# Letting the genie out of the maize genebank bottle



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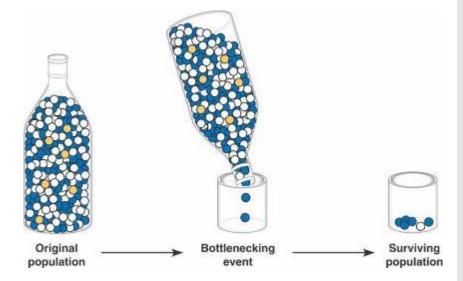
#### "Genebanks are not museums"

- Most of the requests to banks with maize and wheat germplasm holdings are for described elite lines or landraces / wild relatives with some publication history
- The majority of breeders would not "touch" an un-described landrace and would have to be "desperate" to use one even with very good characterisation



#### The genie in the genebank bottle

- Farmers and breeders have spent a long time removing unwanted genetic variation
- This bottlenecking was in many cases a good thing, the frequency of favourable traits was increased compared with deleterious traits.
- However, it carried the penalty of "throwing the baby out with the bathwater"- valuable genetic variation has been lost also during the selection process



http://bio1151.nicerweb.com/Locked/media/ch23/bottleneck.html

## Bridging the divide- getting the needles from the haystack



## Research emphasis

#### Breeding-oriented

#### **Upstream**

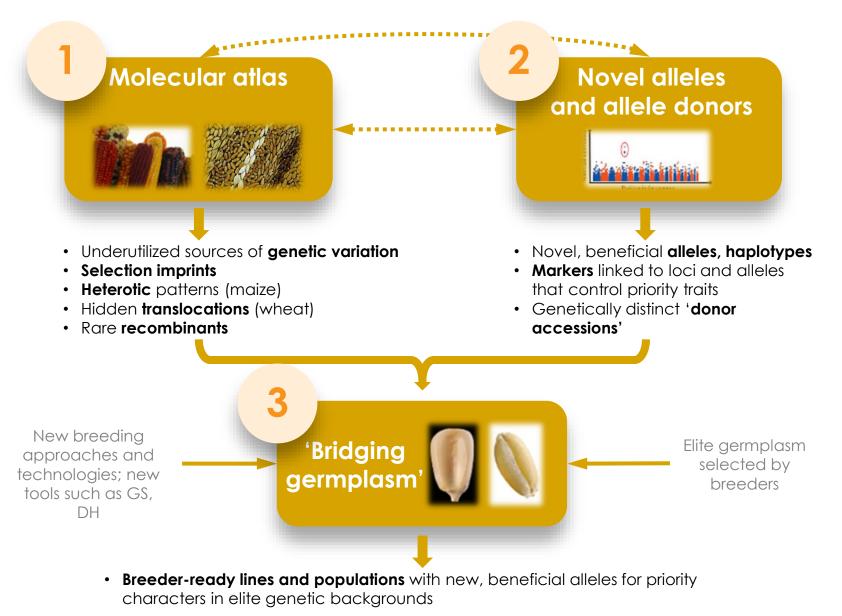
Genetically complex traits [heat/drought tolerance]

> Genetically simple traits

> [some diseases, phenology]

'Low-hanging fruits' for breeding

Main emphasis: Mobilize novel alleles for complex traits into breeding programs Seek collaborations to mine data for basic research



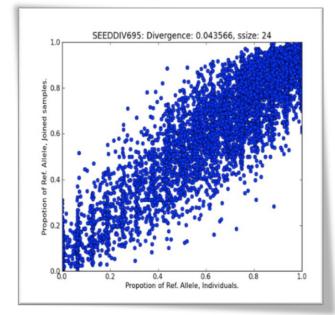
• Molecular **markers** linked to beneficial alleles and statistical **models** for estimating breeding values to accelerate genetic progress in breeding programs



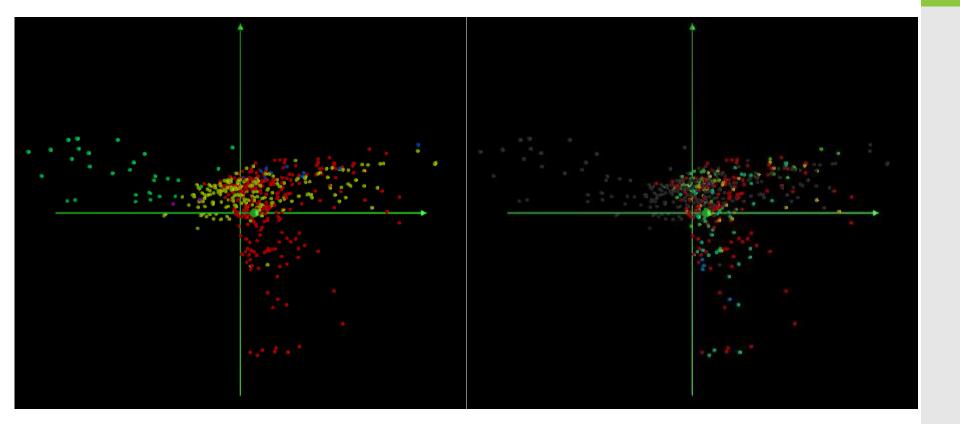
### Molecular atlas

#### Molecular atlas

- Maize: ~27,500 accessions in CIMMYT's genebank further 15-20,000 unique accessions in Mexican genebanks
- Developed new GbS method for composite DNA samples (30 plants per accession); the method simultaneously
  - Quantifies allele frequencies within accessions (SNP), and
  - Estimates genetic distances among accessions (PAV)
  - ▶ 45,000 SNP per sample, 260k polymorphisms
- Completed the sequencing of 20,000 accessions → diversity analysis in progress



### Preliminary analysis



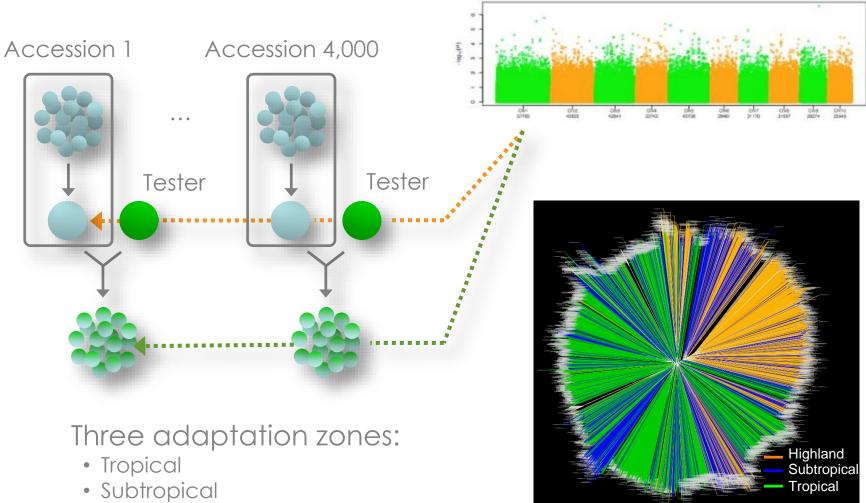
### Analysis 2014

- Environmental selection footprints
  - ▶ 18,500 accessions with good quality geo-location data
  - Extracted long term abiotic environment data
  - Shifts in haplotype distribution and allele frequency with environmental cline across global collection
- Breeding selection footprints
  - Cycles of recurrent selection populations genotyped
  - Evaluate response to selection
  - Evaluate selected genomic regions in derived lines
- Use selection footprints
  - Race footprints and use footprints



## Novel, beneficial alleles and allele donors

#### SeeD Maize GWAS



• Highland

36 Latin American countries

#### Accurate, field-based phenotyping is the main bottleneck

Traits	Maize	
Abiotic stresses	heat	
	drought	
	low N	
Biotic stresses	tar spot, ear rot, stalk rot, Turcicum, Cercospora	
Grain quality	hardness, starch, oil, amino acids, phenolics	

• Maize: 700,000 data points from 34 trials across 14 locations



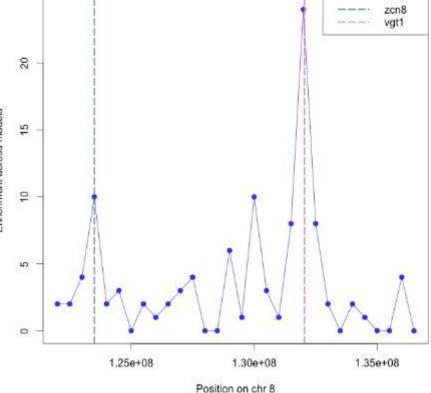
## GWAS in SeeD: Association analysis shows overlap in previously reported loci

Association at known loci can provide insight into statistical power

500k SNP, imputation with FILLIN GWAS were performed per trial using BLUPs for days to silking using naïve GLM and GLM+Q. Non parametric meta-analysis

There are markers with significant association at and close to Vgt1 and ZCN8

In conclusion, we can perform genome wide association in the SeeD panel



GWAS significance for days to silking on SeeD

#### Tar Spot Disease Complex

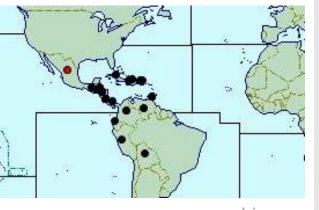
Caused by Phyllachora maydis and Monographella maydis in association

Yield loss for up to 30% in Mexico in farmers fields (Hock et al. 1995); 46% in unsprayed onstation test plots (Bajet et al. 1994)

Most severe in sub-tropical adaptations (700-1,600 m)



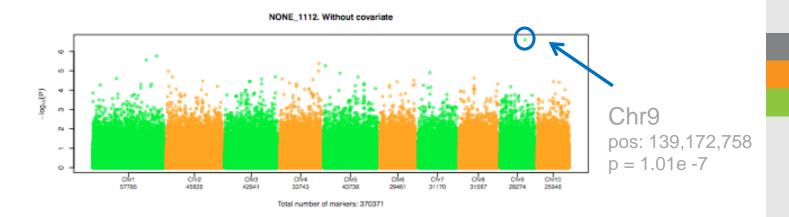
- 1st generation Tar Spot GWAS panel
- 842 gene bank accessions testcrosses evaluated Chiapas in 2011 and 2012
- Average visual mean and averaged row mean



source: www.cabi.org

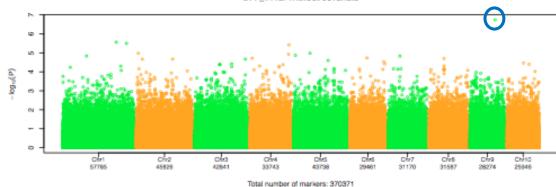
• Filtered GBS2.7 SNP (365,000 SNPs)

Tar Spot Disease Response BLUP GWAS without covariate

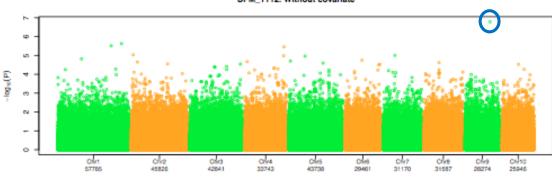


DFF\_1112. Without covariate

Tar Spot Disease Response BLUP GWAS with FFT covariate

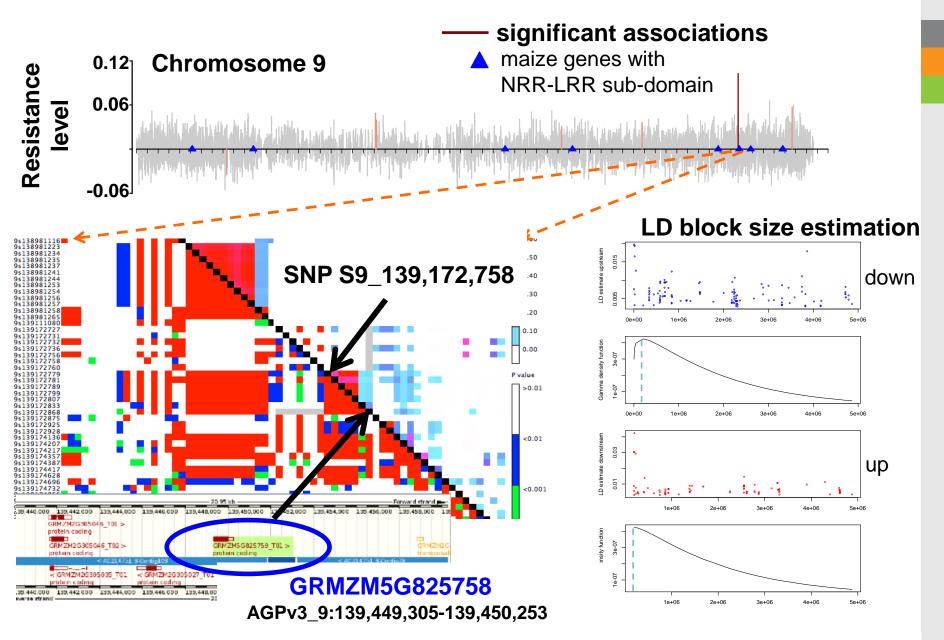


Tar Spot Disease Response BLUP GWAS with MFT covariate





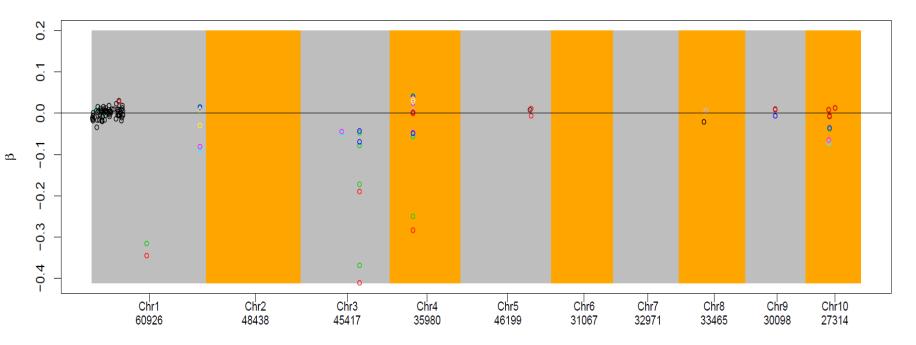
Total number of markers: 370371



270kb – shorter than mean in NAM

#### Quality traits

## Starch content, oil content, protein content, carotenoid content and profile (14 traits)



Effect plot of 17 traits

Total number of markers: 391875



## Pre-breeding → 'bridging germplasm'

#### Maize 'bridging germplasm'

Useful novel alleles & haplotypes



Early generation lines & pools enriched for favorable alleles



...using **multiple strategies** defined by trait complexity and breeder needs (desired input germplasm, demand for new sources)

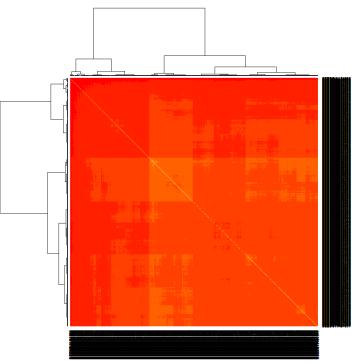
_	Irait complexity			
Breeder demand	Monogenic (1-3)	Oligogenic (4-10)	Polygenic (>10)	
Urgent	DH from landrace & landrace / line crosses, selfing	DH from landrace & landrace / line crosses, selfing	GS with MABC for BC1S1 develop- ment	
Medium- term	MABC	MARS & prediction index	GS with MABC for BC1S2 develop- ment	
Long-term	MABC & GS	MARS, prediction index & GS	GS with MABC for BC1S2 develop- ment	

Trait complayity

#### Pre-breeding-GWAS/GS

- G-matrix
- Phenotypic ranking of the 4000
  testcrosses
- Description of adaptation, colour, grain type "heterotic pattern" not A/B
- Selection of best 20 accessions per adaptation per heterotic group
- What to use for GS test population?
  - Testcrosses
  - DH from accessions
  - Accessions
- Simulations
  - Germplasm input, Ne, marker density and coverage, re-training and test pop stratergy





#### Conclusions simulations

#### • Approach

- Lower accuracy in initial selection using test-cross materials but higher genetic merit in C4 (beware of reconstructing the tester!!!)
- More gain up to C4 using landrace DH than segregating materials but add two more seasons for making DH (lower rate of gain)

#### Genotyping platform

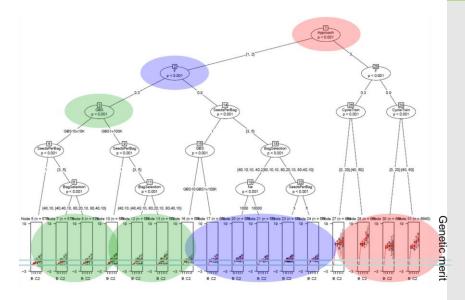
 larger chip better with high Ne (GBS10x,10K not enough with large Ne=10K)

#### • Retraining

Improves accuracy and gain (40 individuals likely enough)

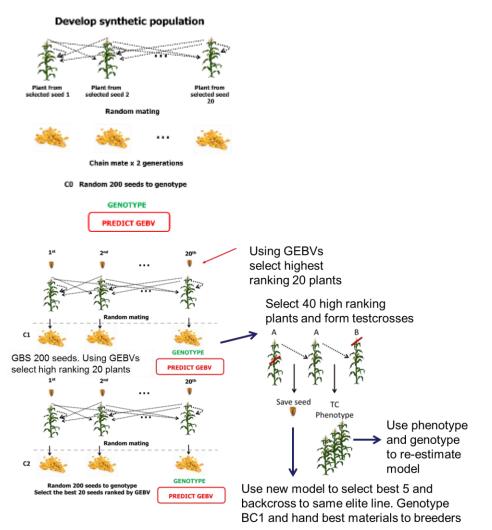
#### • Test more seeds per landrace

 3 plants per landrace better for GS applications than looking across more backgrounds



#### GS populations

- Six populations
- 2 rounds chain mating to increase recombination among genomes
- Between 7 and 14 founders per population
- 100k marker density explored



#### **Repeat 4 times**

## Bridging the divide- getting the needles from the haystack





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