

## Genomic data:

Insights into breed histories,  
population structures and  
genetic background of traits

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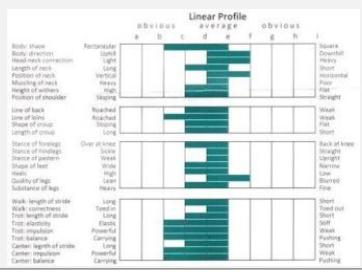
**3rd International Workshop on Linear Profiling in the Warmblood Horse**  
HuL Marbach, 24 Feb. 2017





## Establishing a Linear Profile

- Define specific traits of value for breeding program
- Describe horses precisely, accurately, reproducibly
- Ultimate - full description of a horse's phenotype
- Along with performance data from self and relatives, can derive Estimated Breeding Values (EBV) and other metrics.




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## X Limitations of EBV

- Precision and reproducibility of measurements
- Number of traits of interest in breeding program
- Incidence of traits of interest in population

**Mating two animals with high EBV will only on AVERAGE result in offspring with higher EBV**

- Complex inheritance
  - Multiple genetic variants with small effects
  - Environmental effects
  - Slow genetic progress if selection for one trait is deleterious for other, harder to measure traits

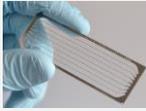
**Need to combine phenotype and genotype data**


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## X Genomic Profiling

- Illumina Equine SNP70 beadchip
  - 70 k SNP
- Affymetrix Axiom Equine HD chip
  - 670 k SNP
- Next generation sequencing (NGS)
  - Whole genome or exome sequencing (WGS/WES)
  - All variants, huge amount of data





Once this “profile” exists, the genetic variants can be analyzed for association with any trait that has been recorded.


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## Genomic Selection

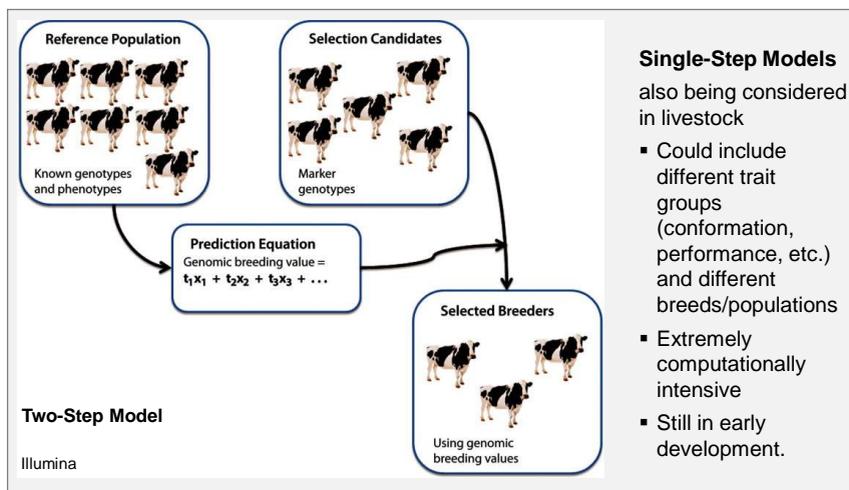
- Identifying genetic variants positively associated with traits and selecting for them in a breeding program
  - (Requires: precise definition of traits of interest, consistent measurement)
- Leverage Linear Profiling Data for the phenotyping



Linear Profile	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
Neck	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Head	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Body	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Legs	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1
Overall	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1	1



## Genomic Selection



## Success of Genomic Selection

- Intensity of selection
- Generation interval
- Genetic variation existing for trait
- Distance between markers and causative SNPs
- “Moving target”
  - Dependent on change in effective population size over time
  - With two-step model, reference population needs to be updated periodically, in order to measure the improvement and refine selection

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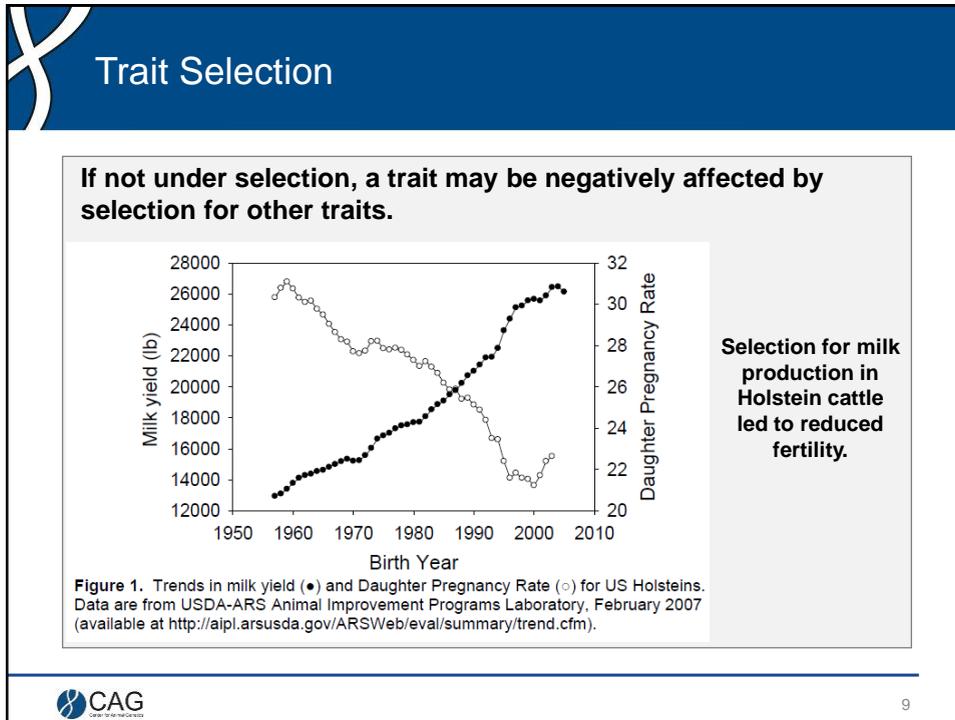
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## Animal Selection

- Should genomic profiles and linear profiles be generated for all foals in a population?
  - Only inspected foals?
  - Only “elite” horses (successful in sport or breeding)?
  - Only “elite” stallions?
- How much of the population’s genetic variance will be captured in a sample collection strategy?
- Success is dependent on data quantity and quality.
- If a trait has not been measured / recorded / prioritized, it cannot be selected for or against.

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## Linear Profiling Considerations

- Each horse is compared to the average for that breed
- Average of the “elite” population may be very different than the average population of all horses in the breed, or of another breed
- Even if the trait definitions are standardized, genomic selection based on linear profiling of one population may not be appropriate for a different population.

→ Genomic profiling can help evaluate differentiation between (sub)populations.

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## American Quarter Horse Subpopulations

**Different Breeding and Performance Goals  
Distinct differentiation of subpopulations**

◆ Haller  
 ▲ Pleasure  
 × Reining  
 ▼ Working Cow  
 □ Cutting  
 \* Racing

Haller   Pleasure   Reining   Working Cow   Cutting   Racing   Thoroughbred

Petersen JL *et al.* The American Quarter Horse: Population Structure and Relationship to the Thoroughbred, *Journal of Heredity*, 2014

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## Warmblood Breeds

306	● Hanoverian	46 shared stallions
348	● Holsteiner	(34 between Hanoverians & Oldenburgers)
219	● Oldenburger	
44	● Trakehner	50k Illumina SNPchip

Heuer *et al.*: Genomic prediction of unordered categorical traits: an application to subpopulation assignment in German Warmblood horses, *Genet Sel Evol*, 2016.

**Hanoverians & Oldenburgers**

- Low population differentiation
- "...classification of the Hanoverian and Oldenburger animals into two distinct breeds is questionable."

**Holsteiners**

- Minimal overlap with the other breeds
- Distinct subpopulations within breed

**Trakehners**

- Separate but close to Hanoverians
- Shared use of stallions?
- Lowest prediction accuracy because smallest data set

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## Which animals are being sampled?

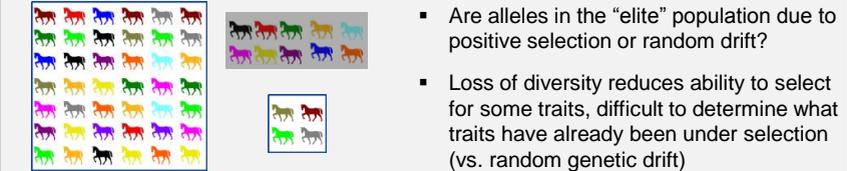


- Genetic diversity from the whole population is not preserved in the “elite” breeding populations
- If only approved stallions are genotyped, a large amount of genetic information is lost
- Sampling mares is also essential!
  - Less preselection, varying depth of linear profiles (performance tests > studbook inspection)

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## Selection vs. Genetic Drift

- Effective population size ( $N_e$ )
  - Number of individuals that contribute offspring to the next generation
- Genetic drift
  - Random fixation of alleles (homozygosity) in a population due to chance, rather than selection
- Large population - greater chance that gain and loss of alleles will cancel out
- Small population – reduced heterozygosity (fewer alleles)
  - Are alleles in the “elite” population due to positive selection or random drift?
  - Loss of diversity reduces ability to select for some traits, difficult to determine what traits have already been under selection (vs. random genetic drift)



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## Maintaining Genetic Diversity

- Inbreeding Depression
  - Lack of diversity decreases fitness
  - Loss of alleles that would allow for selection
- Outbreeding depression
  - Offspring may not be as well adapted / competitive as either parent
- Programs to increase diversity
  - Offspring often fail licensing inspections and are not allowed to breed
    - Intended diversity is therefore lost before entering the population
- Avoid the problem
  - Use genomic profiling to identify animals with high genetic diversity  
AND favourable genetic variants for traits of interest



The image shows a horse with a white body and brown stripes, standing in a field. This is likely a representation of a horse with high genetic diversity, as mentioned in the text.

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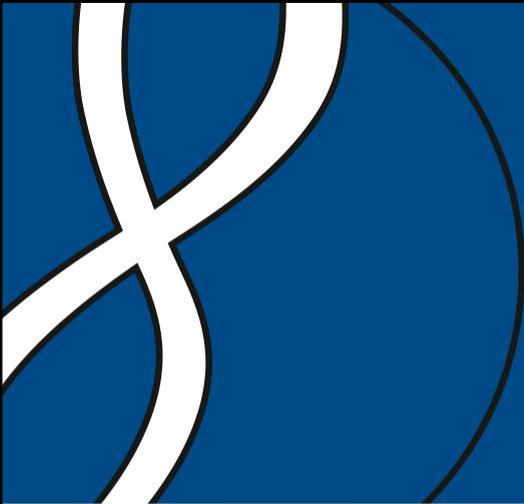
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## Final Thoughts

- It is easier to preserve genetic diversity than to regain it
- Avoid extreme use of a small number of stallions
- Cryopreservation
  - Save sperm/embryos of many horses (not just “elite” stallions) for future use if genetic diversity is high or they have rare alleles
- Design your selection strategy and breeding goals to optimize the full potential of your breed.
- Consider genetic variants associated with traits of interest and overall genetic diversity to allow for sustainable genetic progress.

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Thank you!

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