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## Genomics assisted breeding in alfalfa

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► **To cite this version:**

Bernadette Julier, Marie Pégard, Julien Leuenberger, Philippe Barre. Genomics assisted breeding in alfalfa. EUCLEG Workshop on Genomics assisted breeding in forage and grain legumes, Sep 2021, online, United Kingdom. hal-03365357

**HAL Id: hal-03365357**

**<https://hal.inrae.fr/hal-03365357>**

Submitted on 5 Oct 2021

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**Horizon 2020 of European Union:** Call 2016, SFS 44 : “A joint plant breeding programme to decrease the EU's and China's dependency on protein imports”

*This project has received funding from the European Union's Horizon 2020 Programme for Research & Innovation under grant agreement n°727312.*



## Genomics assisted breeding in alfalfa

**INRAE**

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[www.eucleg.eu](http://www.eucleg.eu)

# Alfalfa - Lucerne

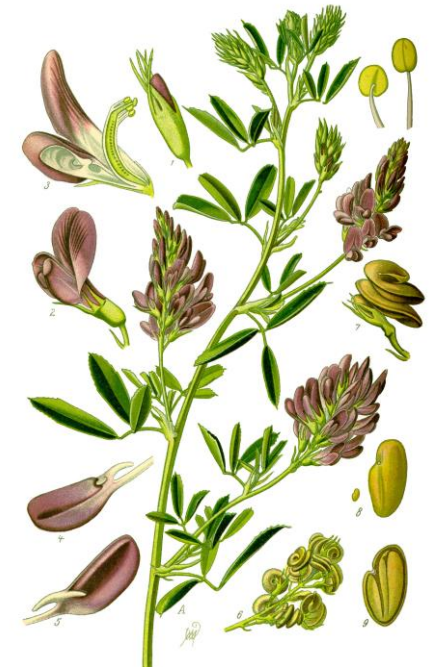
## A major legume species

- Highest protein production/ha in temperature climates
- Drought tolerant
- Protein/energy
- Ruminant health
- Positive effects in the rotation

Allogamous reproduction, synthetic varieties

$2n = 4x = 32$

Julier et al. 2017, CABI Publishing



# Traditional breeding methodology

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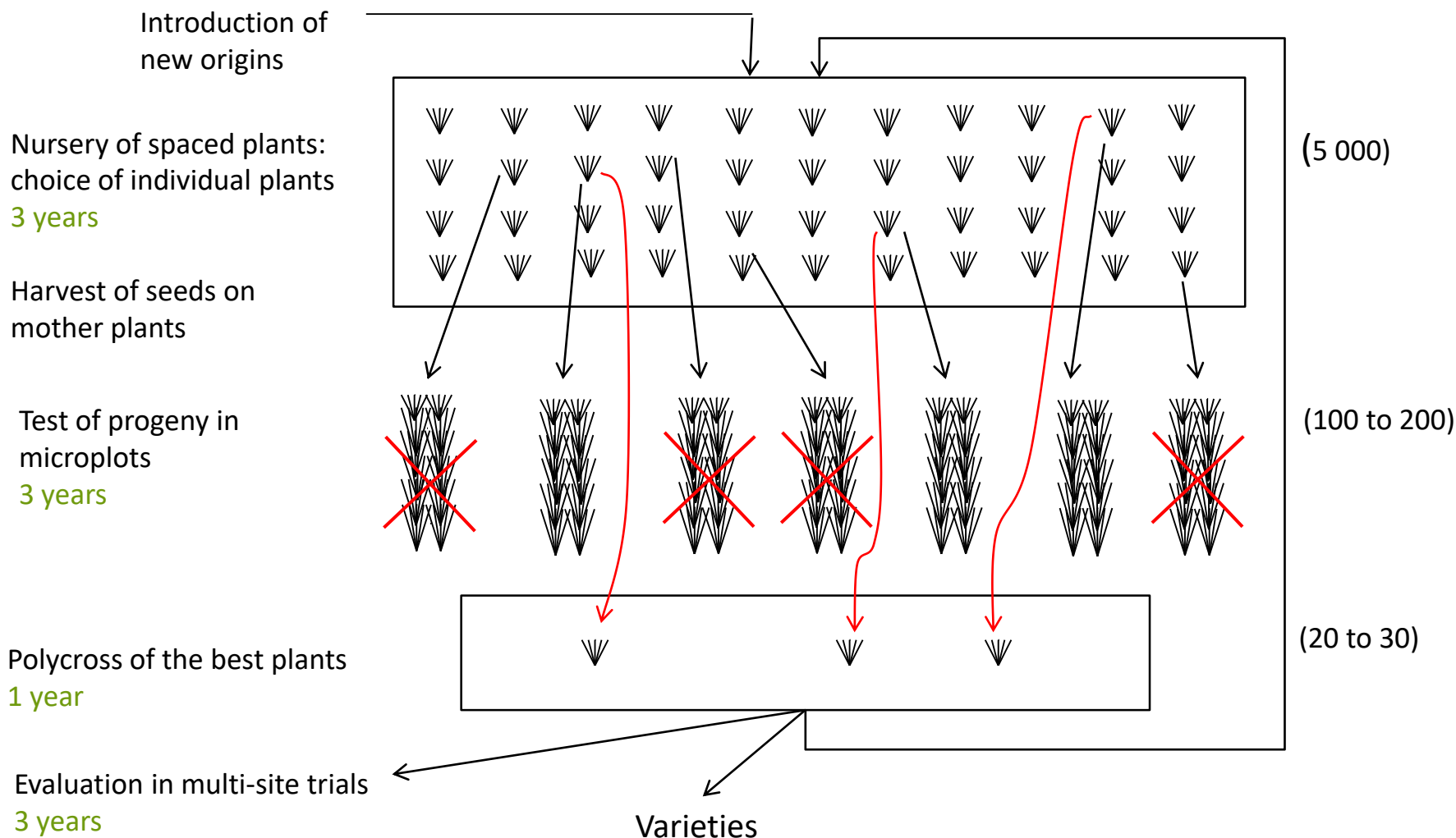


- Based on phenotypic traits
- First step in nursery of spaced plants
- Second step in progeny testing



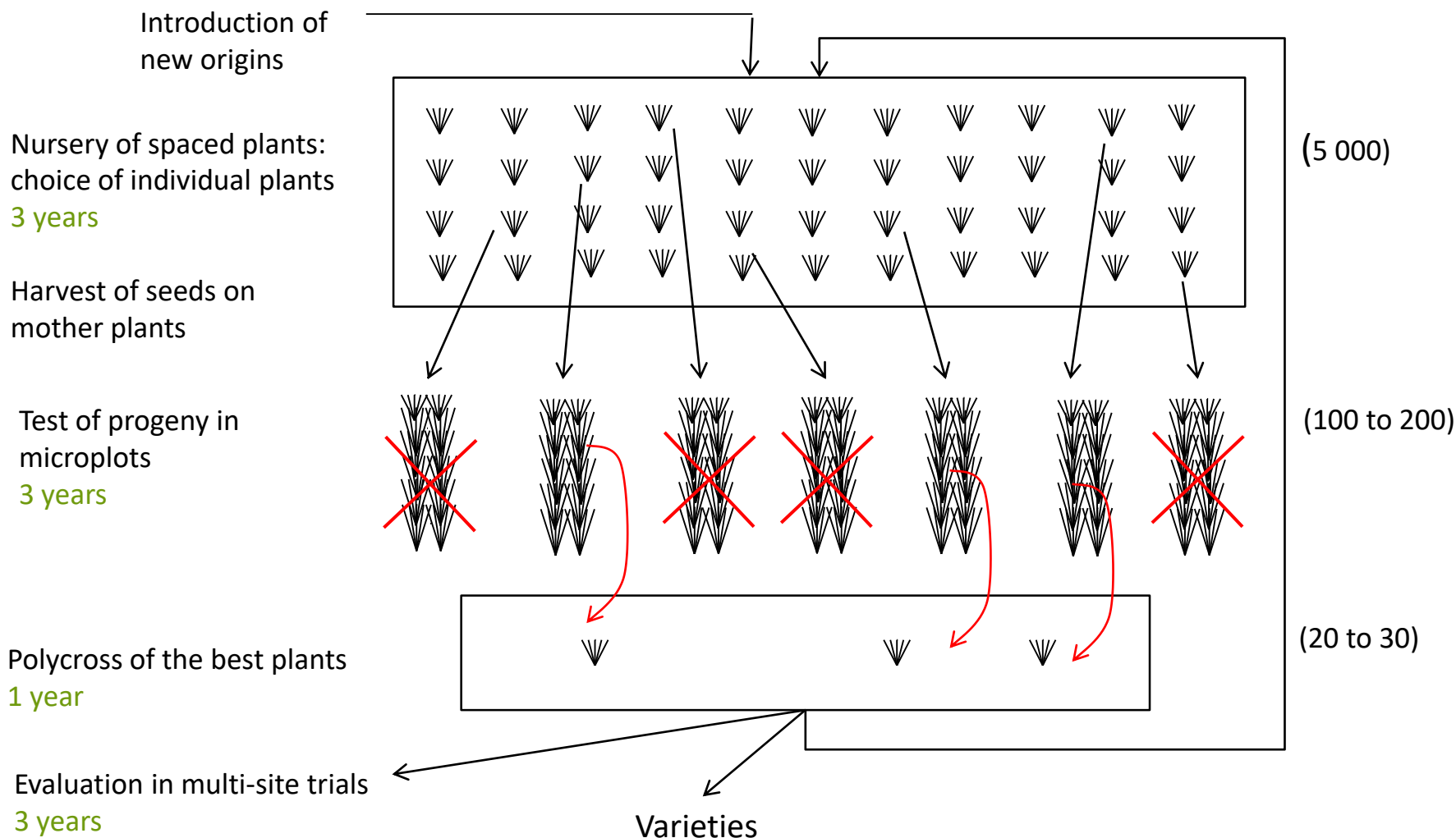
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# Traditional breeding methodology



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# Traditional breeding methodology



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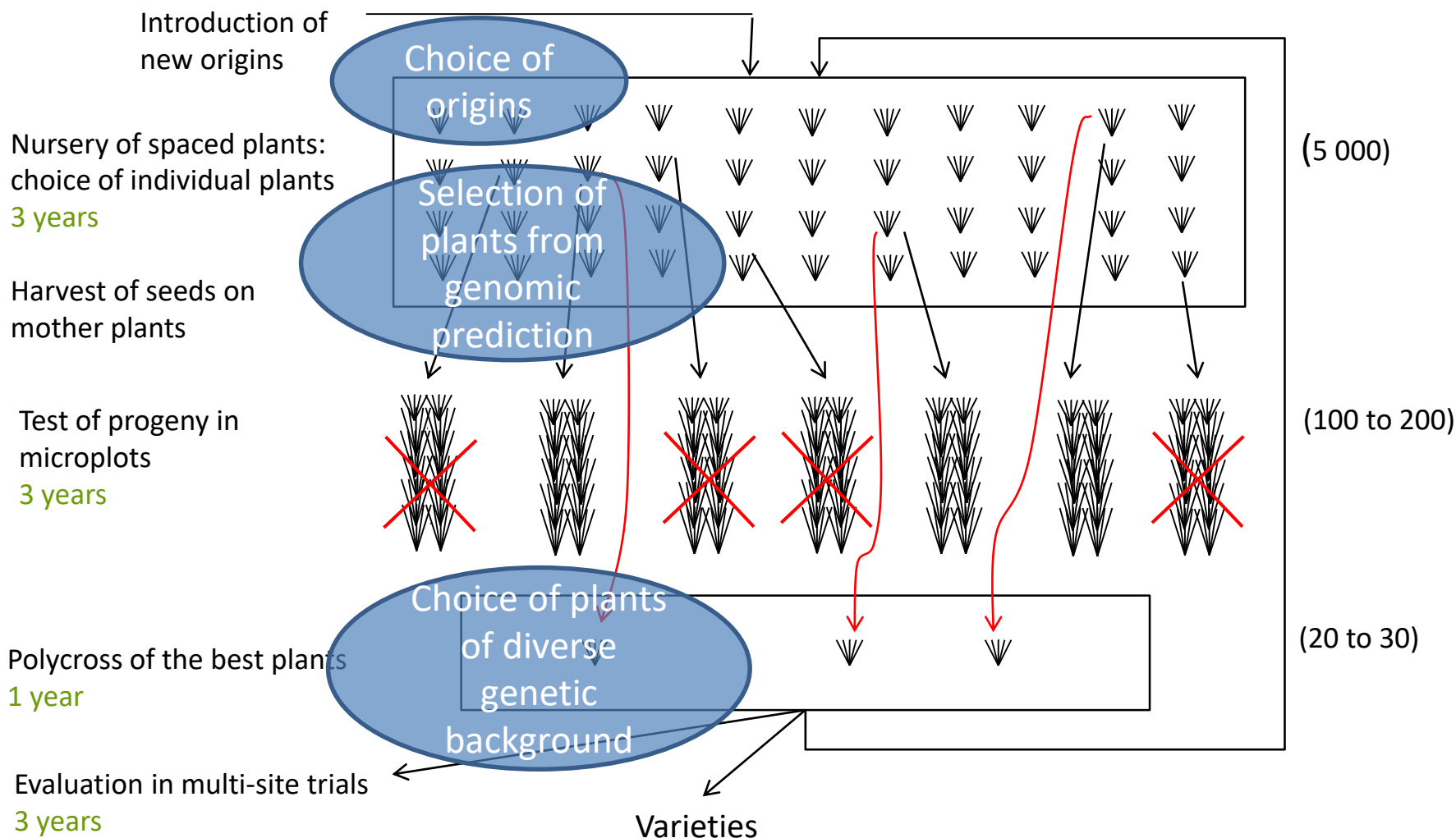
## Strength

- Scoring of many traits
- Early selection for heritable traits
- Skilled staffs

## Weakness

- Some traits are scored in case of stress occurrence only
- Number of years
- Cost
- Fixation of positive alleles is slow

# Genomics assisted breeding





# Genomics assisted breeding

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- Marker development
- Management of genetic diversity
- Genome wide association study
- Genomic selection



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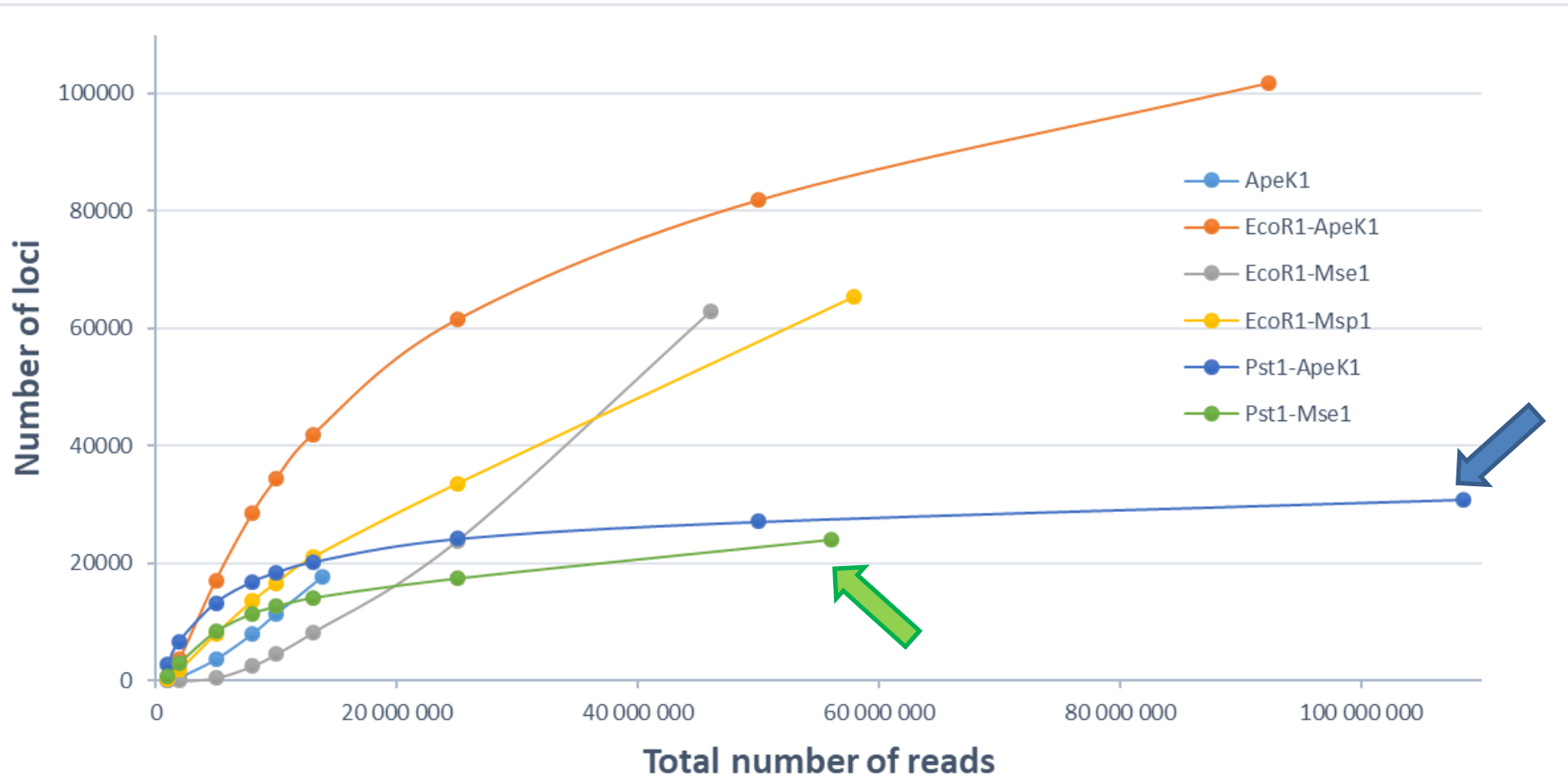
## Before EUCLEG:

- Low throughput markers: SSR, AFLP...
- 10k SNP array: too expensive
- GBS: < 40K markers, risk of missing data

## EUCLEG: an improved GBS protocol

- Choice of restriction enzymes to reduce missing data

# Marker development



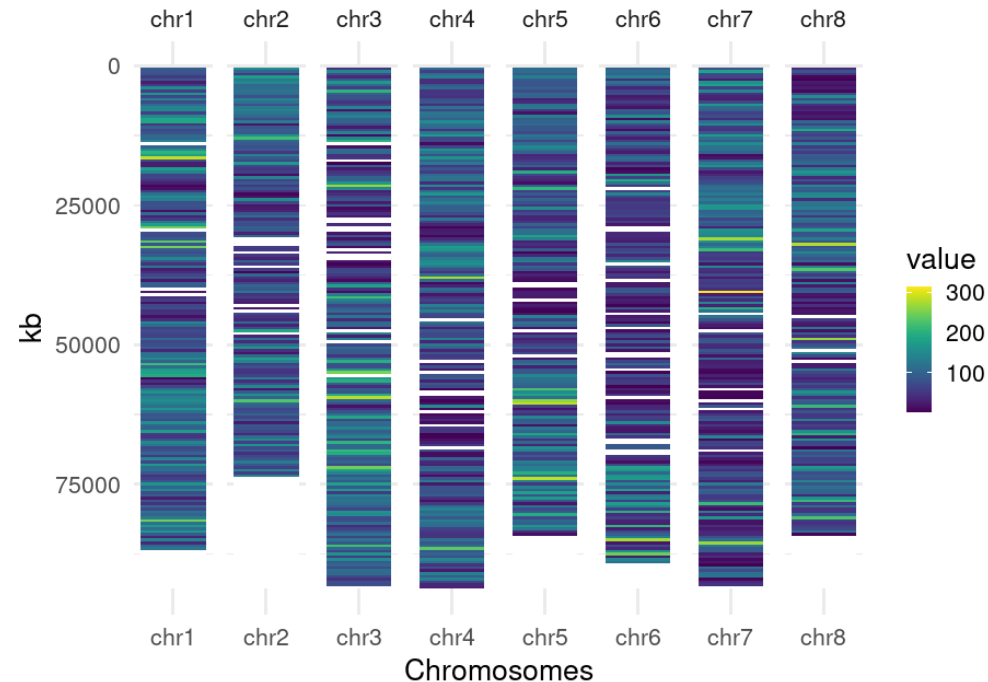
## EUCLEG: an improved GBS protocol

- Choice of restriction enzymes to reduce missing data
- Use of a reference genome sequence: Chen et al. 2020
- Allele frequency of each accession

# Marker development

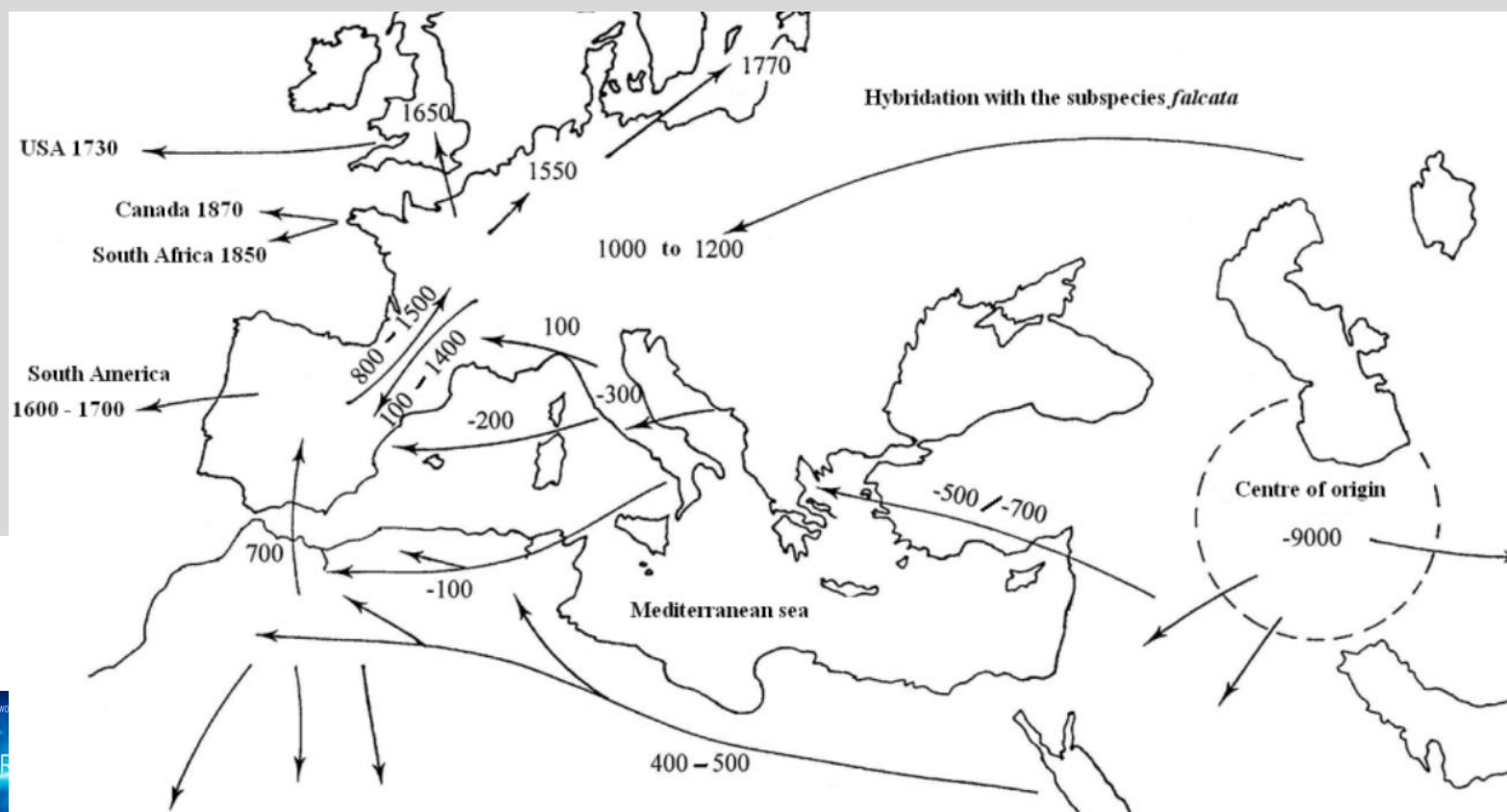
On 1 061 accessions:

- 31 743 loci
- 228 568 SNP with less than 5% missing data per SNP
- 118 421 SNP without missing data



## Before EUCLEG:

- Overview of world diversity



## Before EUCLEG:

- Overview of world diversity
- Large among-accession diversity
- Huge within-accession diversity

	<u>10 populations, 40 indiv/pop</u>		<u>11 populations, 7-20 indiv/pop</u>
	<u>5 SSR</u>	<u>Plant height</u>	<u>Yield</u>
Variance among-varieties	0.02	0.10	1.7
Variance within-varieties	7.56	0.30	27.7
No structure			

Herrmann et al., 2010

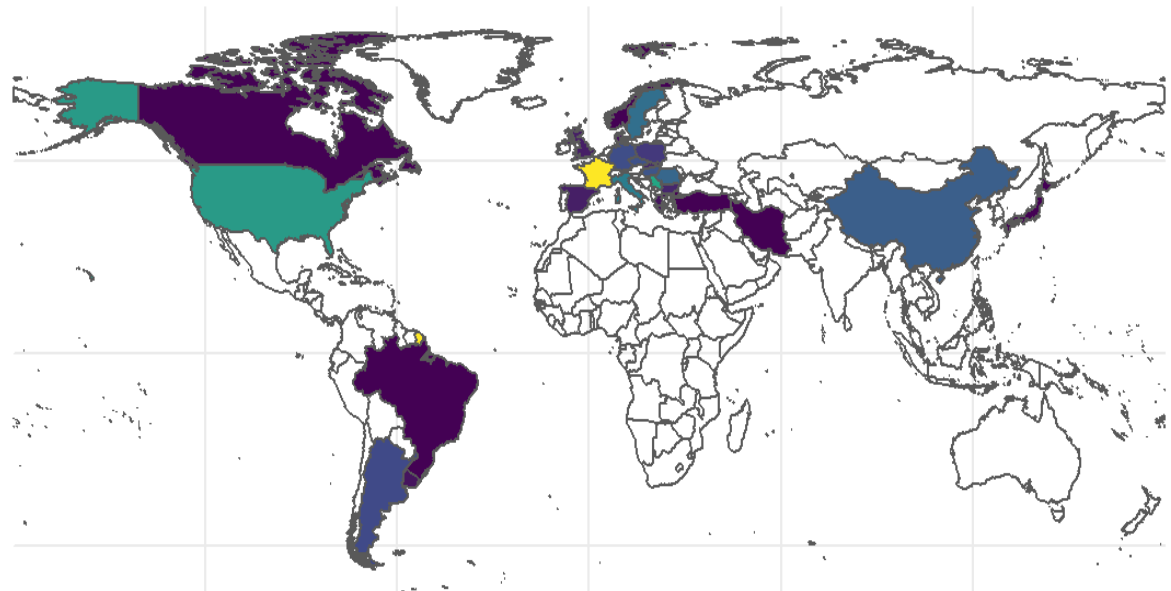
Julier et al. 2000



## EUCLEG: a revision of diversity overview

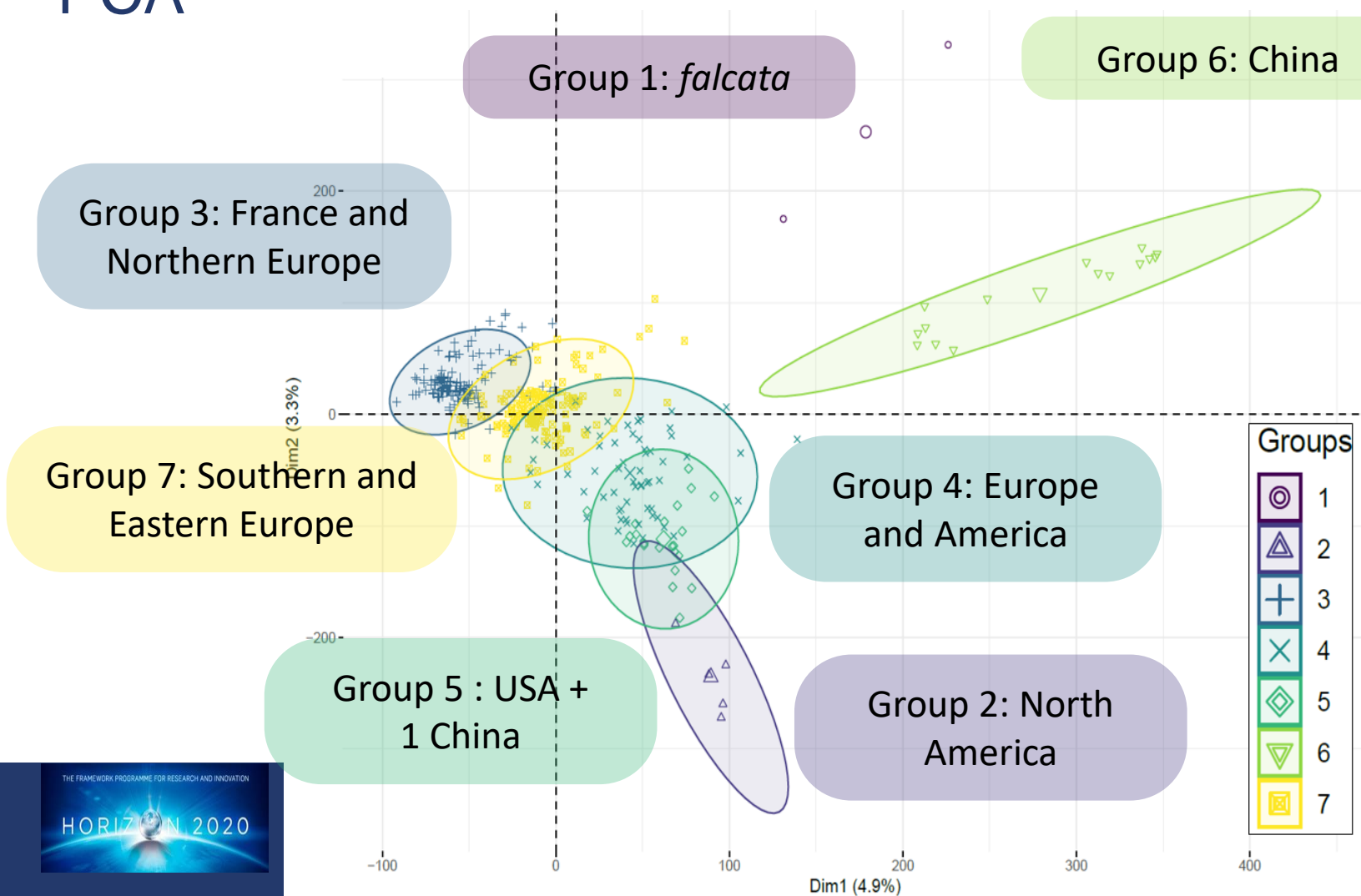
400 accessions: landraces and cultivars, dormancy 3 – 7:

- Europe : 313
- North America : 45
- South America : 16
- China : 17
- Middle East : 3
- Japan : 1



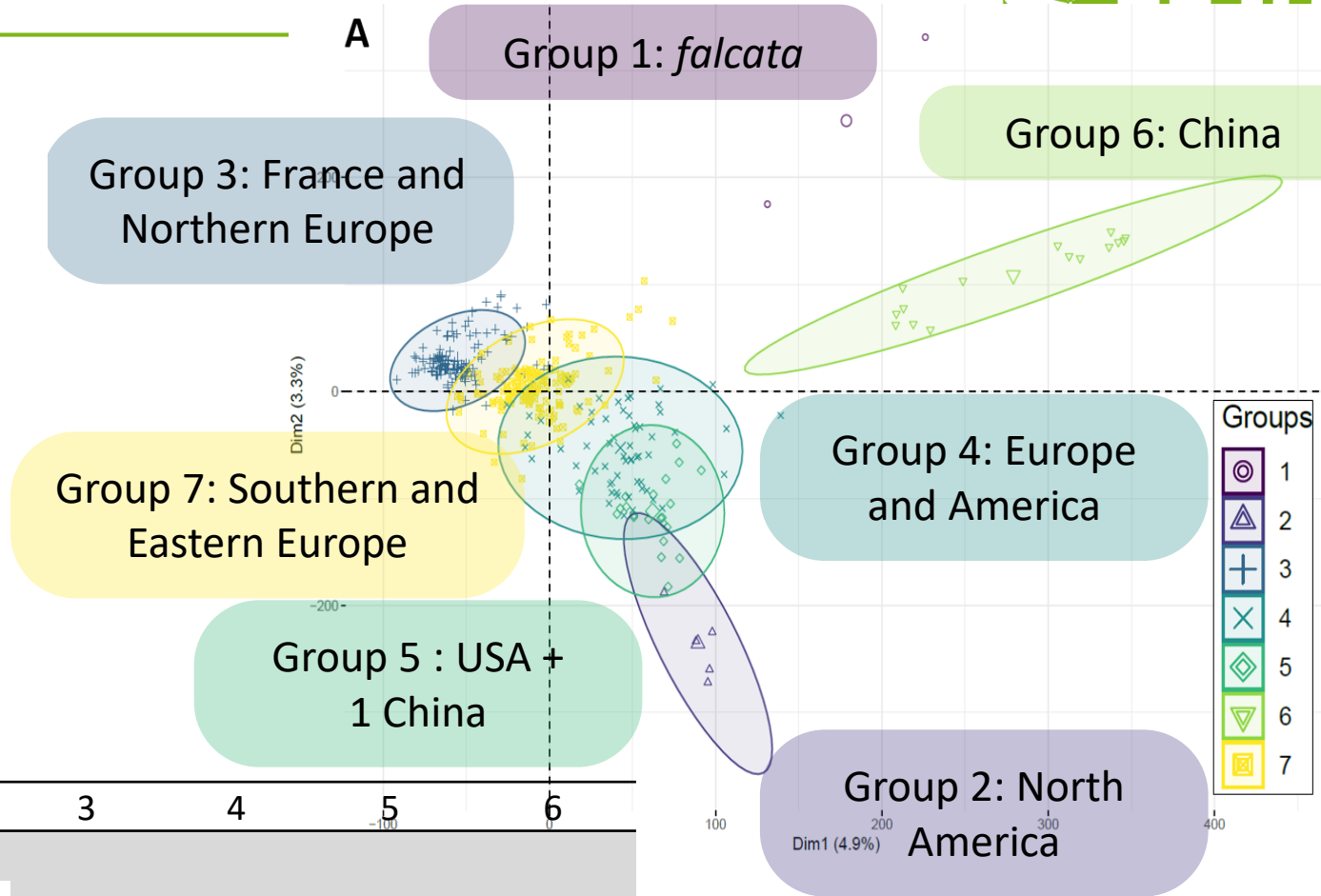
# Management of genetic diversity

## PCA



# Management of genetic diversity

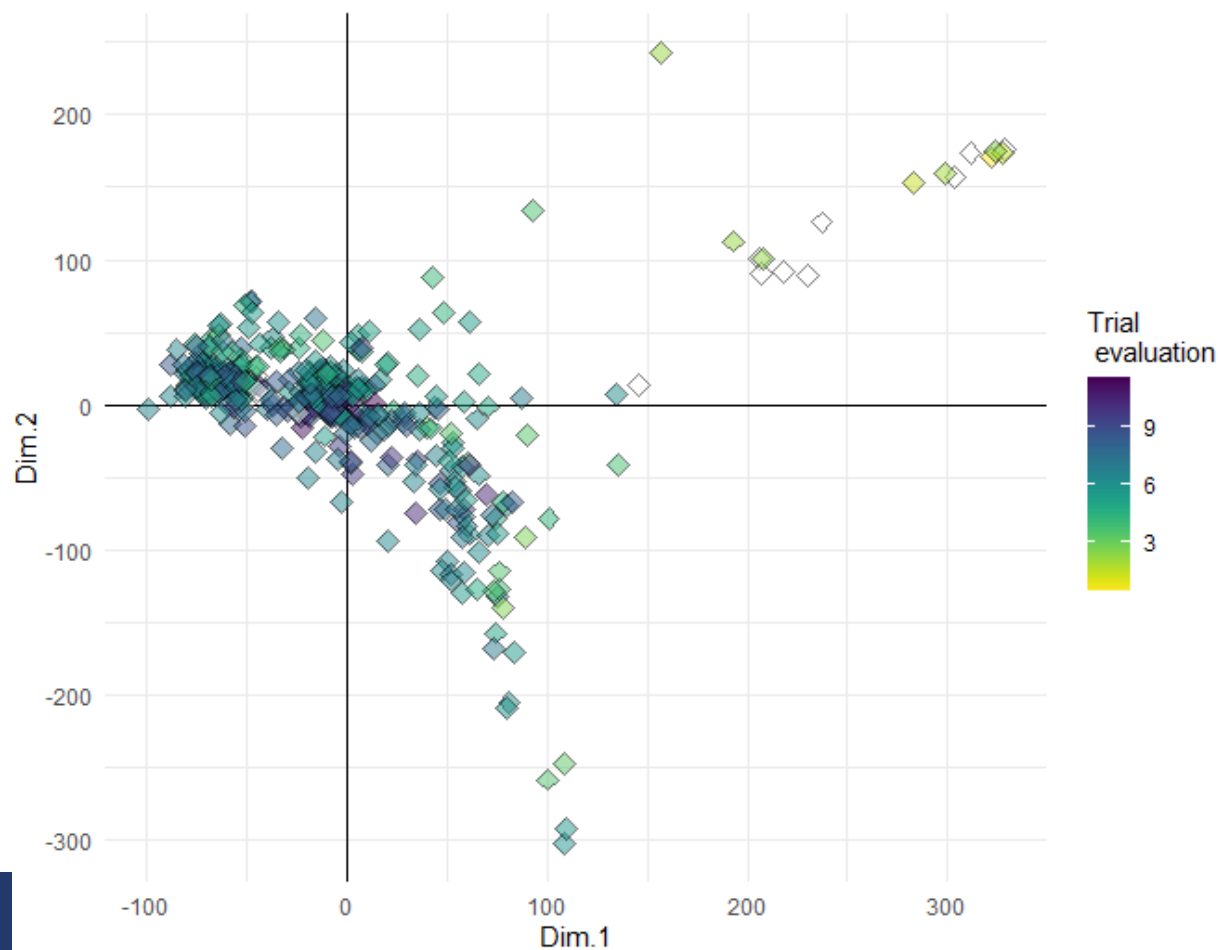
## PCA



Clusters	1	2	3	4	5	6
1						
2						
3		0.017				
4		0.013	0.003			
5		0.004	0.006	0.002		
6		0.026	0.019	0.012	0.015	
7		0.016	0.001	0.001	0.005	0.015

# Management of genetic diversity

PCA : accessions colored with autumn dormancy score

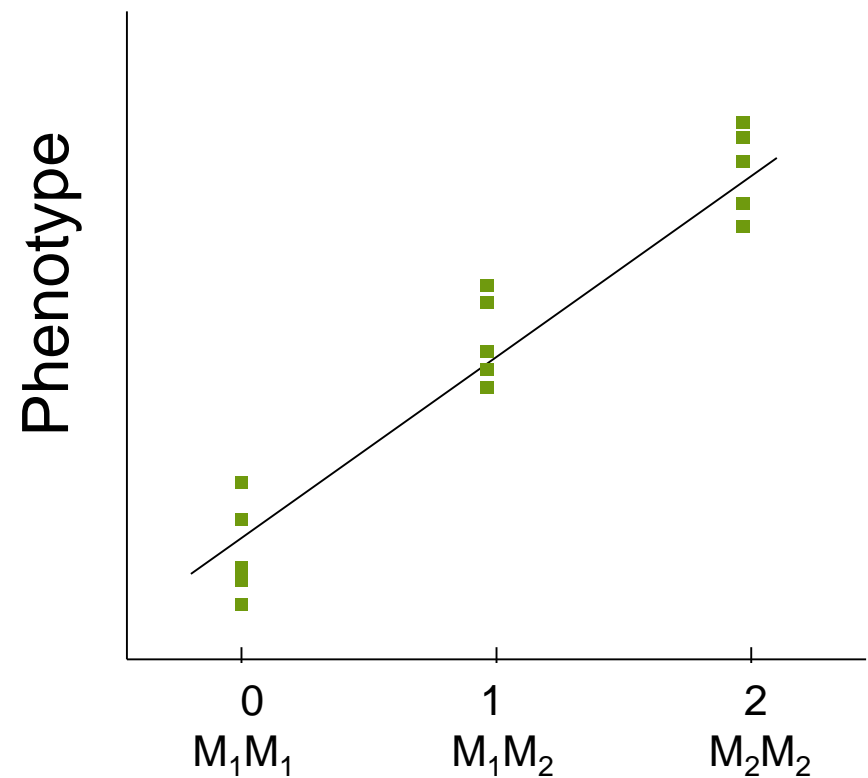
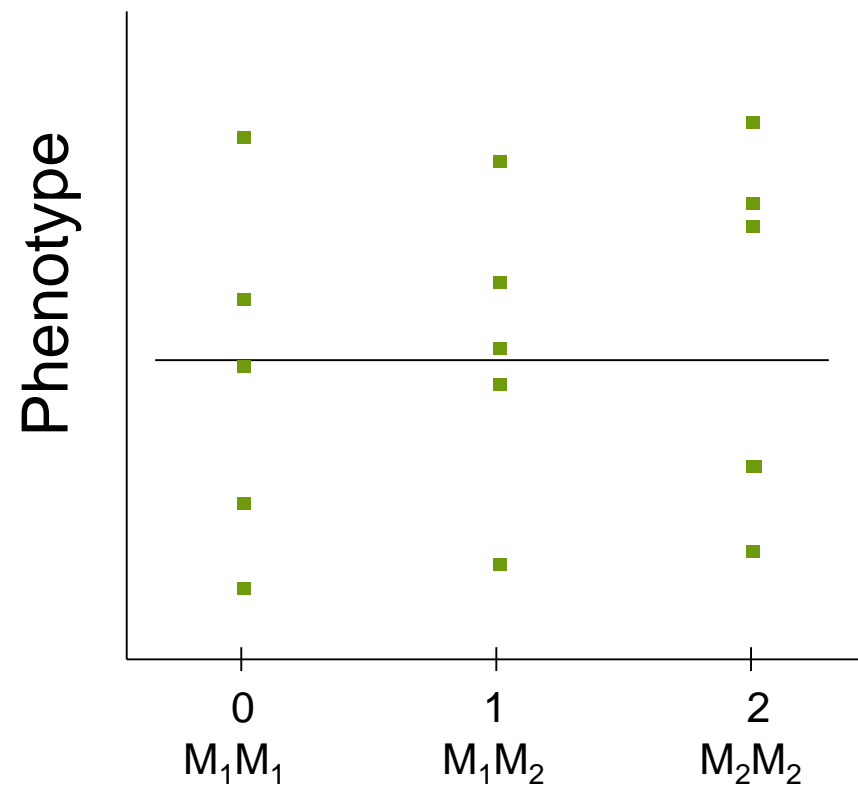


## EUCLEG: a revision of diversity overview

- Diversity: China  $\leftrightarrow$  Europe + America
- Diversity: Europe  $\leftrightarrow$  America
- Structure is not associated to autumn dormancy

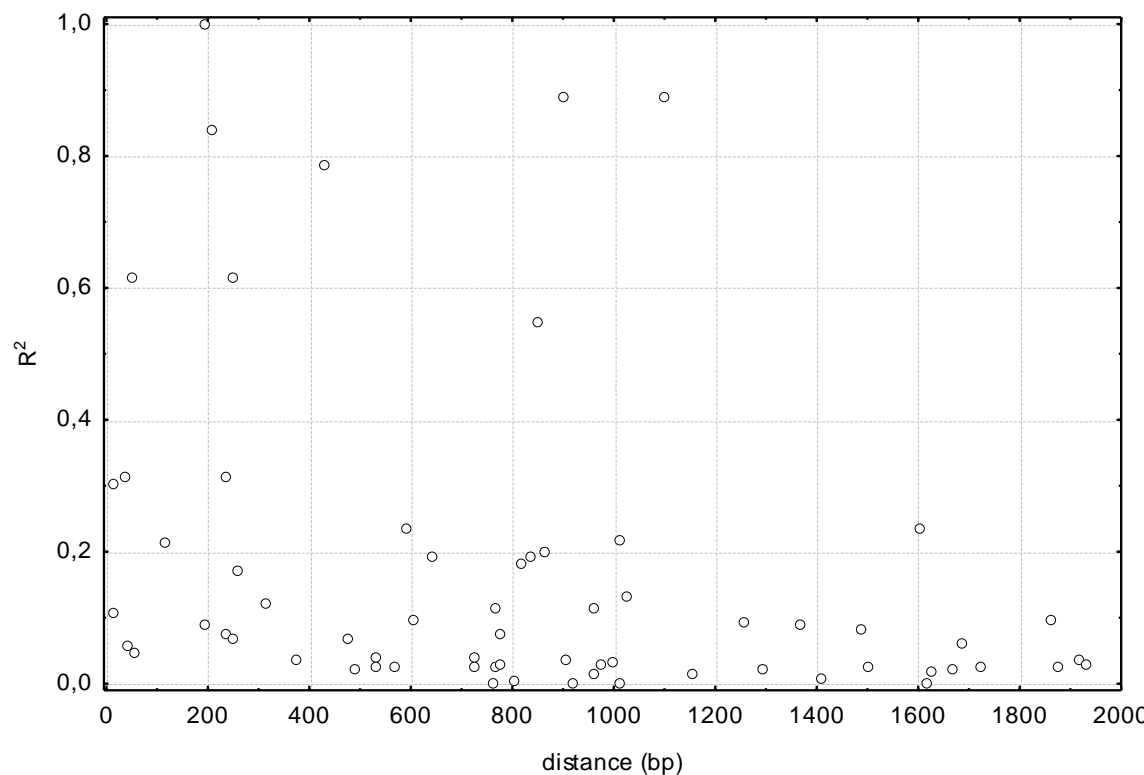
# Genome wide association study

For each marker: is it associated to trait variation?



## Before EUCLEG:

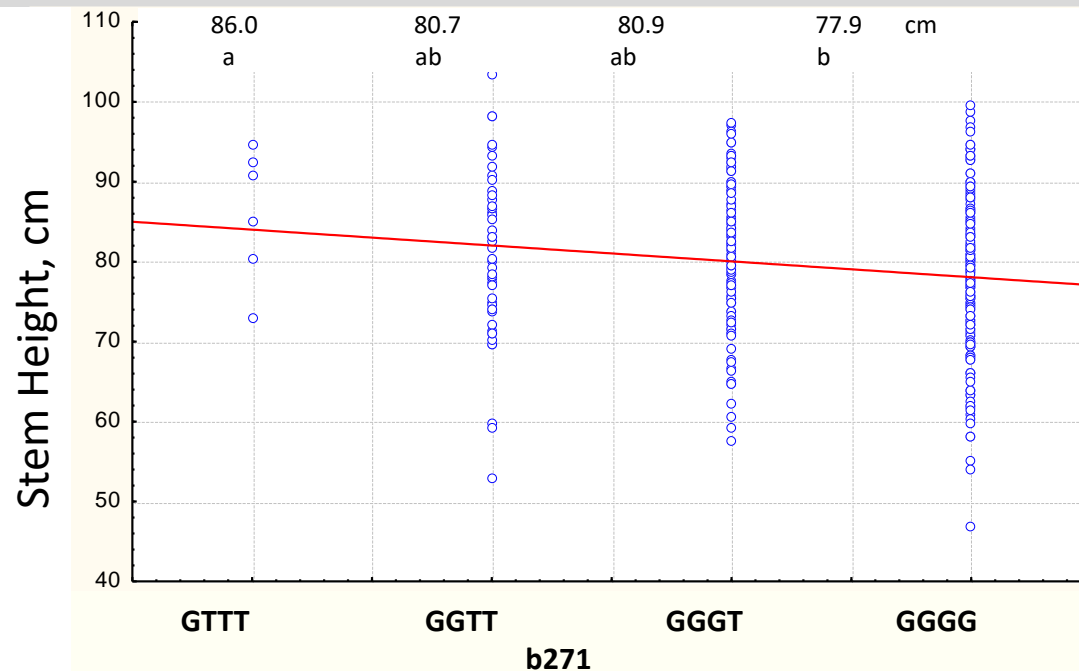
- Low marker density
- Short linkage disequilibrium



12 SNP (66 pairs) in  
Constans-like gene  
(Herrmann et al.,  
2010)

## Before EUCLEG:

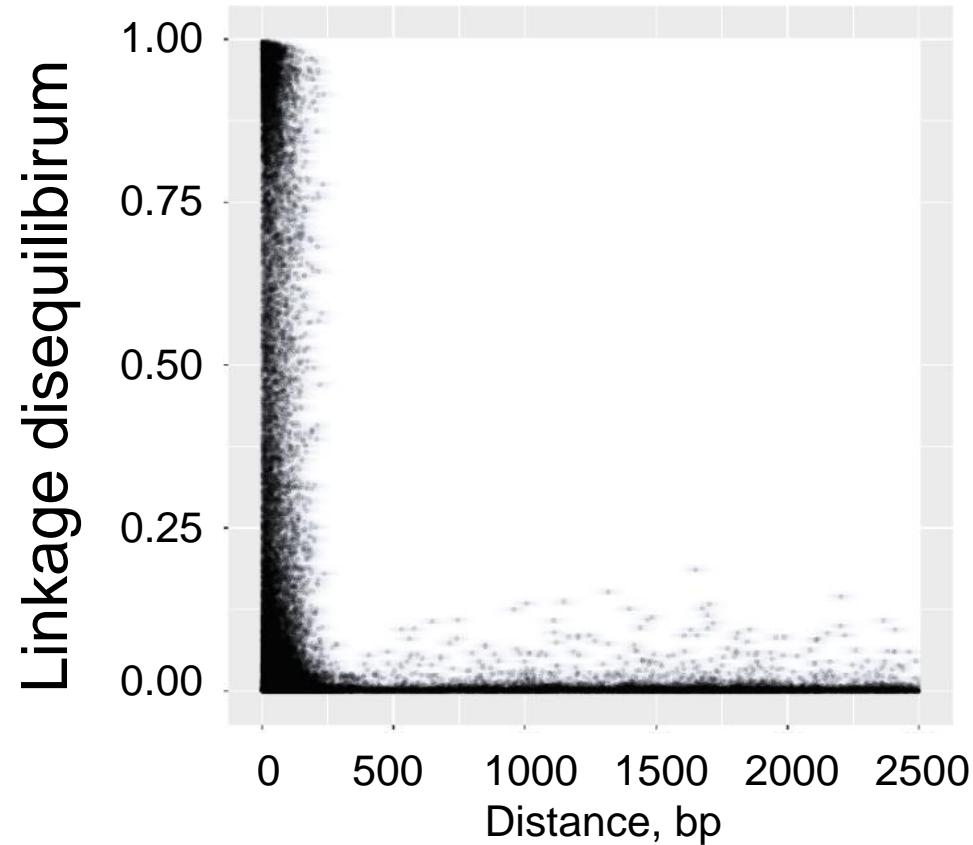
- Low marker density
  - Short linkage disequilibrium
- Candidate gene approach only



Constans-like gene  
(Herrmann et al.,  
2010)



## EUCLEG: Short linkage disequilibrium over the genome



Yield and quality (proteins, fibres, saponins)

400 accessions x 2 locations x 2 years

+ 100 accessions x 3 locations x 2 years

Germination

Disease resistance: fusarium, anthracnose

Drought and P tolerance

Drought x fusarium

# Genome wide association study

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EUCLEG: Detection of major QTL

400 accessions x 2 locations x 2 years

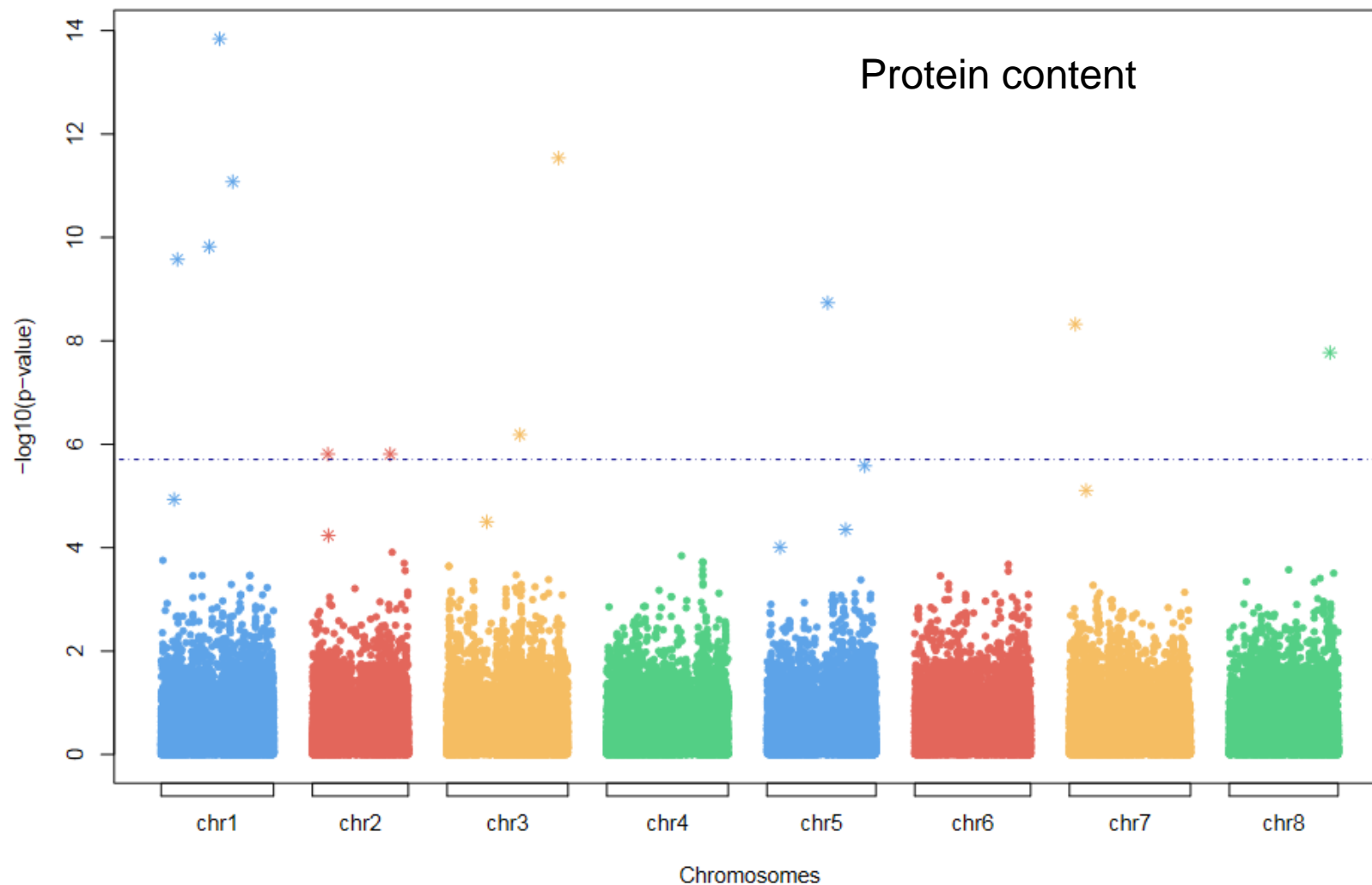
Method: Multi Locus Mixed Model (MLMM)



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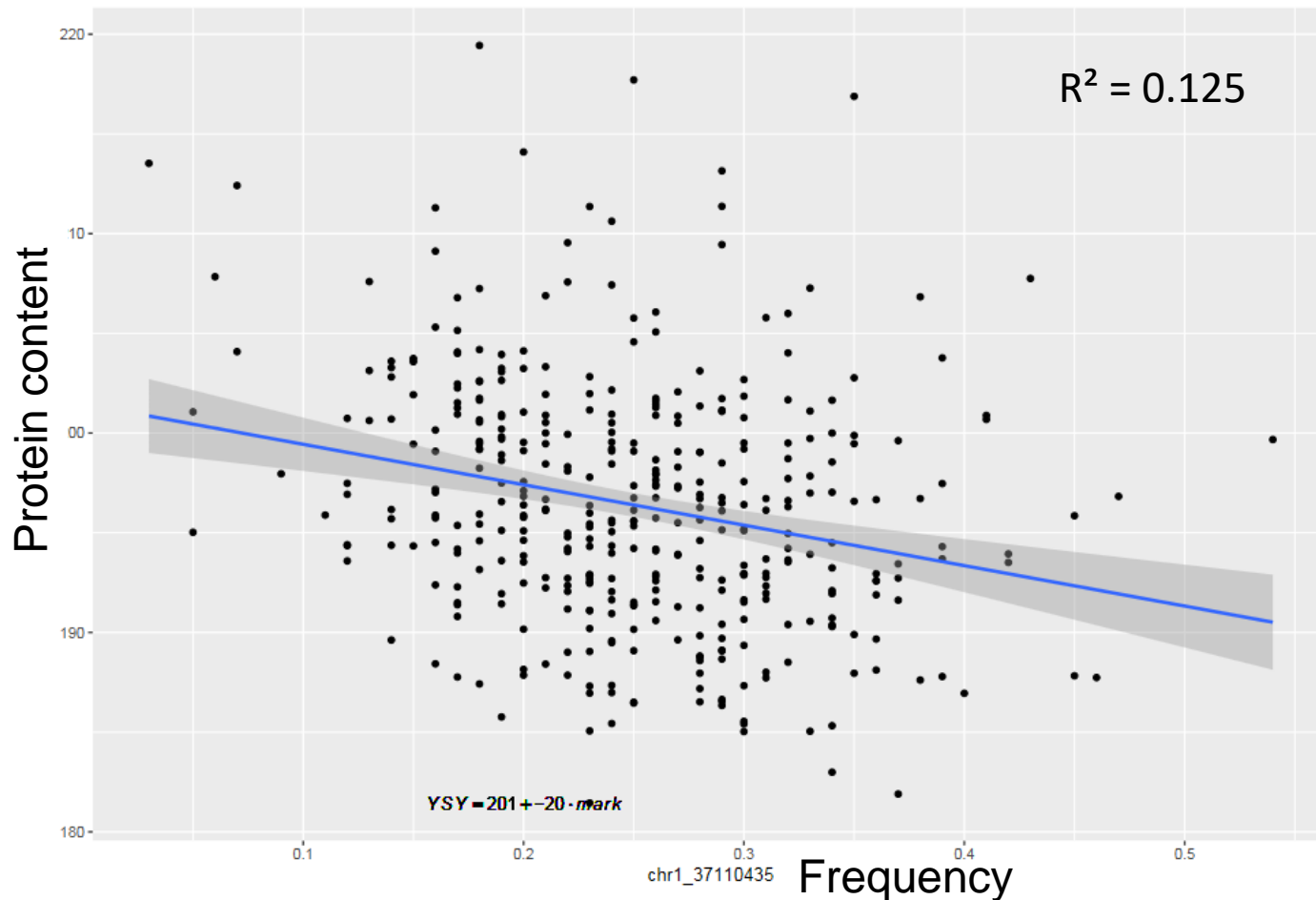
# Genome wide association study

## EUCLEG: Detection of major QTL

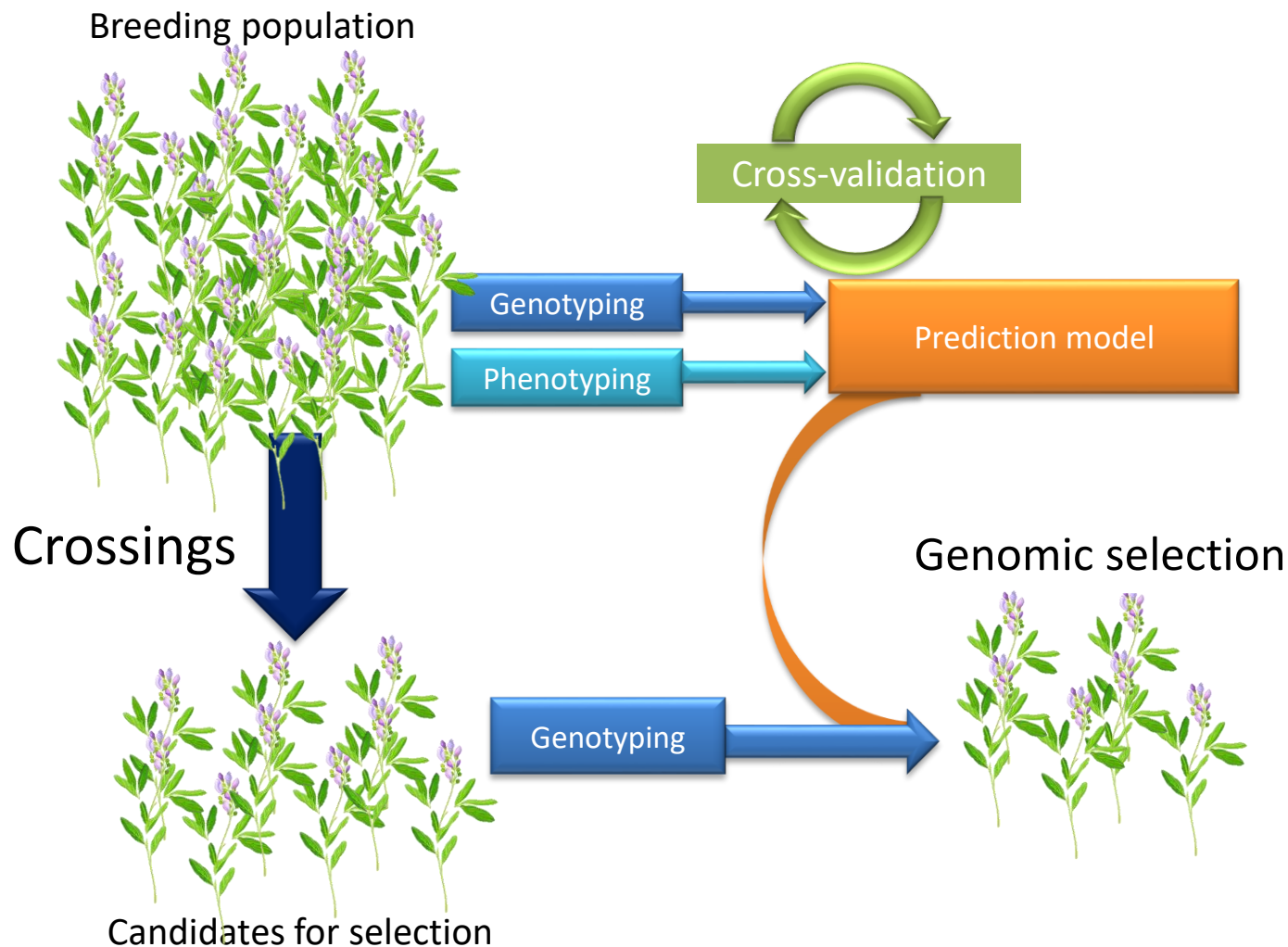


## EUCLEG: Detection of major QTL

- Up to 10 – 20% of variation



# Genomic selection



## Before EUCLEG

- 8 – 44 K SNP, 75 – 244 individuals
- Promising results, predictive ability ~ 30%

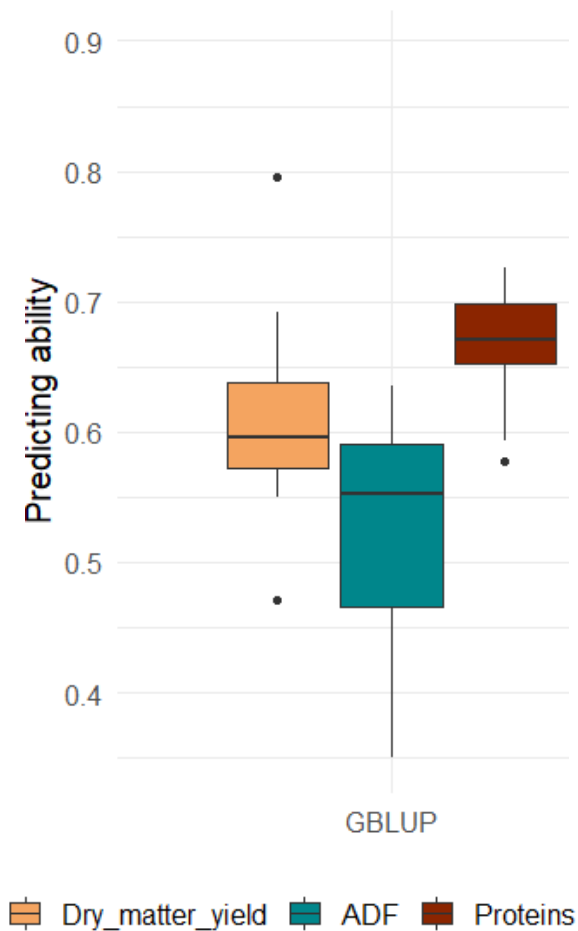
# Genomic selection

EUCLEG

- GBLUP

- A good predicting ability:

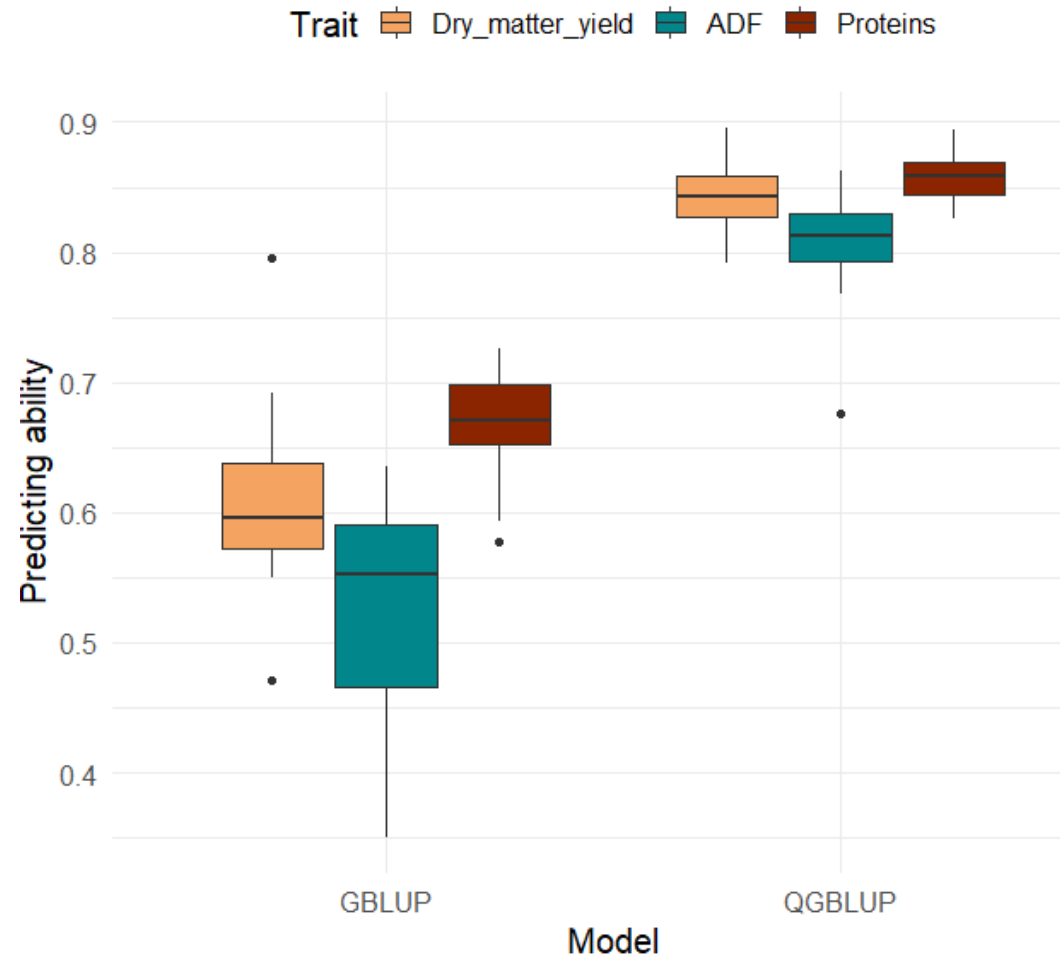
$0.52 < P < 0.66$





Integration of the QTL information in the prediction model (QGBLUP)

→  $P > 0.80$



## GBS are efficient markers

- Allele dosage in individuals
- Allele frequency in populations
- Genome coverage
- Low missing data

→ useful to analyse genetic diversity and genetic determinism of breeding traits

## Management of genetic diversity

- Some specialisation of the breeding pools in EU, America, China
- GBS markers to decide on the introduction of new genetic diversity in a breeding pool

GS models provide high predictive ability

- Even higher with the inclusion of QTL effect

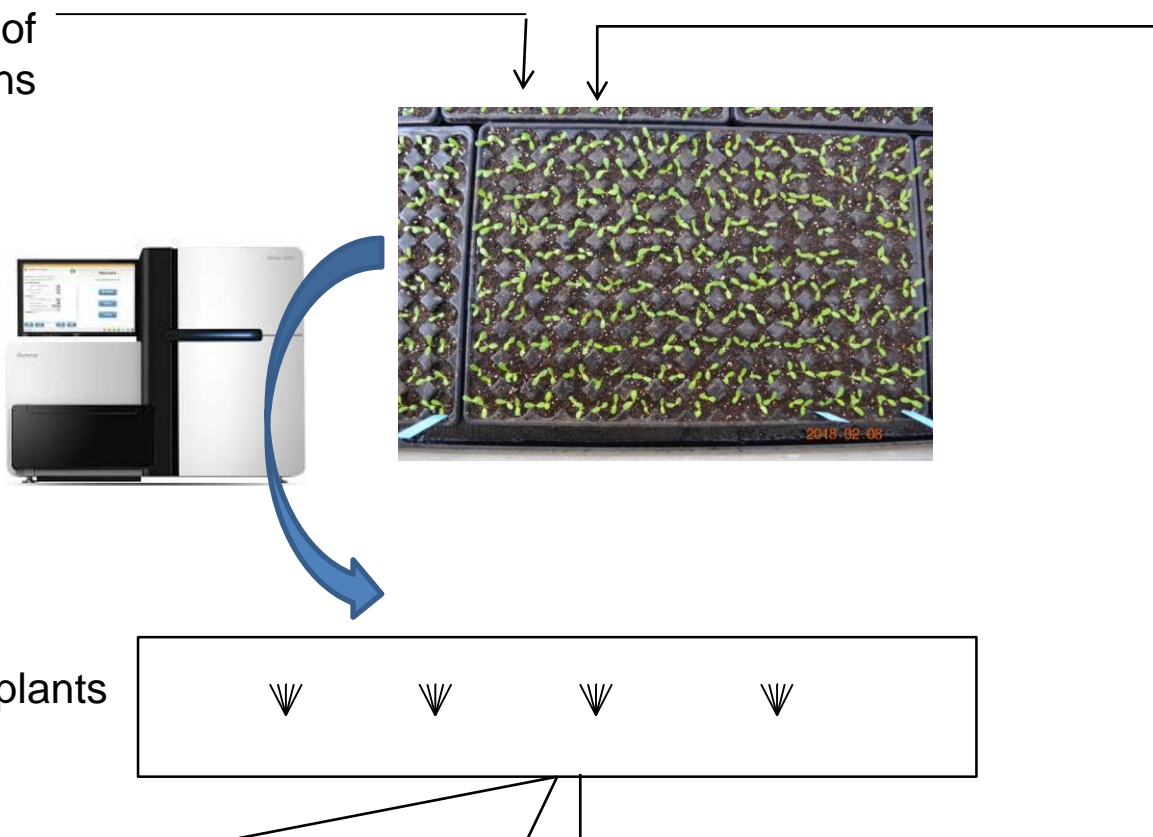
→ To be used to select promising individuals in breeding pools

- Extend the analysis of alfalfa diversity from dormancy 3-7 to the whole species complex
- Improve cost-efficiency of genotyping
- Calculate genetic gain with GS
- Estimate cost-efficiency of GS
- Implement genomic selection in breeding programmes

# GS in breeding programmes

Introduction of  
new origins

Genotyping  
Analysis of diversity  
Genomic prediction  
→ Choice of plants  
0.5 year



(5 000 to  
15 000)

(20 to 30)

Polycross of the best plants  
1 year

Evaluation in multi-site trials  
3 years

Varieties

## Strength

- Reduced field work
- Early selection for all predicted traits
- Reduced number of years
- Fixation of positive alleles is quick

Genetic  
gain?

## Weakness

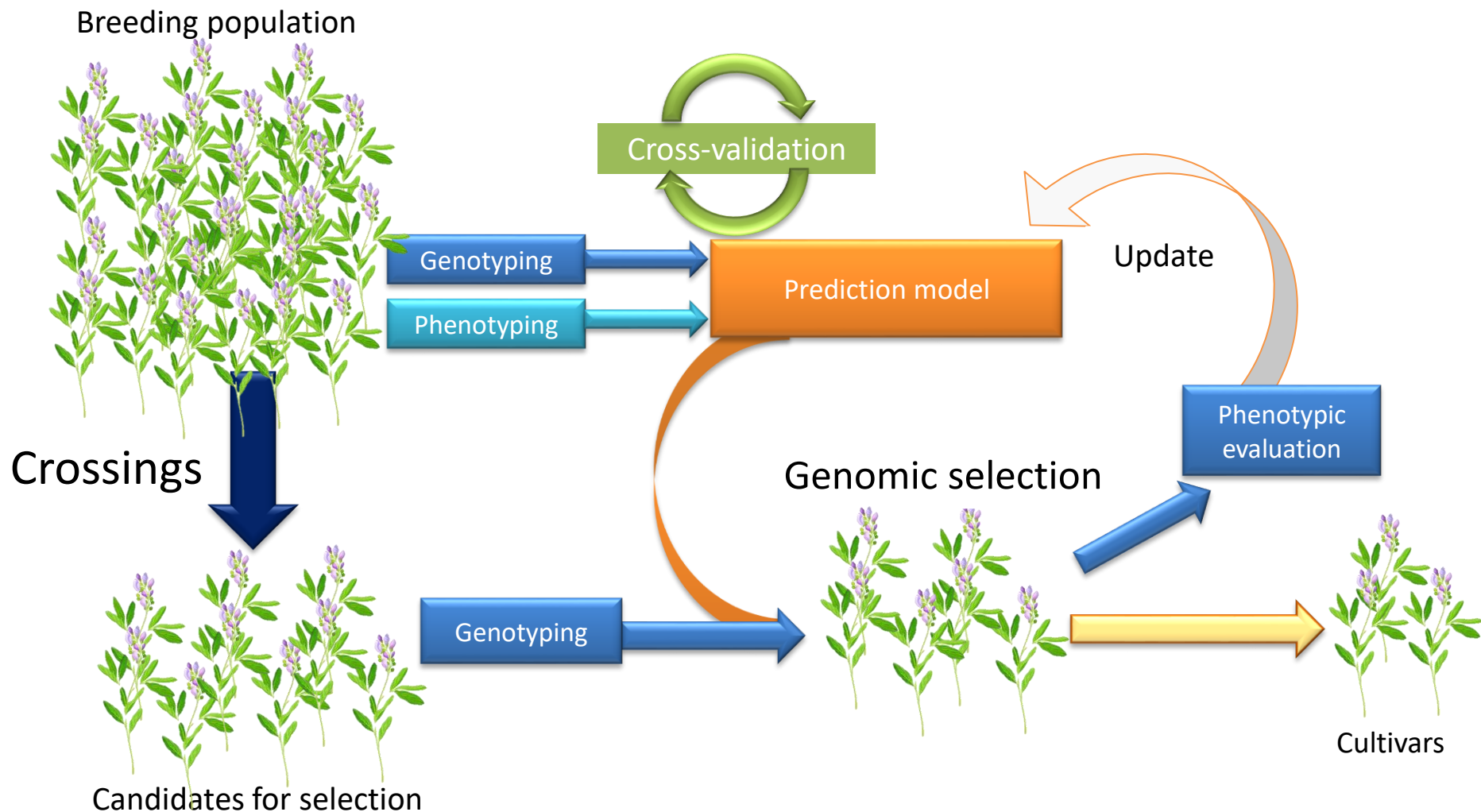
- No prediction for some traits
- Staffs have to get new skills

Cost  
efficiency ?

- Extend the analysis of alfalfa diversity from dormancy 3-7 to the whole species complex
- Improve cost-efficiency of genotyping
- Calculate genetic gain with GS
- Estimate cost-efficiency of GS
- Implement genomic selection in breeding programmes
- Imagine the updating of GS equations



# Genomic selection





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**EUCLEG.eu**