



Pre-breeding strategies for obtaining new resilient and added value berries

Workshop

Advancing Berry Breeding: From Phenotyping to Genomic Innovation

**The benefits of GS in a cultivated strawberry breeding programme:
an example of powdery mildew resistance**



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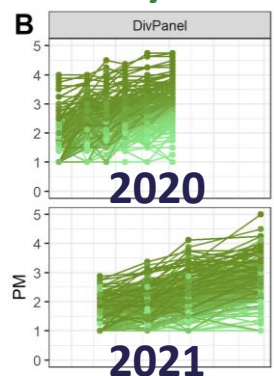


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Powdery mildew (PM) in Strawberry

- Pathogen agent: *Podosphaera aphanis*
- Major threat for strawberry production in France and the world
- Affects all aerial parts
Vegetative parts = diminution of photosynthesis and yield
Fruits = non commerciable yield
- **Resistant varieties** = practical and efficient control strategy

2 years of phenotyping



Scale
0 (resistant) to
5 (highly susceptible)

GWAS on AUDPC

Prohaska, Rey-Serra, Bénéjam et al., *in prep*



Powdery mildew symptoms

Diversity panel

223
genotypes

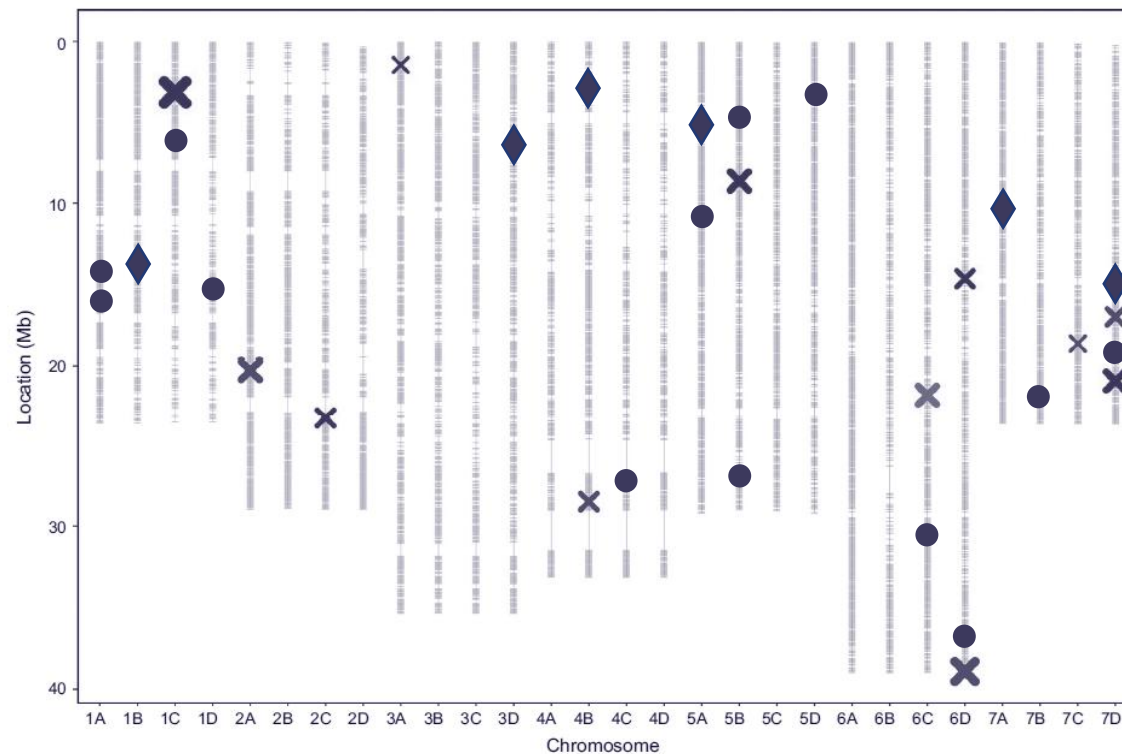
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QTLs/SNPs linked to PM resistances in Strawberry

Genetic map of some QTLs/SNPs-associated to PM (approximative positions)

- ✕ Cockerton et al., 2018
- ◆ Lynn et al., 2024
- Prohaska, Rey-Serra, Bénéjam et al., *in prep*



PM resistances are :

- Highly polygenic
- Unstable between environments
- Mainly additive

Breeding strategies adapted to powdery mildew

Screening based
on phenotypes



Advantages

Conventionally used
Easy to use

Limits

Time-consuming
Subjective
Depends on the trial

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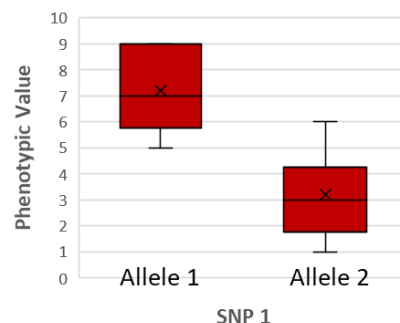
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**Screening based
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**Marker-assisted
selection**



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(based on genetic information)
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Polygenic traits

Breeding strategies adapted to powdery mildew

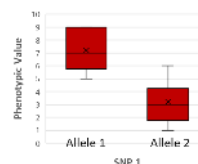
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Marker-assisted
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Genomic
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New breeding strategy for PM?

Objective
Additive and polygenic traits
Environment can be considered
Multiple trait selection

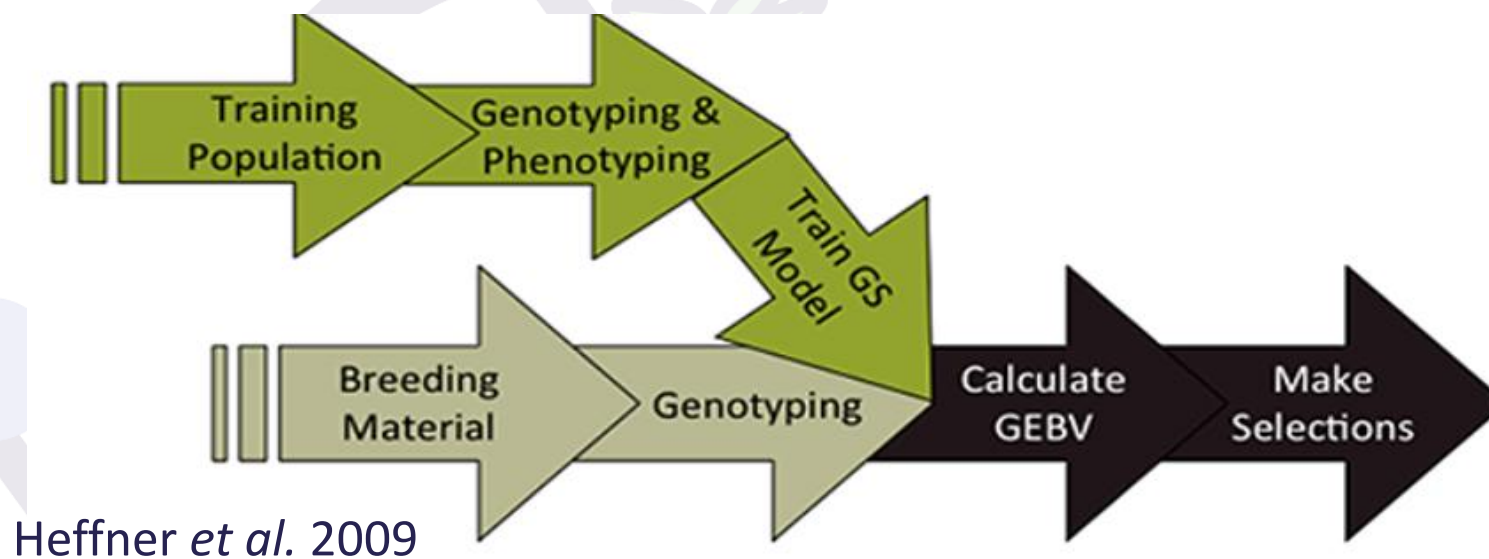
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Polygenic traits

Principle of genomic selection

1- Design of the prediction model using a training population



2- Model application

Principle of genomic selection

Prediction model:

Whittaker *et al.* 2000

$$Y = a * x + b$$



$$y_i = \mu + \sum_k w_{ik} \beta_k + e_i$$

Y= vector of phenotypes
 y_i for individual i

μ overall mean

e_i residual vector

$$e_i \sim N(0, \sigma_e^2)$$

w_{ik} is the genotype at locus k {0, 1, 2}

β_k the effect of this allele

Allele SNP1 (genotypeA) * SNP1 effect + Allele SNP2 (genotypeA) * SNP2 effect +

Genomic Best Linear Unbiased Prediction (GBLUP)

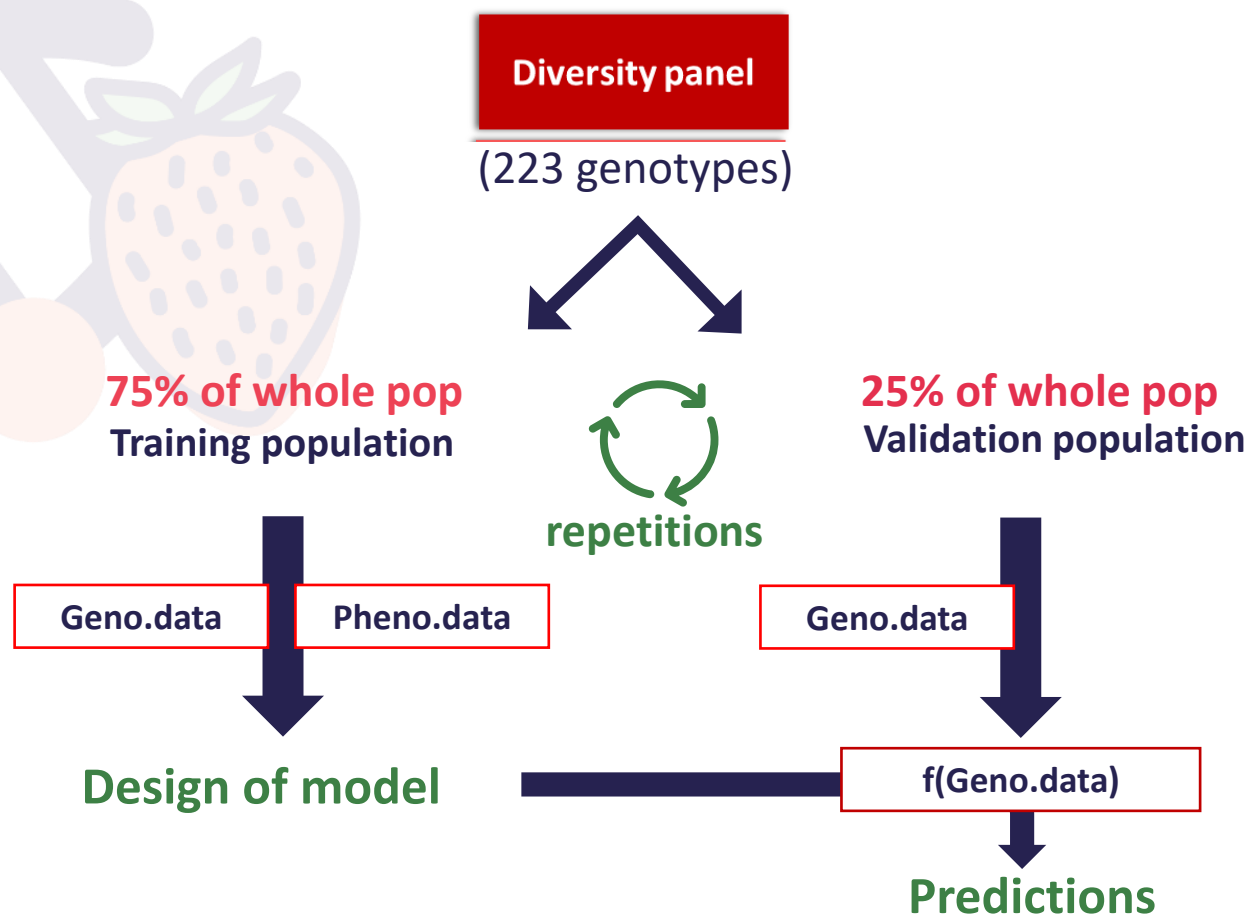
Predictive ability of powdery mildew



Evaluation of the performance
of genomic prediction
for powdery mildew resistance

Cross-validation

For testing the efficiency of genomic prediction



$$\text{Prediction ability} = \text{cor}(\text{predicted pheno}, \text{observed pheno})$$

Predictive ability of powdery mildew

75% of whole pop -> Training population =
collection of 165 genotypes



Y = vector of susceptibility values

X = matrix with 33K SNPs



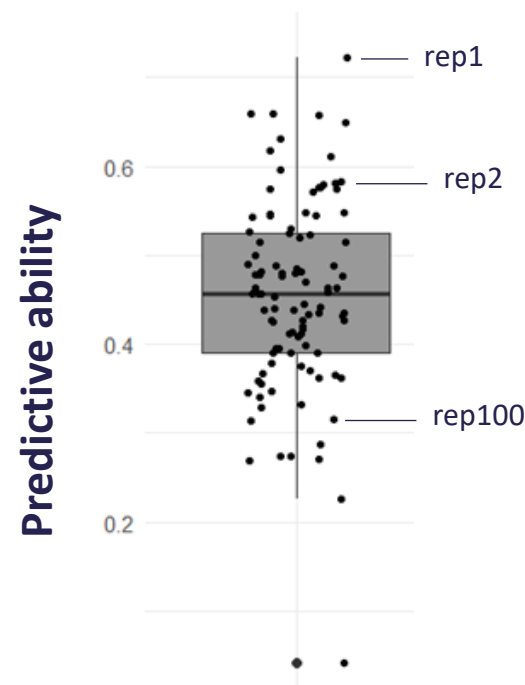
Model : RRBLUP (x100 repetitions)

25% of whole pop -> Validation population =
55 genotypes



Calculation of **predictive ability**
~ Model efficiency / accuracy

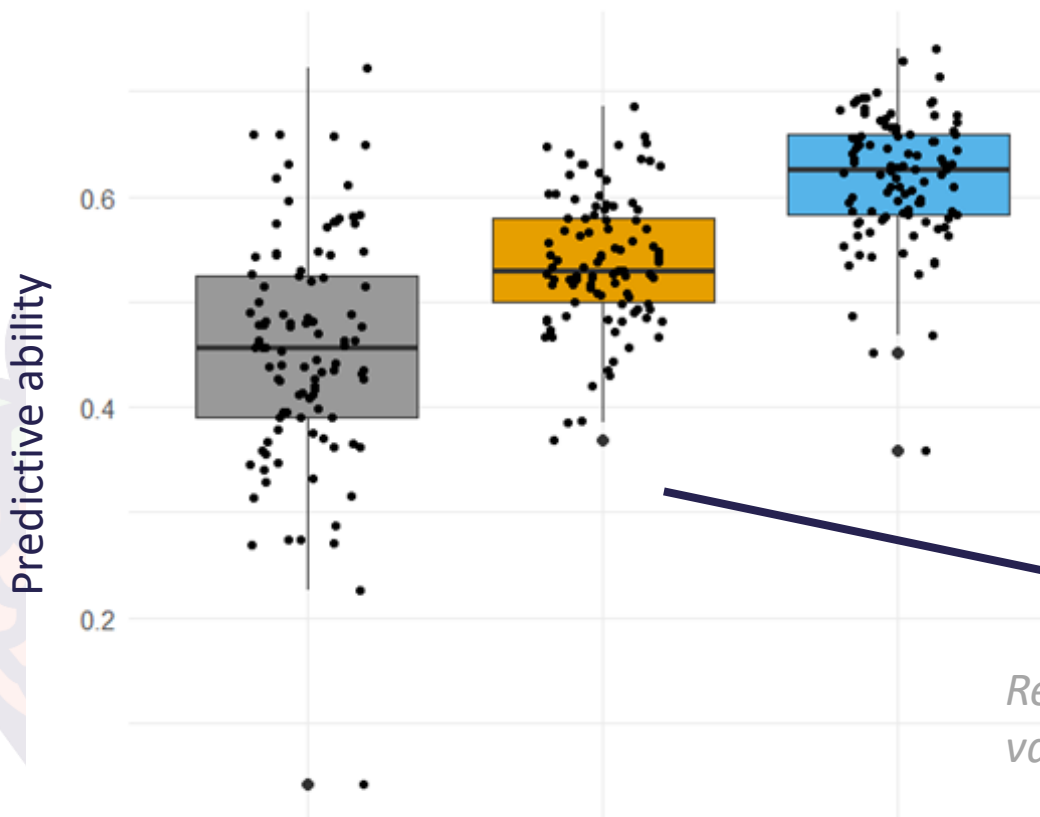
Boxplot of result



Performance:
Predictive ability ~ 0.45

Predictive ability of powdery mildew

2 examples of ways to improve predictive ability



Equation optimization

Adding **cofactors** as fixed effects in the model
Environmental effect, QTL, other influencing factors...

Training population optimization

Relationship between training and validation population, size of validation population, intra- / inter- population prediction...

Performance after optimization:
 Predictive ability ~ 0.65

Predictive ability of powdery mildew

Application of genomic selection
in breeding programme

1-Prediction of new hybrids

**2-Prediction of parental
values**

3-Prediction of crosses

Predictive ability of powdery mildew

1- Prediction of phenotypic values of new hybrids

Breeding programme

Pre-breeding population

→ Genotyping
→ Phenotyping

→ Model design

For high efficiency: adapt the training population to the breeder programme

Parents

Progenies

→ Genotyping

→ Model application on progenies

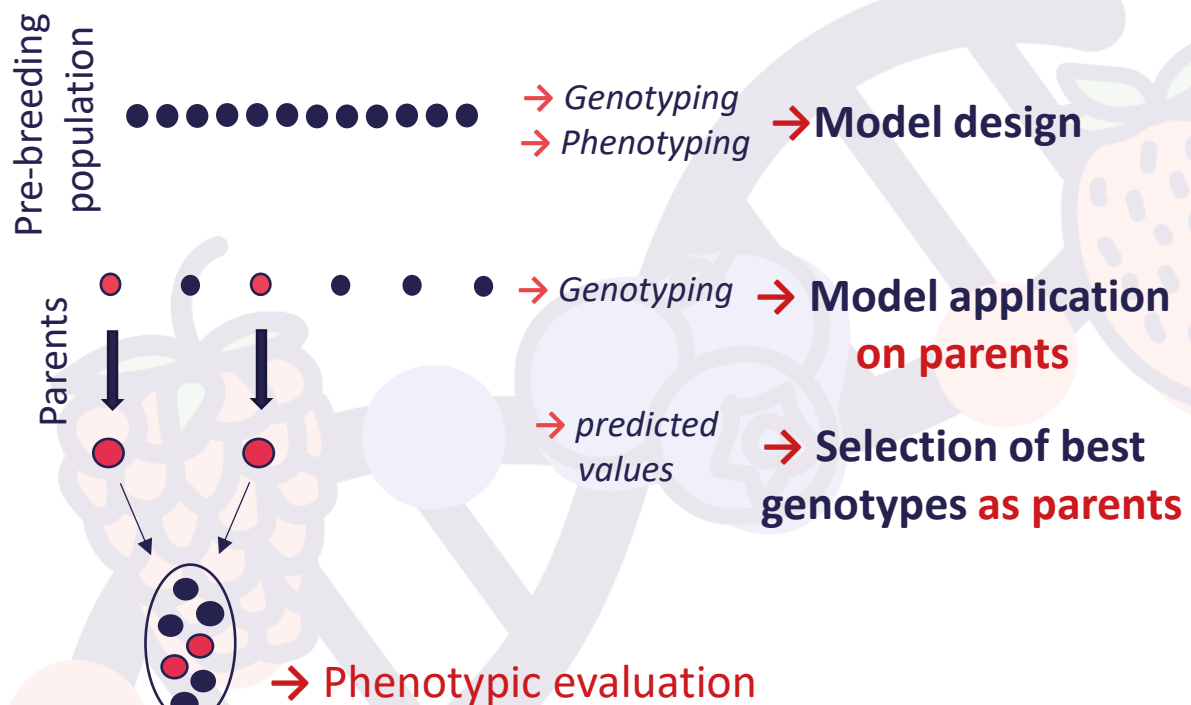
Candidates as new cultivars

→ predicted values

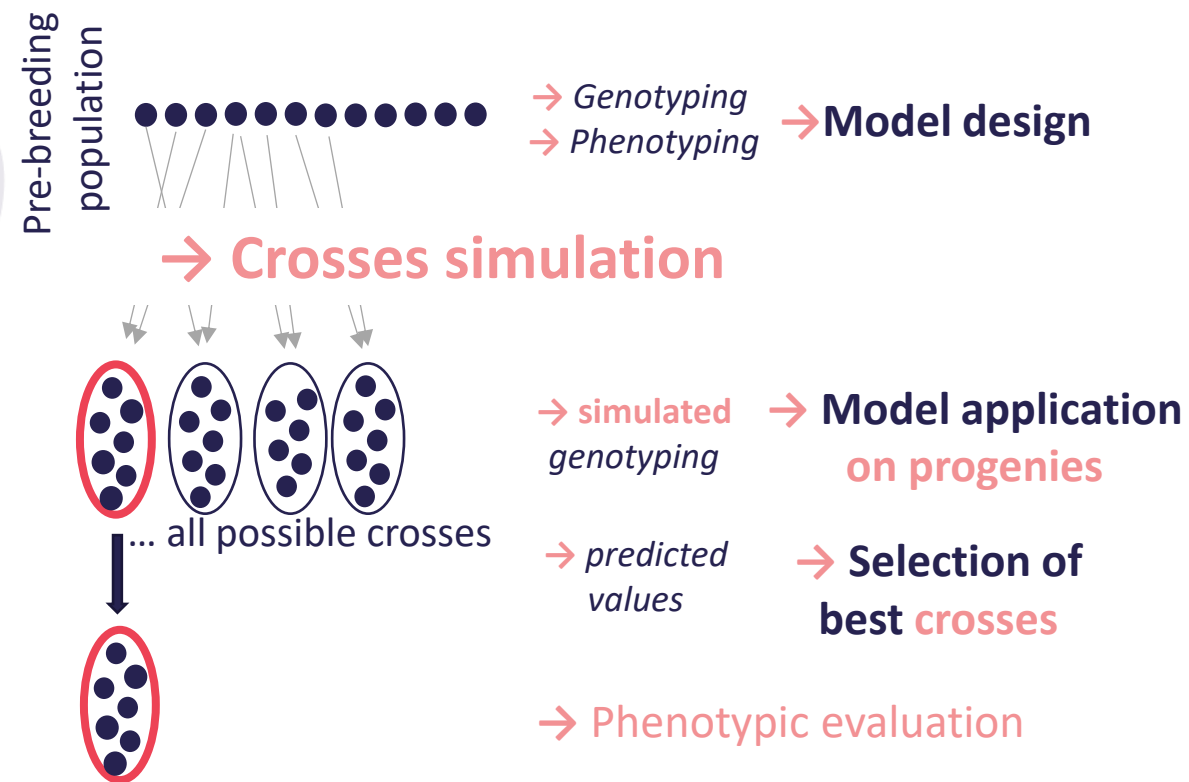
→ Selection of best genotypes

Predictive ability of powdery mildew

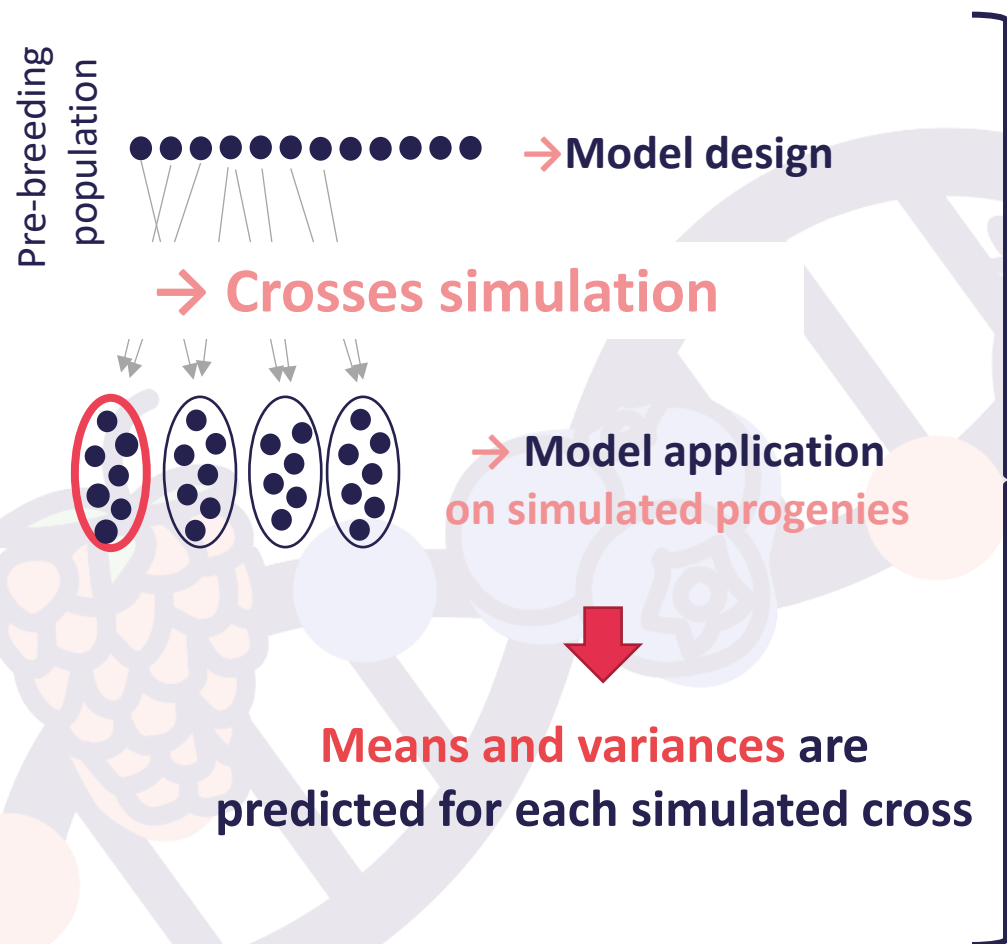
2-Prediction of parental values



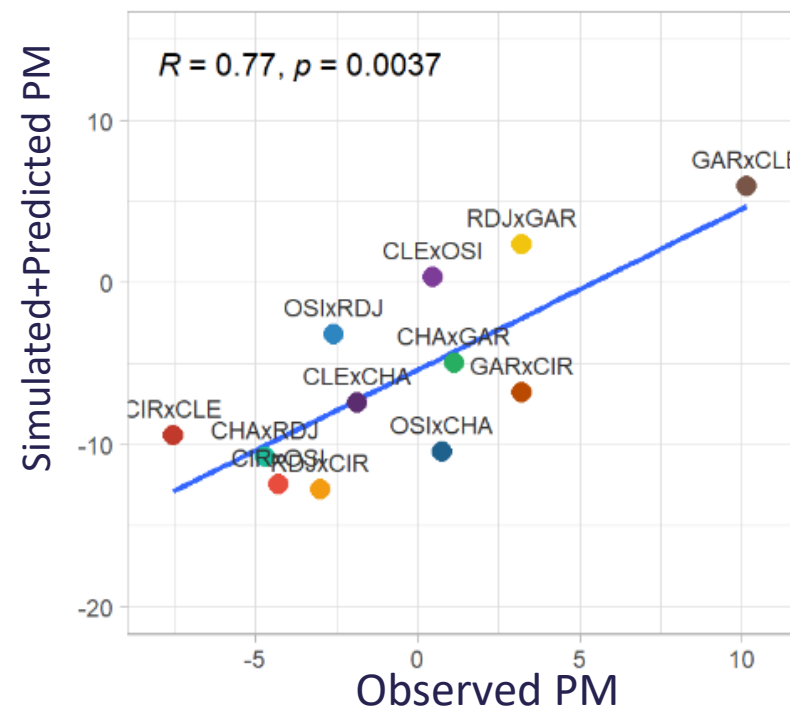
3-Prediction of crosses



3-Prediction of crosses



Results: High correlation between observed and simulated+predicted PM means in 12 progenies



Simulation coupled with prediction of the values of new crosses is promising
 -> easy way to transfer to breeding programmes?

Perspectives

Genomic prediction:

Very promising (optimization in progress)
Efficient for complex and integrated traits

For powdery mildew resistance:

Genomic prediction = efficient alternative (highly polygenic and additive trait).

Crosses simulation:

Prediction of crosses -> **sort out promising crosses**

First step towards implementing GS in the breeding programme

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Crosses simulation:

Prediction of crosses -> **sort out promising crosses**
first step towards implementing GS in the breeding programme

INRAE

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THANK YOU !

