



The potential of genotyping pooled DNA to leverage commercial phenotypes for genetic improvement of beef cattle

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Genomic selection is now a reality in beef cattle,
and require a large group of animals to be individually
genotyped

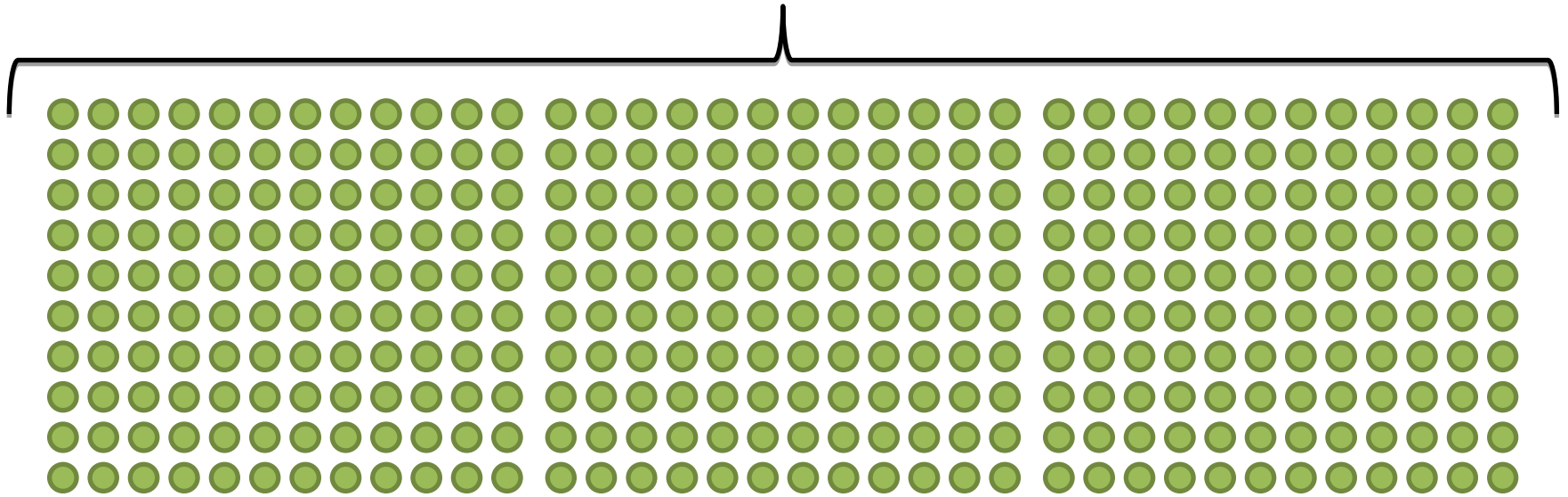
Genotyping pooled DNA :



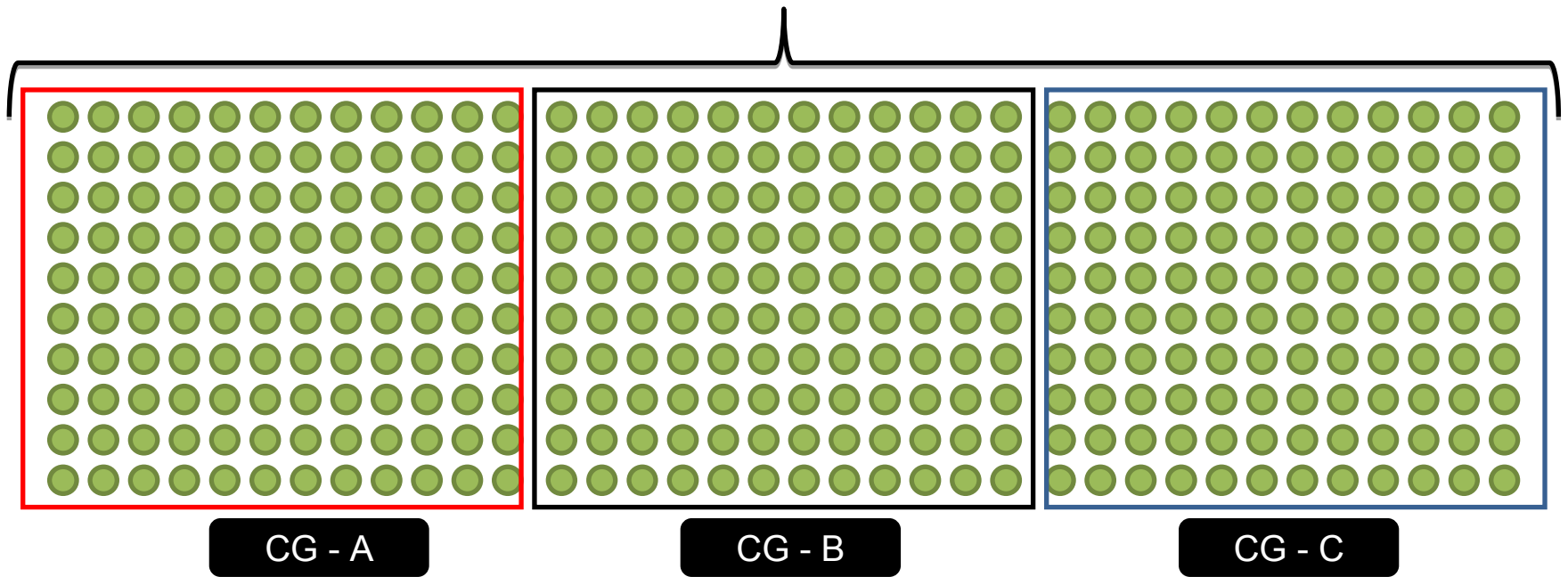
Group animals based on the
Phenotype similarity, mix the biological
material and genotype
the entire group only once

Could we build a reference population
in a economical way?
(first look on traits only recorded in the commercial sector)

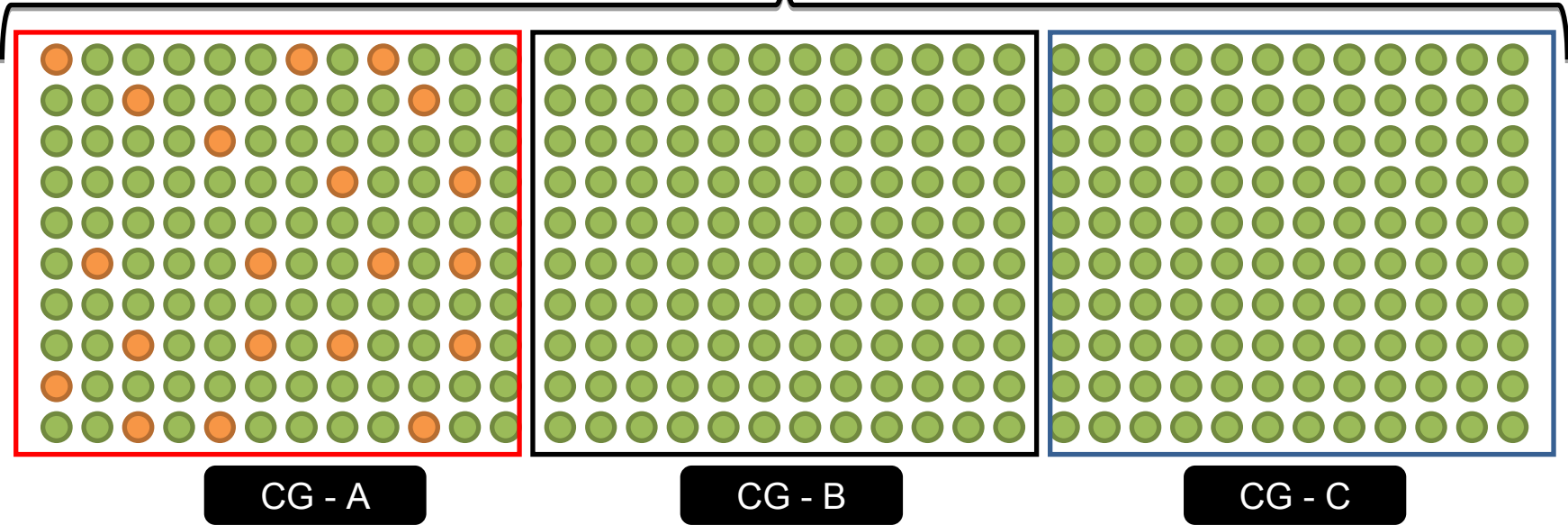
Herd



Herd

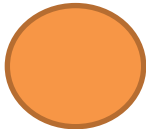


Herd



● Extremely -

● Extremely +

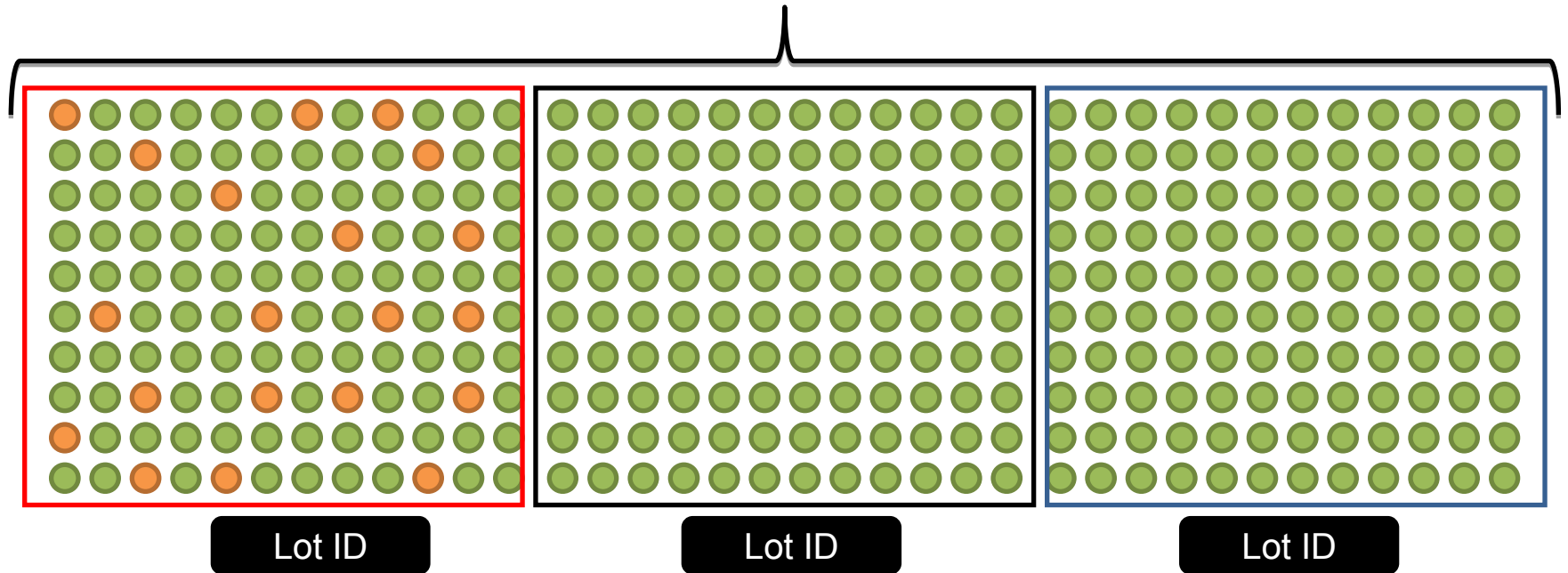


25 individuals in each pool
sorted based on the phenotype

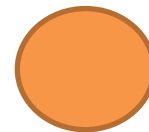


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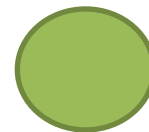
Packing plant



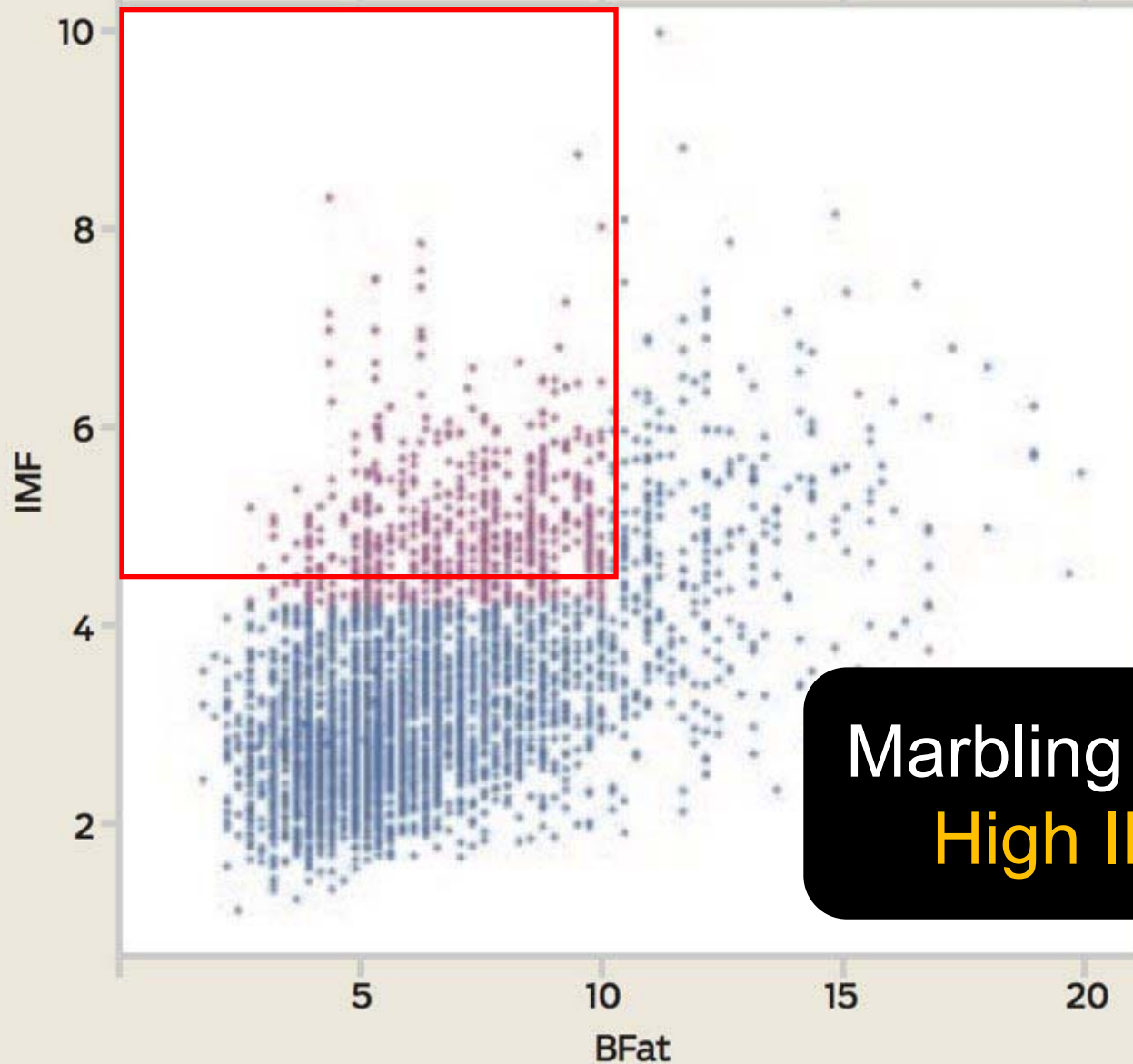
- Extremely -
- Extremely +



25 individuals in each pool
sorted based on the phenotype



25 individuals in each pool
sorted based on the phenotype



Marbling and Yield grade
High IMF / Low IMF

Material and Methods

157,870 registered American Angus animals:
Ultrasound intramuscular fat phenotypes
Another set of economically important traits (ongoing)
87K imputed genotypes

Pools



Simulated the pools by **averaging the allele frequencies** on **individually genotyped animals in a group**

Material and Methods

157,870 registered American Angus animals:
Ultrasound intramuscular fat phenotypes
Another set of economically important traits (ongoing)
87K imputed genotypes

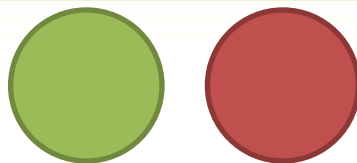
Genotypes of pooled DNA samples:



(Reverter et al., 2016)

SNP genotypes in the pools were categorized into to “0”, “1”, and “2” genotypes based on their B-allele frequencies

- 1) if the B-allele frequency was ≤ 0.3 , then SNP genotype was assigned to a “0”
- 2) if the B-allele frequency was > 0.3 and ≤ 0.7 , then SNP genotype was assigned to “1”
- 3) if the B-allele frequency was > 0.7 and ≤ 1.0 , then SNP genotype was assigned to “2.”



(1000 Low and 1000 High IMF)

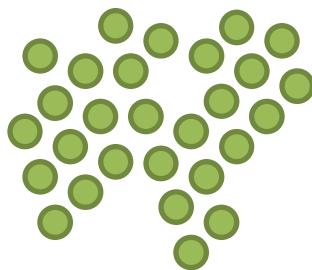
157,870 original phenotypes

Top 1,000 PCTIMF

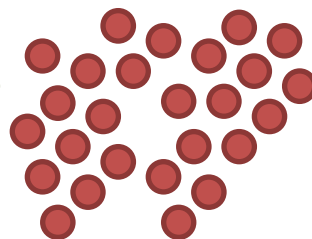
Bottom 1,000 PCTIMF

Each set of 1,000 animals
subdivided into 40 groups
of 25 individuals

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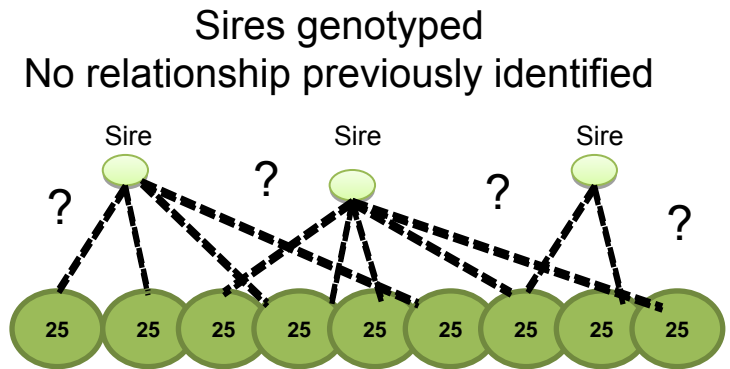
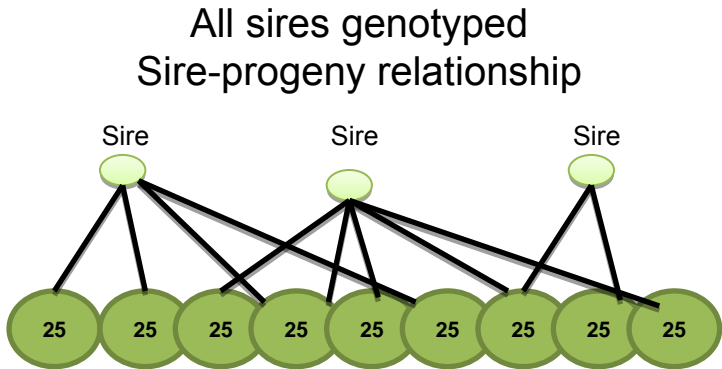


40 Pools
25 animals Low IMF



40 Pools
25 animals High IMF

40 H + 40 L as reference population to obtain predictions for the sires



J Anim Sci, 2016 Oct;94(10):4096-4108. doi: 10.2527/jas.2016-0675.

Genomic analyses of tropical beef cattle fertility based on genotyping pools of Brahman cows with unknown pedigree.

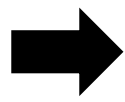
Reverter A, Porto-Neto LR, Fortes MR, McCulloch R, Lyons RE, Moore S, Nicol D, Henshall J, Lehnert SA.

Abstract

We introduce an innovative approach to lowering the overall cost of obtaining genomic EBV (GEBV) and encourage their use in commercial extensive herds of Brahman beef cattle. In our approach, the DNA genotyping of cow herds from 2 independent properties was performed using a high-density bovine SNP chip on DNA from pooled blood samples, grouped according to the result of a pregnancy test following their first and second joining opportunities. For the DNA pooling strategy, 15 to 28 blood samples from the same phenotype and contemporary group were allocated to pools. Across the 2 properties, a total of 183 pools were created representing 4,164 cows. In addition, blood samples from 309 bulls from the same properties were also taken. After genotyping and quality control, 74,584 remaining SNP were used for analyses. Pools and individual DNA samples were related by means of a "hybrid" genomic relationship matrix. The pooled genotyping analysis of 2 large and independent commercial populations of tropical beef cattle was able to recover significant and plausible associations between SNP and pregnancy test outcome. We discuss 24 SNP with significant association ($< 1.0 \times 10^{-6}$) and mapped within 40 kb of an

GBLUP

“Hybrid G matrix”



S-S	S-P
S-P	P-P

Material and Methods

157,870 original phenotypes

Top 1,000 PCTIMF

Bottom 1,000 PCTIMF

Validation
Step 1

AAA weekly National cattle evaluation
IMF EPD

Highest 30 sires
IMF EPD

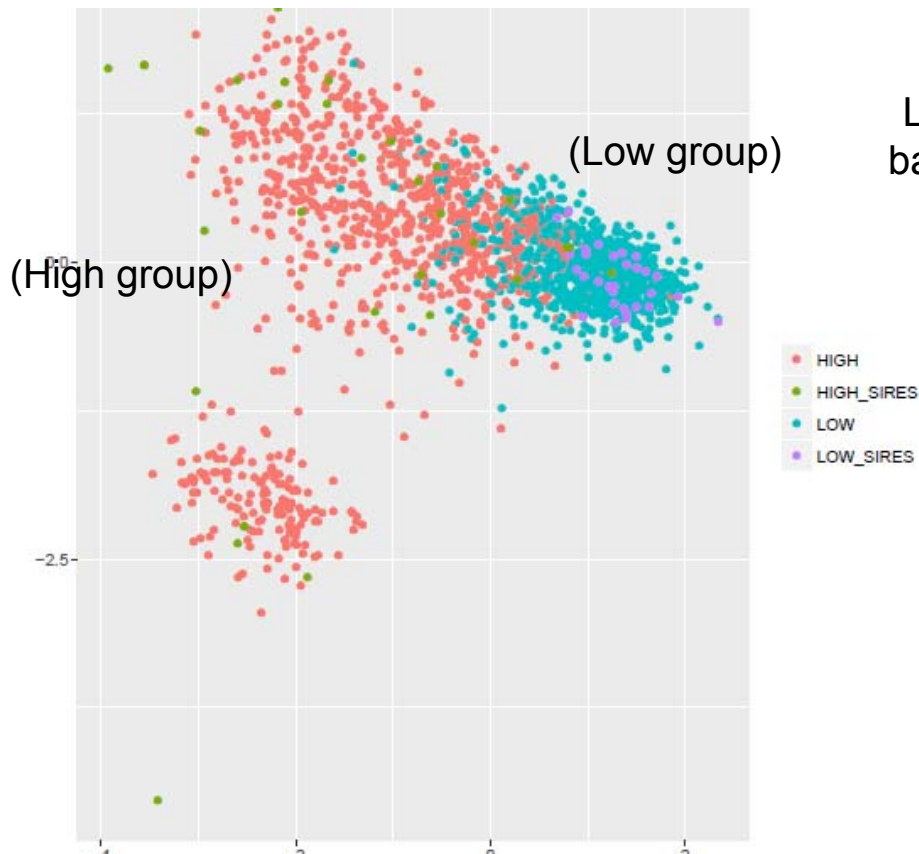
Lowest 30 sires
IMF EPD

Cor (DGV from GBLUP-pool, EPDs at Angus)

Clustered the genotypes before and after pooling

Individual genotypes

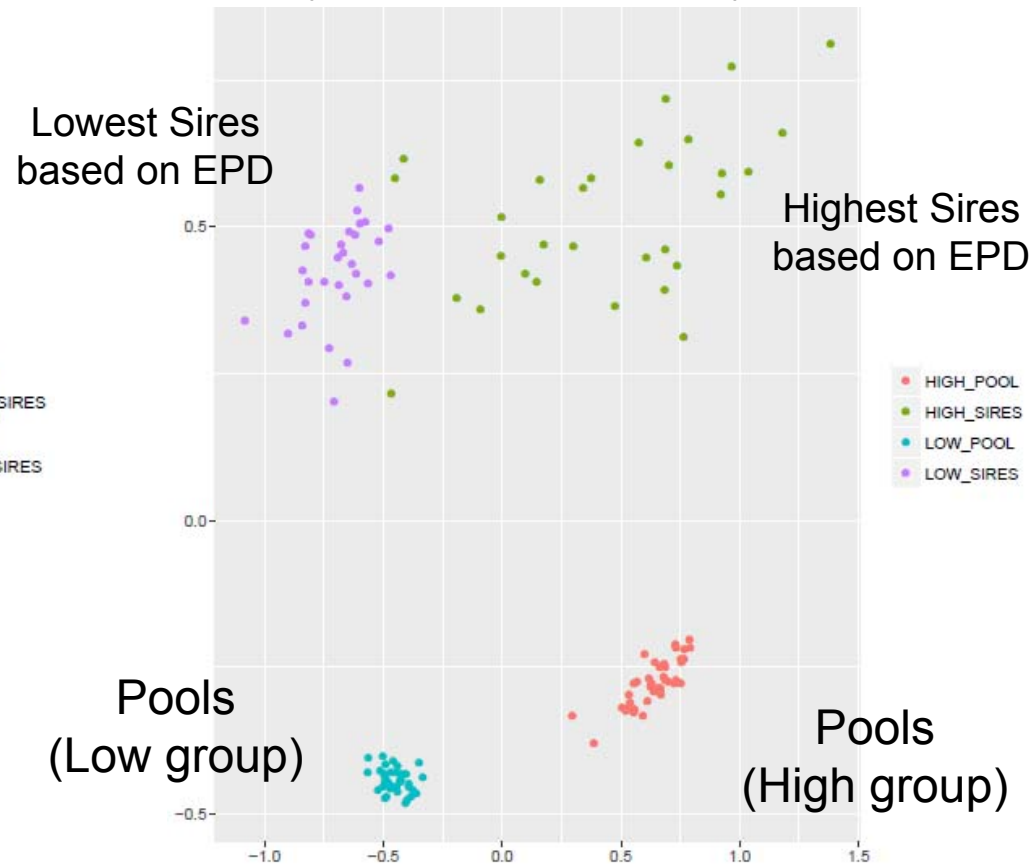
(1000 Low and 1000 High IMF)



1000 H, 1000 L, 30H, 30L

Pool (40 High + 40 Low)

(25 individuals each)



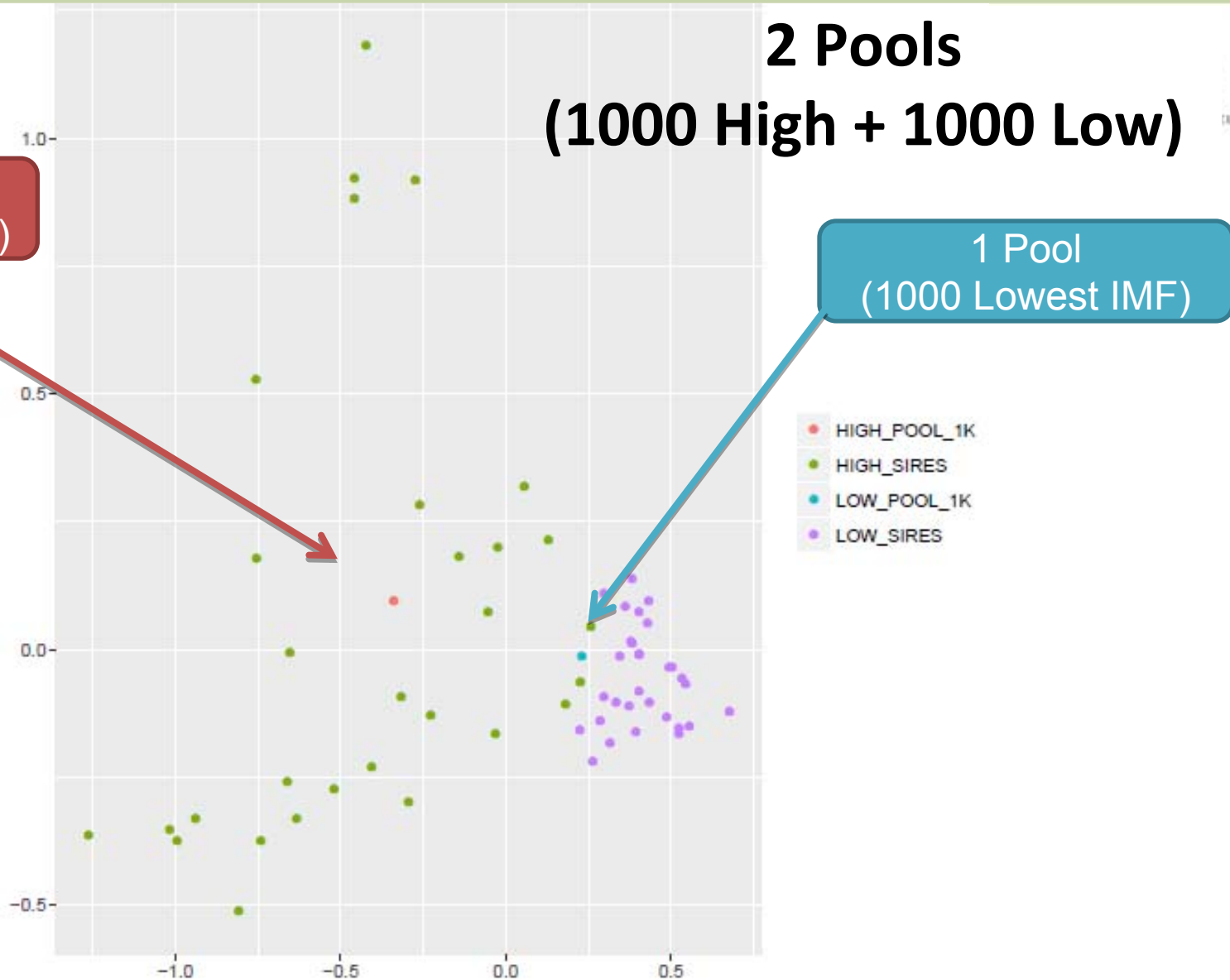
40 Pools H, 40 Pools L, 30H, 30L

Clustered the genotypes before and after pooling

2 Pools (1000 High + 1000 Low)

1 Pool
(1000 Highest IMF)

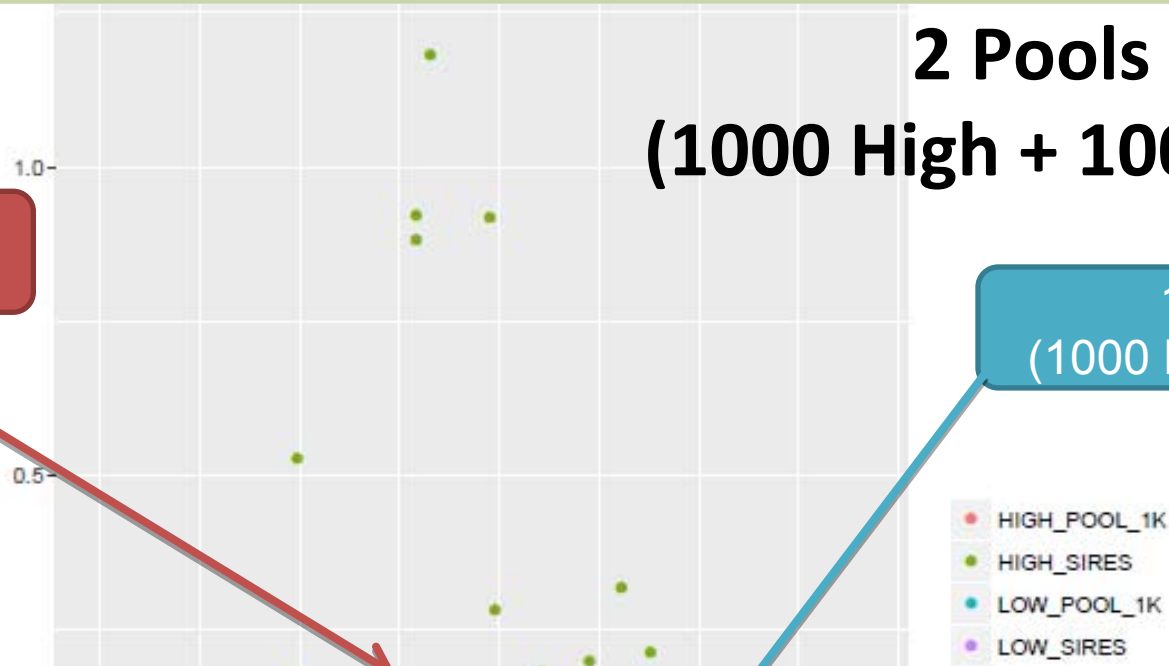
1 Pool
(1000 Lowest IMF)



2 Pools (1000 High + 1000 Low)

1 Pool
(1000 Highest IMF)

1 Pool
(1000 Lowest IMF)



2 pools approach:

$\text{cor}(\text{difference in sires genomic relationship with the high and the low groups, EPDs}) = 0.858$

```
cor((dataResults$HIGH - dataResults$LOW), dataResults$EPD_Bull)
```

80 pools approach - GBLUP: $\text{Cor}(\text{DGVs, EPDs}) = 0.895$

2 Pools (1000 High + 1000 Low)

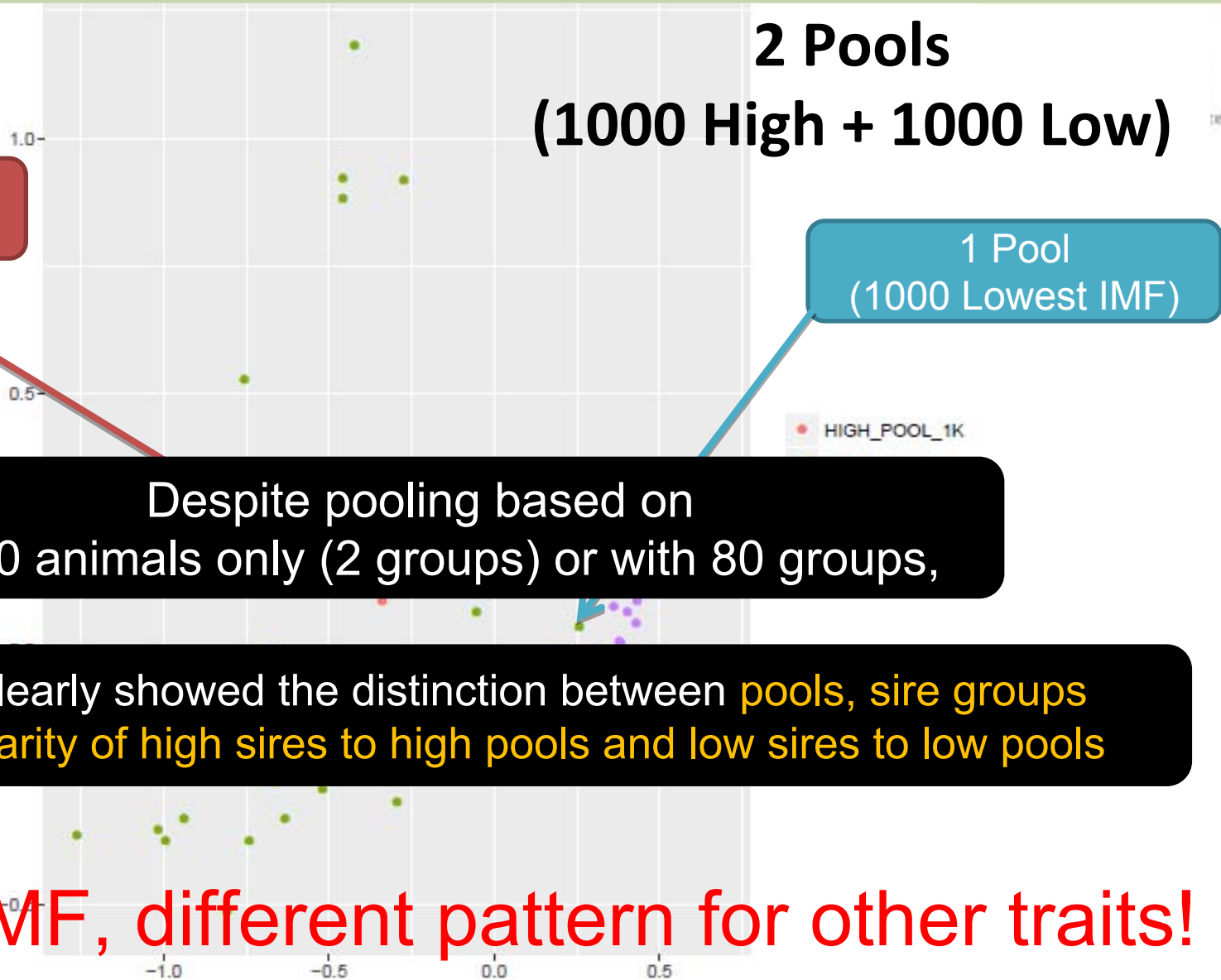
1 Pool
(1000 Highest IMF)

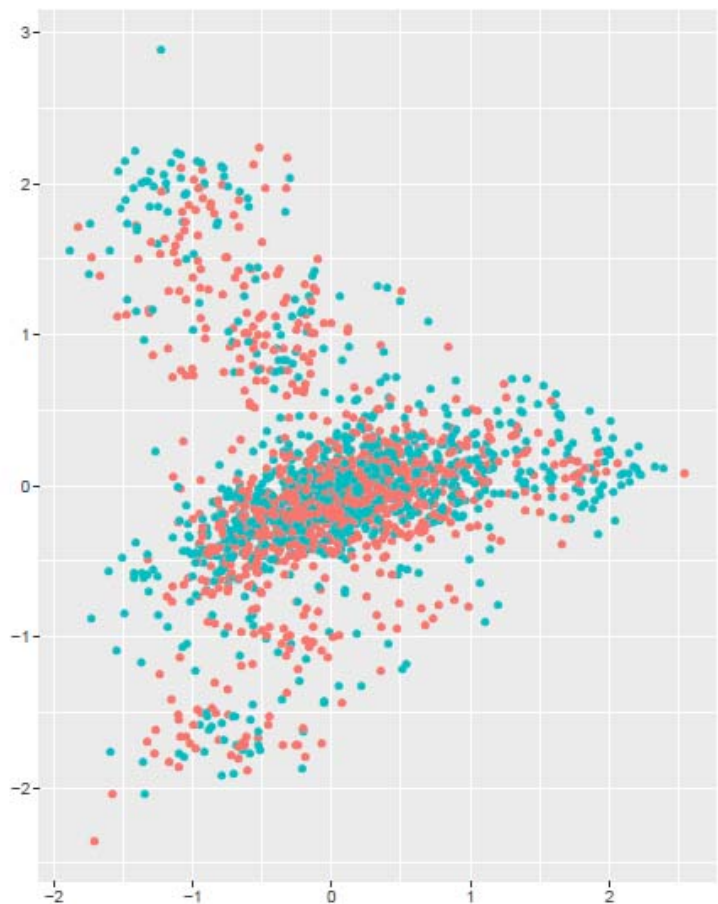
1 Pool
(1000 Lowest IMF)

Despite pooling based on
1,000 animals only (2 groups) or with 80 groups,

PCA plots clearly showed the distinction between **pools, sire groups**
and the similarity of **high sires to high pools and low sires to low pools**

For PCTIMF, different pattern for other traits!





• BOT_USLEAN
• TOP_USLEAN



REA

RIBFAT

USLEAN

What are the factors causing this issue?

Data issue? (NO)

Variance components re-estimated at Angus and at Project level

Trait structure (80K vs SNPs associated)

Even under similar h^2 , cluster pattern could be different

How many markers affecting the trait, how many Chrs?

Which GWAS method to select markers?

What is the information available for each GWAS study?

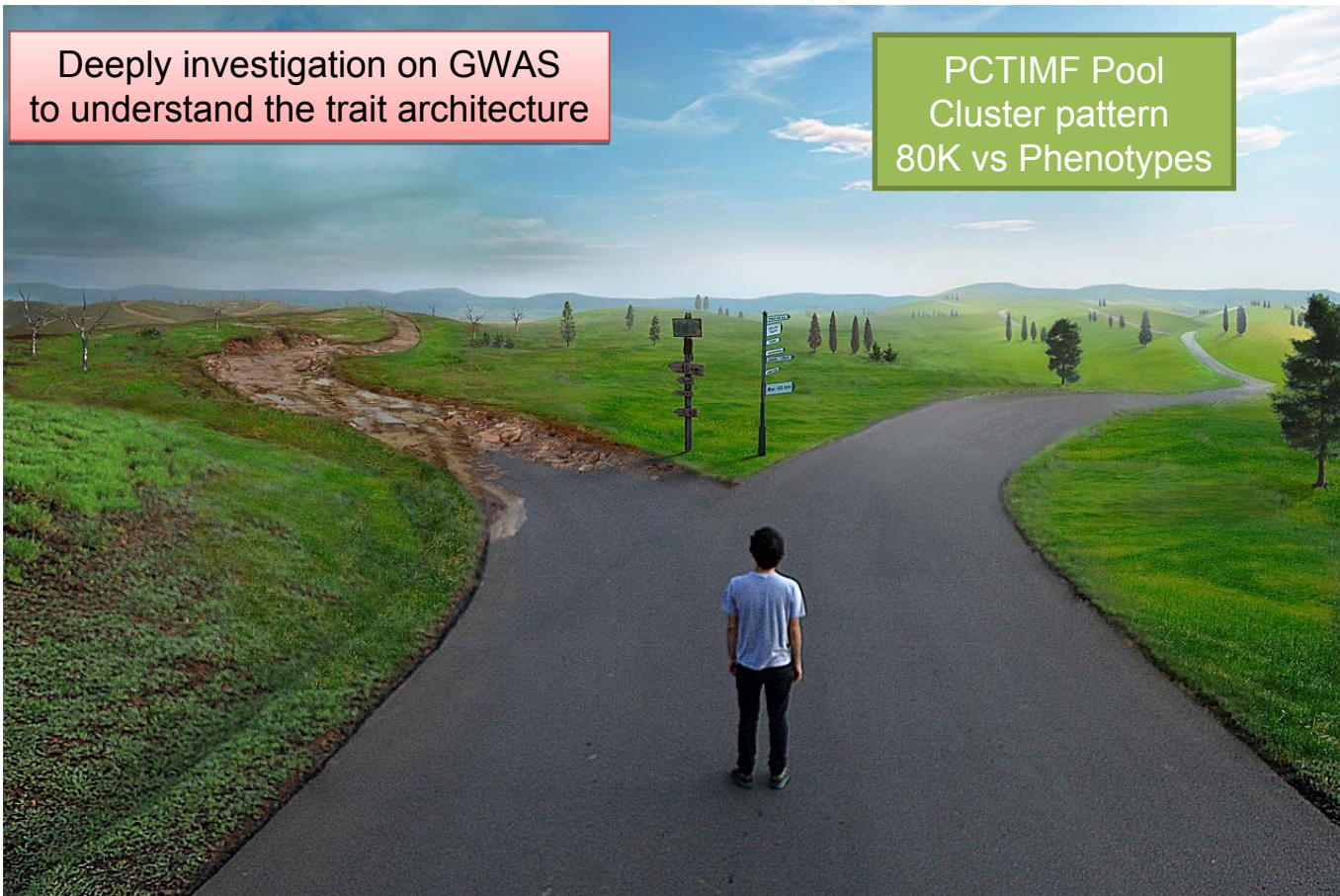
How many animals? Extremes?

% Phenotypic variance explained by the markers?

Switching the project focus ...

Deeply investigation on GWAS
to understand the trait architecture

PCTIMF Pool
Cluster pattern
80K vs Phenotypes



GWAS using different reference sizes (extremes or not for each trait)

157,870 original phenotypes



Normal selection

1,000 animals

2,000 animals

5,000 animals

10,000 animals

Extremes selection

1,000 animals

2,000 animals

5,000 animals

10,000 animals

Raw REA

Adjusted REA

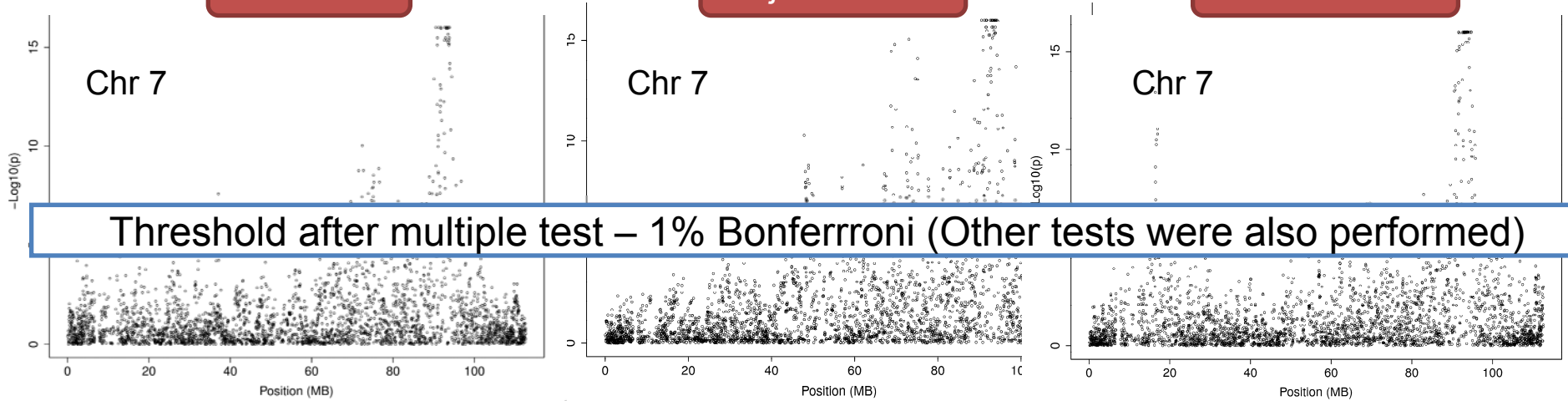
EBV REA

Chr 7

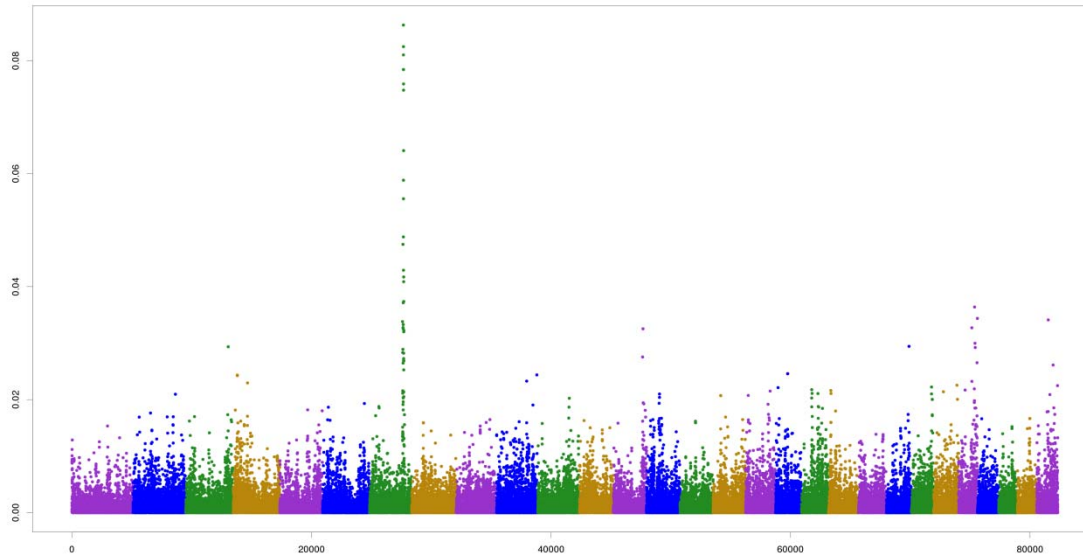
Chr 7

Chr 7

Threshold after multiple test – 1% Bonferroni (Other tests were also performed)



Manhattan Plot SNP Variance explained by 1adjacents SNP window - Trait: 1 Effect: 4



Adjusted REA
ssGWAS

Take home message

Pooling is an effective way to investigate new traits at a very low cost

Pooling based on all the medium/high density markers may require the identification of SNPs after GWAS

Trait architecture must be carefully investigated even with similar heritability before applying DNA pooling

.: Acknowledgments



Support since August 2017 – JP 16/19514-2