



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

How to Leverage Genomic Selection in Plant Breeding

**Module 4
August 6, 2025**

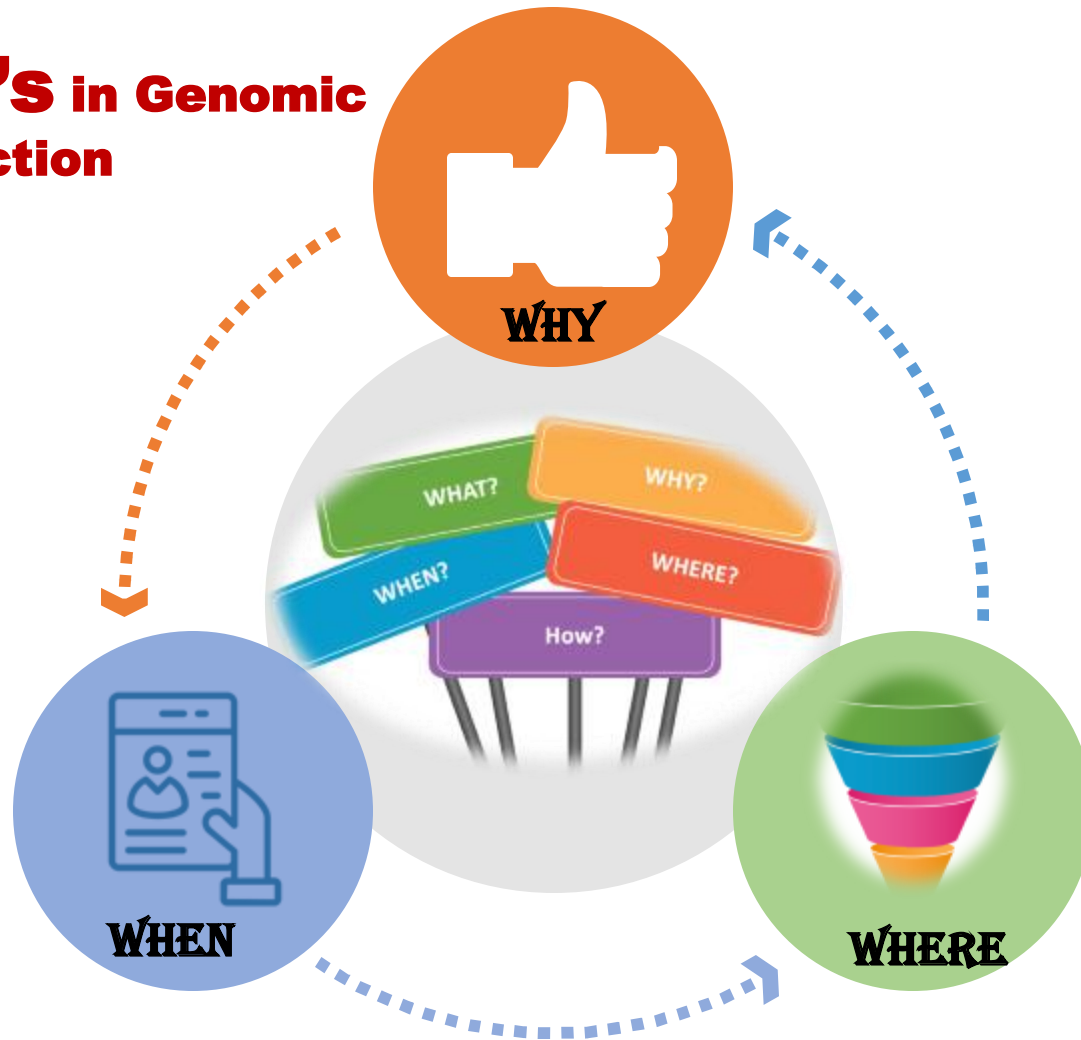
**Waseem Hussain and Mahender Anumalla
Rice Breeding Innovations Platform
IRRI**

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

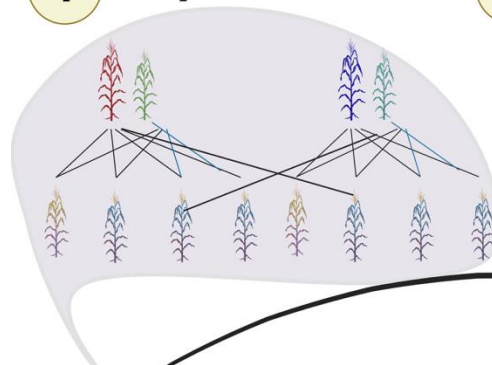
- Requirements (Genotyping, reference populations etc.,
- Resources
- Capacity to use GS

● Where to use GS

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

How Genomic Prediction Works

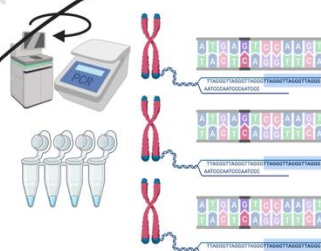
1 Population



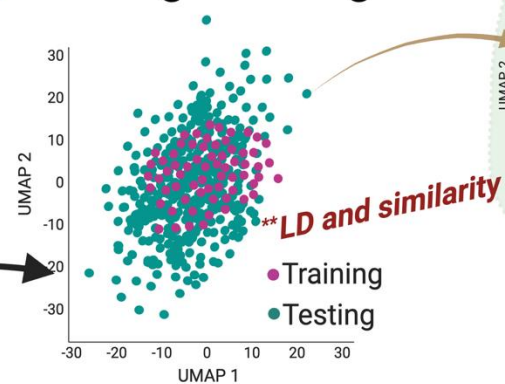
2

Genotype Whole Population

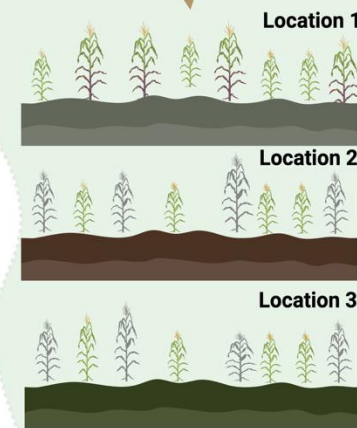
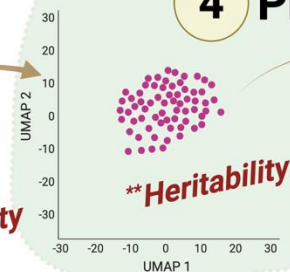
****Cost and density**



3 Creating Training Set

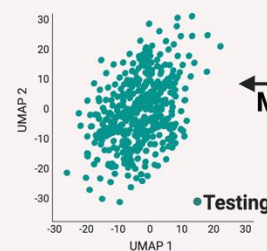


4 Phenotype Training Set



5 Perform Analysis

5



Phenotype Data Marker data



Marker effects

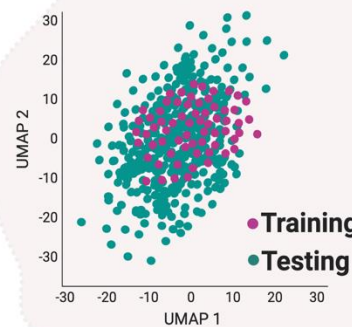
Model Training
 $Y = Xb + Zu + e$

****Model selection and marker variance**

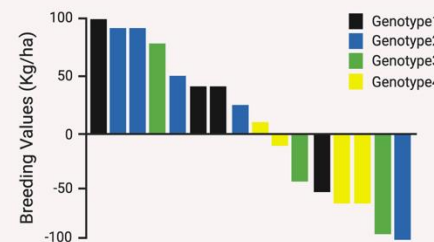
6

Estimate Breeding Values

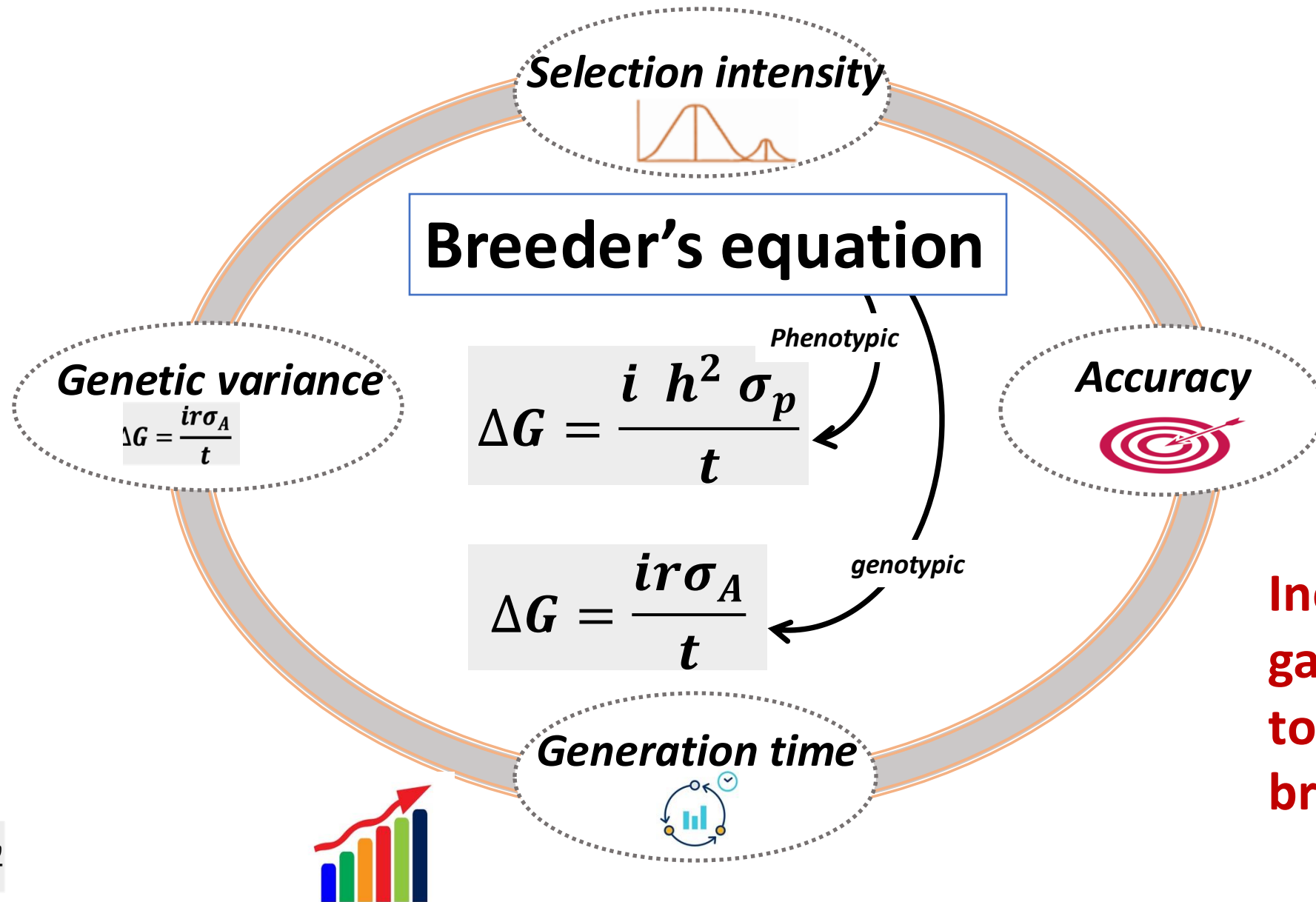
Select Top Ones



Genomic Estimated Breeding Values



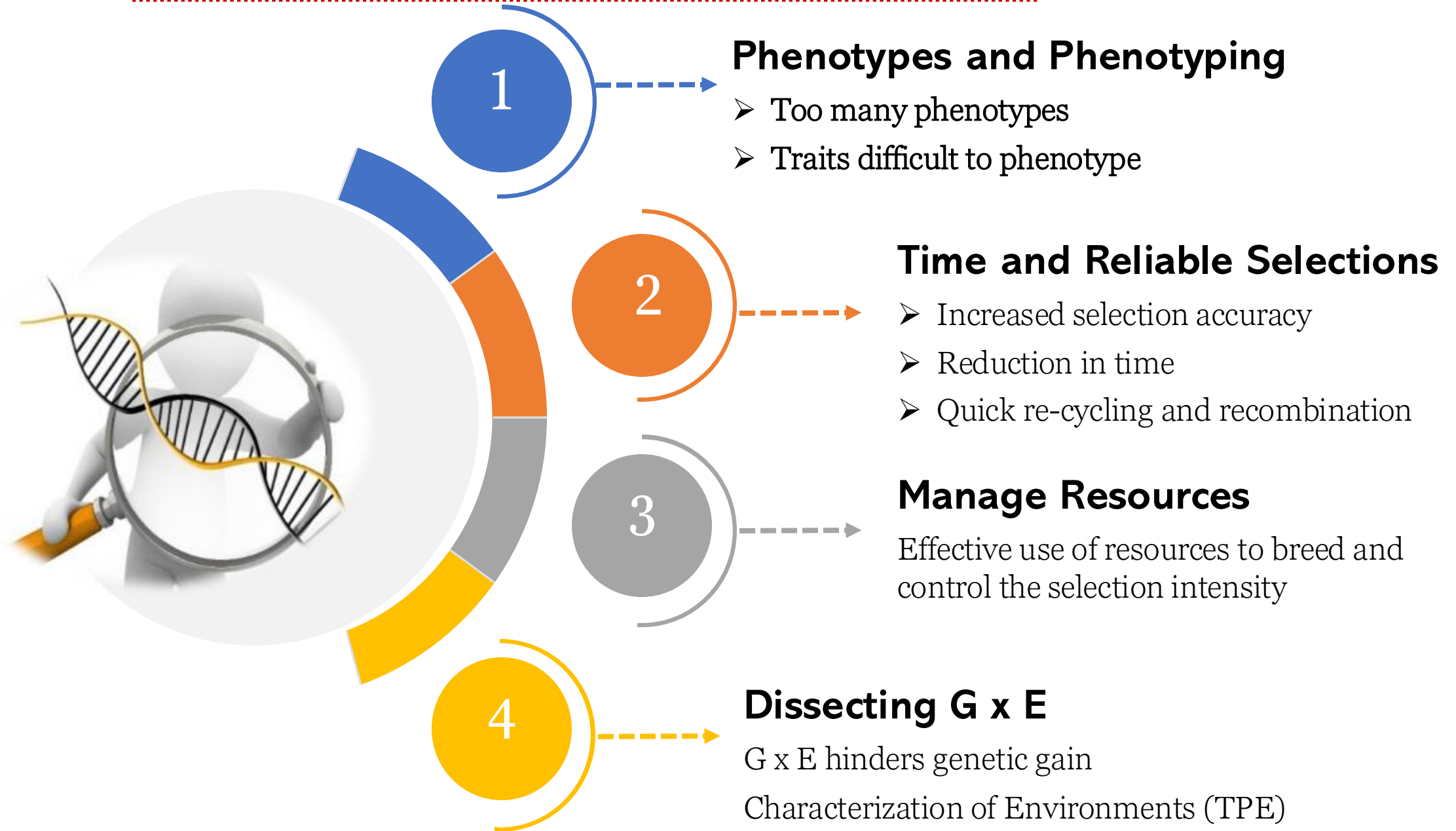
The guiding principle is Breeders Equation



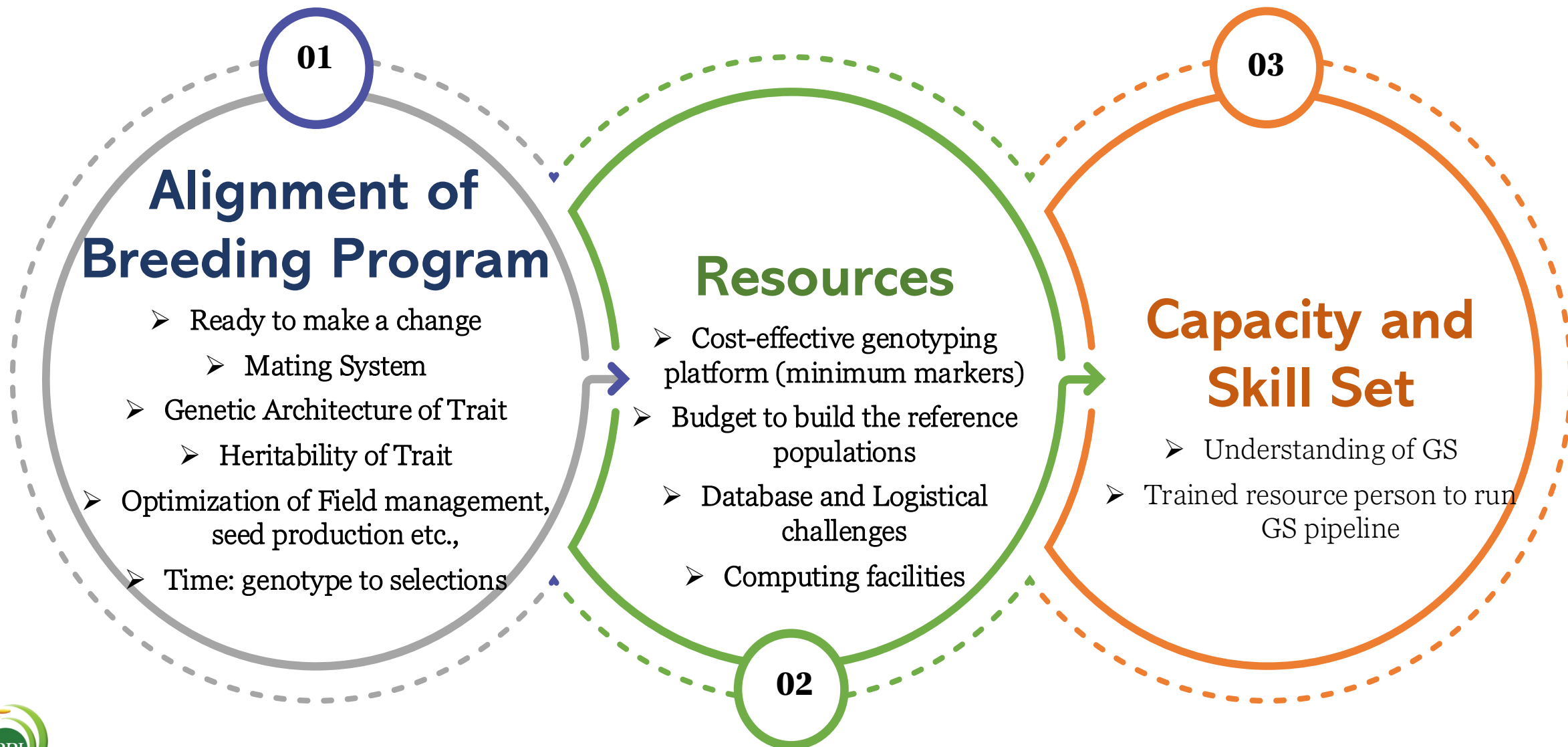
$$\Delta G = \frac{i h^2 \sigma_p}{t}$$



Why Genomic Selection

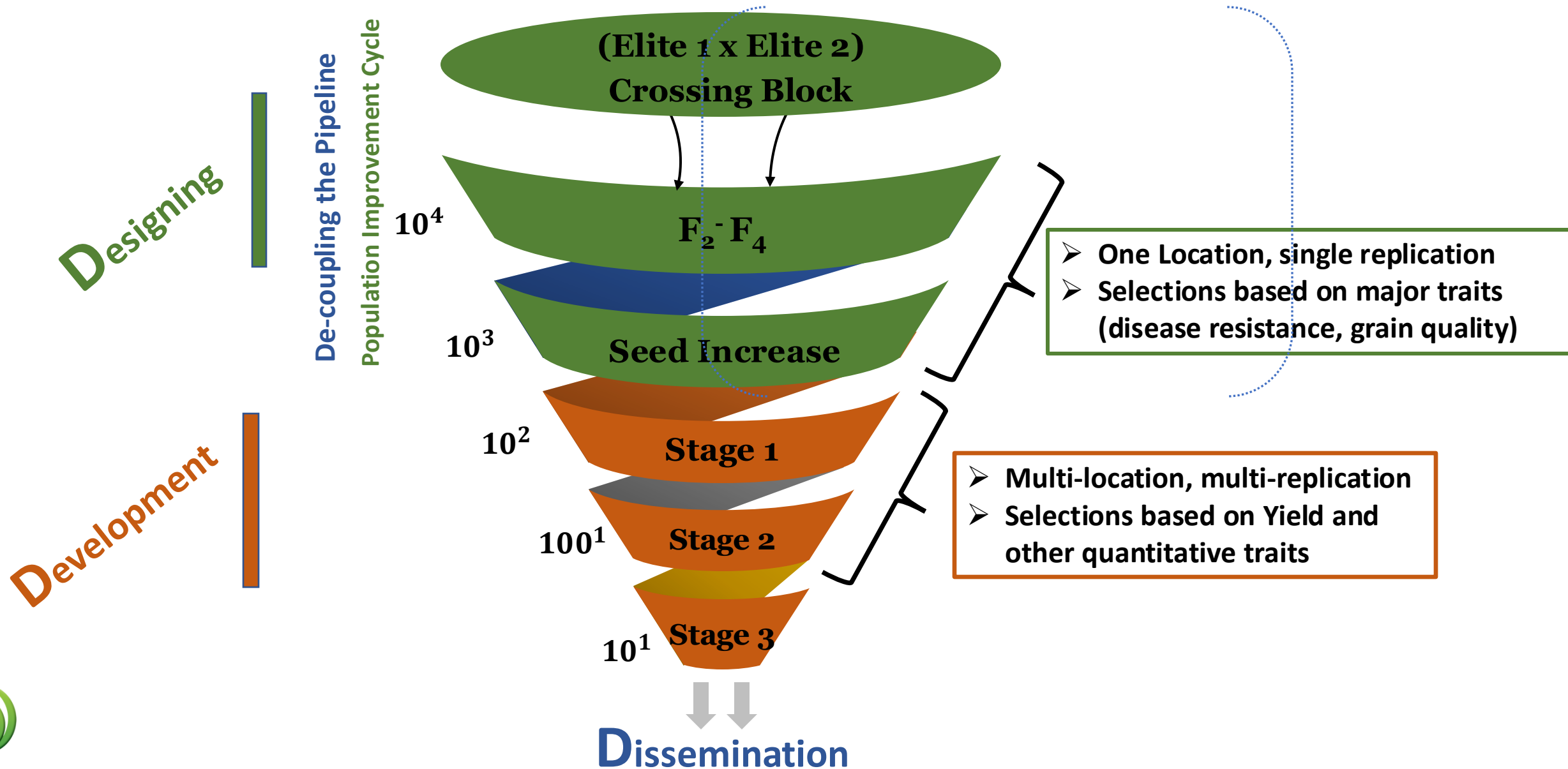


When to Use Genomic Selection

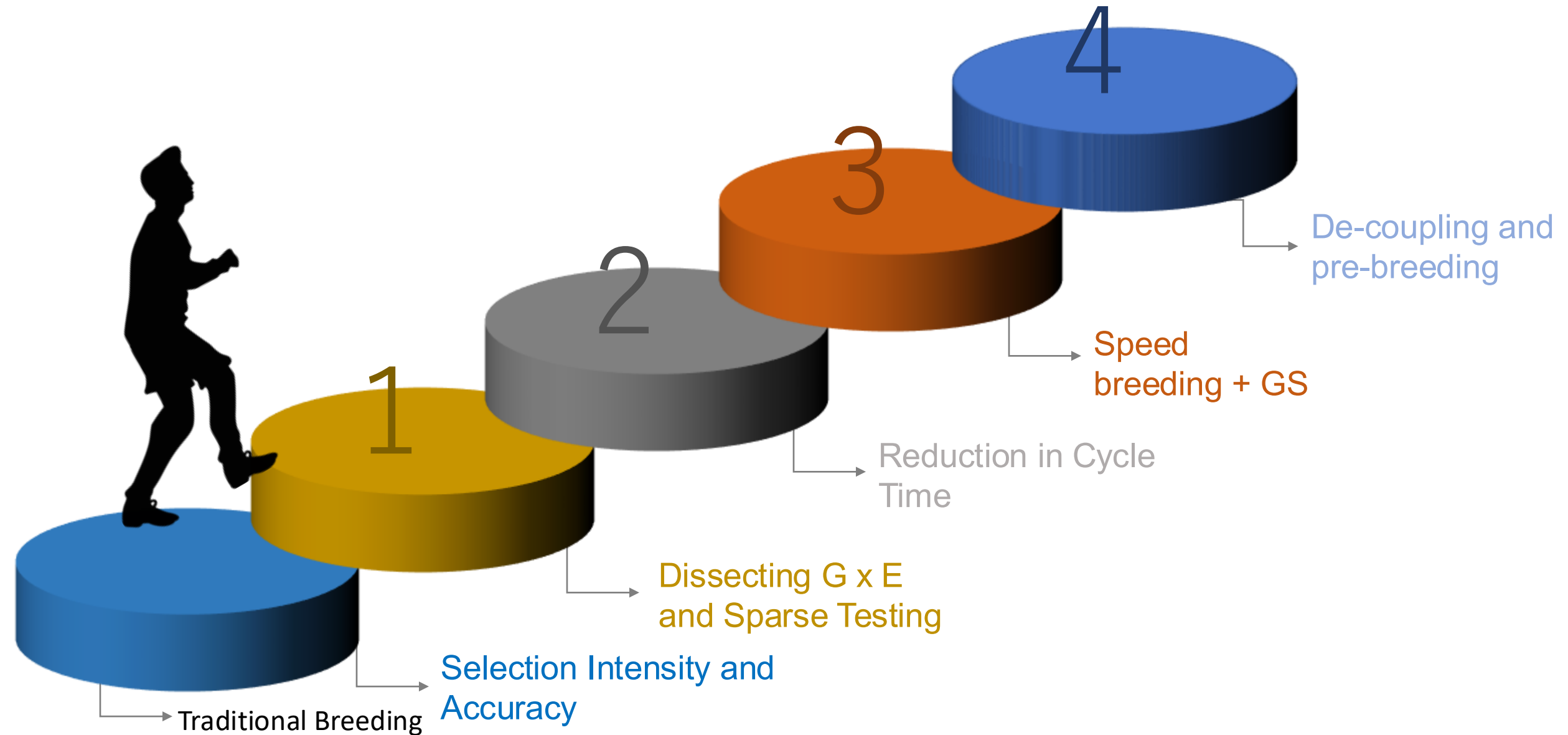


When and How to Use Genomic Selection

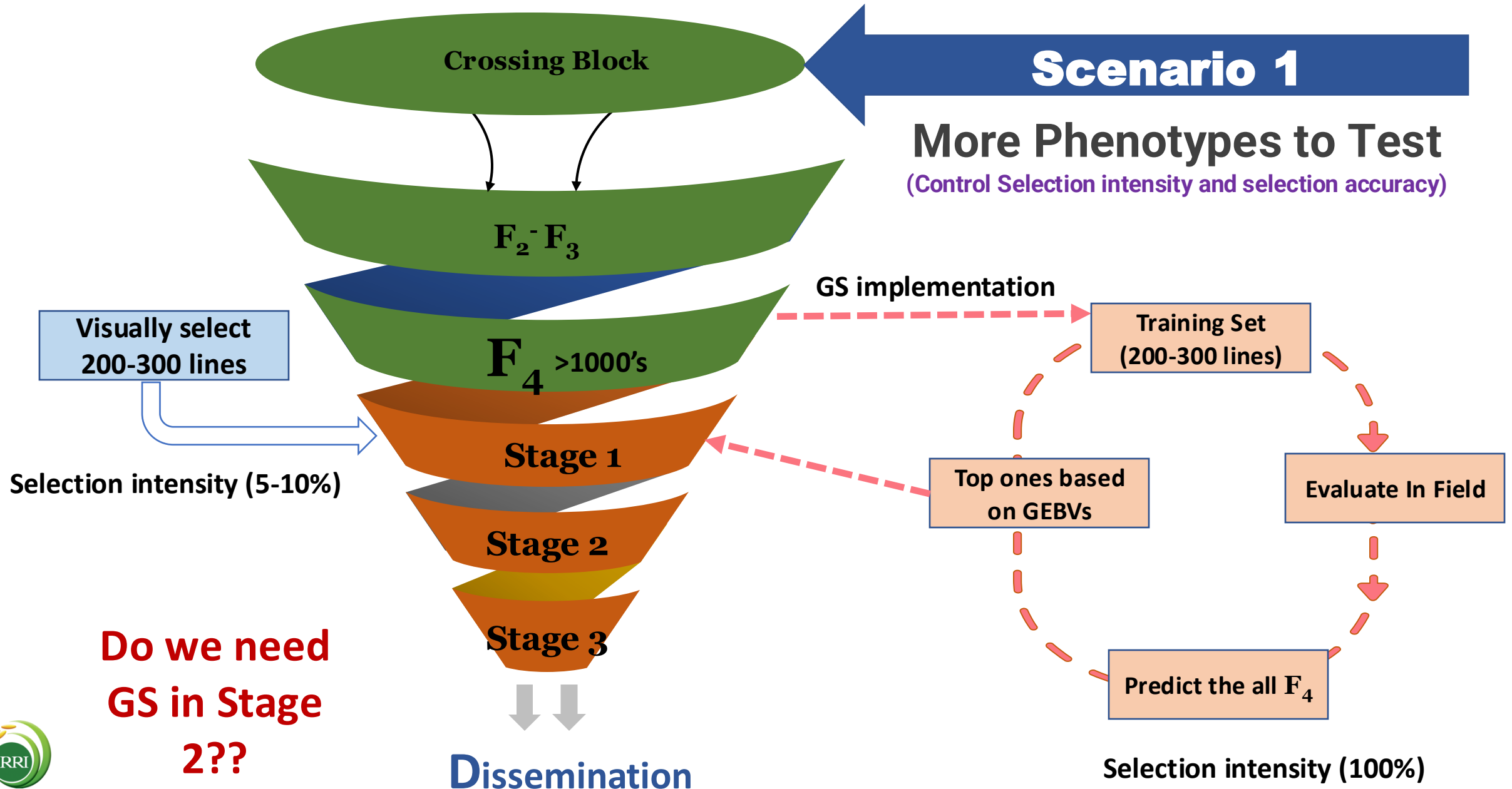
(General Breeding Program/Pipeline)



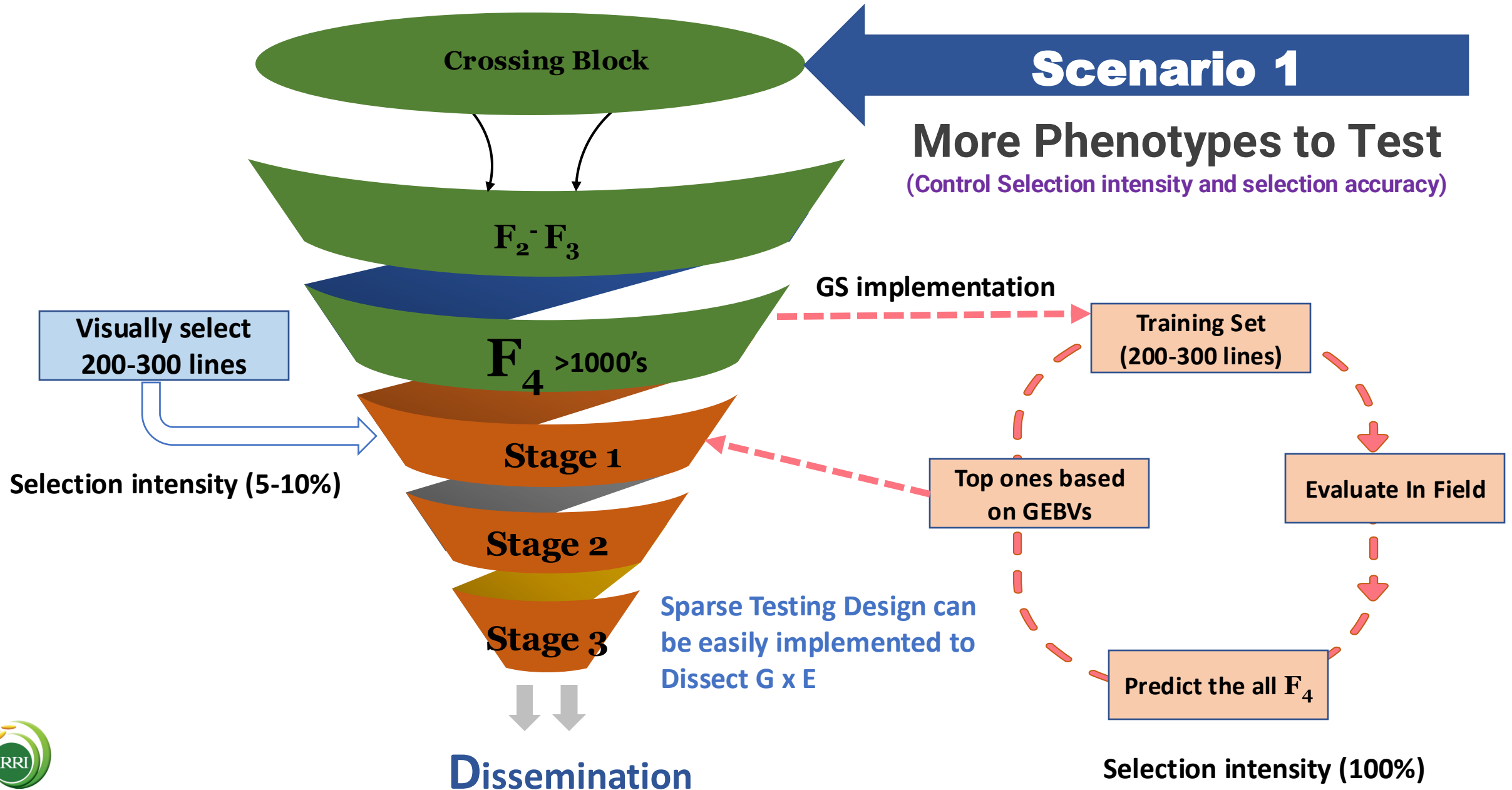
Step by step Approach for GS



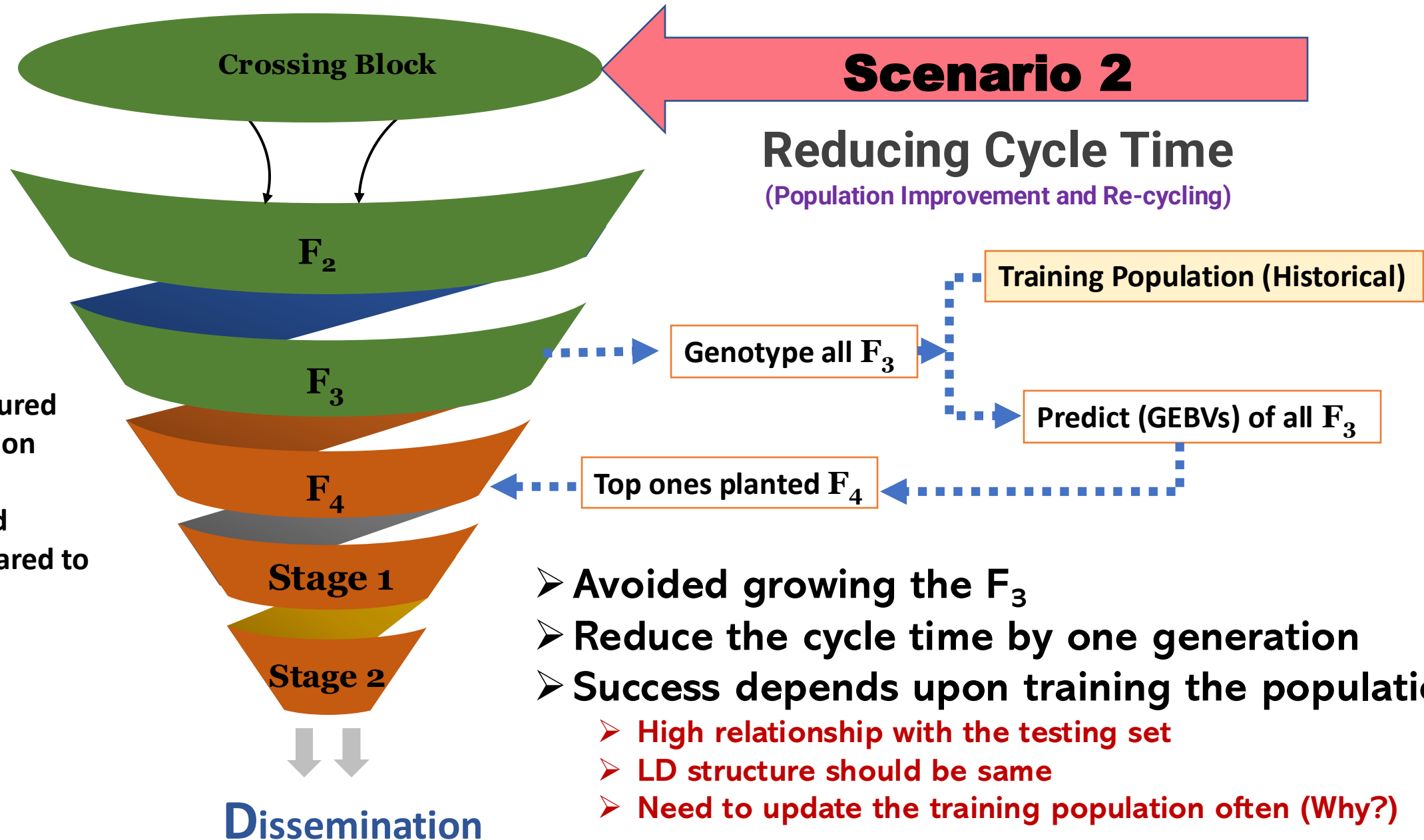
When and How to Use Genomic Selection



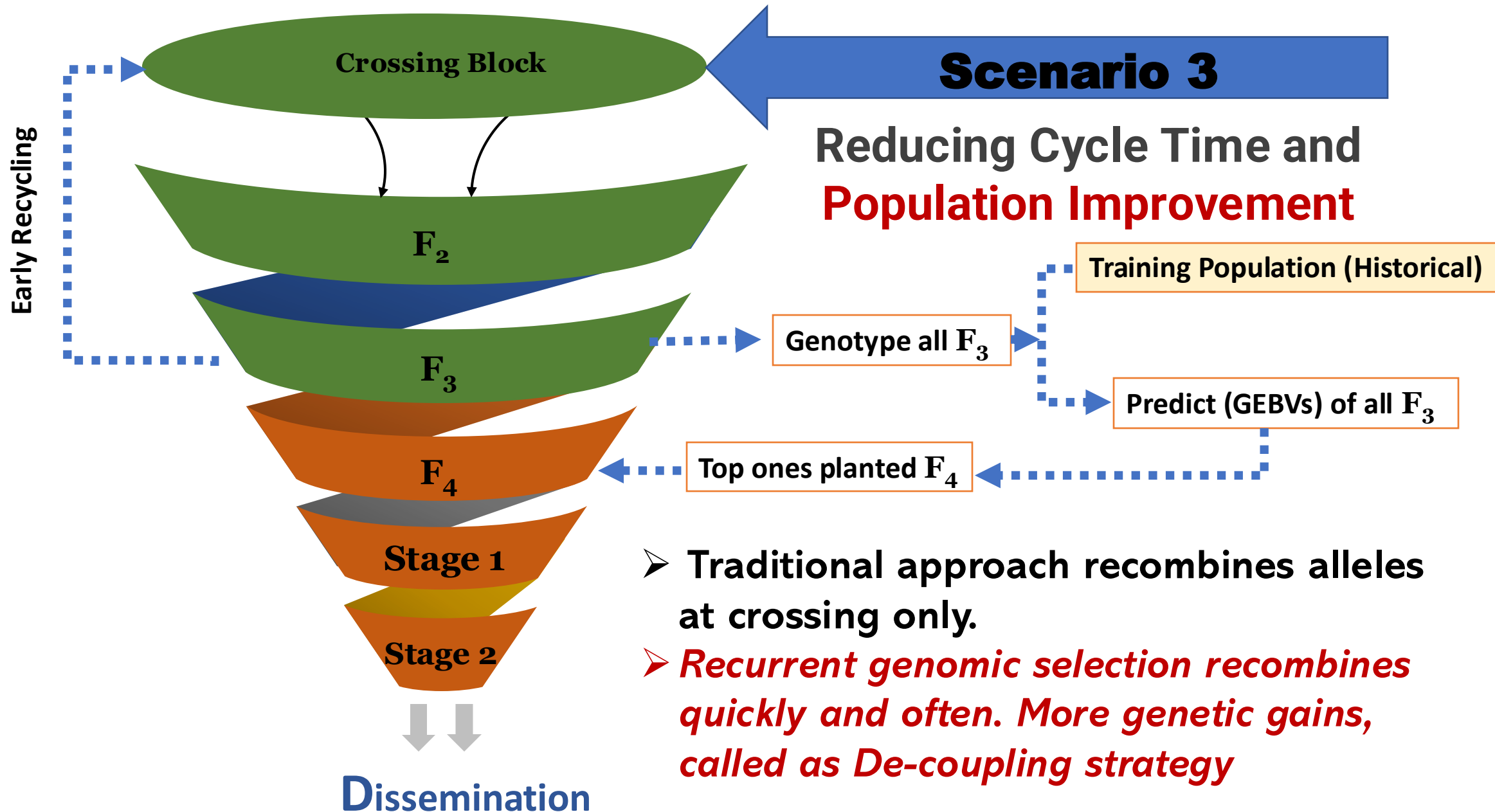
When and How to Use Genomic Selection



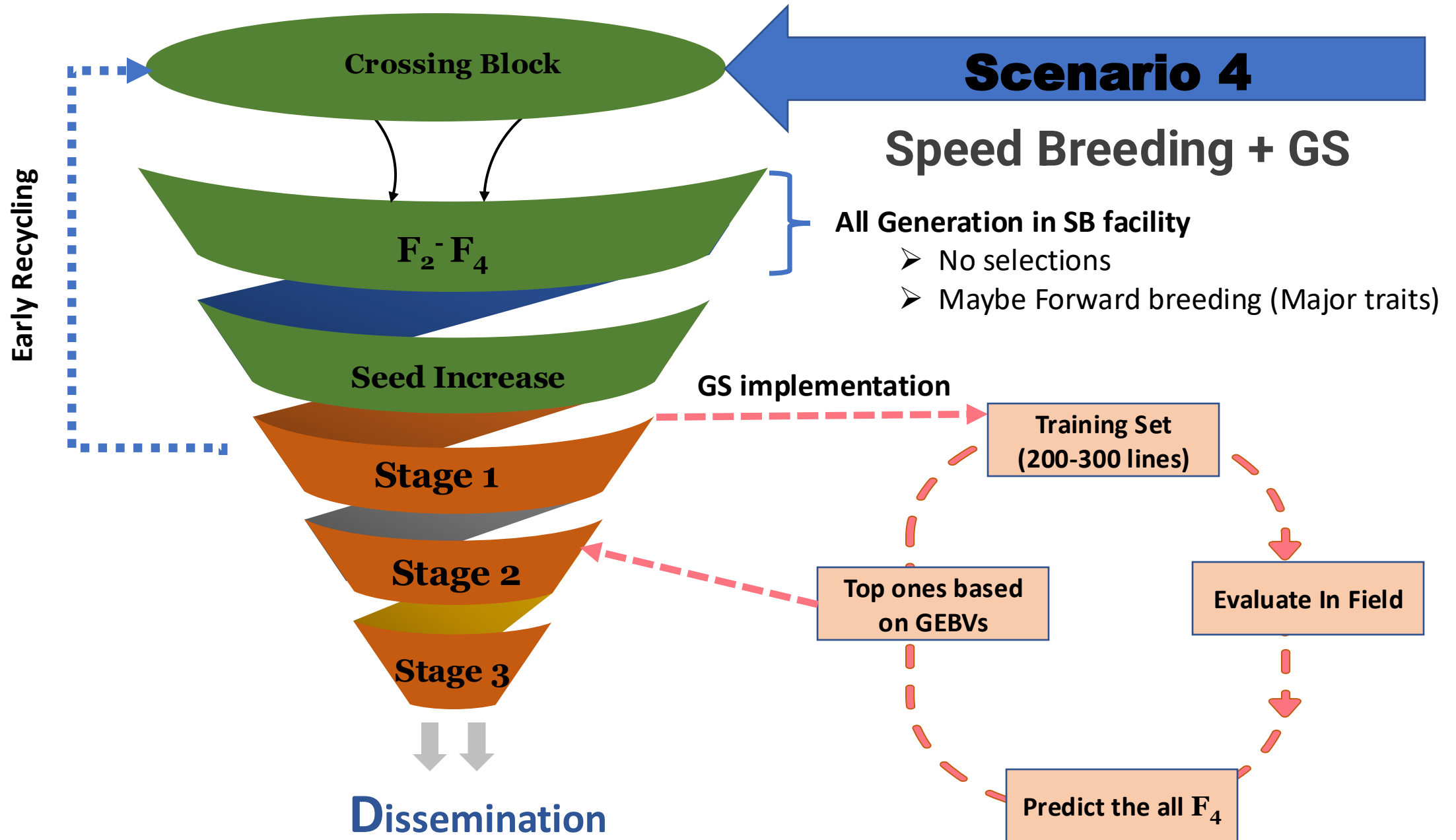
When and How to Use Genomic Selection



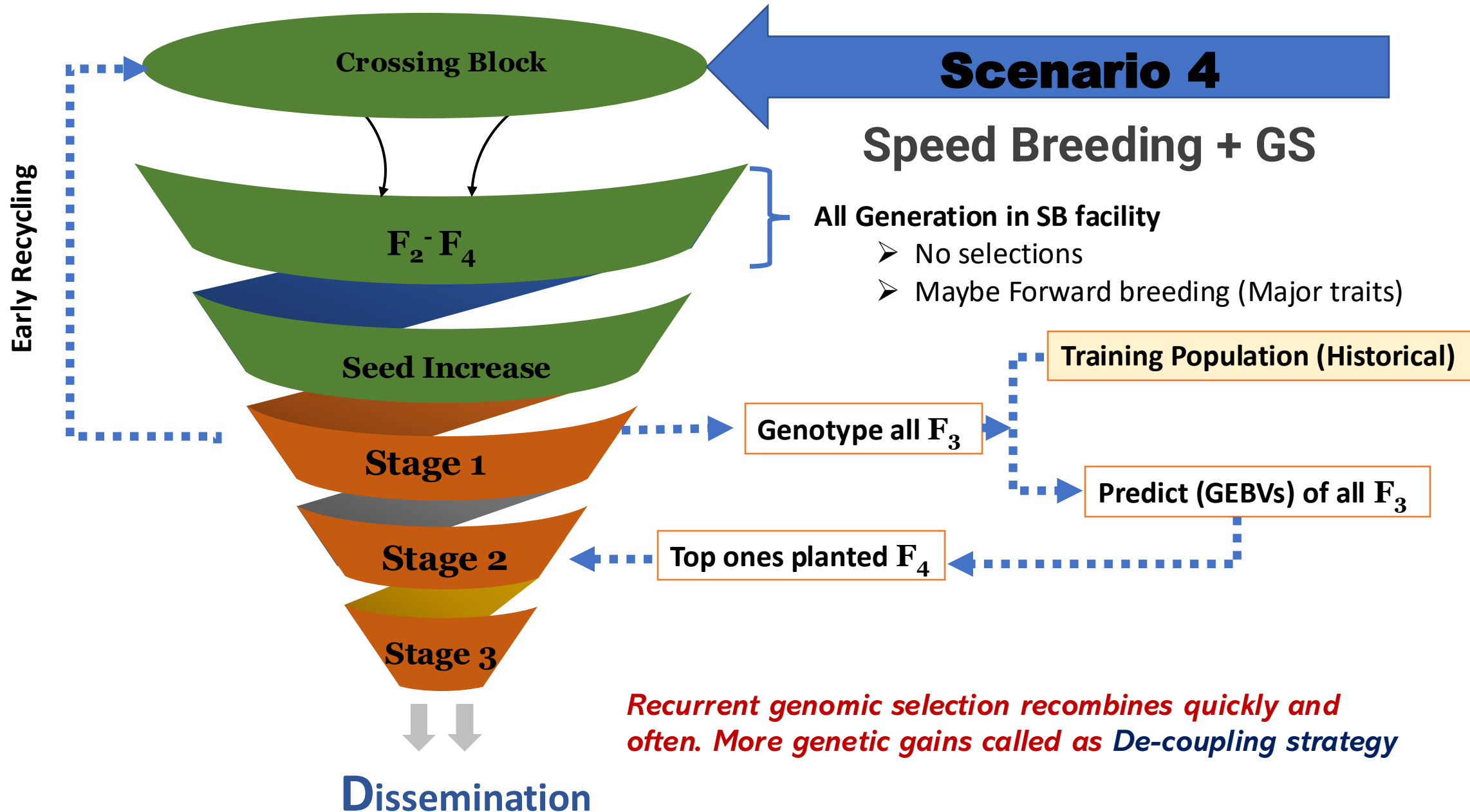
When and How to Use Genomic Selection



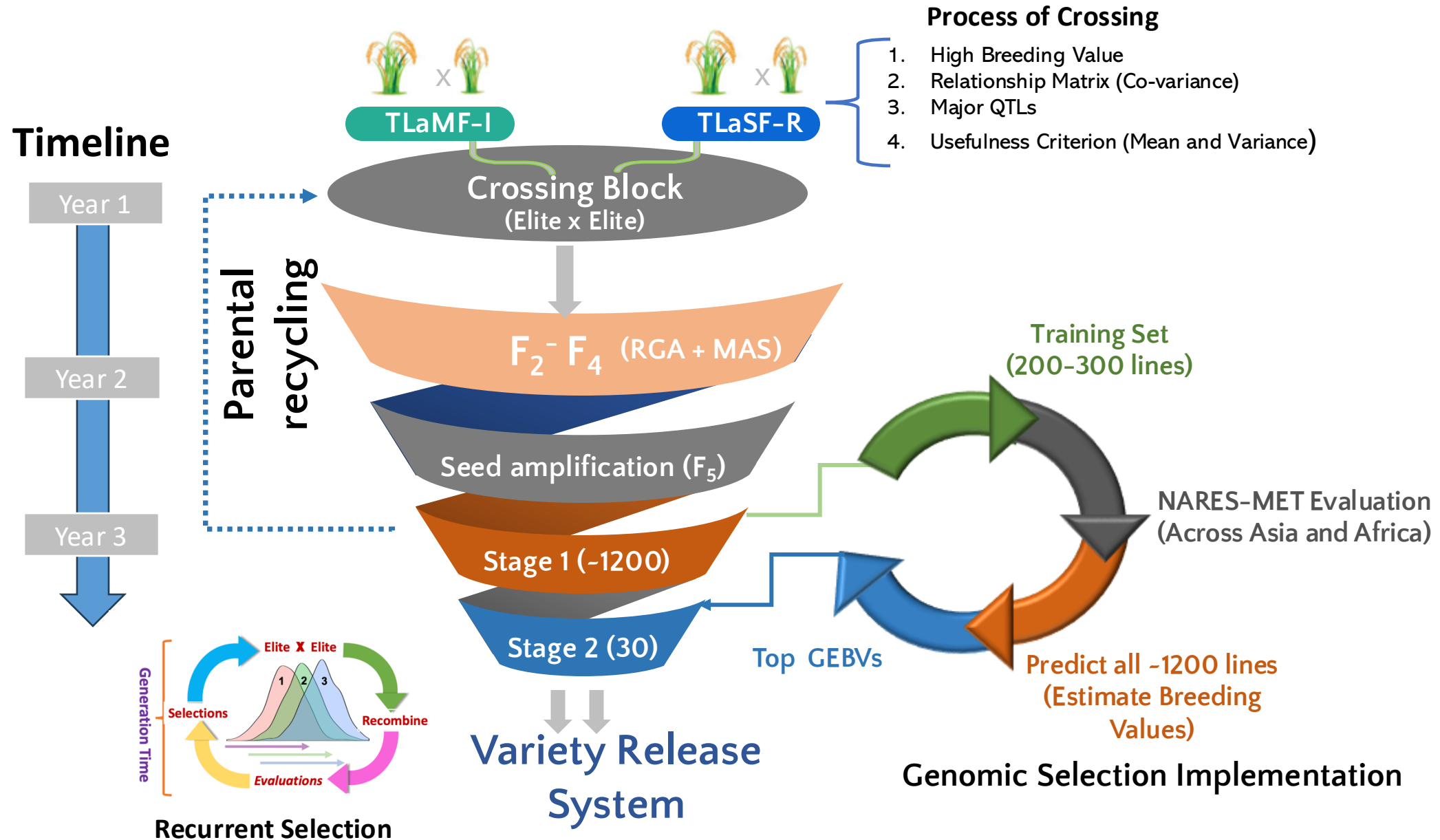
When and How to Use Genomic Selection



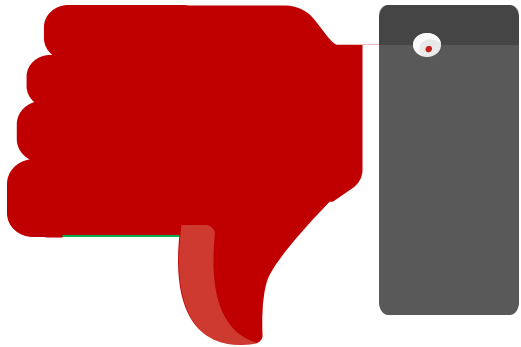
When and How to Use Genomic Selection



Genomic Selection in IRRI's Global Rice Breeding



When not to Use Genomic Selection



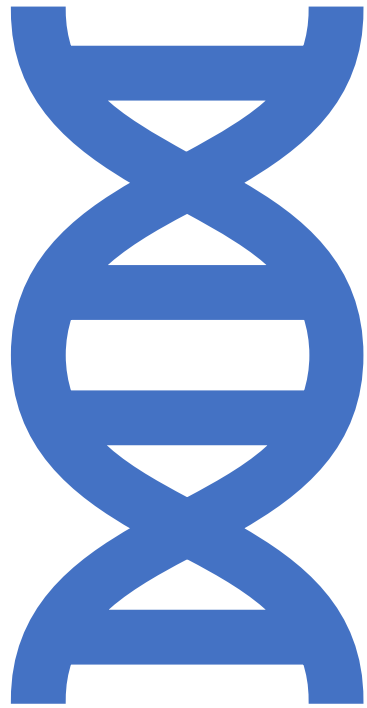
Un-related populations (GS exploits relationships)

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 only major haplotypes



How We Can Leverage Genomic Prediction in Your Breeding Program

Think in terms of:

- Connecting Genotypes
- Connecting Environments
- Saving resource
- Early Selection of Top Genotypes
- Increase Selection accuracy: More Reliable
- Dissecting G x E and Predict Stability