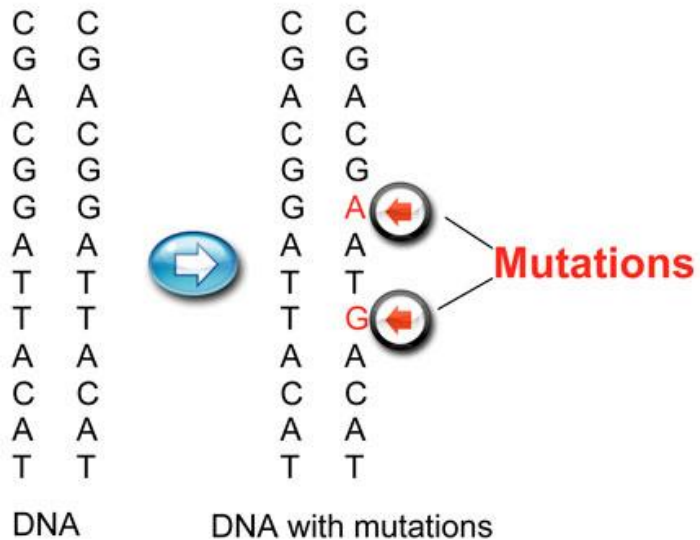


# Genomic selection without own phenotypes exploits new mutational variance less than BLUP selection

Han Mulder, Sang Hong Lee, Sam Clark, Ben Hayes and Julius van der Werf

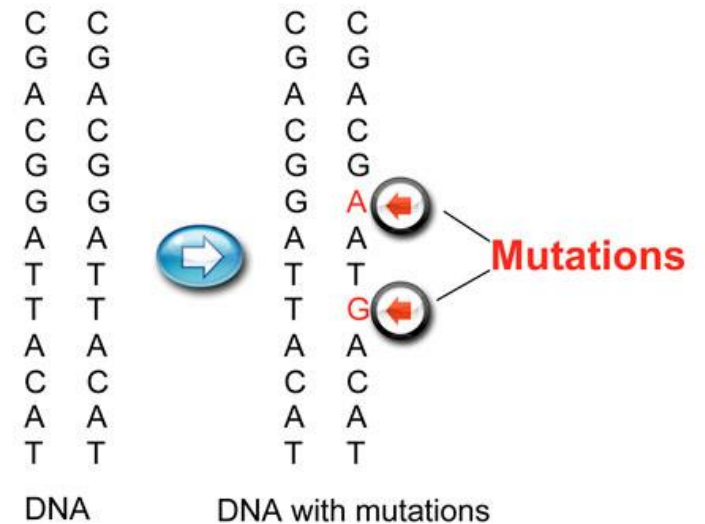


# Acknowledgements

- WUR-ABG supporting my sabbatical, February – March 2017
- Prof. Julius van der Werf for hosting me at University of New England

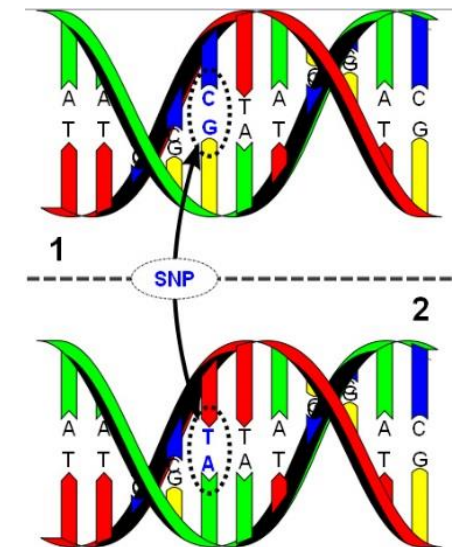
# Magnitude of mutational variance

- De novo mutation rate:  $1.0 - 1.8 \times 10^{-8}$  per site per gamete
  - 20-80 per individual in humans
  - $1.1 \times 10^{-8}$  per site per gamete in cattle
  - 0.5 deleterious mutation per individual in cattle (Charlier et al. 2016)
- Some mutations have favourable effects
- Contribution to genetic variance:  $0.001V_e$ 
  - Houle (1996), Hill (1982)



# Does genomic selection exploit mutational variance?

- Mutations are not on a SNP-chip
- Young mutations are in no LD with SNP on chip
- Mutations in selection candidate are not yet expressed if selection is at young age on GEBV before the phenotype is expressed
- Hardly any selection pressure on new mutations

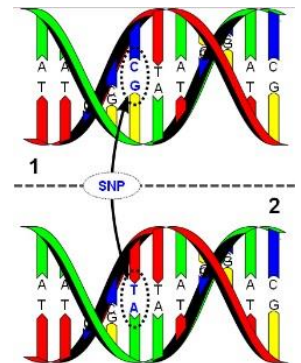


# Hypothesis and objectives

- Hypothesis: genomic selection exploits new mutational variance less than traditional selection
- Aims:
  - Investigate long-term selection response for mass, BLUP\_OP, BLUP\_no\_OP, GBLUP\_OP, GBLUP\_no\_OP selection
  - Investigate development of standing genetic variance and mutational genetic variance

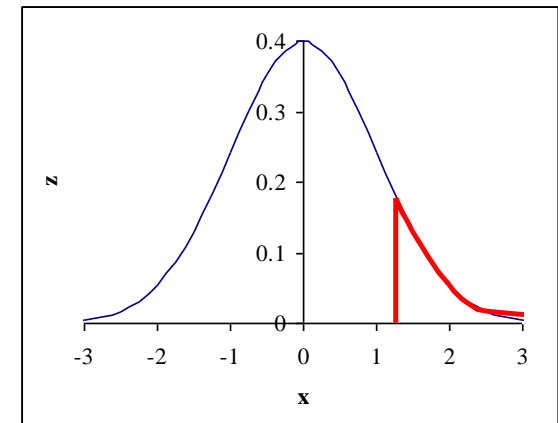
# Simulation

- Sequence data Holstein bulls 1000 bull genomes project
  - Chromosomes 1, 2 and 3
  - 300,000 SNV used
  - 5000 QTL
  - 20,000 markers for chip
- 0.5 mutation/animal
- $V_m = 0.001V_e$
- $h^2 = 0.3$
- QTL and mutations sampled from normal or gamma distribution

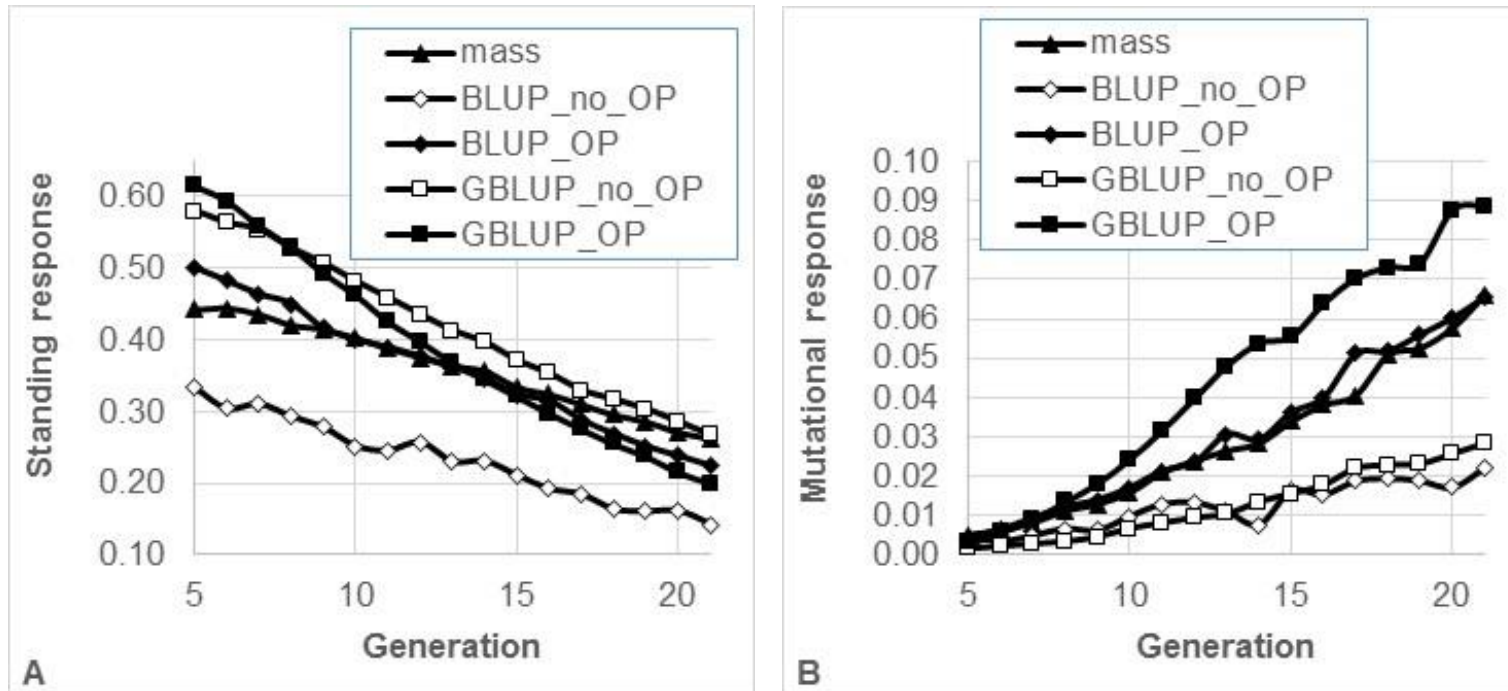


# Selection strategies

- Each generation 1000 males and 1000 females
- 50 males to be selected
- 200 females to be selected; 10 offspring/female
- 20 generations of animals
- Parents are selected on
  - Own phenotype (mass selection)
  - Pedigree-BLUP EBV with or without own phenotype
  - GBLUP-EBV, with or without own phenotype



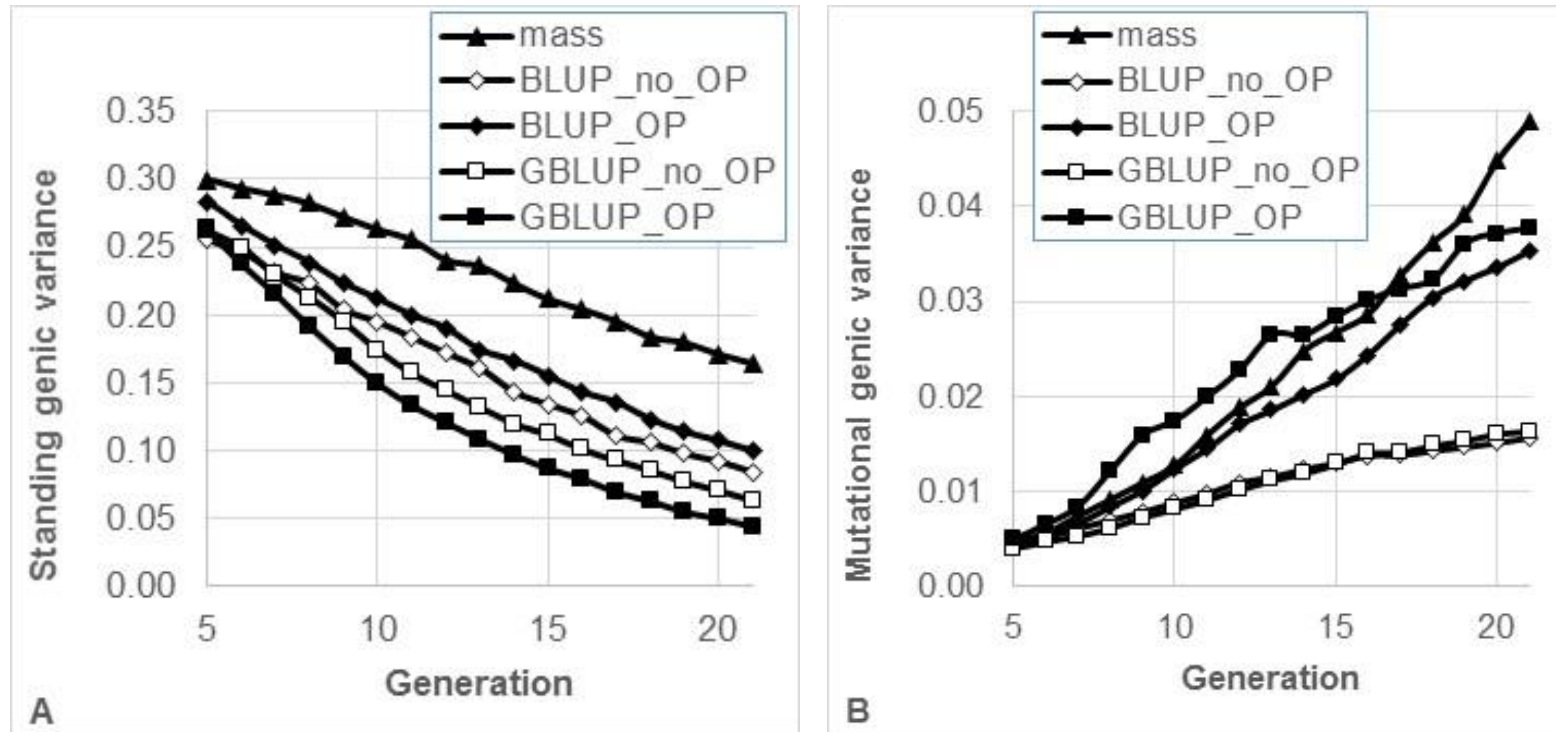
# Standing and mutational selection response



Genomic selection without own phenotype (and BLUP\_no\_OP) has **lower mutational response** than GBLUP\_OP, mass and BLUP\_OP selection



# Standing and mutational genic variance



Genomic selection without own phenotype (and BLUP\_no\_OP) has **lower mutational genic variance** than GBLUP\_OP, mass and BLUP\_OP selection

# The fate of DNM:

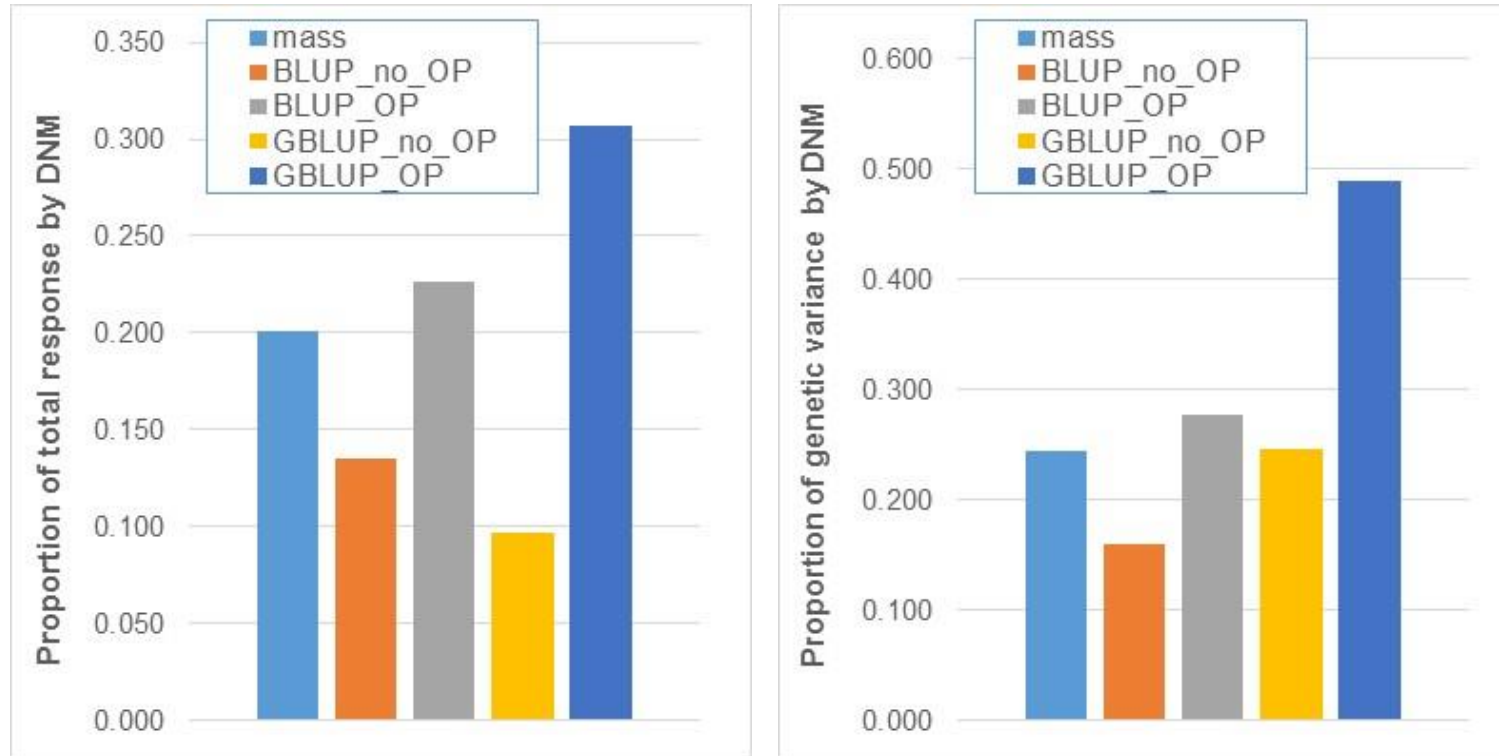
## DNM that segregate for 10 generations after appearance

	NQTL	N mut	N pos	N neg	prop pos
mass	3313	104.6	58.0	46.5	0.56
BLUP_no_OP	1602	55.6	28.6	27.0	0.51
BLUP_OP	2357	67.7	36.8	30.9	0.54
GBLUP_no_OP	2268	82.4	42.7	39.7	0.52
GBLUP_OP	2296	81.4	55.2	26.2	0.68

**Very few DNM survive!**

# Can the contribution of DNM be ignored?

Proportions in generation 21 after 20 generations of truncation selection



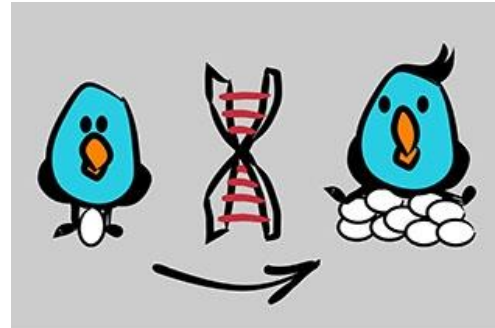
Mutational variation accounts for 10-30% of response and 15-50% of genetic variance!

# Take-home message

- GBLUP\_OP is best in exploiting mutational variance
- Genomic selection without own phenotype exploits mutational variance less than traditional selection using own phenotype
  - Crucial factor is the role of the own phenotype
- Faster decline in total genetic variance with genomic selection than with BLUP, no mutation-selection-drift equilibrium
- Need for sustainable genomic selection strategies

# Free online courses (MOOCs) in Animal Breeding and Genetics

ABG01x:  
Genetic Models in  
Animal Breeding



ABG02x:  
Evaluating Animal  
Breeding Programmes

- Now open for registration
- New runs starting every 4 months
- [www.edx.org](http://www.edx.org) >> search “Wageningen”

Since first run 2017:  
- 10k learners  
- High ratings (81%)



ICQG6  
icqg6.org

SIXTH INTERNATIONAL  
CONFERENCE OF QUANTITATIVE GENETICS  
14-19 June 2020 • Brisbane, Australia

Registration now open  
Abstract submission now open  
Abstract submission closes October 4 2019

icqg6.org

International Congress of  
Quantitative Genetics  
**Brisbane June 2020**

Including pre-conference  
student/postdoc workshops



Nick Barton - QG Theory



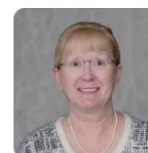
Ed Buckler - QG in Maize and Other Crops



Anne Charmantier - QG in Wild Birds in the Anthropocene



Susanne Dreisigacker - QG in Wheat



Trudy Mackay - QG using Drosophila as a model



Steve McCarroll - QG in Single Neurons and Organoids



Theo Meuwissen - QG theory in livestock and crops



Han Mulder - QG of GxEx Interaction



Yaniv Erlich - QG in Crowd-Sourced Data



Daniel Gaffney - QG in Human Induced Pluripotent Stem Cells



Lucia Galvão de Albuquerque - QG in Tropical Cattle



Jarrod Hadfield - QG theory and applications in wild systems



Jessica Rutkoski - QG in Rice



Matthew Stephens - Statistics in QC



Barbara Stranger - QG of Gene Expression



Shamil Sunyaev - QG at the Interface with Biology



Rachel Hawken - QG in Broiler Chickens



David Houle - QG of the Genotype-Phenotype Map



Satish Kumar - QG in Horticulture



Michael Lynch - QG and Evolutionary Biology



Albert Tenesa - QG in Human Big Data



Bruce Walsh - QG and Evolutionary Biology



Bruce Weir - Between Population and Forensic QG



Jian Yang - Novel statistical methods for QG



# Take-home message

- GBLUP\_OP is best in exploiting mutational variance
- Genomic selection without own phenotype exploits mutational variance less than traditional selection using own phenotype
  - Crucial factor is the role of the own phenotype
- Faster decline in total genetic variance with genomic selection than with BLUP, no mutation-selection-drift equilibrium
- Need for sustainable genomic selection strategies

# Sensitivity analysis

- Mutational variance per generation has large impact: 0.001 versus 0.004 $V_e$
- Number of DNM per individual has large impact: 0.5 versus 2 DNM
- Distribution of mutational effects has large effect: mutational response/variance smaller with normal distribution
- Epistasis and dominance have minor effects on mutational response/variance