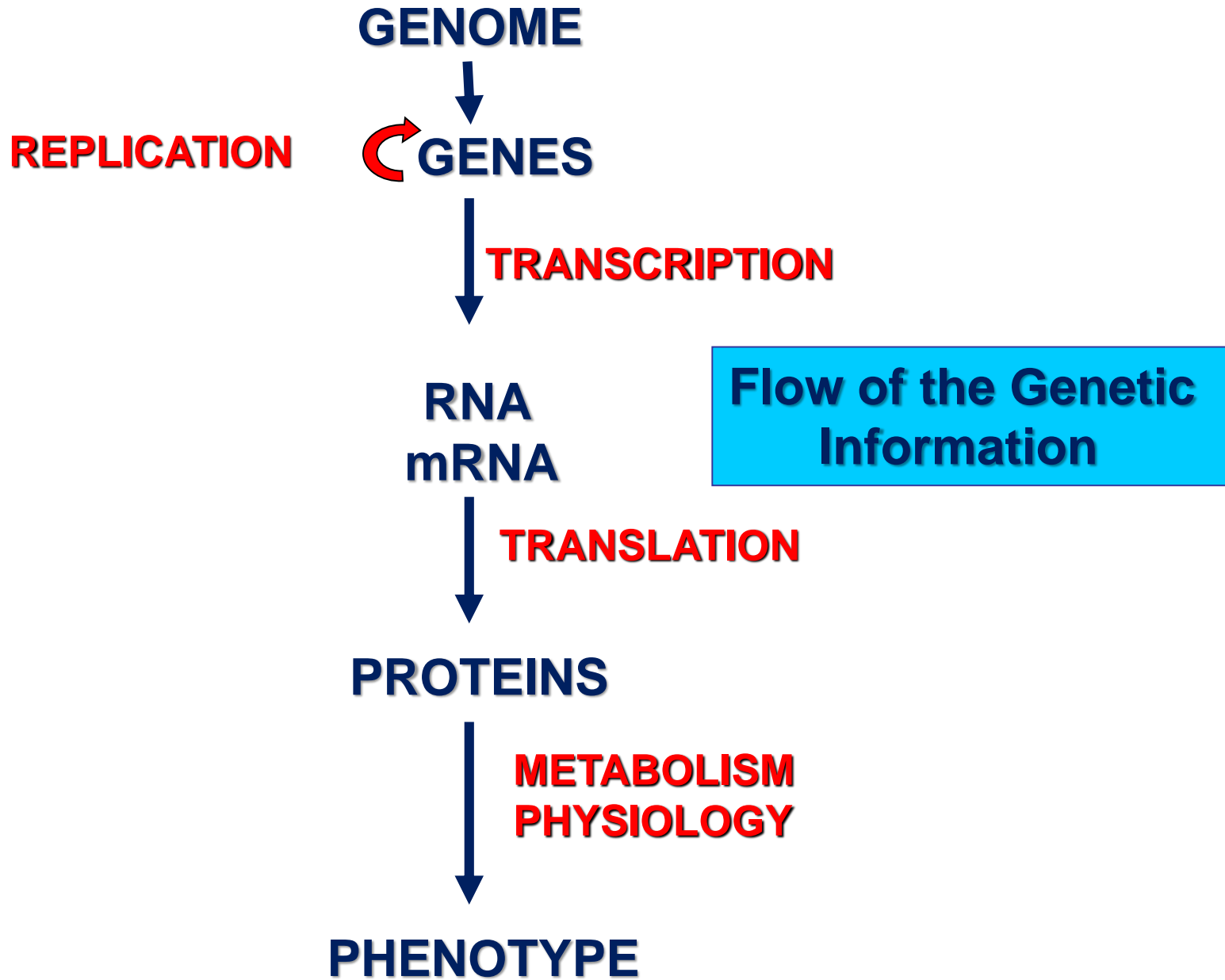




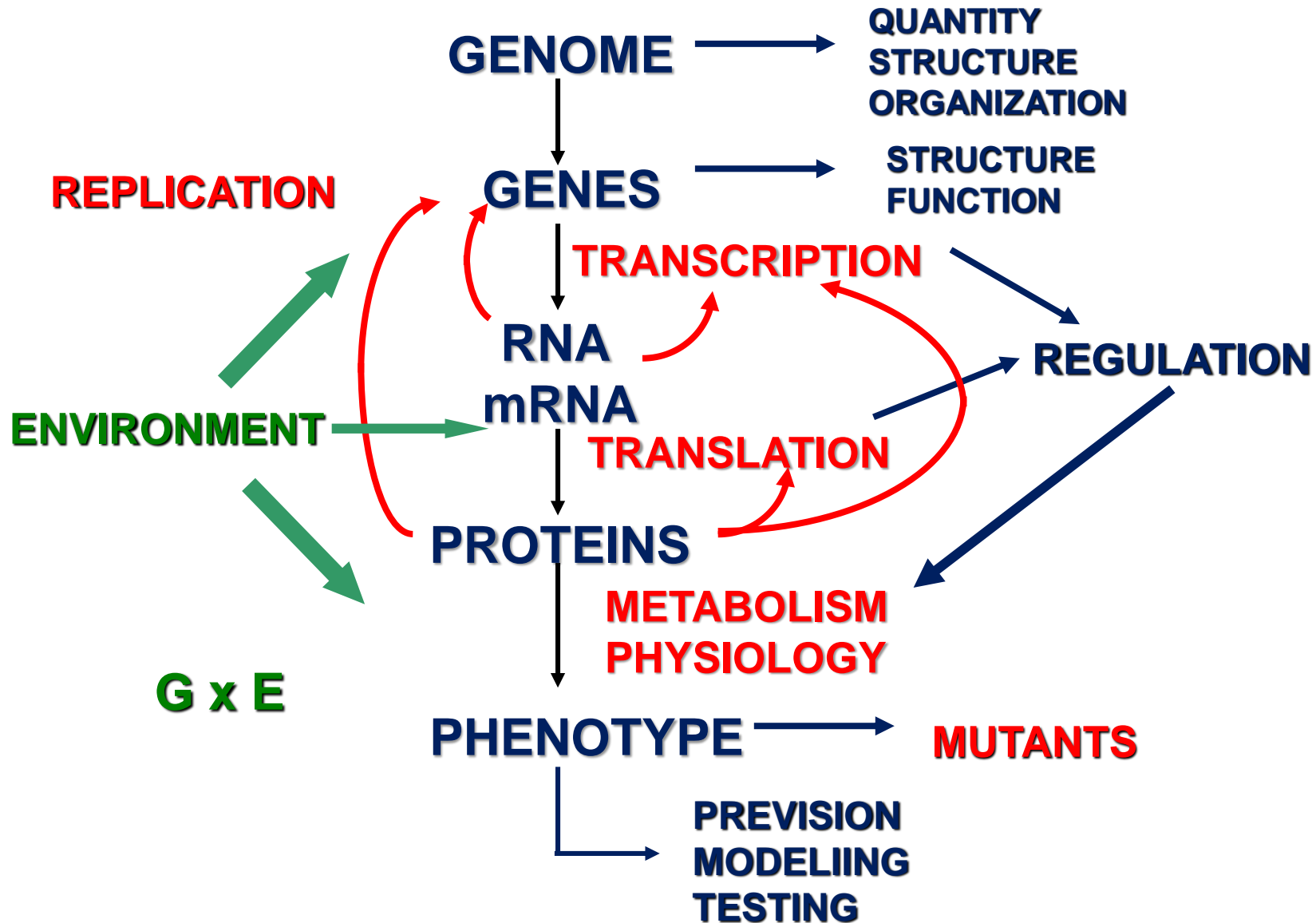
Genotype - Phenotype: still the key question in Life Sciences



M. Enrico Pè
Scuola Superiore Sant'Anna, Pisa



Flow of the Genetic Information



GENOTYPE- PHENOTYPE RELATIONSHIPS: STILL THE QUESTION

**To understand the nature of genetic variation,
which is at the basis of evolution**

DIFFERENT SCHOOLS

1. DARWINIAN SCHOOL

Approach: Olistic

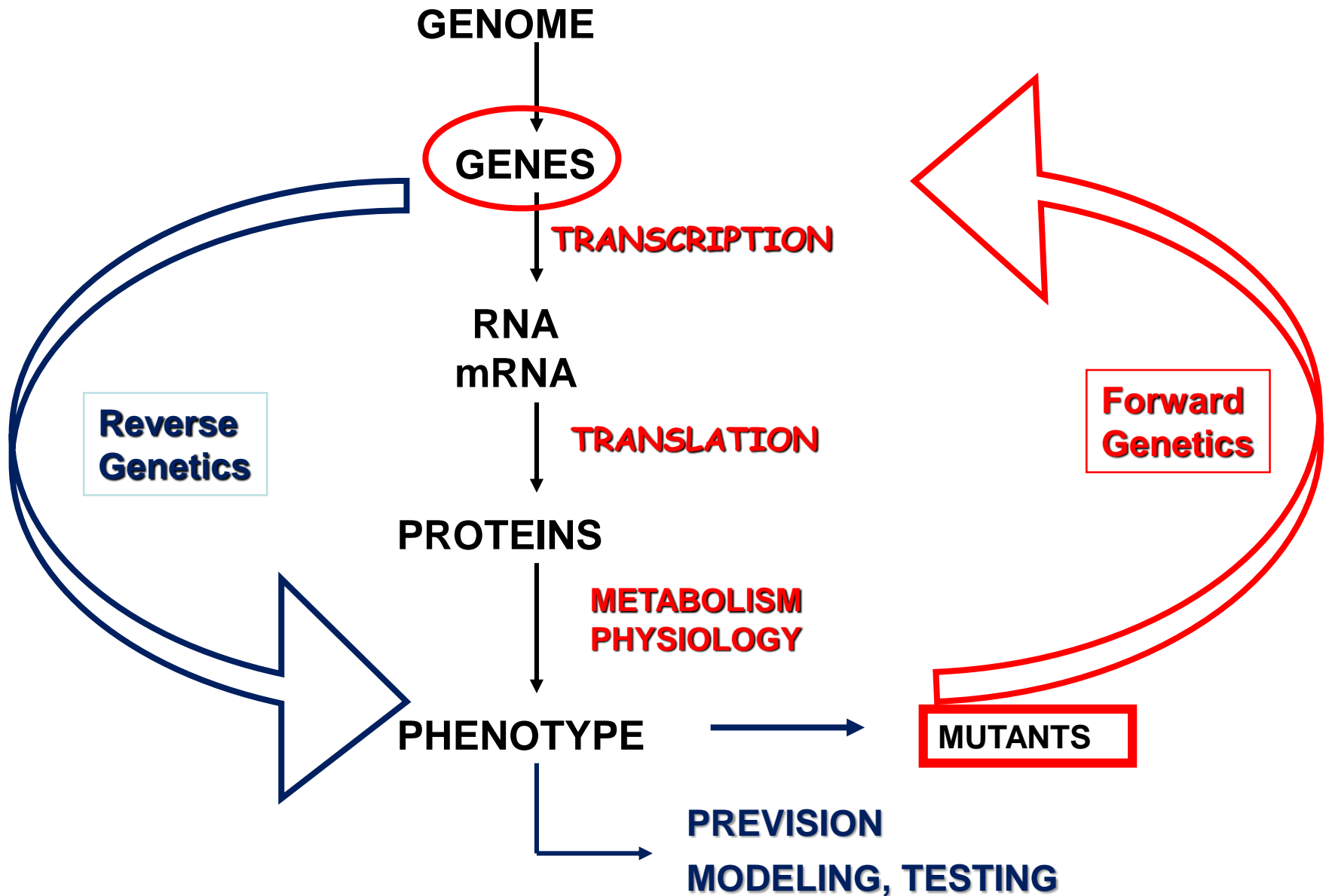
Methods: Biometry and Quantitative Genetics

2. MENDELIAN SCHOOL

Approach: Reductionist

Methods: Mendelian Genetics, Molecular Genetics

Genetic Approaches

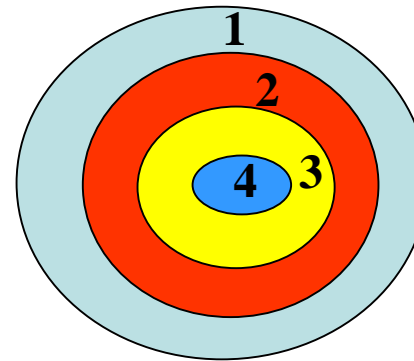


THE POWER OF FORWARD GENETICS: FLOWER DEVELOPMENT in *Arabidopsis thaliana*



*Arabidopsis
thaliana*

**whorl = a circular
arrangement of leaves or
flowers or other organs
radiating from a single node**



Concentric whorls

1. Sepals
2. Petals
3. Stamens
4. Carpels

**The German poet Goethe in XVIII century hypothesized
that a flower is a transformed leaf**

Single-gene Homeotic Mutations Disrupt the Genetic Regulation of Organ Identity



Mutant *apetala 1*



Mutant *pistillata*



Mutant *agamous*

ABC Model



nature

International journal of science



Altmetric: 11 Citations: 1728

Review Article | Published: 05 September 1991

The war of the whorls: genetic interactions controlling flower development

Nature 353, 1991

Enrico S. Coen & Elliot M. Meyerowitz

Link Between Forward Genetics and Reverse Genetics

Homeotic genes code for transcription factors controlling flower development

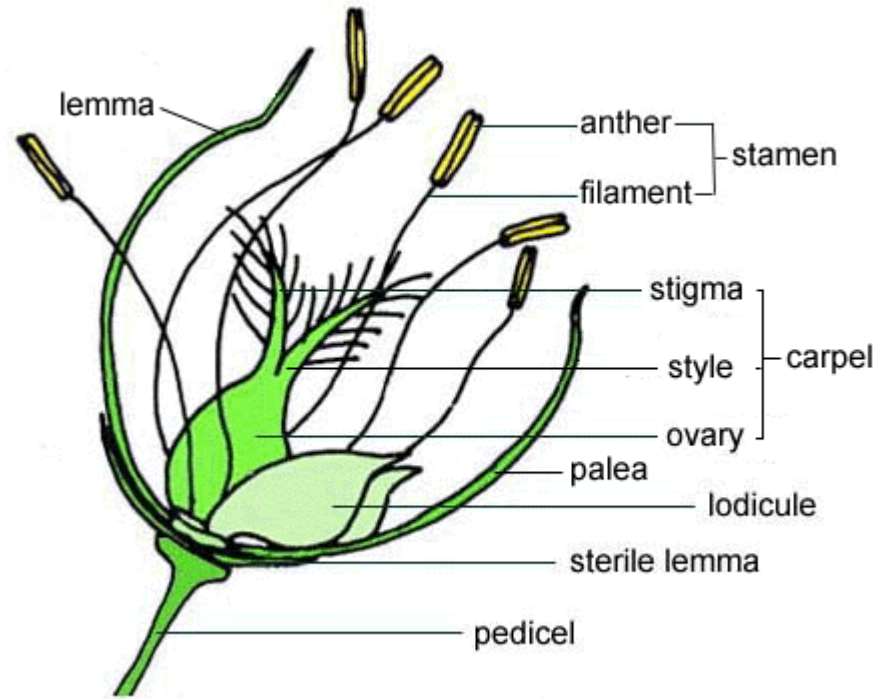
Most of homeotic genes belong to the MADS box gene family

MADS is a functional domain of about 60 AA for binding to DNA **HIGHLY CONSERVED**

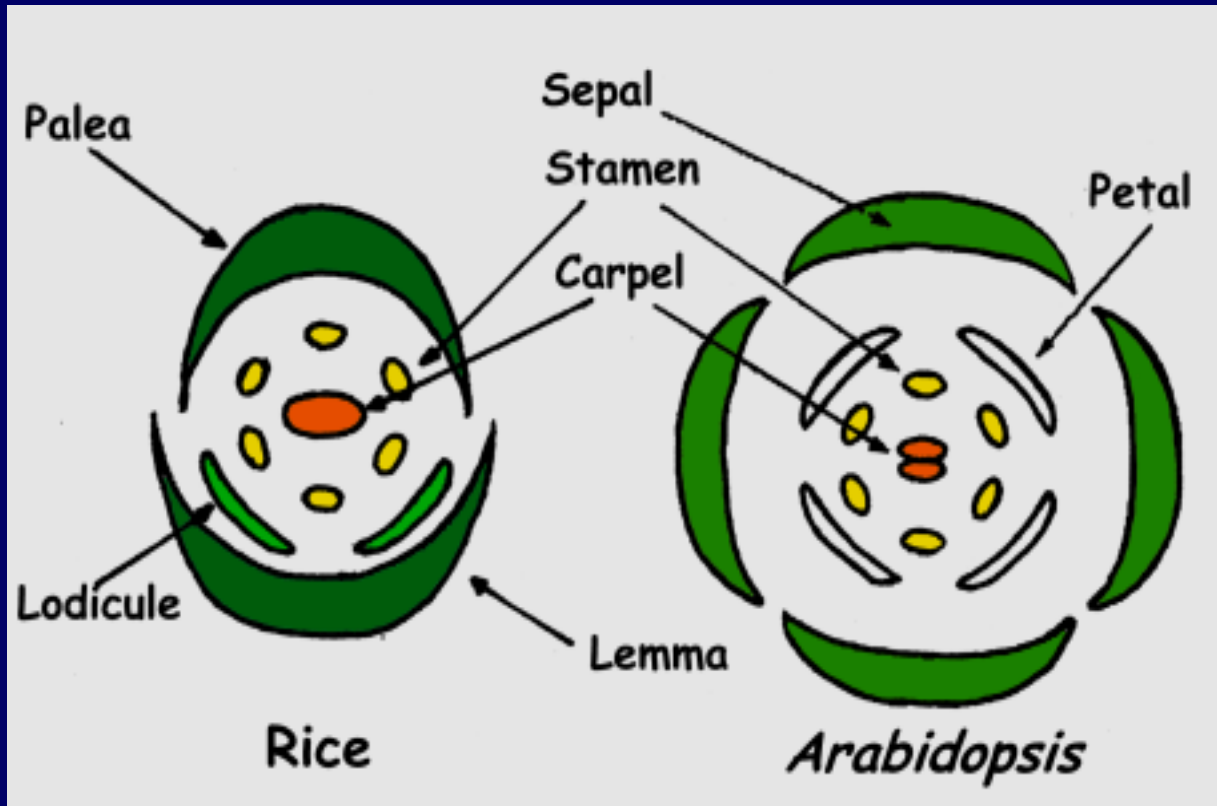
Starting from this information it is possible to isolate **MADS** genes from other species and test the model in other species as well



Arabidopsis



Rice spikelet



Quantitative Traits

The most important for breeding and evolution

Mendelian Analysis cannot be applied

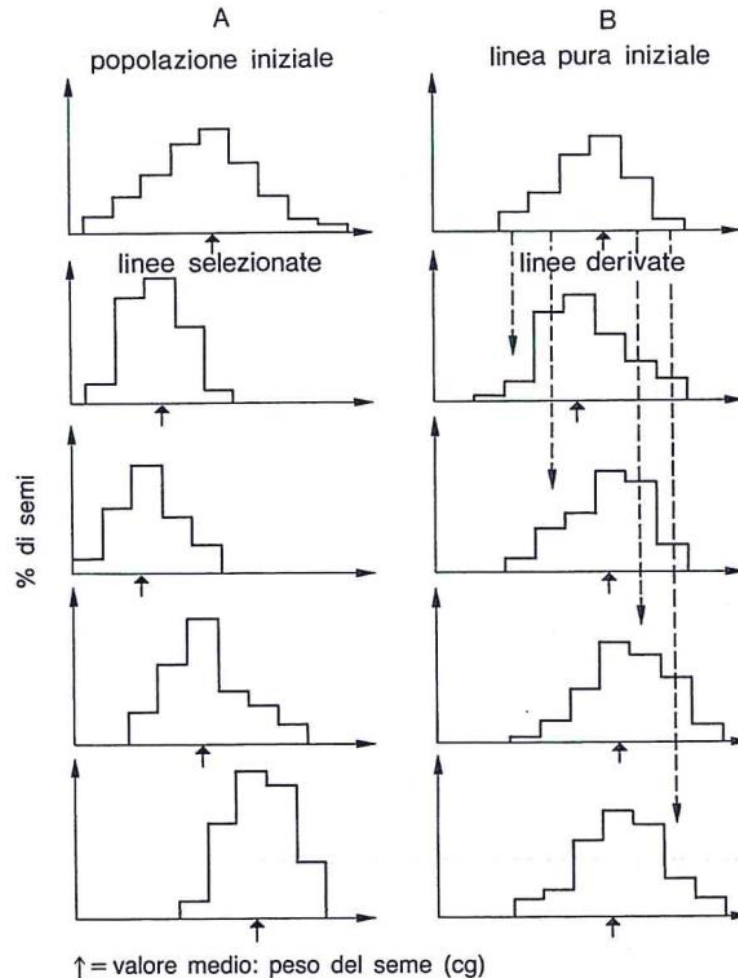
Differences among individuals are measured

Phenotypic values depend on genetic and environmental factors

Genetics and Environment

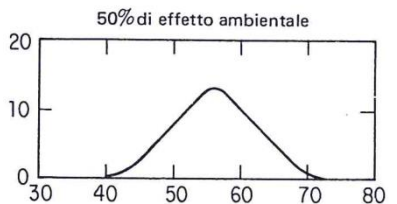
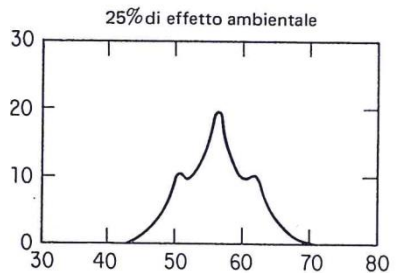
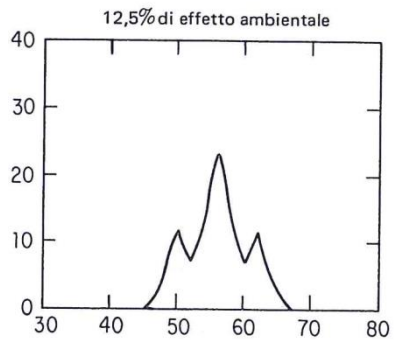
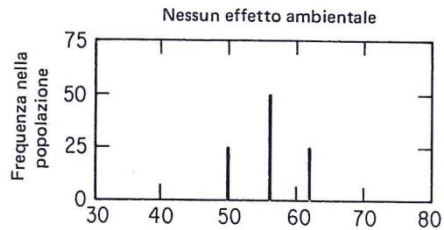


Wilhelm Johannsen
(1857-1927)
Danish botanist
Coined the terms
Gene, Genotype
and Phenotype



**1903: the beans
pure lines
experiment**

The Confounding Effect of the Environment



With strong environmental effects even the action of a single segregating gene can be blurred

Theory of Polygenic Inheritance of Quantitative Traits and the Application of Biometry



Sir Ronald Fisher
(1890-1962)
British statistician
and geneticist
Great contribution to
Population genetics
and New Darwinism

- 1. Phenotypic value depends on G and E**
- 2. Genetic effects are due to the action of many genes with additive effects**
- 3. Effect of a single gene is small**
- 4. Environment has a stronger effect than that of a single gene**

CONSEQUENCES

- 1. $P = G + E$**
- 2. G is an estimate of all genetic effects**
- 3. In order to estimate G, E must also be estimated**
- 4. Application of biometrical analysis**
MOSTLY BASED on the analysis of variance

Genetic Meaning of Variance

P = phenotypic value

G = genotypic value,

E = environmental effects

P = G + E, if E acts randomly on the different individuals

Considering many individuals:

Phenotypic variation : $\sigma^2_P = \sigma^2_G + \sigma^2_E$

$\sigma^2_G = 0$ if individuals are genetically uniform

Heritability in broad sense $h^2_b = \sigma^2_G / \sigma^2_P$

Dissection of the Genetic Variance

σ^2_G can be used to predict the effect of selection (natural and artificial) only in genetically homogeneous and strictly autogamous species, if this is not the case:

- Individuals transmit their genes not their genotype
- Segregation, recombination and epistasis contribute in determining parents/offspring resemblance
- Model to partition σ^2_G in different components

$$\sigma^2_G = \sigma^2_A + \sigma^2_D + \sigma^2_I \quad \text{where}$$

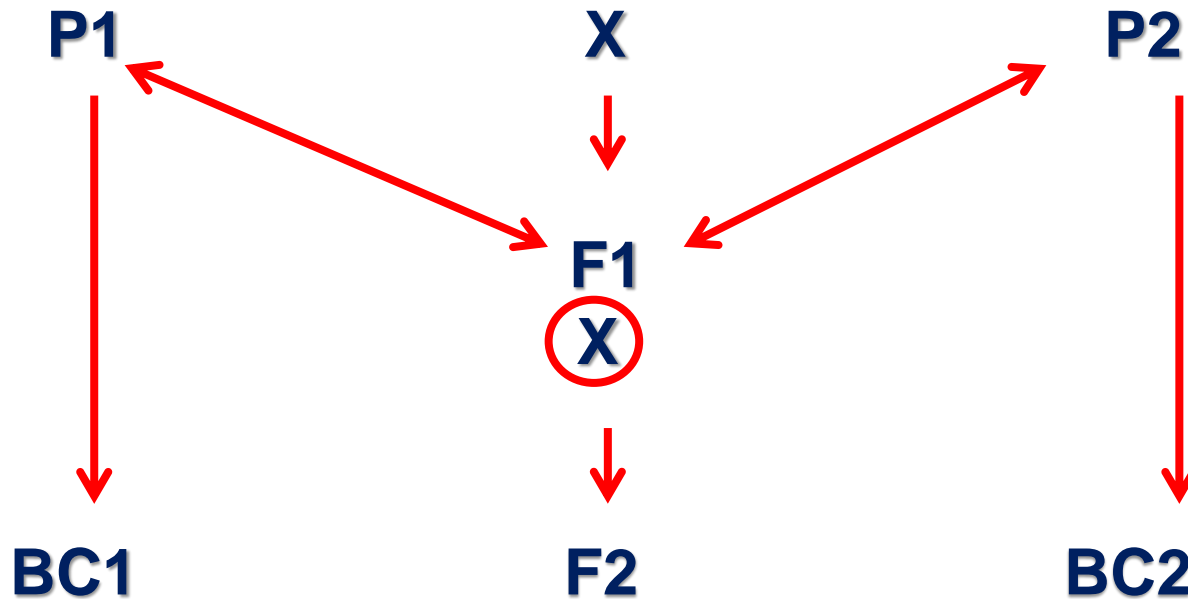
$$\sigma^2_A = \text{additive variance}$$

$$\sigma^2_D = \text{dominance variance (interactions within loci)}$$

$$\sigma^2_I = \text{variance due to interactions among different loci}$$

Mating Design

Populations with different genetic structure are produced



Different populations allow estimating σ^2_G components

Inbred lines: σ^2_A ; among F1: σ^2_D

F2: $\sigma^2_A + \sigma^2_D$; BC1 + BC2: $\sigma^2_A + 2 \sigma^2_D$

Quantitative Genetics

- **Mating design:** comparison among artificial population with different genetic structure
- **Experimental design:** accurate evaluation of phenotypic values
- **Estimate of genetic effects vs environmental effects**
- **Information on the genetic system as a whole**
- **No information on single genes effect or gene number or gene position**

Genetic Variation and Genotyping

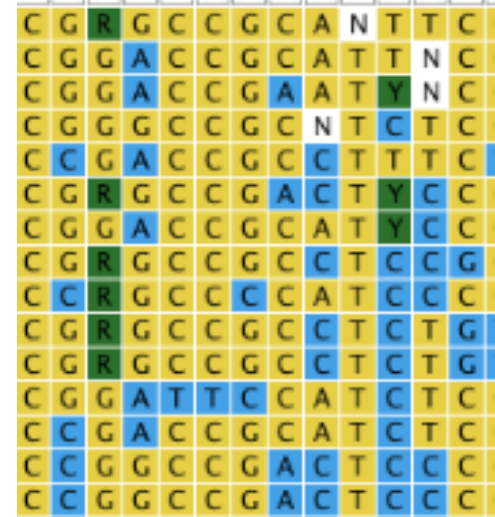
...C C **A** T T G A C...
 ...G G **T** A A C T G...
 ...C C **G** T T G A C...
 ...G G **C** A A C T G...

Allele 1

Allele 2



Different individuals



Genetic variants

Genetic Mapping in the Genomic Era

- ❖ Efficient way to MAP phenotypes
- ❖ It contributes to better understand the relationship between genotype and phenotype
- ❖ Indication on the function of DNA sequences (genes; regulatory elements)
- ❖ Based on the linkage between DNA polymorphisms and the causal factor determining phenotypic variation:
 - **STATISTICAL EVIDENCE**
 - **INDIRECT APPROACH**

If the phenotype is quantitative → **QTL Mapping**

Quantitative Trait Loci Analysis

- ❖ A QTL is a *locus* contributing to the phenotypic value of a complex (multigenic) trait.
- ❖ QTL analysis aims at the dissection of complex traits into Mendelian factors.
- ❖ Advanced statistical methods are used to test whether a QTL is likely to be present at certain *loci*.
- ❖ **Appropriate materials (crossing or natural populations)**
- ❖ Molecular characterization of the population
- ❖ Consistent and reproducible phenotypic data

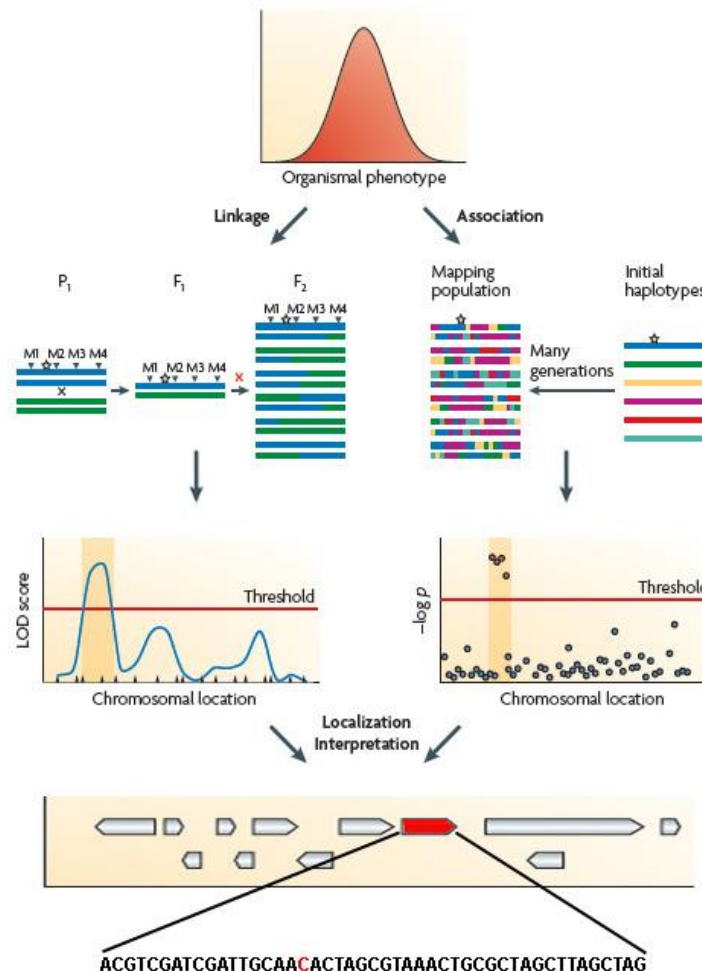


Two Different Methods to Map QTL

Linkage mapping

- low density required
- fully known pedigree
- more robust
- limited variation
- low definition
- time demanding

Structured pops

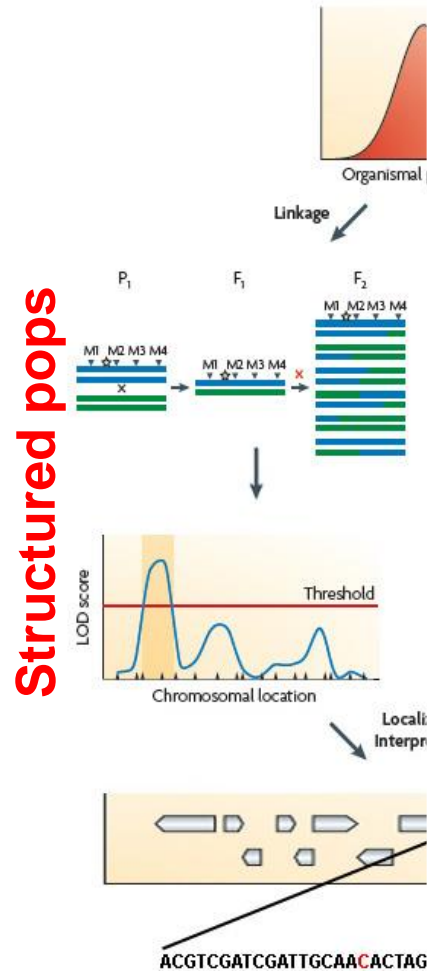


Non-structured pops

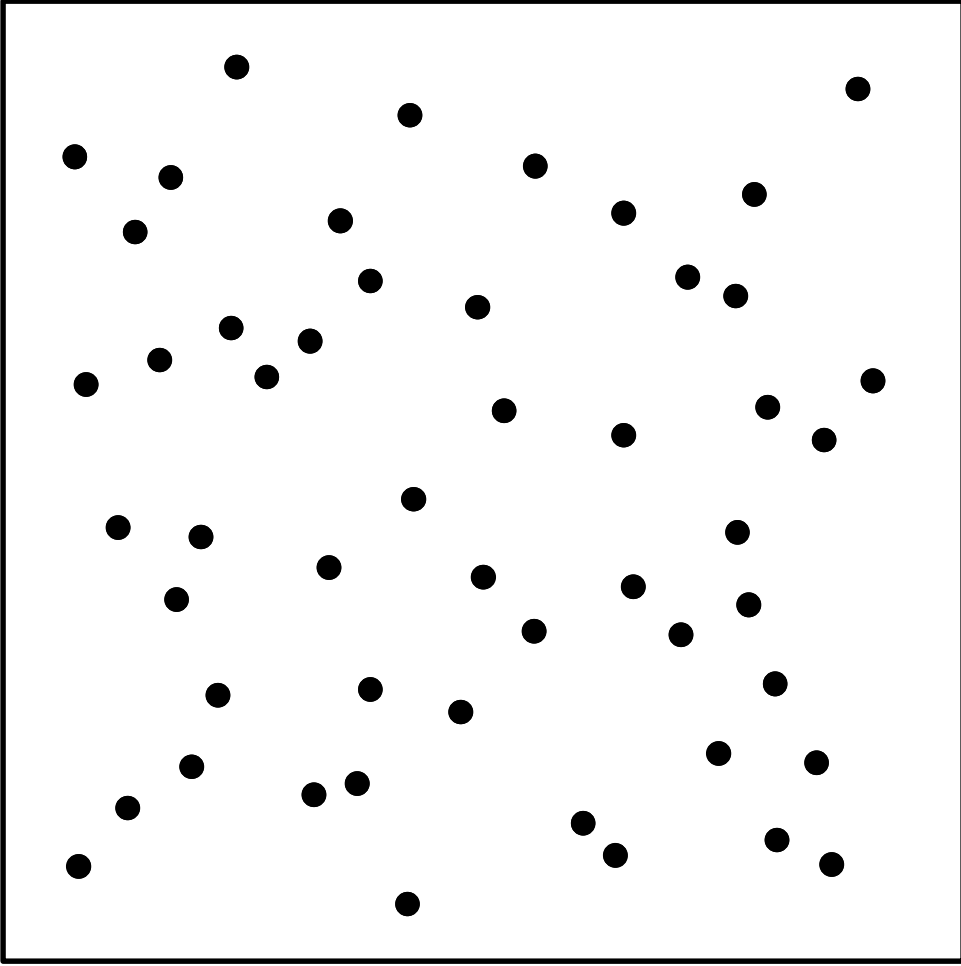
Association (GWAS)

- high density necessary
- hidden structure, LD
- higher false rate
- broad variation
- high definition
- faster, cheaper

A closer look to QTL mapping in Structured Populations

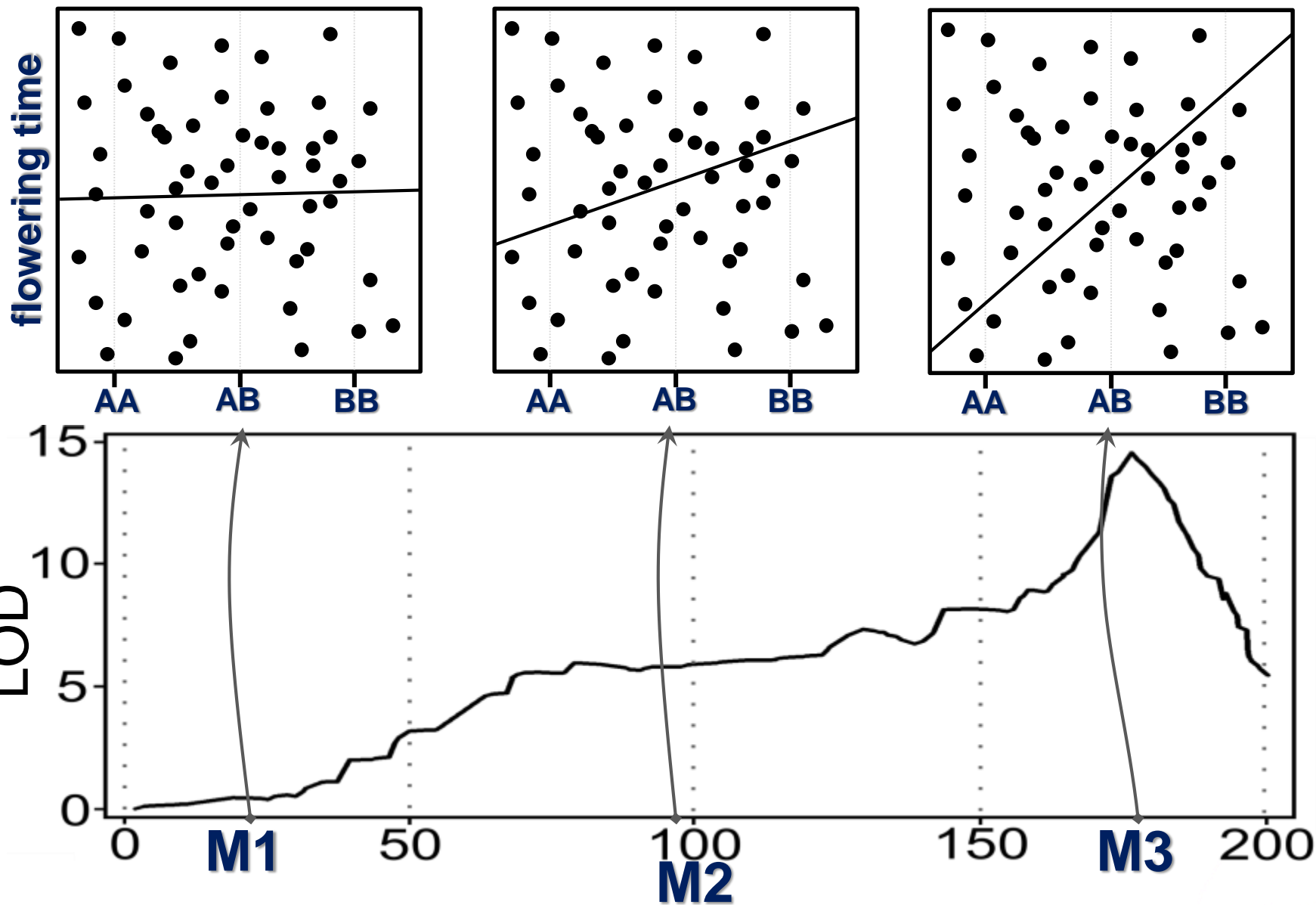


flowering time



plant

Variation

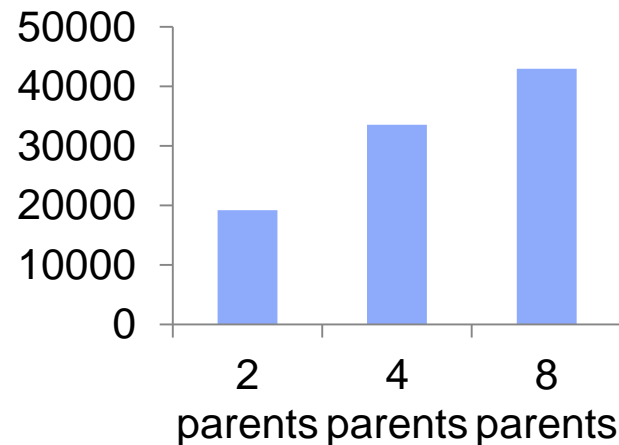
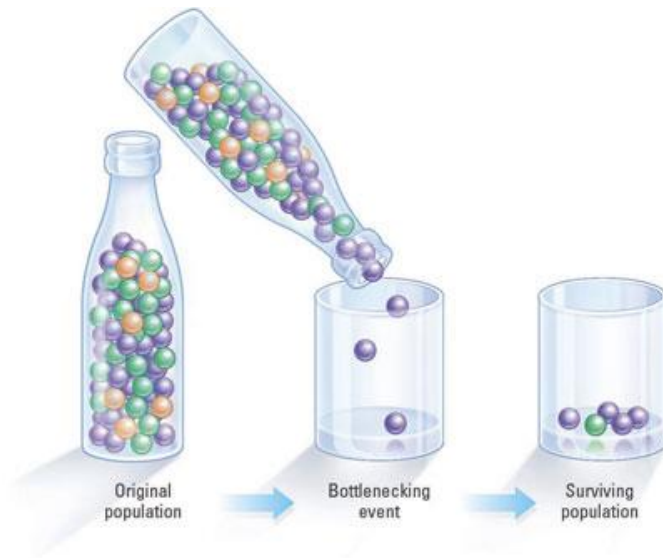


Two major features are required for QTL mapping to be efficient:

1. The amount of genetic/phenotypic **diversity** (amount of QTL detected)
2. The amount of **recombinations** (definition by which QTL are detected)

1

More diversity means more alleles into play (more segregating traits)



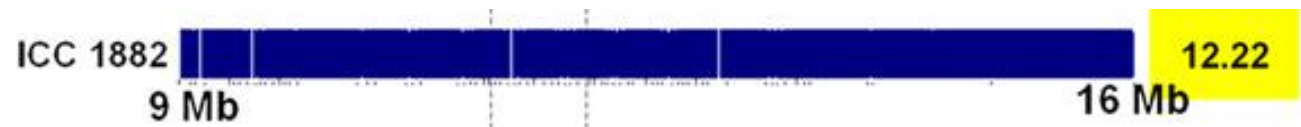
2

Imagine a QTL for Yield somewhere on this chr. Red parent high, blue parent low. How to pinpoint it?

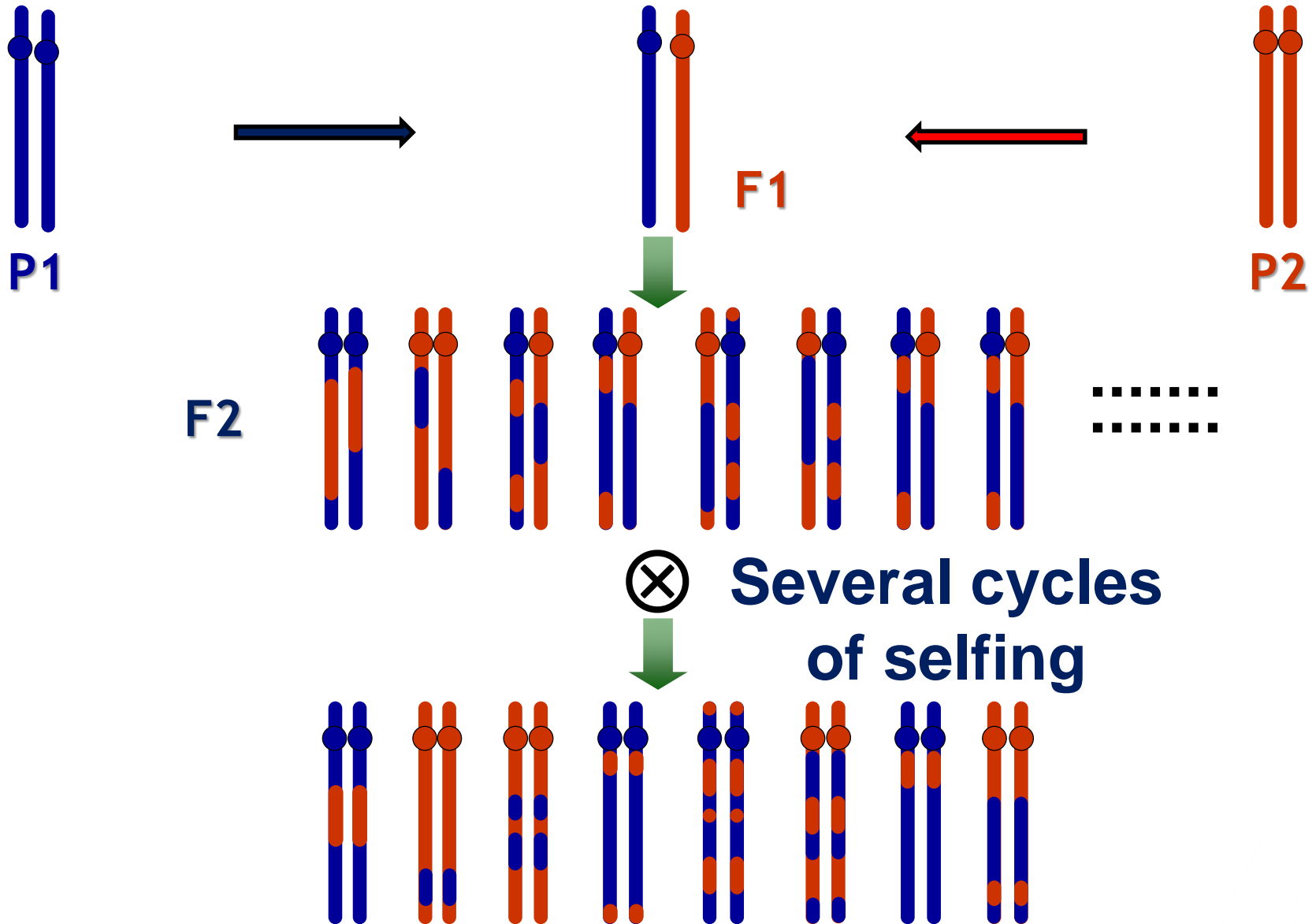
the rationale of having a segregant population is to break founder genomes in smaller recombination blocks

chromosome 7

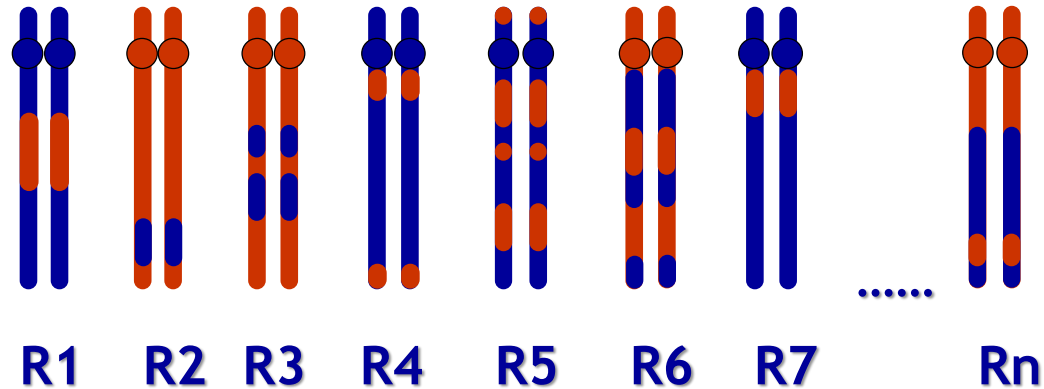
TGW



Recombinant Inbred Lines (RIL)



Recombinant Inbred Lines (RIL)



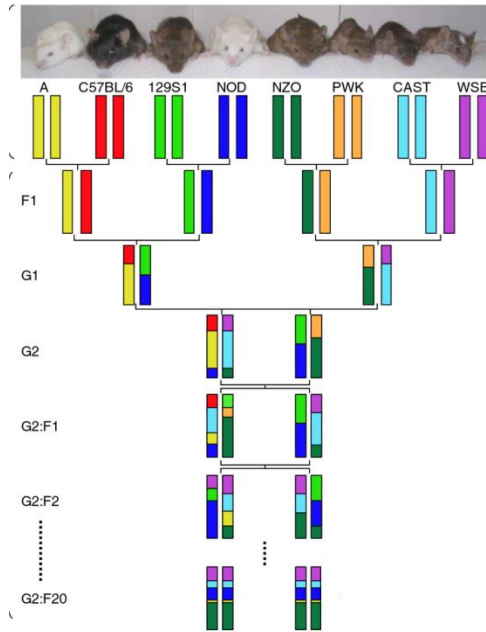
Immortalized genotypes:
recombination blocks are fixed

RILs are poor in both

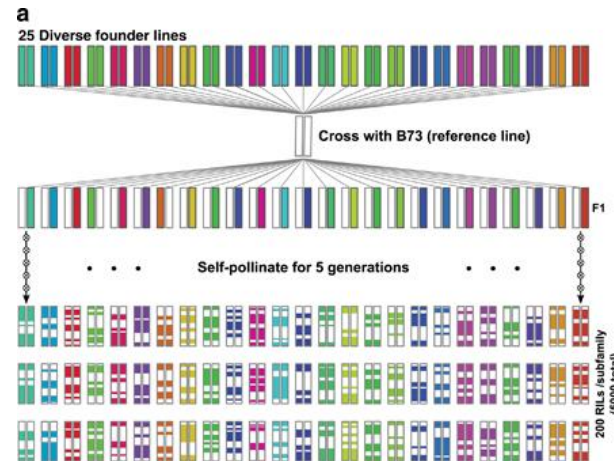
- **Variability**
- **N° of informative recombinations**

Multiparental Populations Achieve More Diversity and More Recombination Events than Biparental populations

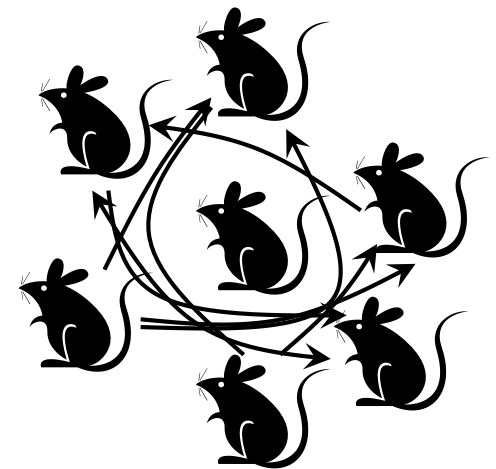
...with different designs



**Collaborative
Cross-like**



NAM-like



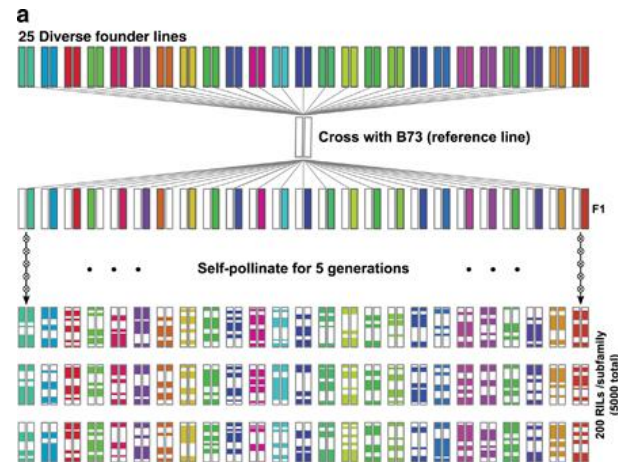
Outbred-like

and variation on the theme

The Genetic Architecture of Maize Flowering Time

Edward S. Buckler,^{1,2,3*} James B. Holland,^{1,4*} Peter J. Bradbury,^{1,2} Charlotte B. Acharya,² Patrick J. Brown,² Chris Browne,^{1,5} Elhan Ersoz,² Sherry Flint-Garcia,^{1,5} Arturo Garcia,^{1,5} Jeffrey C. Glaubitz,⁶ Major M. Goodman,⁴ Carlos Harjes,⁷ Kate Guill,^{1,5} Dallas E. Kroon,² Sara Larsson,³ Nicholas K. Lepak,^{1,3} Huihui Li,^{8,2,9} Sharon E. Mitchell,² Gael Pressoir,² Jason A. Peiffer,³ Marco Oropeza Rosas,⁴ Torbert R. Rocheford,^{10,11} M. Cinta Romay,^{2,12} Susan Romero,² Stella Salvo,^{1,4} Hector Sanchez Villeda,^{5,13} H. Sofia da Silva,¹⁰ Qi Sun,¹⁴ Feng Tian,² Narasimham Upadyayula,¹⁰ Doreen Ware,^{1,15} Heather Yates,² Jianming Yu,¹⁶ Zhiwu Zhang,² Stephen Kresovich,^{2*} Michael D. McMullen^{1,5*}

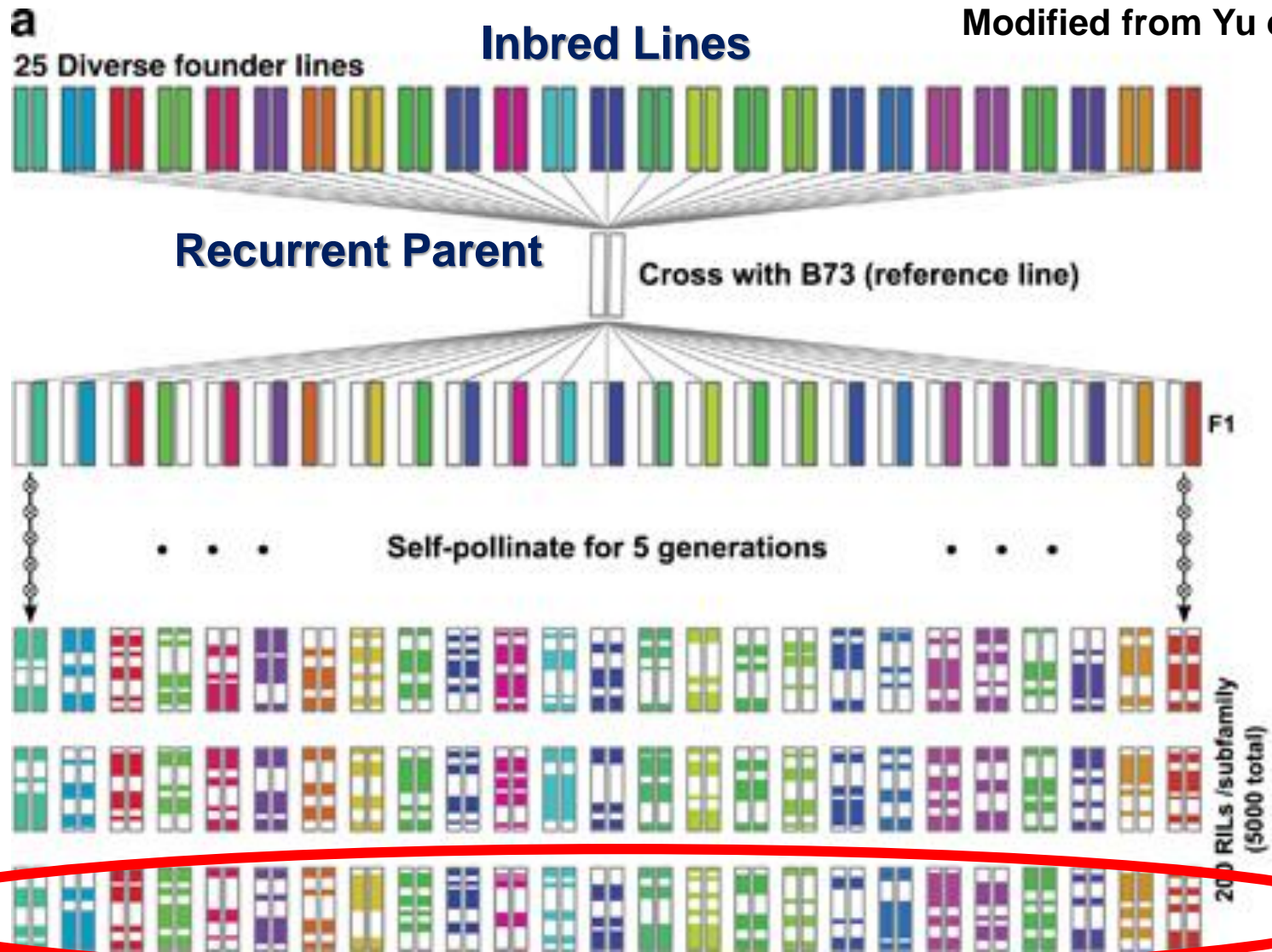
7 AUGUST 2009 VOL 325 SCIENCE



Nested Association Mapping - NAM - Population

Nested Association Mapping - NAM - Population

Modified from Yu et al. 2008



NAM POPULATION CHARACTERISTICS

Advantages

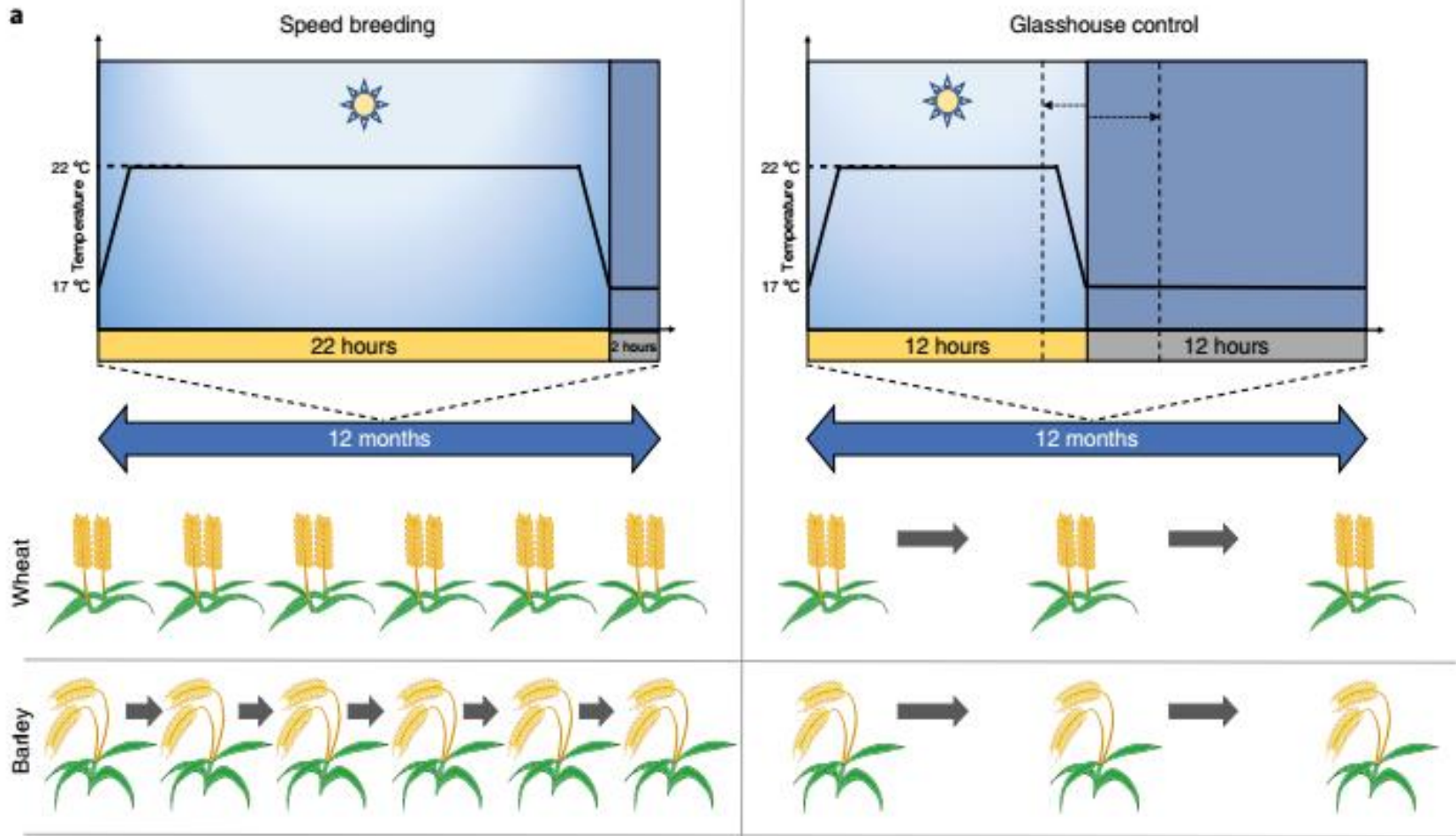
- **Easy to produce**
- **A lot of variation**
- **Open scheme**

Disadvantages

- **Genetic variation dispersed**
- **It does NOT increase the number of recombinations / RIL**
- **It requires high number of RIL to achieve high definition**

NAM Populations Currently Publicly Available

Species	Founders	# of Lines	Notes	Reference
Barley	25 wild x elite	1,420	BC-NAM 5,700 SNP	Maurer et al. 2016
Spring wheat	9 x elite	852	Stem rust	Bajgain et al. 2016
Sorghum	10 x recurrent	2,310	6,000 SNP chip	Bouchet et al. 2017
Soybean	40 x elite	5,600	90,000 SNP chip	Song et al . 2017
Durum wheat	50 landrace x elite	6,280	1,200 9,000 SNP chip	Kidane et al. submitted



ETHIOPIA: Valorization of durum wheat genetic resources



- 100? Million people (2°in Africa)
- 83% of the population lives of subsistence farming in rural areas (accounting for 47% of GDP)
- Per capita GDP is 550 \$
- 40% of the population is undernourished



**Ethiopia is a
Vavilov center
for crop
diversity**

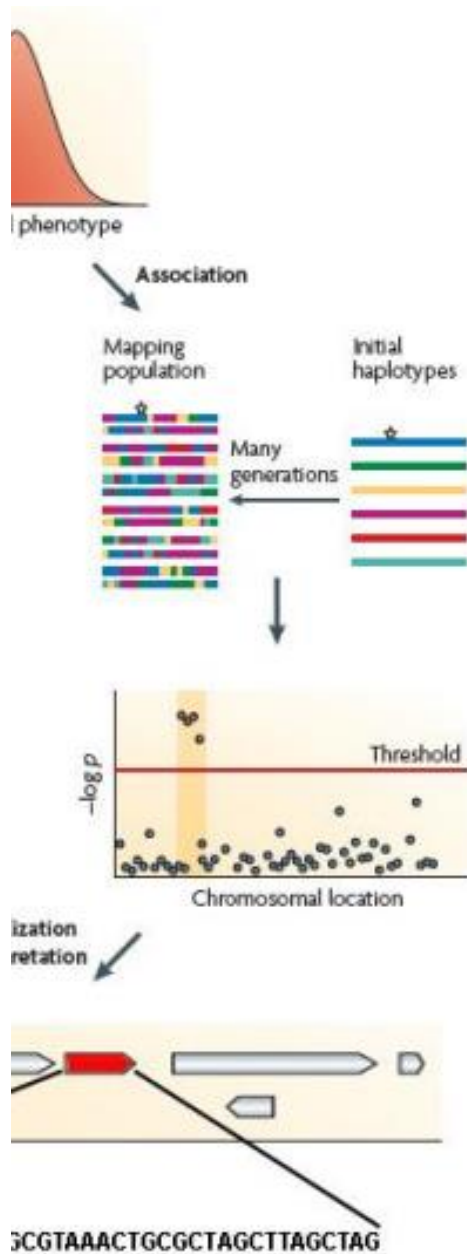


**Coffee, barley, millet, sesame, teff,
durum wheat**

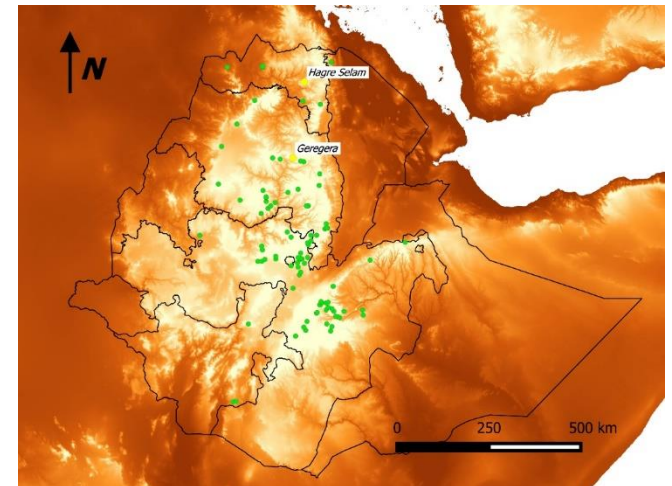
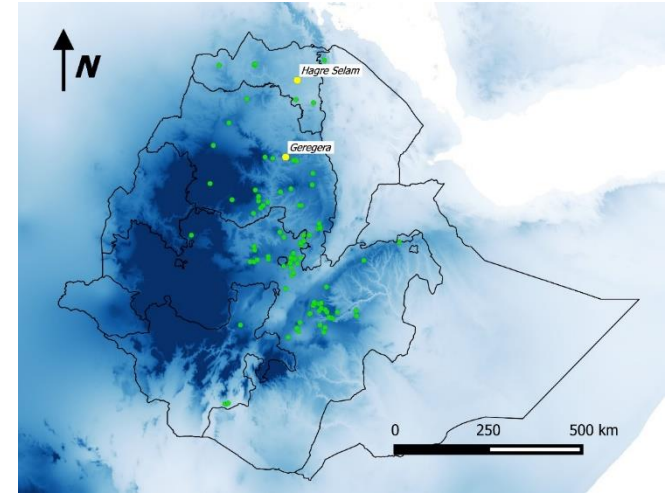
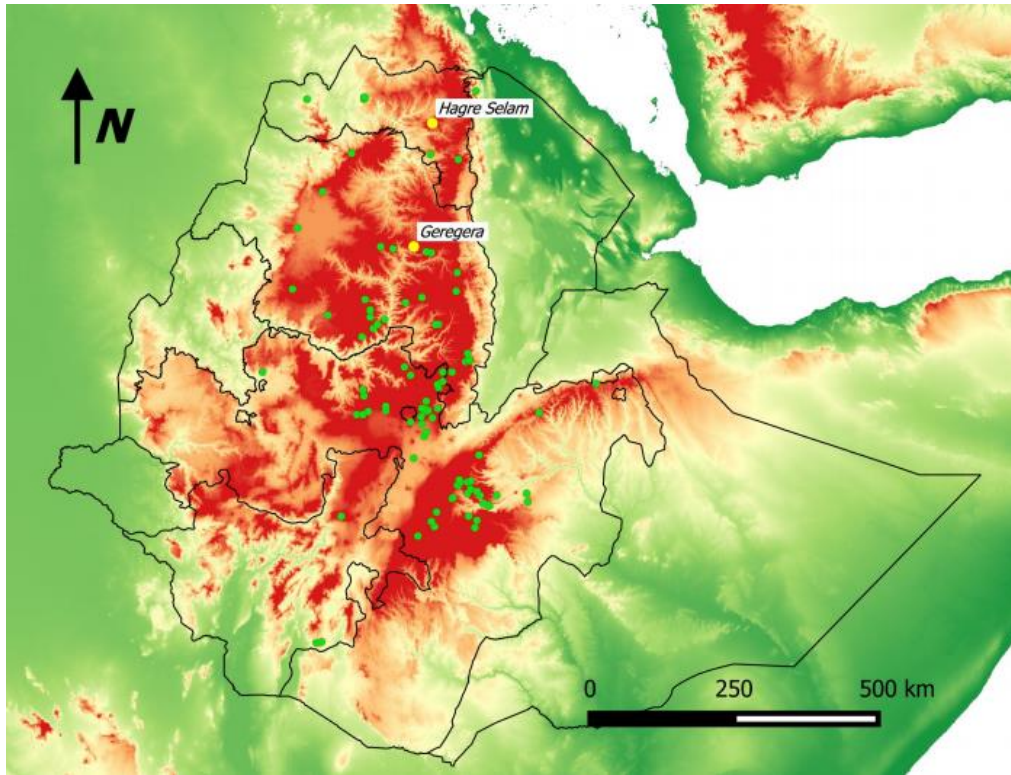
**Diversity is mostly maintained in
thousands of landraces cultivated
within the family farming system,
partially maintained at the Ethiopian
Biodiversity Institute**

Diversity Panels

Non-structured pops

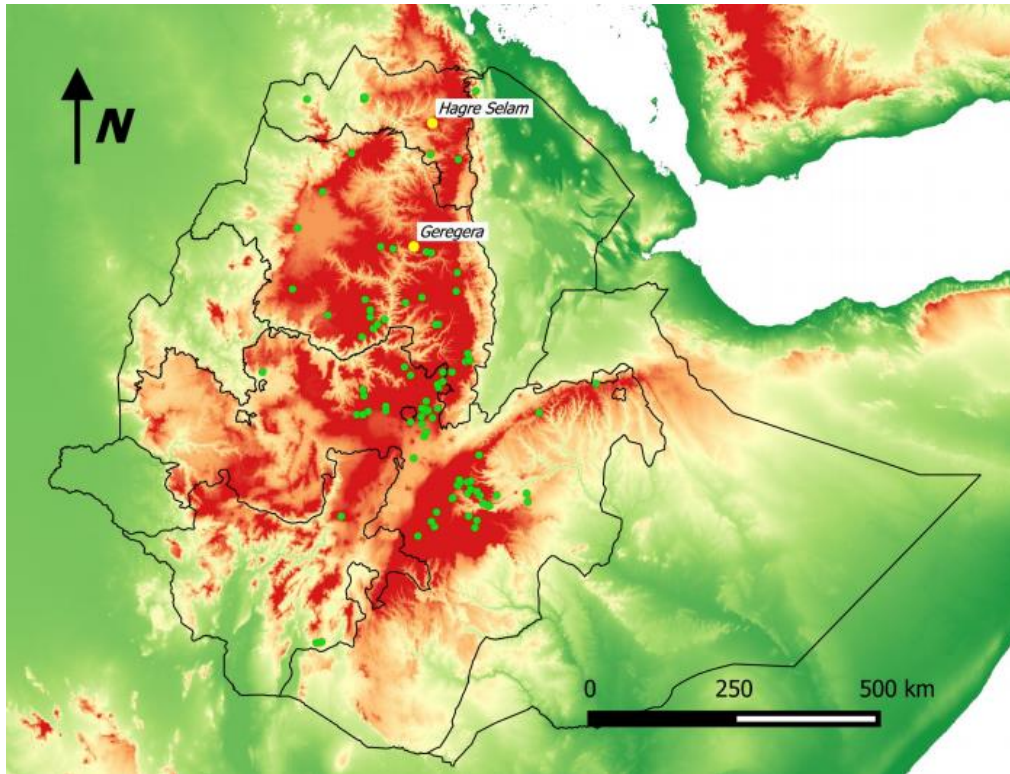


The massive diversity in Ethiopian landraces is linked to the varying environmental conditions in which durum wheat is cultivated in rainfed, low input fields → landraces are adapted to local climate



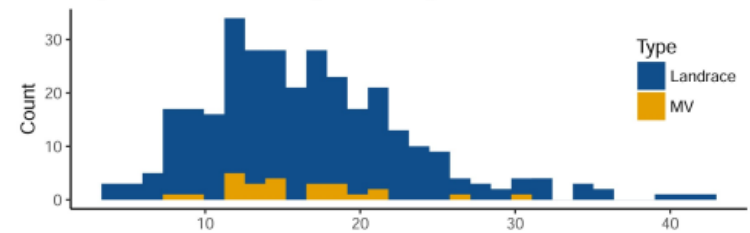
Landscape genomics approaches can be used to track the molecular basis of environmental adaptation of landraces

ASSEMBLY and CHARACTERIZATION of a DIVERSITY PANEL for GWAS ANALYSIS

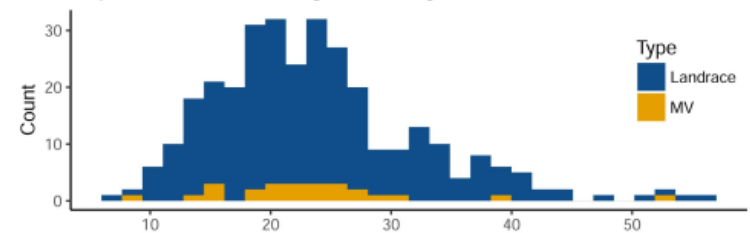


Landraces have broad variation in agronomic traits. Some landraces have interesting stress resistance traits (drought – pests)

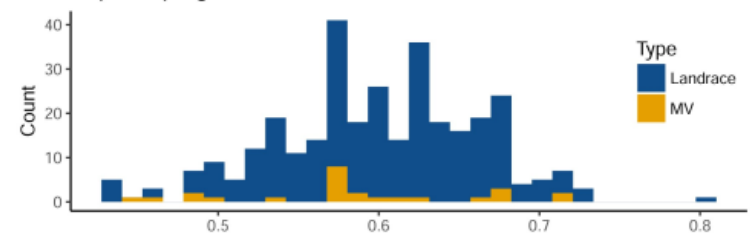
Septoria disease severity at heading



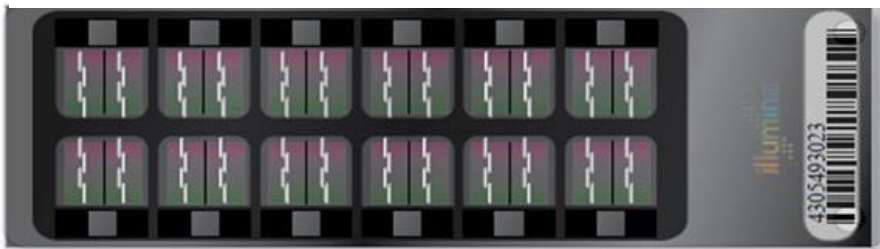
Septoria disease severity at maturity



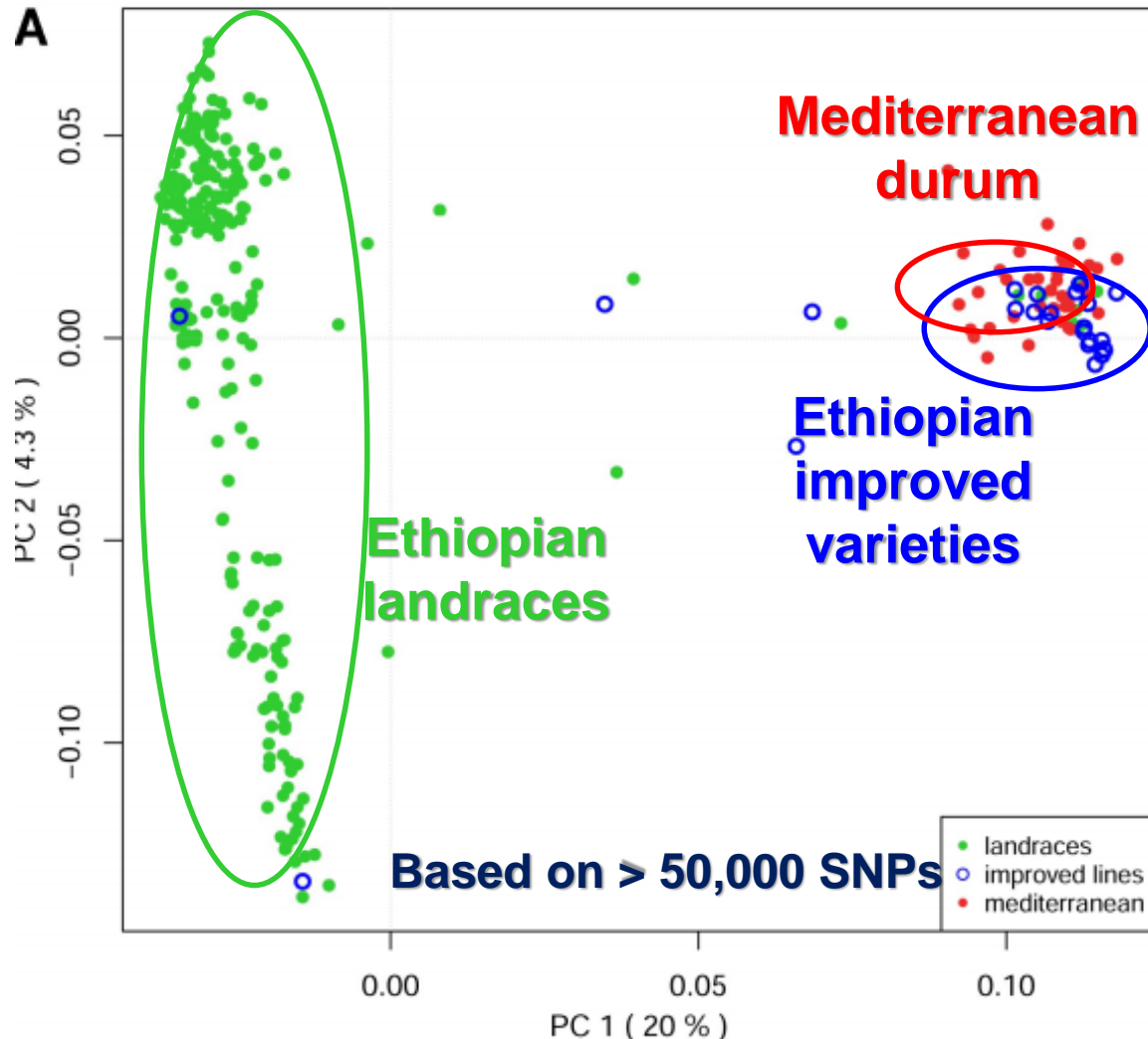
Septoria progress coefficient



90,000 genome-wide SNP markers



Principal Component Analysis on Molecular Data of the Diversity Panel



MAIN MESSAGES

- Ethiopian landraces are genetically very different
- Most improved varieties are genetically similar
- Ethiopian germplasm is mostly untapped

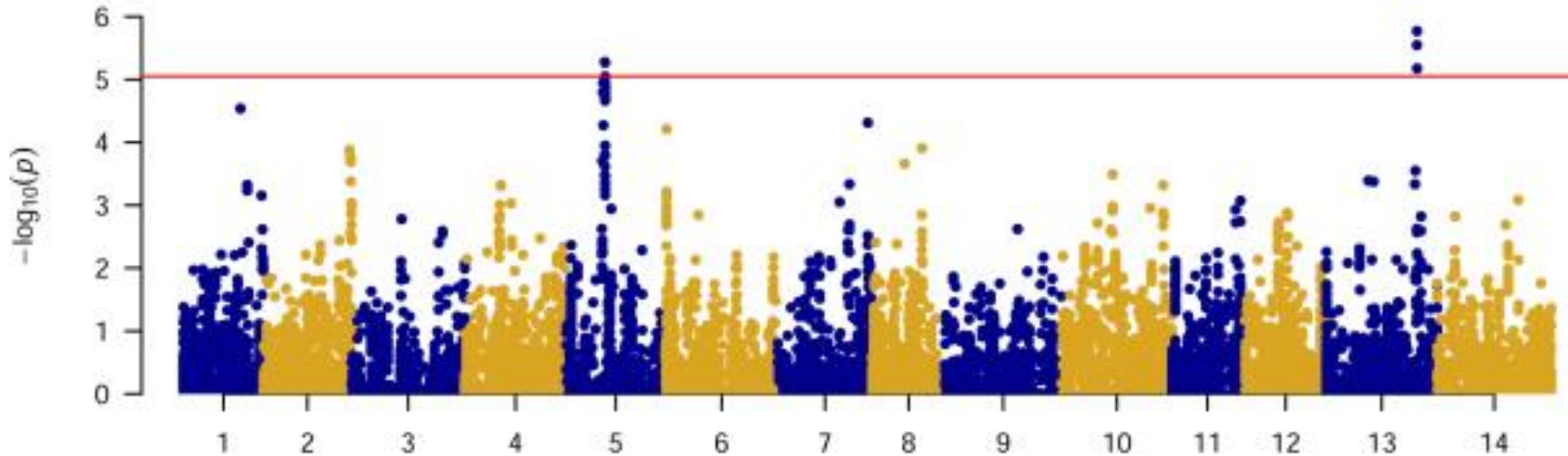
Genome-Wide Association Study (GWAS)

C	G	R	G	C	C	G	C	A	N	T	T	C	
C	G	G	A	C	C	G	C	A	T	T	N	C	
C	G	G	A	C	C	G	C	A	A	T	Y	N	C
C	G	G	G	C	C	G	C	N	T	C	T	C	
C	C	G	A	C	C	G	C	C	T	T	T	T	C
C	G	R	G	C	C	G	C	A	C	T	Y	C	C
C	G	G	A	C	C	G	C	C	A	T	Y	C	C
C	G	R	G	C	C	G	C	C	T	C	T	G	C
C	G	R	G	C	C	G	C	C	T	C	T	G	C
C	G	R	G	C	C	G	C	C	T	C	T	G	C
C	G	G	A	T	T	C	C	A	T	C	T	C	C
C	C	G	A	C	C	G	C	A	T	C	T	C	C
C	C	G	G	C	C	G	C	A	C	T	C	C	C
C	C	G	G	C	C	G	C	A	C	T	C	C	C

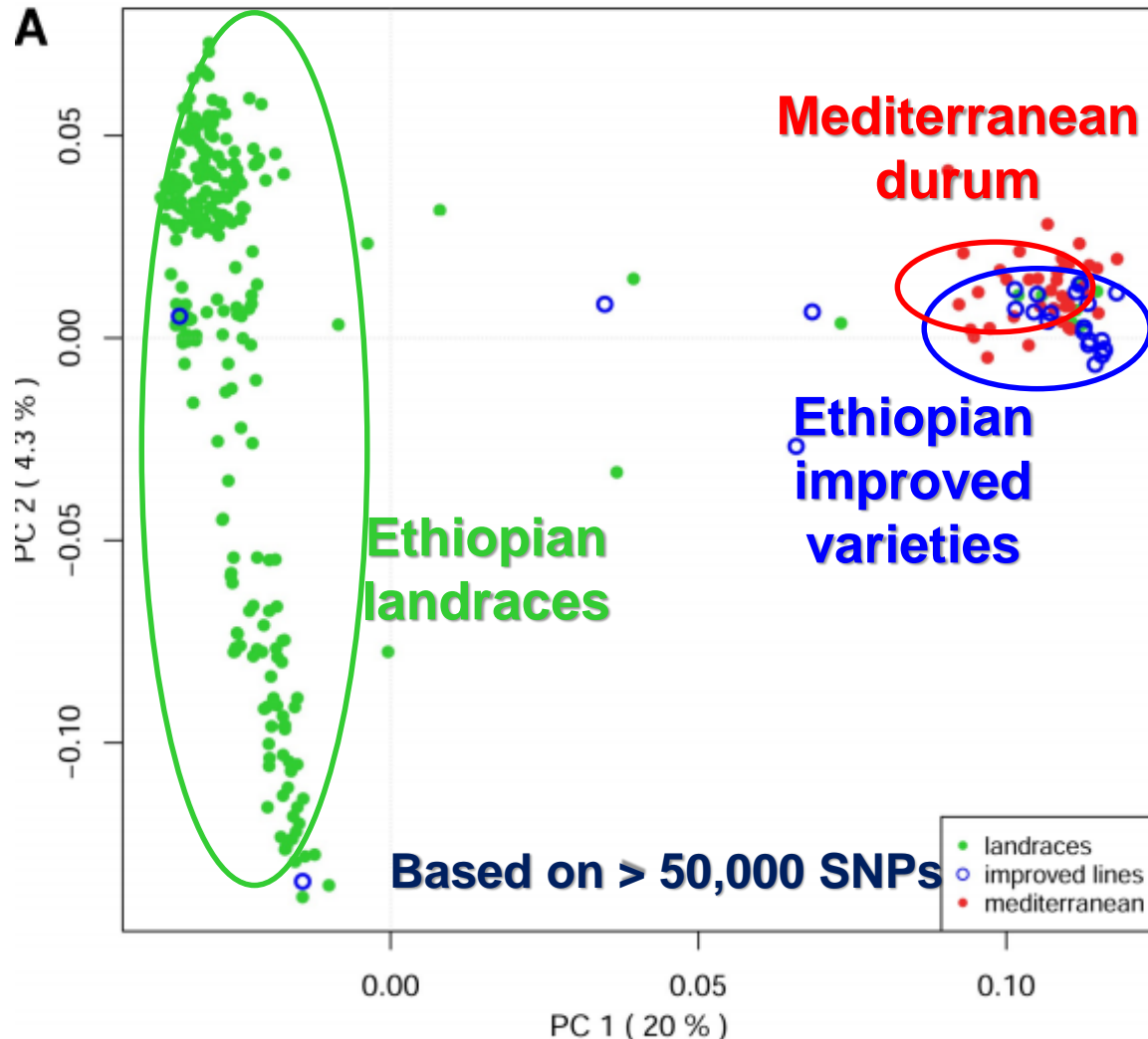
**Genome-wide
molecular
markers**

**Phenotypic
measures /
Environment
al measures**

**Statistical analysis
- mixed linear
models**



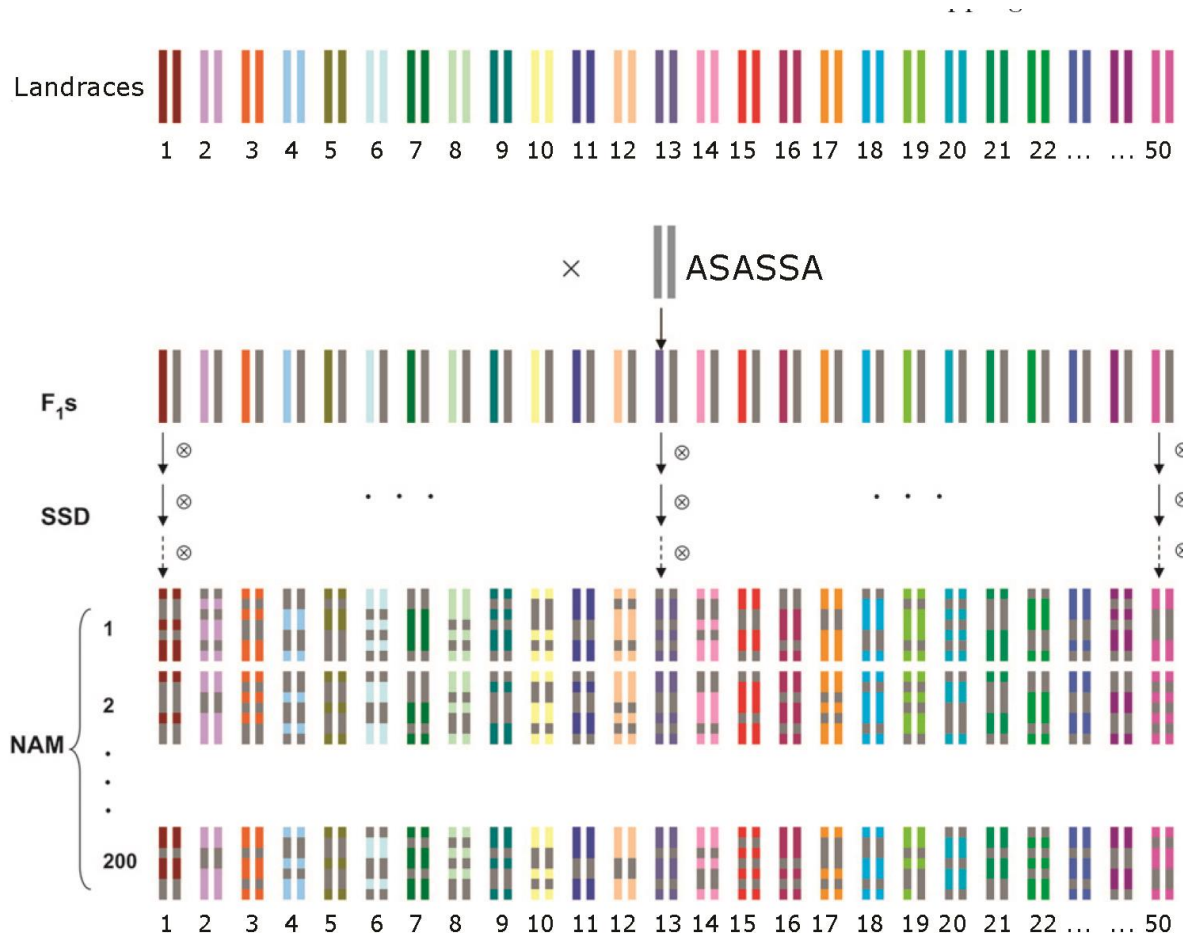
Principal Component Analysis on Molecular Data of the Diversity Panel



MAIN MESSAGES

- Ethiopian landraces are genetically very different
- Most improved varieties are genetically similar
- Ethiopian germplasm is mostly untapped

NAM Population in Ethiopian durum wheat



Principal Facts

- 50 landraces crossed to an improved variety
- development of 50 RIL families of 80 – 230 lines
- 6,280 F6 lines in available

Modified from Yu et al. 2008

Founders choice and characterization: **phenotypes**

Dual Objective:

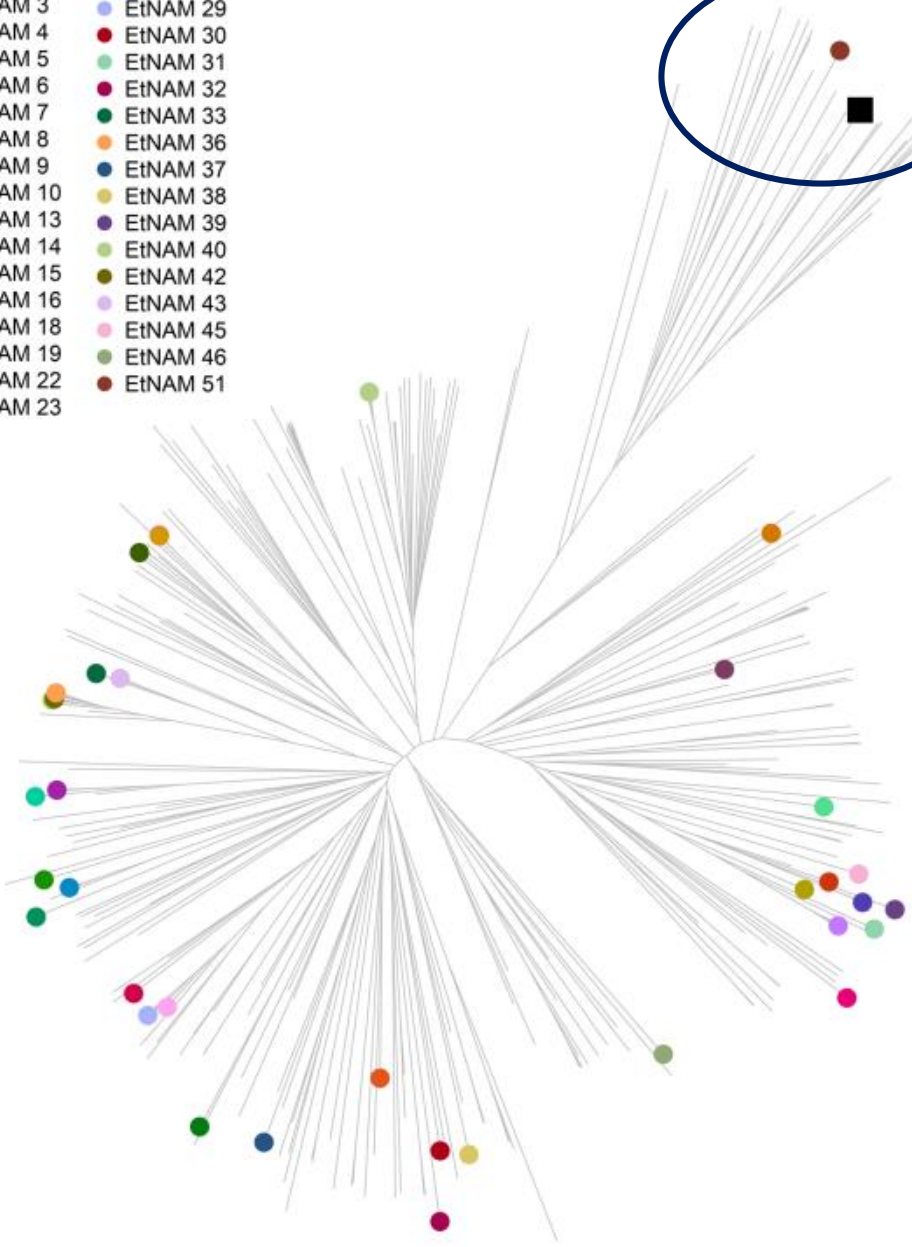
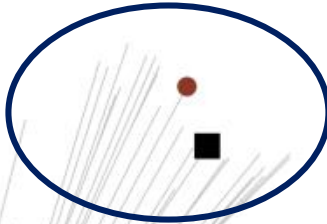
- 1. Advanced QTL mapping**
- 2. Pre-breeding material**



Some traits deliberately included in the NAM: drought resistance, pest resistance, yield, earliness, rusticity

- RF
- EtNAM 1
- EtNAM 2
- EtNAM 3
- EtNAM 4
- EtNAM 5
- EtNAM 6
- EtNAM 7
- EtNAM 8
- EtNAM 9
- EtNAM 10
- EtNAM 13
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- EtNAM 45
- EtNAM 46
- EtNAM 51

Elite varieties

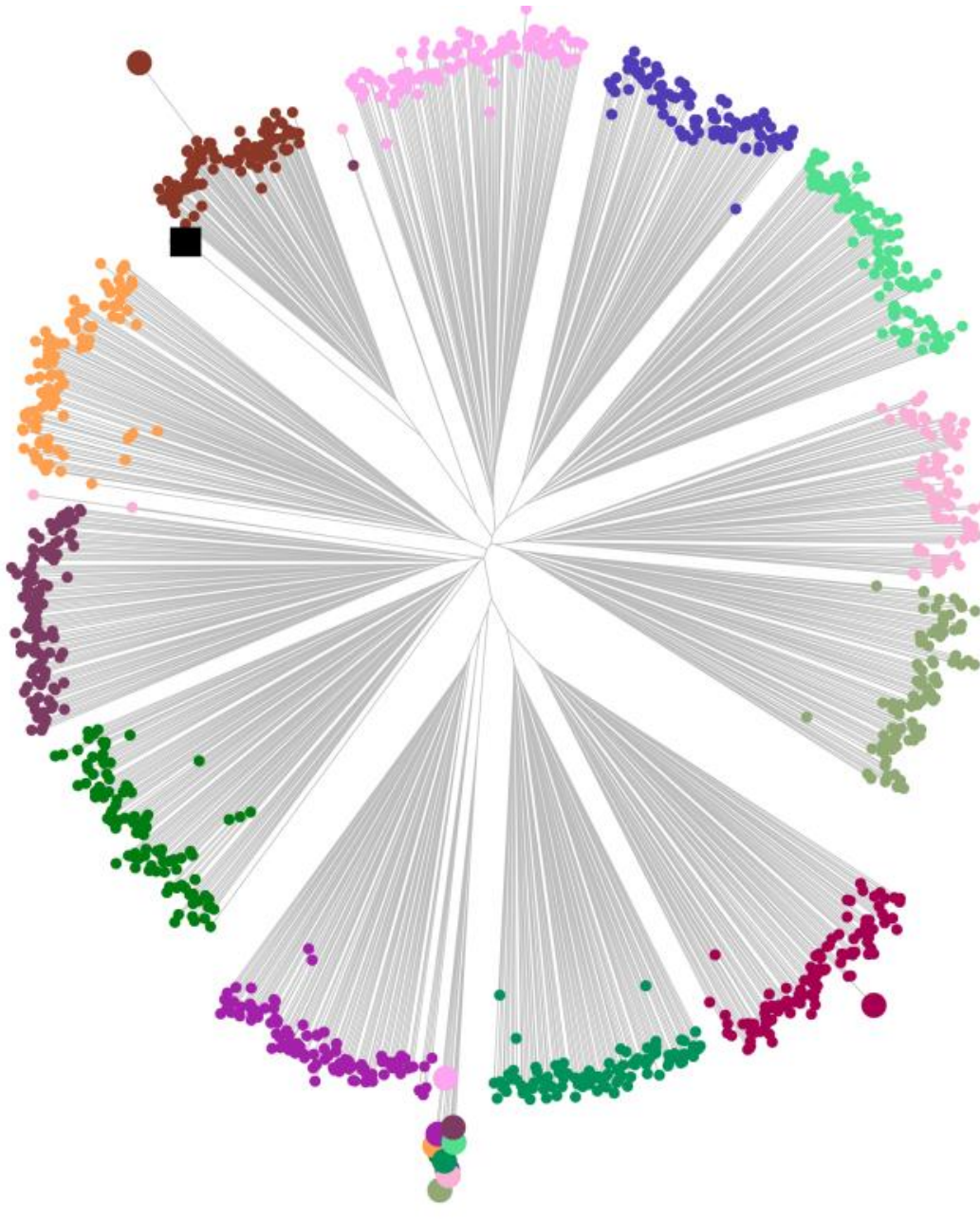


**Founder choice and
characterization:
genotypes**

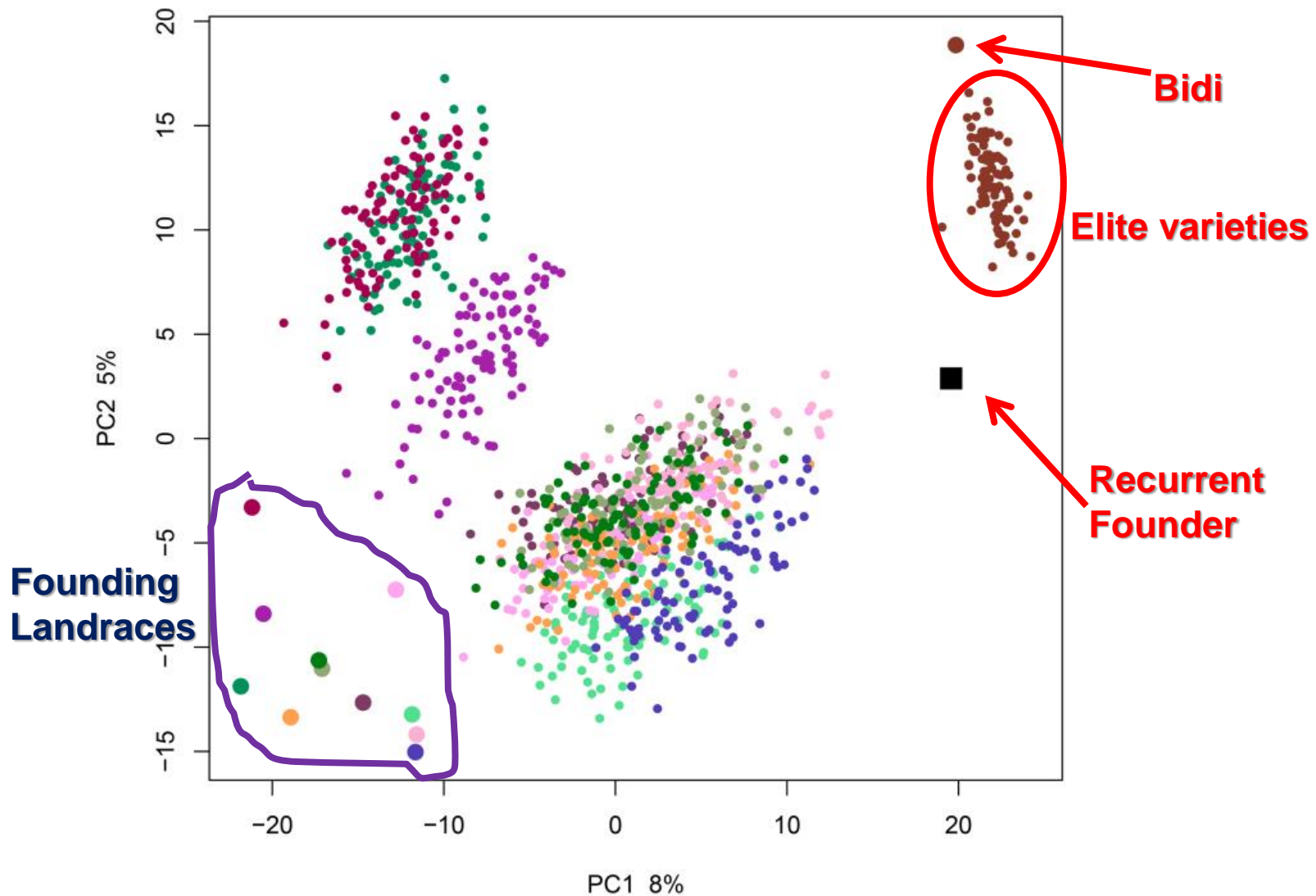
**Nj phylogeny
representing the
molecular diversity of
Ethiopian durum
wheat**

**Genotyping of 12
EtNAM Families (100
RILs each) with
12,203 SNPs**

**Neighbor Joining
Tree
12 monophyletic
clades**



Filling the Gap between Ethiopian Landraces and Elite Germplasm



Phenotypic Characterization and QTL Mapping

2 Locations, 1,300 genotypes, 2 replicates per location two years

10,400 plots

Phenological Traits + Agronomic Traits + Resistance to fungal pathogens + protein content

> 300,000 data points



Septoria tritici blotch
Mycosphaerella graminicola



Leaf rust
Puccinia triticina



Participatory Evaluation Approches with Local Farmers' Communities
4 Farmers' Traits

Acknowledgments



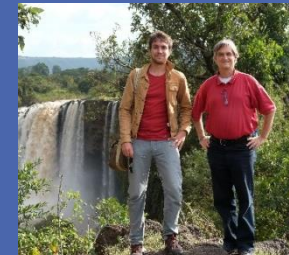
Yosef Kidane, PhD
Bogale Nigir, MD
Cherinel Aleml, MD



Dejene Mengistu, PhD
Chiara Mancini, PhD



Carlo Fadda, PhD



Sant'Anna
School of Advanced Studies – Pisa

