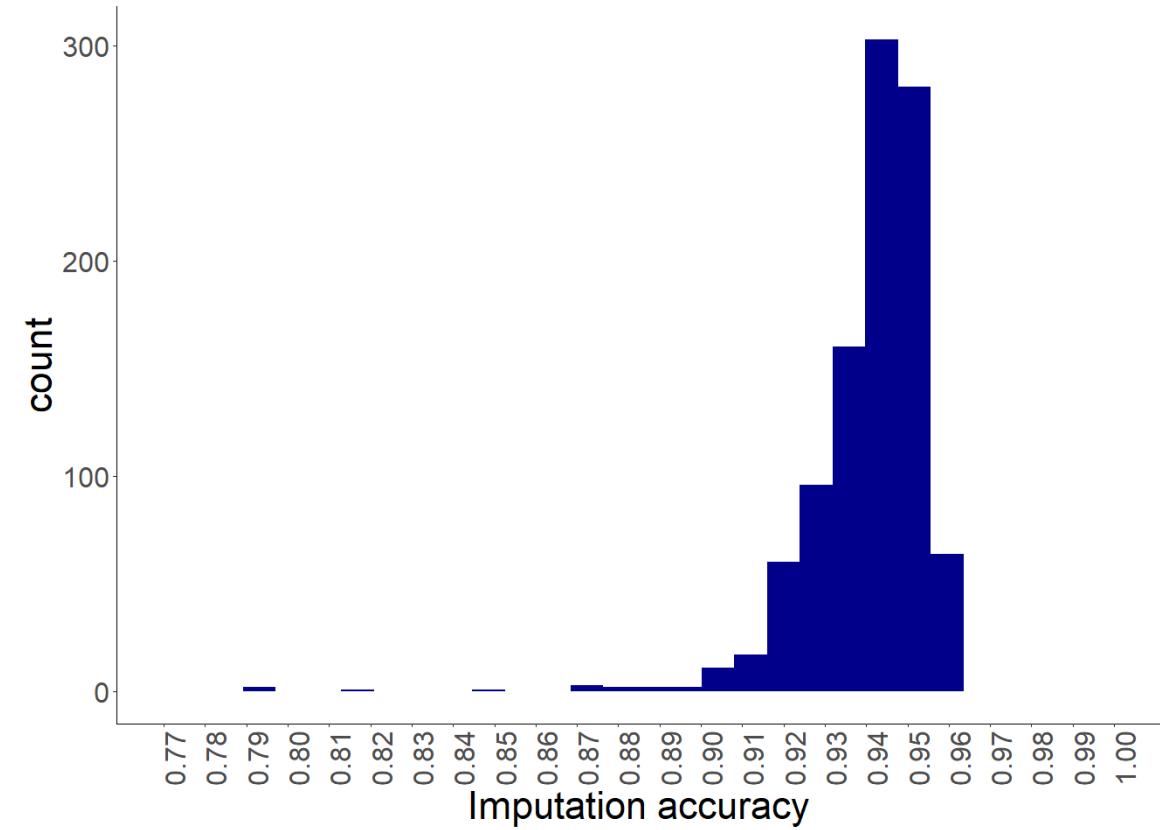
	min	mean	max	SD
Validating set 1	0.79	0.94	0.96	0.02
Validating set 2	0.87	0.94	0.96	0.01
Validating set 3	0.85	0.94	0.96	0.02
Validating set 4	0.89	0.94	0.96	0.01
Validating set 5	0.79	0.94	0.96	0.02





# Genotype imputation accuracy per individual

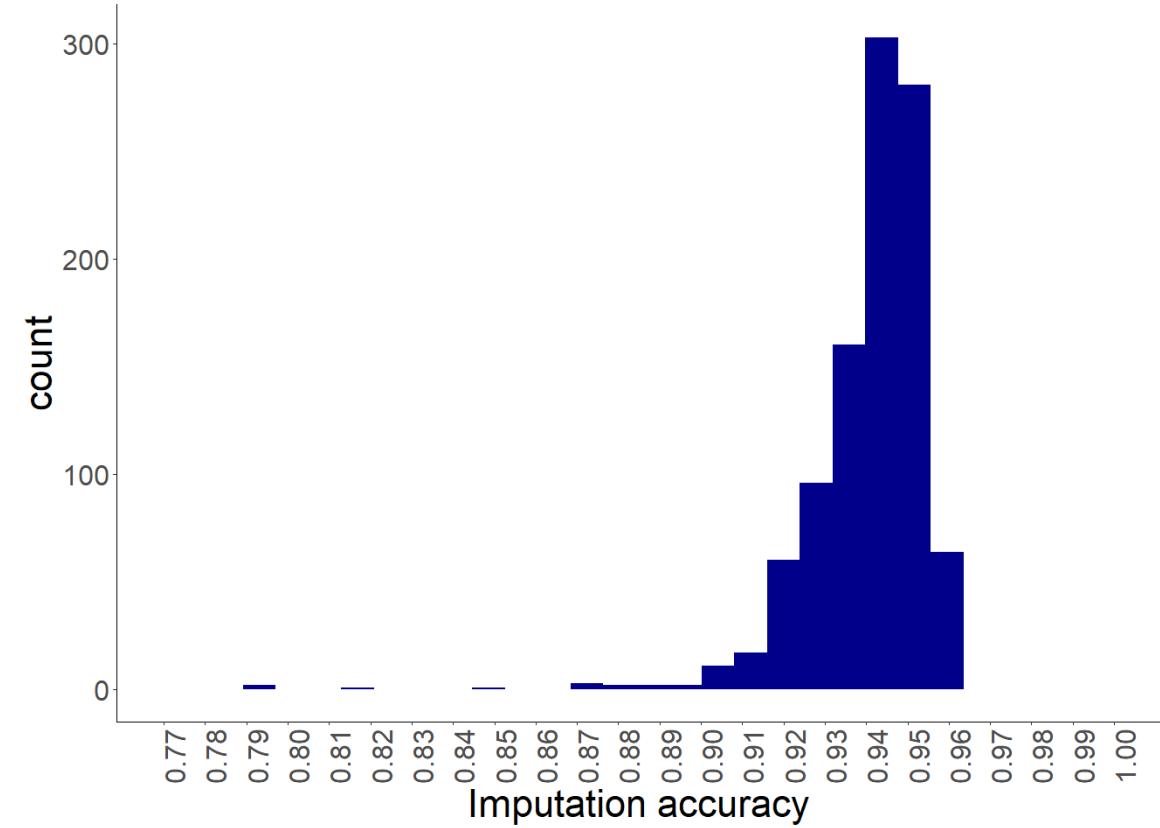
	min	mean	max	SD
Validating set 1	0.79	0.94	0.96	0.02
Validating set 2	0.87	0.94	0.96	0.01
Validating set 3	0.85	0.94	0.96	0.02
Validating set 4	0.89	0.94	0.96	0.01
Validating set 5	0.79	0.94	0.96	0.02





# Genotype imputation accuracy per individual

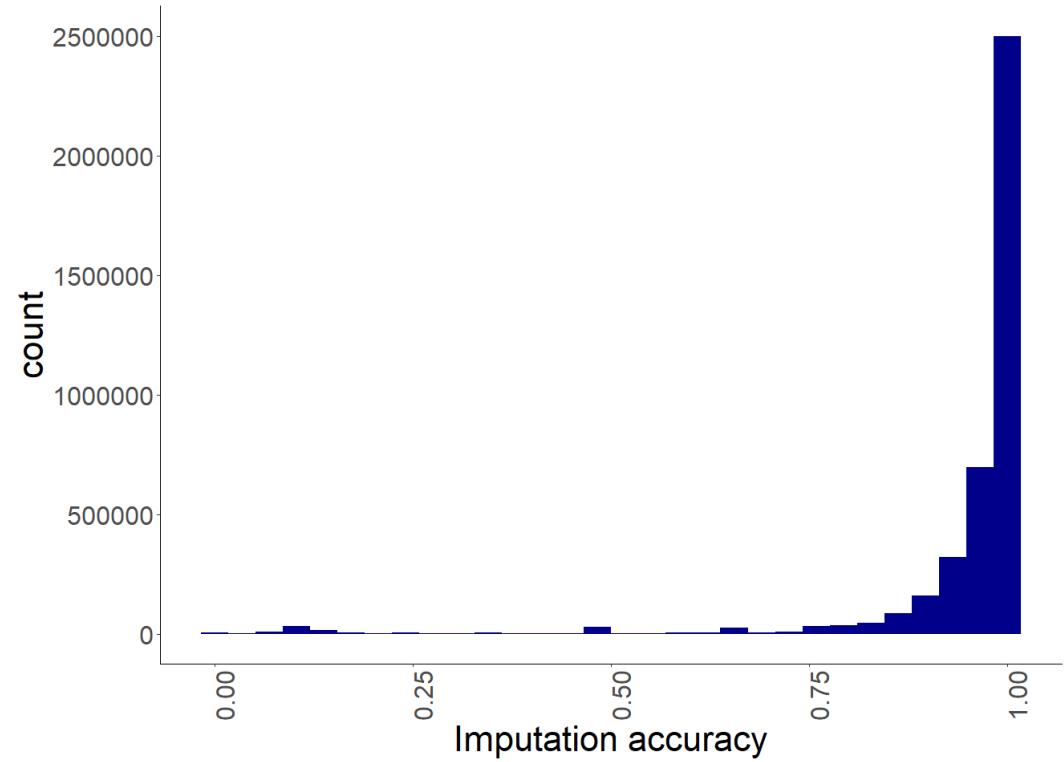
	min	mean	max	SD
Validating set 1	0.79	0.94	0.96	0.02
Validating set 2	0.87	0.94	0.96	0.01
Validating set 3	0.85	0.94	0.96	0.02
Validating set 4	0.89	0.94	0.96	0.01
Validating set 5	0.79	0.94	0.96	0.02





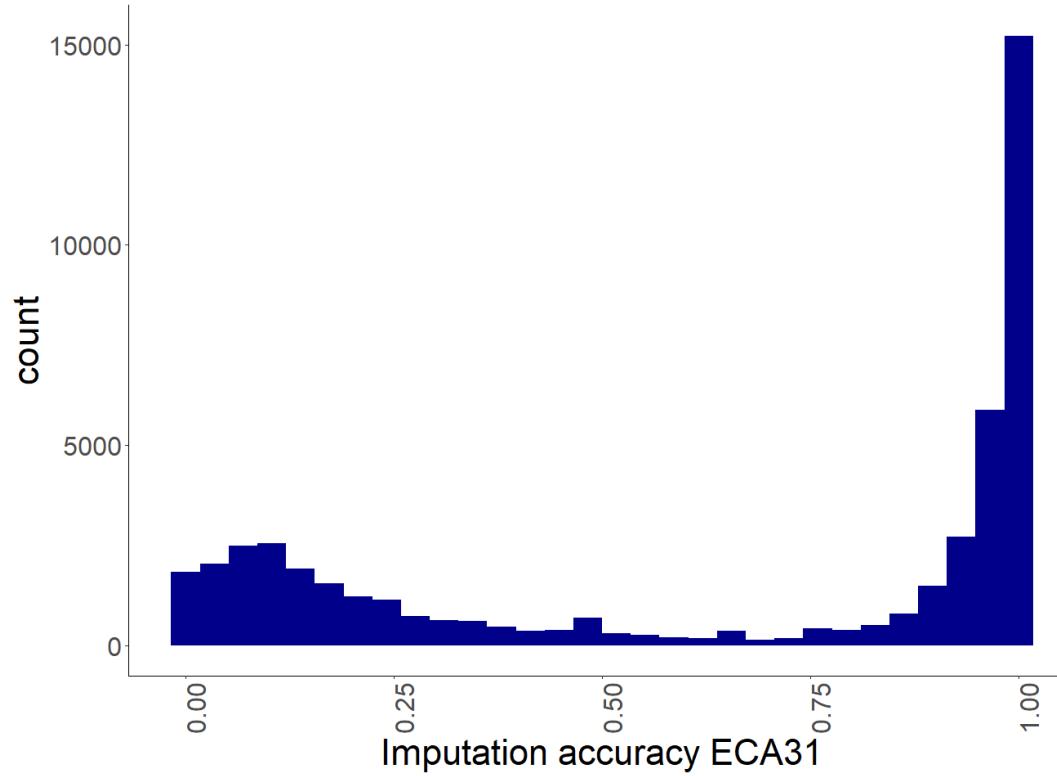
# Genotype imputation accuracy per SNP

	min	mean	max	SD
Validating set 1	0	0.95	1	0.15
Validating set 2	0	0.94	1	0.15
Validating set 3	0	0.95	1	0.15
Validating set 4	0	0.95	1	0.15
Validating set 5	0	0.95	1	0.15





# Genotype imputation accuracy per SNP

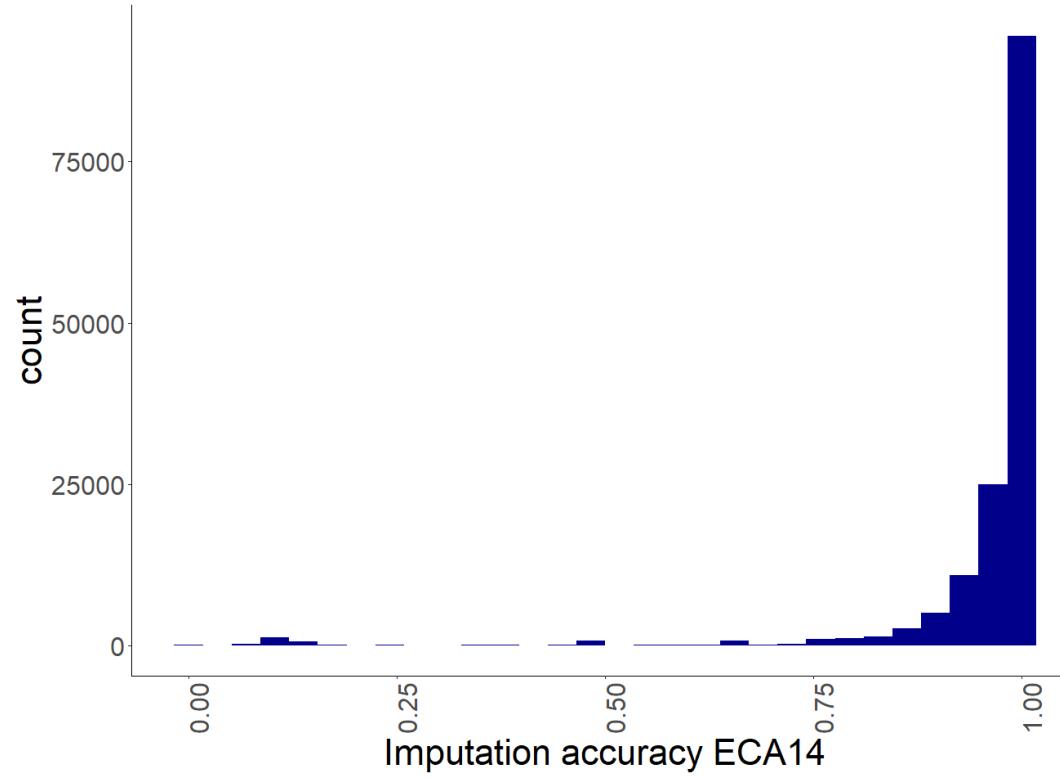


chr	mean $r^2$
ECA1	0.95
ECA2	0.95
ECA3	0.95
ECA4	0.95
ECA5	0.96
ECA6	0.95
ECA7	0.95
ECA8	0.95
ECA9	0.95
ECA10	0.95
ECA11	0.95
ECA12	0.92
ECA13	0.84
ECA14	0.96
ECA15	0.96

chr	mean $r^2$
ECA16	0.95
ECA17	0.95
ECA18	0.95
ECA19	0.94
ECA20	0.95
ECA21	0.95
ECA22	0.95
ECA23	0.95
ECA24	0.95
ECA25	0.95
ECA26	0.95
ECA27	0.95
ECA28	0.95
ECA29	0.95
ECA30	0.95
ECA31	0.64



# Genotype imputation accuracy per SNP



chr	mean $r^2$
ECA1	0.95
ECA2	0.95
ECA3	0.95
ECA4	0.95
ECA5	0.96
ECA6	0.95
ECA7	0.95
ECA8	0.95
ECA9	0.95
ECA10	0.95
ECA11	0.95
ECA12	0.92
ECA13	0.84
ECA14	0.96
ECA15	0.96

chr	mean $r^2$
ECA16	0.95
ECA17	0.95
ECA18	0.95
ECA19	0.94
ECA20	0.95
ECA21	0.95
ECA22	0.95
ECA23	0.95
ECA24	0.95
ECA25	0.95
ECA26	0.95
ECA27	0.95
ECA28	0.95
ECA29	0.95
ECA30	0.95
ECA31	0.64



# Conclusion

- **Genotype imputation** from MD to HD genotypes showed **high accuracies**:
    - Per individual: **0.94** on average
    - Per SNP: **0.95** on average
  - **Lowest accuracy for ECA31, highest for ECA5, ECA14, ECA15**
- ⇒ This panel can be used as a **reference panel** for genotype imputation from MD to HD



Lieke Boucneau

## Next steps:

- Use routinely this genotype imputation from MD to HD in **Belgian Warmblood horses**
- Develop genotype imputation for **other Belgian horse populations**



# Acknowledgments

- Data providers



- Funding



Research Foundation  
Flanders  
Opening new horizons

Travel grant ID: K1D2M23N



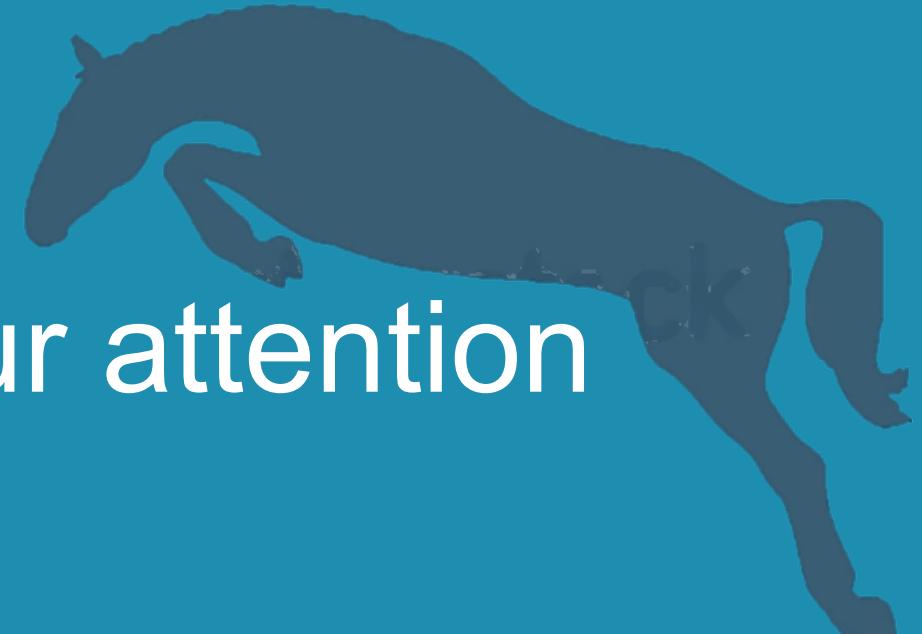
DEPARTEMENT  
LANDBOUW  
& VISSERIJ



PAARDENPUNT VLAANDEREN  
Als het om paarden gaat



C24/18/036 KU Leuven project



Thank you for your attention

[lea.chapard@kuleuven.be](mailto:lea.chapard@kuleuven.be)