



Fundamentals of Genomic Prediction and Data-Driven Crop Breeding (August 4-8, 2025)

How to Leverage Genomic Selection in Plant Breeding

Module 4
November 27, 2025

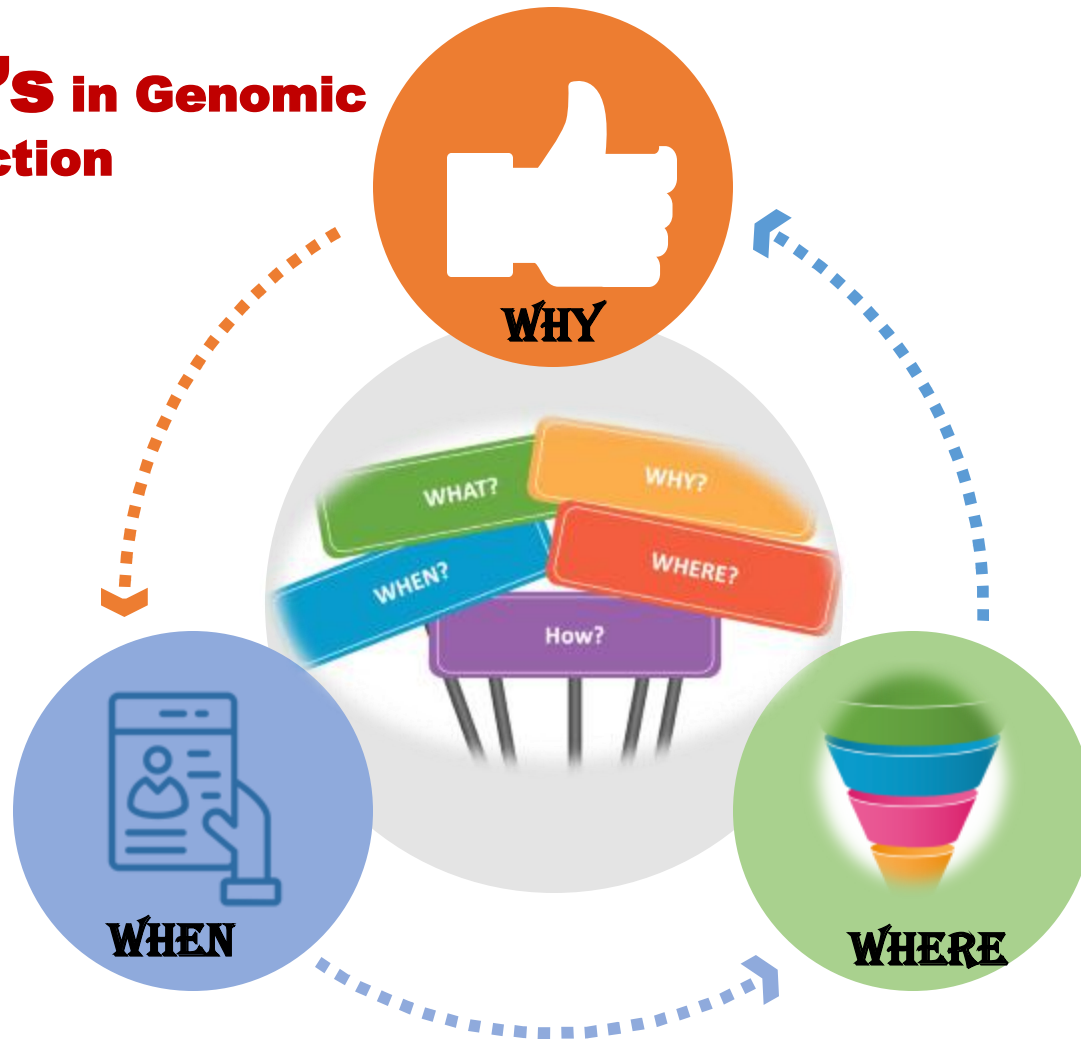
**Waseem Hussain, Mahender Anumalla and
Margaret Catolos**
Rice Breeding Innovations Platform
IRRI

Genomic Selection in Crop Breeding

(What benefits and advantages it have over traditional phenotypic BLUP selection)



3W'S in Genomic Selection



● Why to use GS

- Select from more phenotypes
- Reduce time of breeding cycle
- Increase accuracy of selections
- G x E and complex architecture of traits

● When to use GS

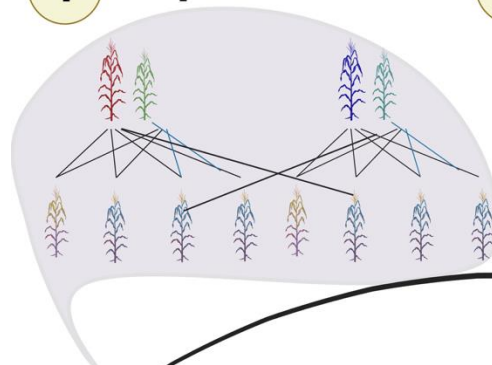
- Requirements (Genotyping, reference populations etc.,
- Resources
- Capacity to use GS

● Where to use GS

- What Stage to Apply in breeding Pipeline
- How to implement it

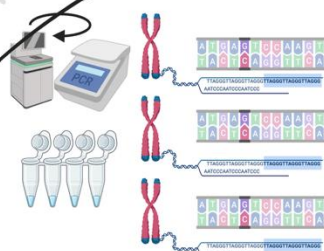
How Genomic Prediction Works

1 Population

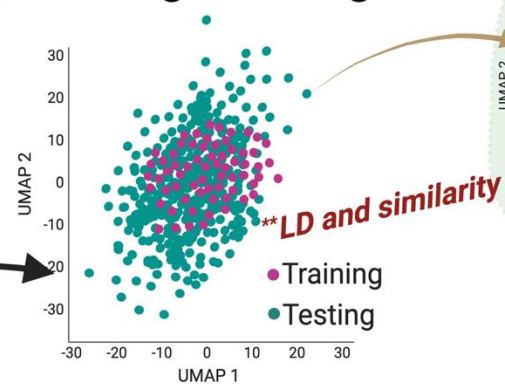


2 Genotype Whole Population

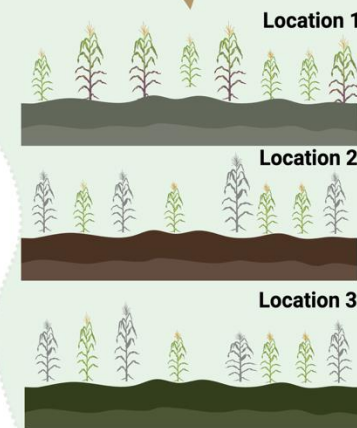
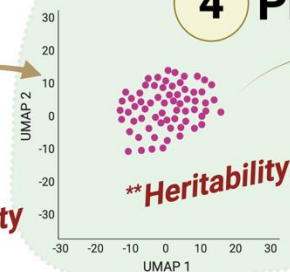
****Cost and density**



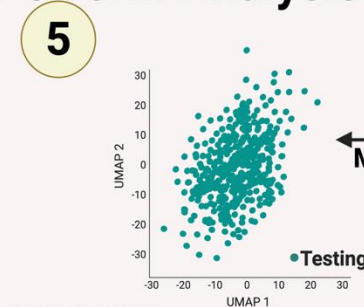
3 Creating Training Set



4 Phenotype Training Set



5 Perform Analysis



Phenotype Data Marker data



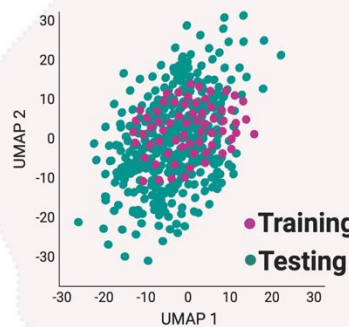
Marker effects

Model Training
 $Y = Xb + Zu + e$

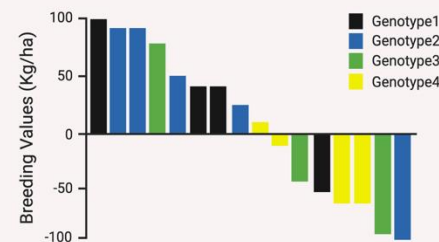
****Model selection and marker variance**

6 Estimate Breeding Values

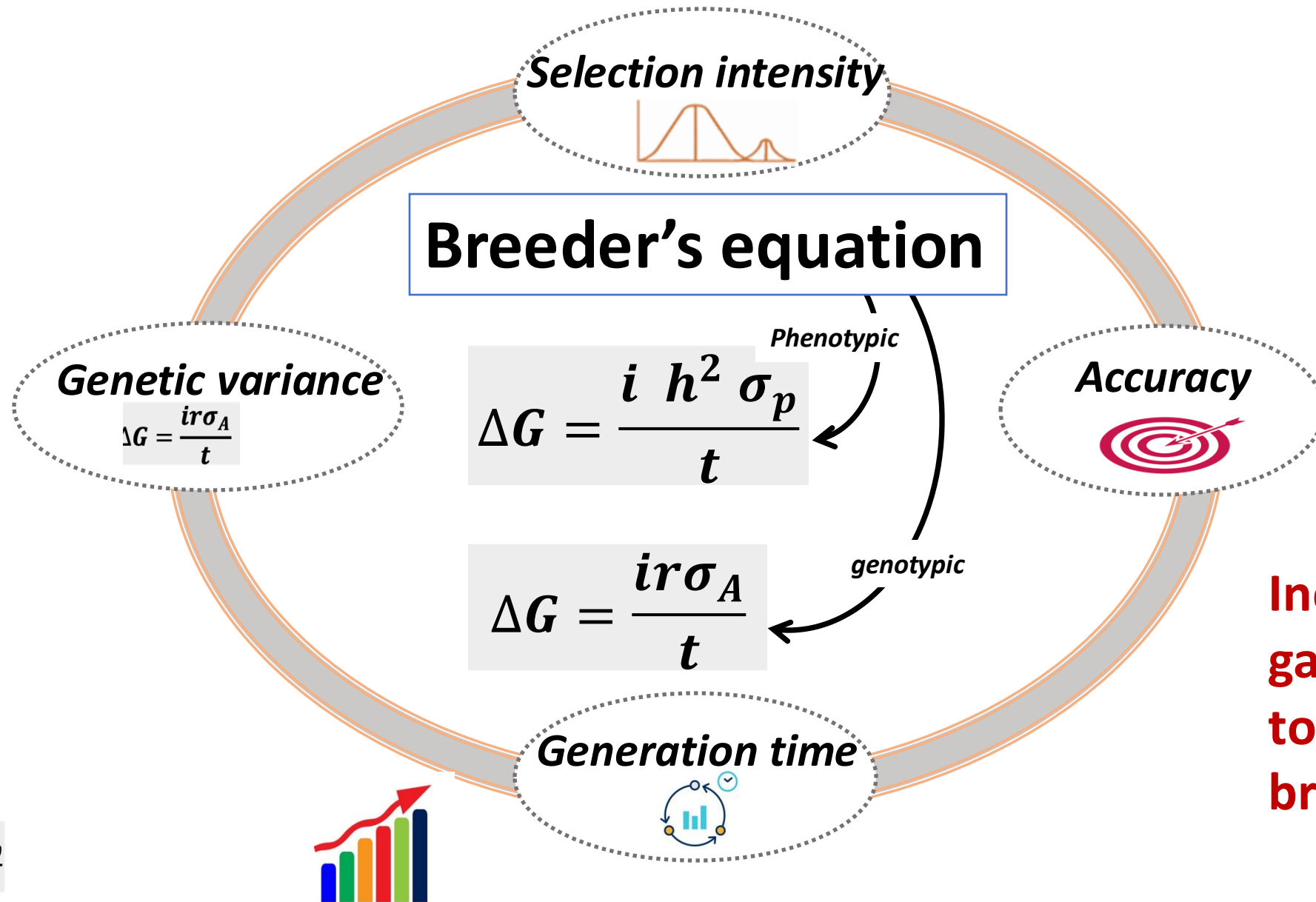
Select Top Ones



Genomic Estimated Breeding Values



The guiding principle is Breeders Equation



$$\Delta G = \frac{i h^2 \sigma_p}{t}$$

Why Genomic Selection

1

Phenotypes and Phenotyping

- Too many phenotypes
- Traits difficult to phenotype

2

Time and Reliable Selections

- Increased selection accuracy
- Reduction in time
- Quick re-cycling and recombination

3

Manage Resources

Effective use of resources to breed and control the selection intensity

4

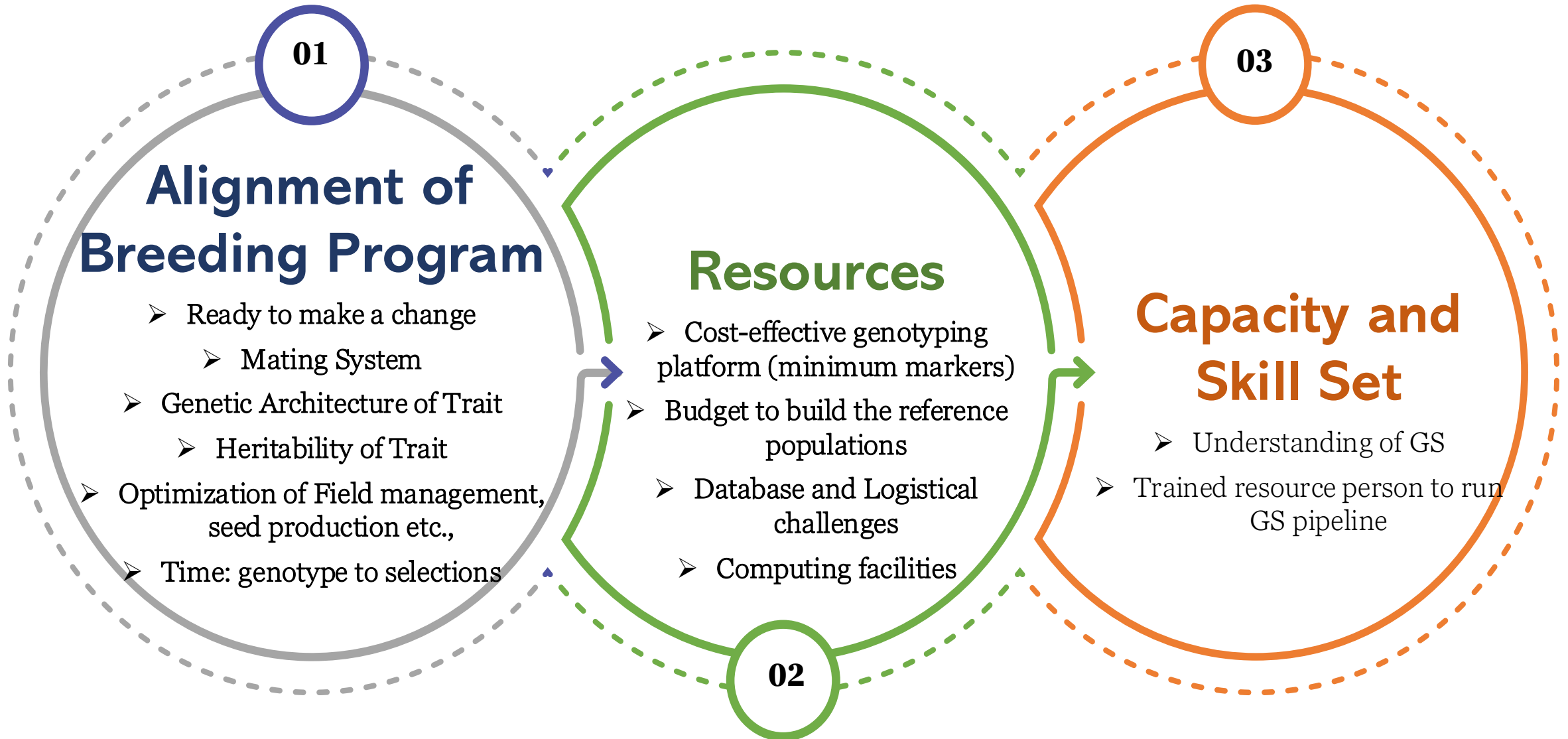
Dissecting G x E

G x E hinders genetic gain

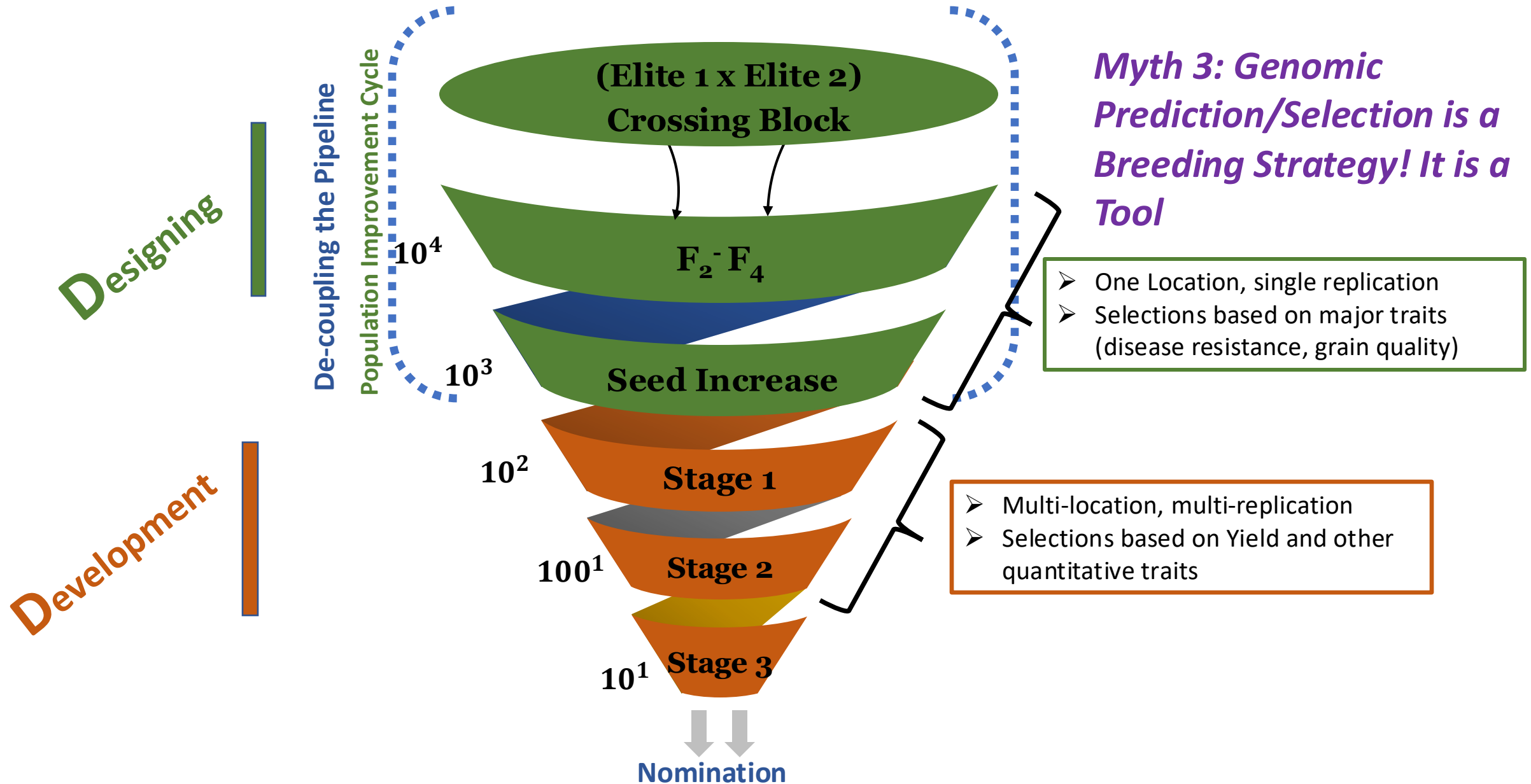
Characterization of Environments (TPE)



When to Use Genomic Selection

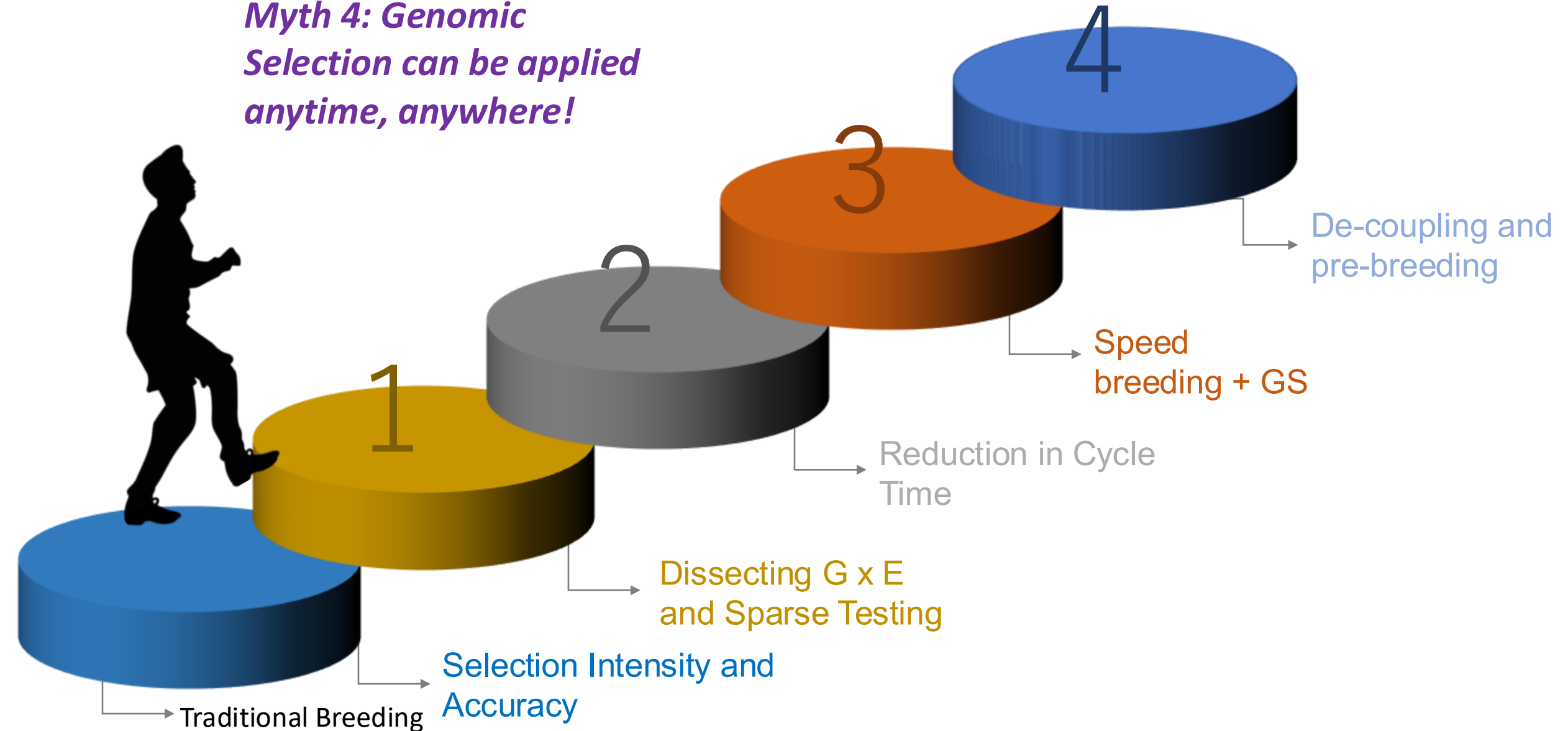


Where I can apply GS Tool

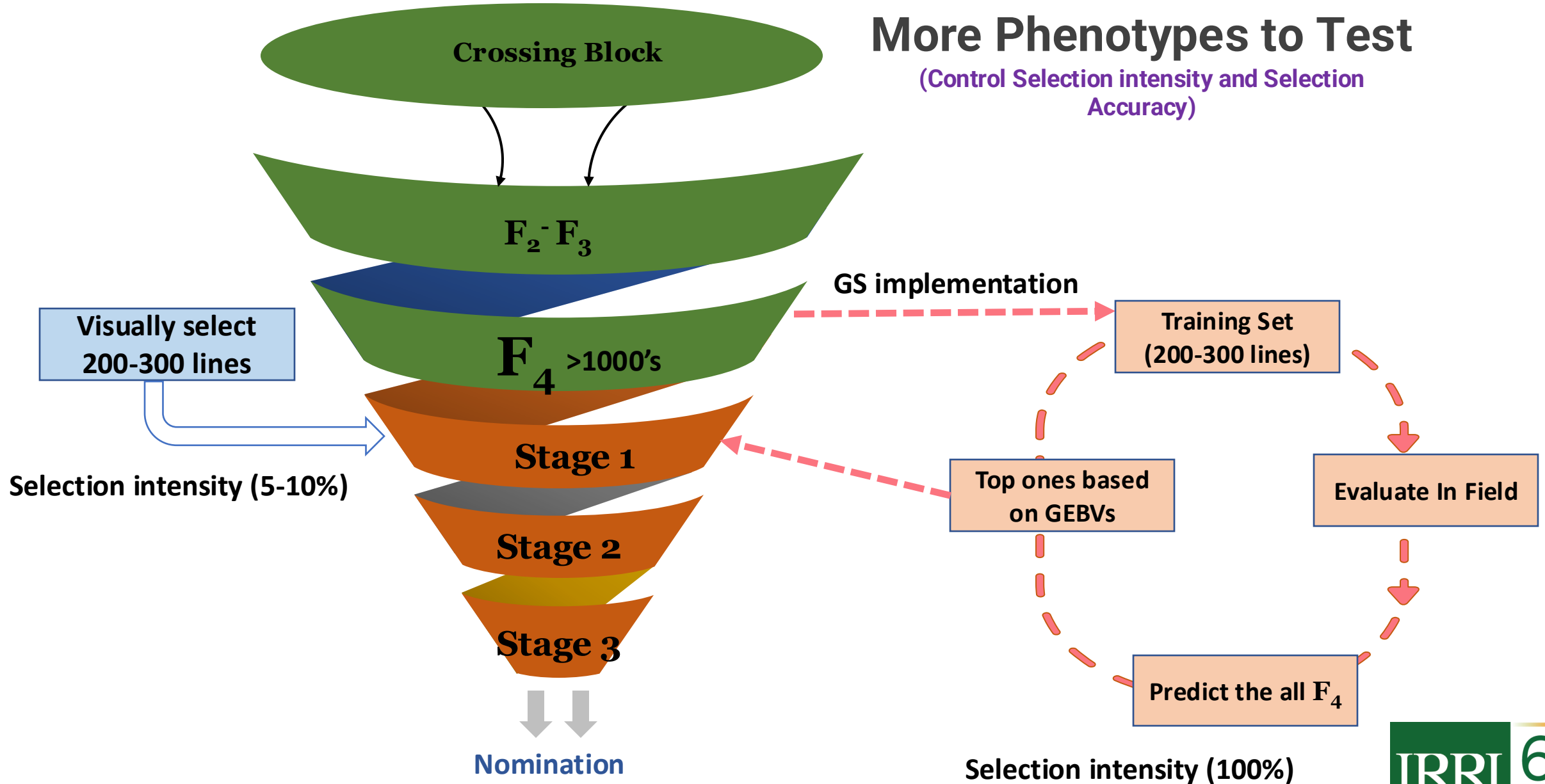


Step by Step Approach to GS

Myth 4: Genomic Selection can be applied anytime, anywhere!



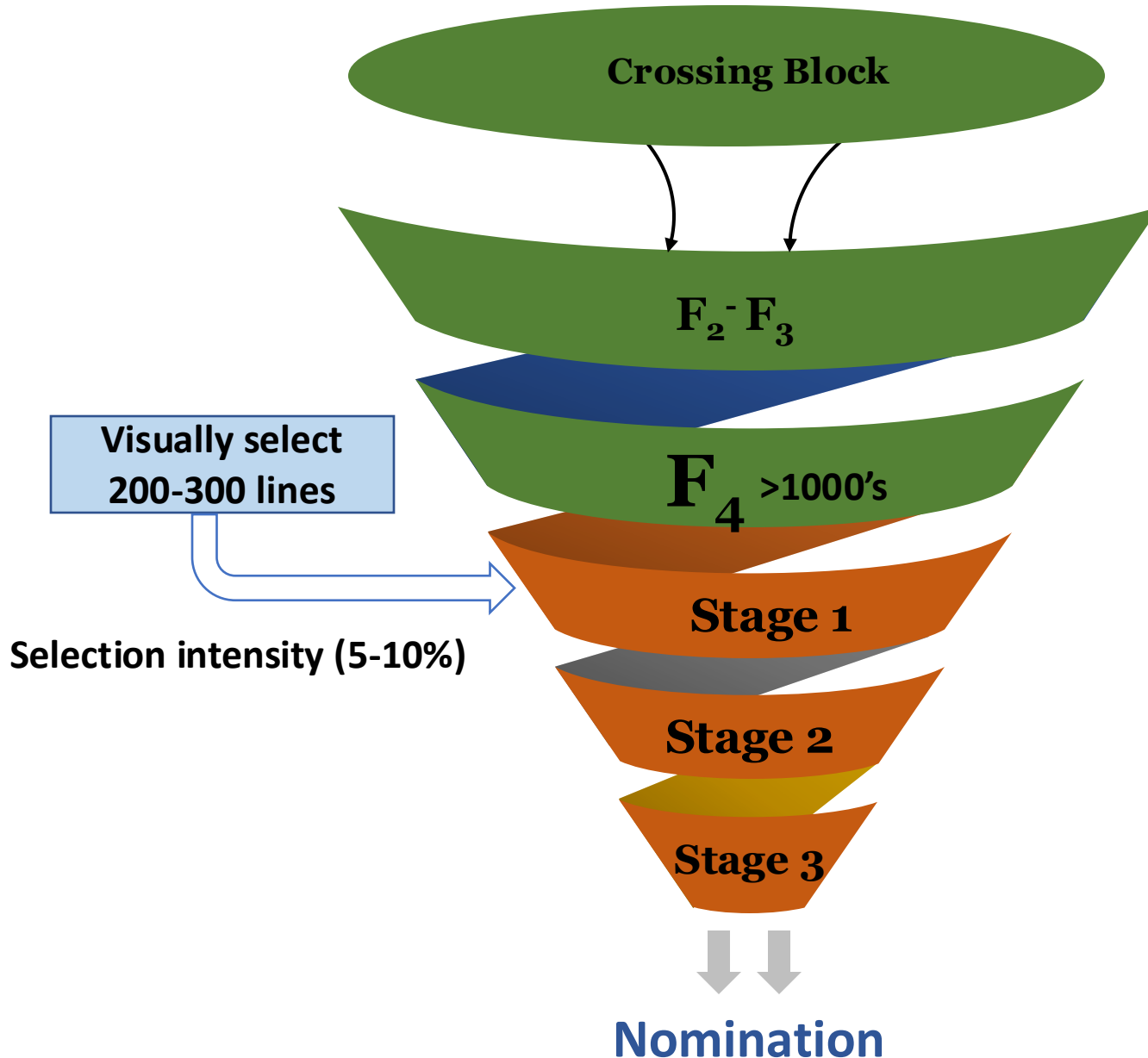
GS Implementation: Scenario 1



GS Implementation: Scenario 1

More Phenotypes to Test

(Control Selection intensity and Selection Accuracy)

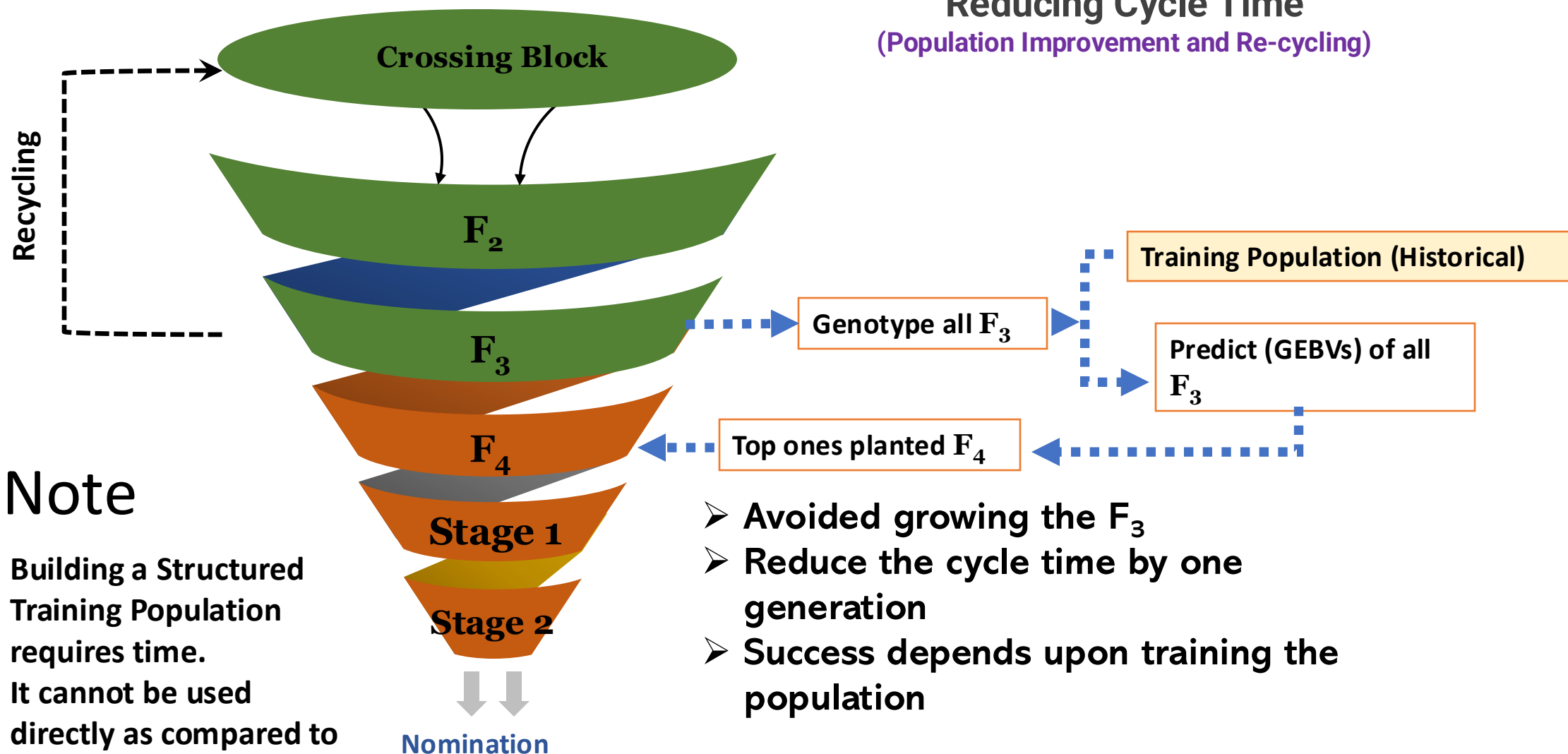


Myth 5: Genomic Selection is more reliable than Phenotypic BLUPs

Yes True! If the accuracy of Selection is high

GS Implementation: Scenario 2

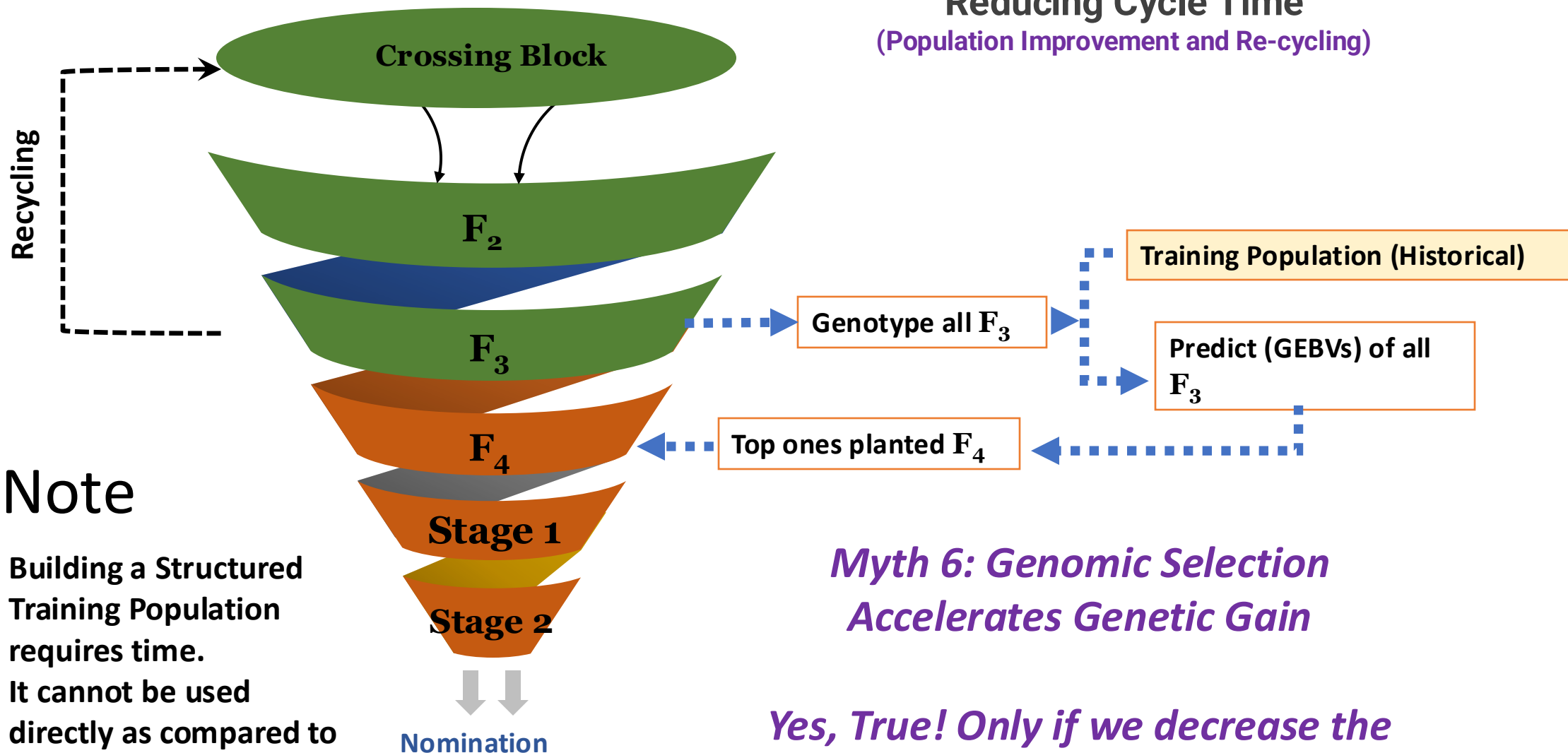
Reducing Cycle Time (Population Improvement and Re-cycling)



- High relationship with the testing set
- LD structure should be same
- Need to update the training population

GS Implementation: Scenario 2

Reducing Cycle Time
(Population Improvement and Re-cycling)



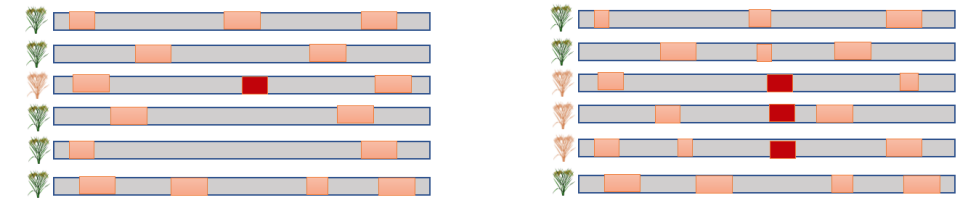
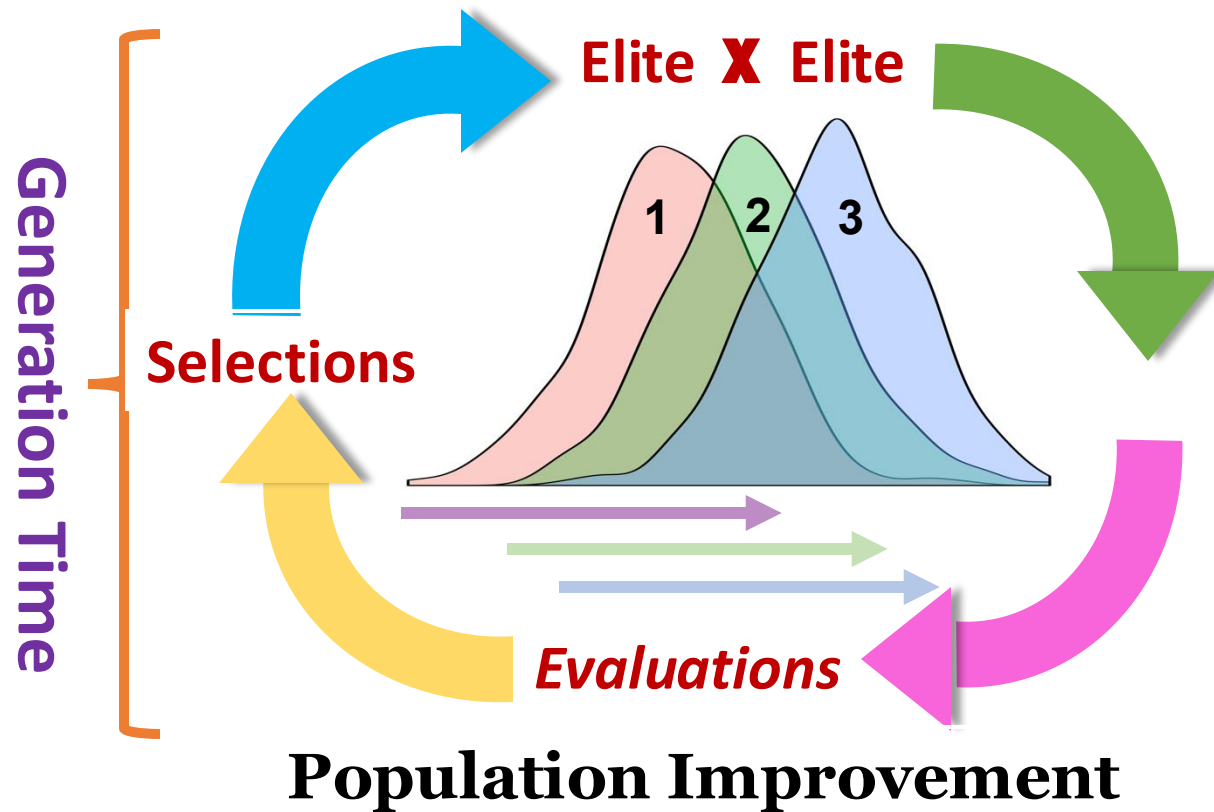
Note

- Building a Structured Training Population requires time.
- It cannot be used directly as compared to scenario 1

*Myth 6: Genomic Selection
Accelerates Genetic Gain*

*Yes, True! Only if we decrease the
cycle time*

Why Population Improvement is Central to GS



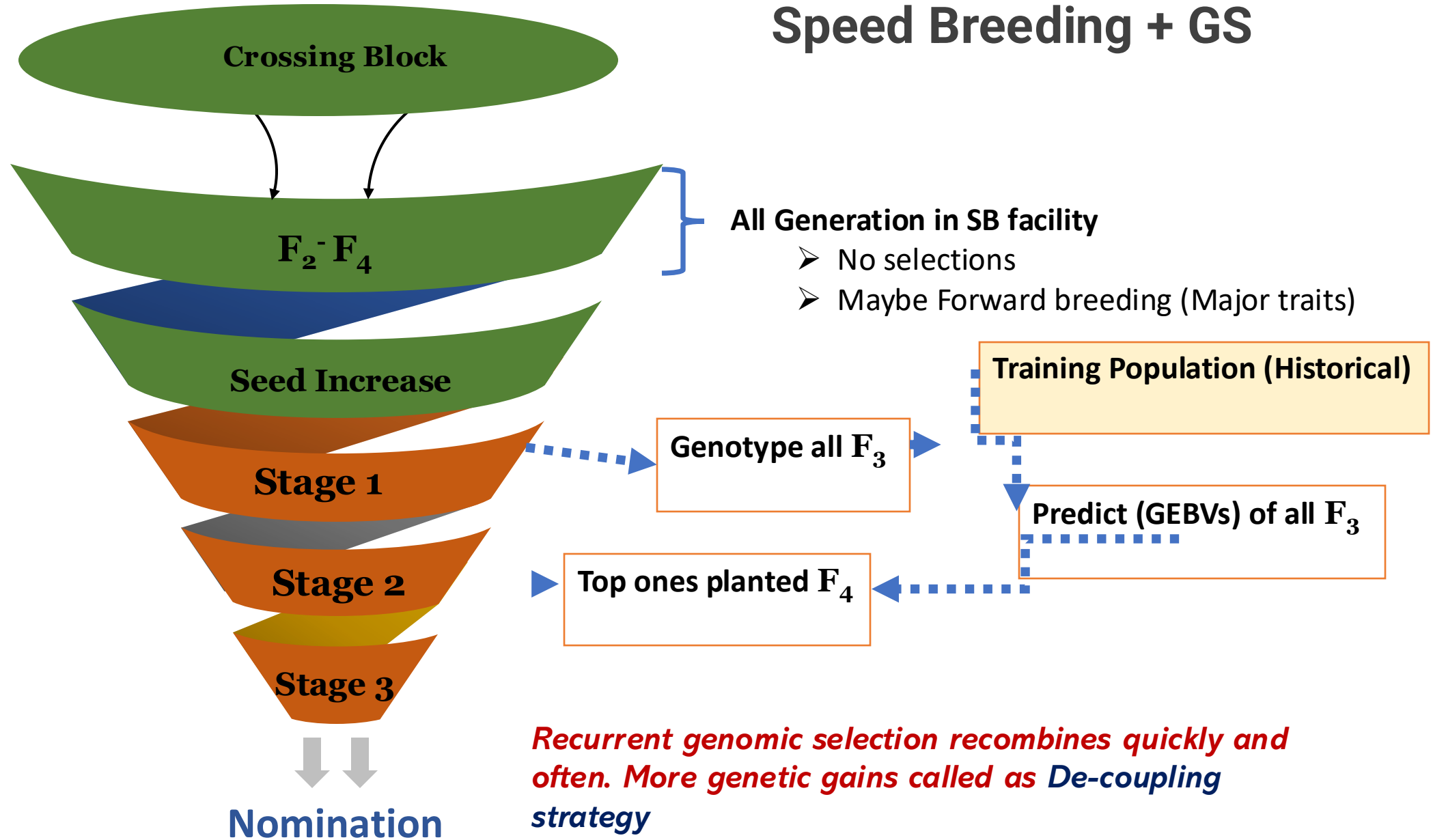
Selection and recombination Increase the frequency of favorable allele

Myth 7: GS alone will do magic and accelerate genetic gains

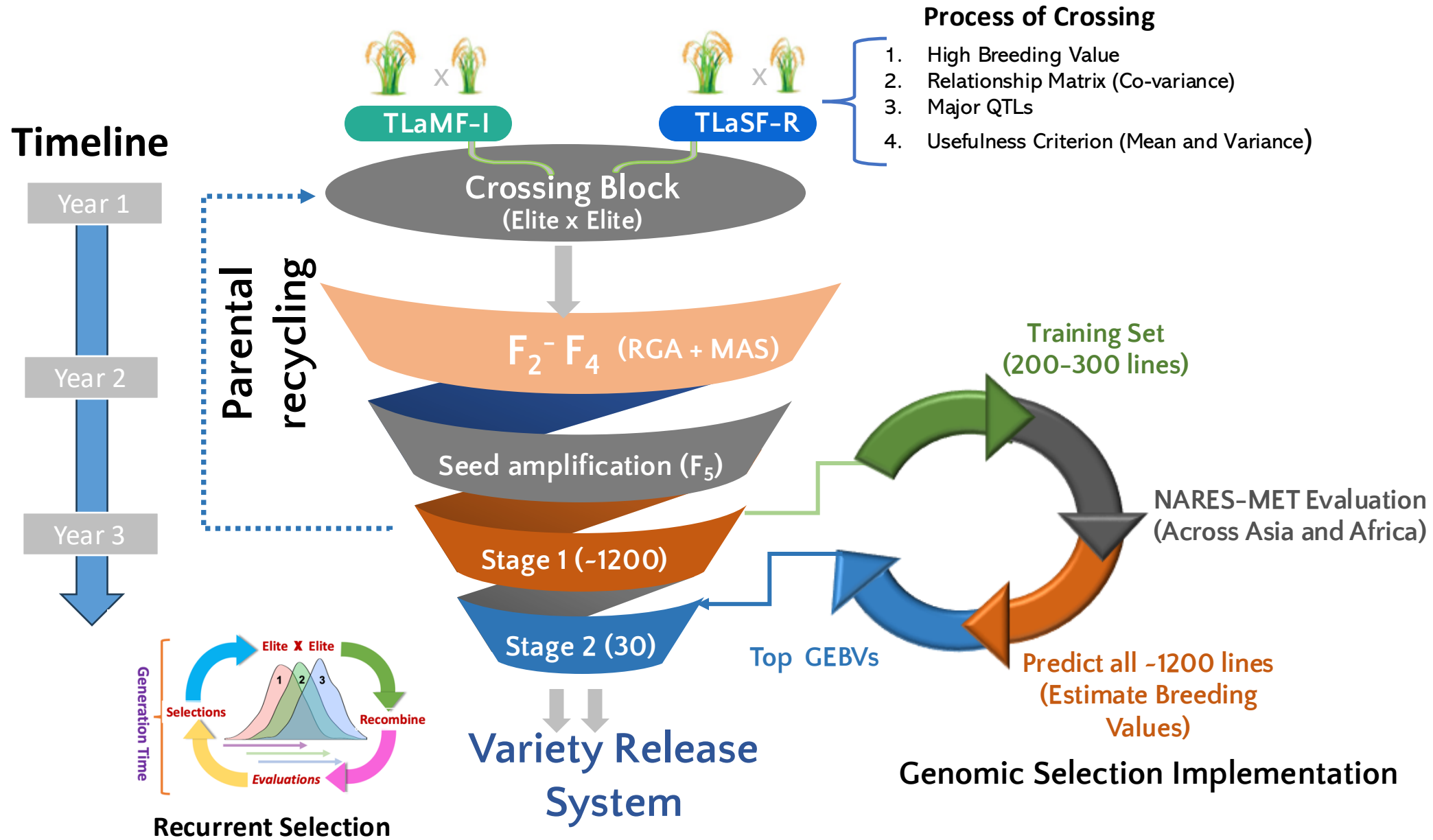
GS Implementation: Scenario 4

Speed Breeding + GS

Early Recycling



GS in IRRI's Rice Breeding Program



Think Twice Before Go for GS



- Un-related populations (GS exploits relationships)
- Lack of the genotyping facility
- High cost of genotyping may halt implementation of GS
- Lack of understanding, capacity, and skill set to run GS pipeline
- Aim is not to improve major haplotypes but drive population improvement.
- Phenotyping is cheaper! Go for it.

Use the Genetic Gain Equation as a Reference and Model



Thank you!