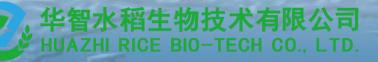
## Application of Molecular Breeding Technologies in Commercial Crop Breeding



#### Jinhua Xiao

Huazhi Rice Bio-Tech Co., LTD

International Symposium on Confection Sunflower Technology and Production August 10, 2018 Wuyuan, Inner Mongolia, P. R. China





MONSANTO 🌋

imagine

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### Outline

# Molecular breeding and seed industry development — Monsanto as an example

**SNP marker development** 

**Molecular breeding technologies** 

**Trend of molecular breeding** 



### **Monsanto** — the rise of multi-national seed Industry giant

## Prior to 1996: had agricultural biotech, pharmaceutical, chemical, and nutrition business segments, not a seed company

- 1996: acquired Agracetus (soybean, corn seed company)
- 1997: acquired Holden's Foundation Seeds L.L.C. and Corn States Hybrid Service L.L.C (corn seed company)
- 1998: acquired DeKalb Genetics Corp (corn and soyben seed company)
- 2005: acquired Seminis, Inc. (vegetable seed company)
- 2007: acquired Delta and Pine Land Company (cotton seed company)
- 2008: acquired De Ruiter Seeds breeds Group (vegetable seed company), Semillas Cristiani Burkard (corn hybrid seed production company), CanaVialis S.A. and Alellyx S.A (sugarcane company)
- 2009: acquired Westbred (wheat seed company)

2017: multi-national seed Industry giant, annual seed sale of > \$10.9B, ~20% of the world seed market share

10/18/2000: IPO as a pure agriculture company, market cap of \$4B June 7, 2018: sold to Bayer for \$65B

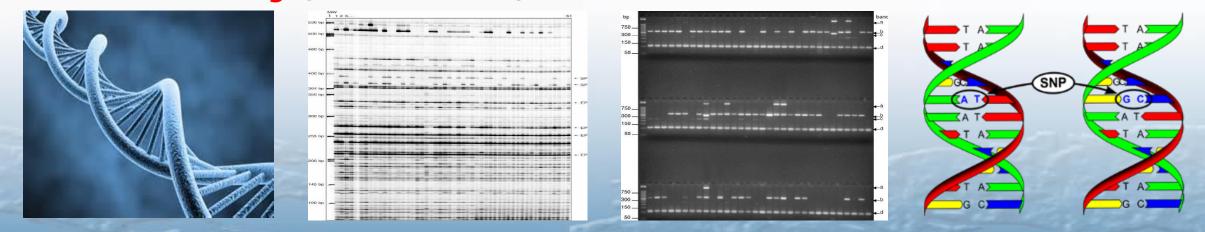


#### Two core technologies made Monsanto become the world seed industry giant

#### **Insect-resistance, herbicide-tolerance transgenic technology** (R&D initiated in 1980)

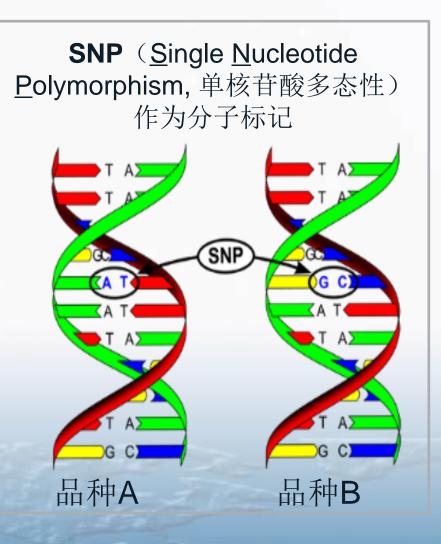


#### **Molecular breeding** (started in 1996)





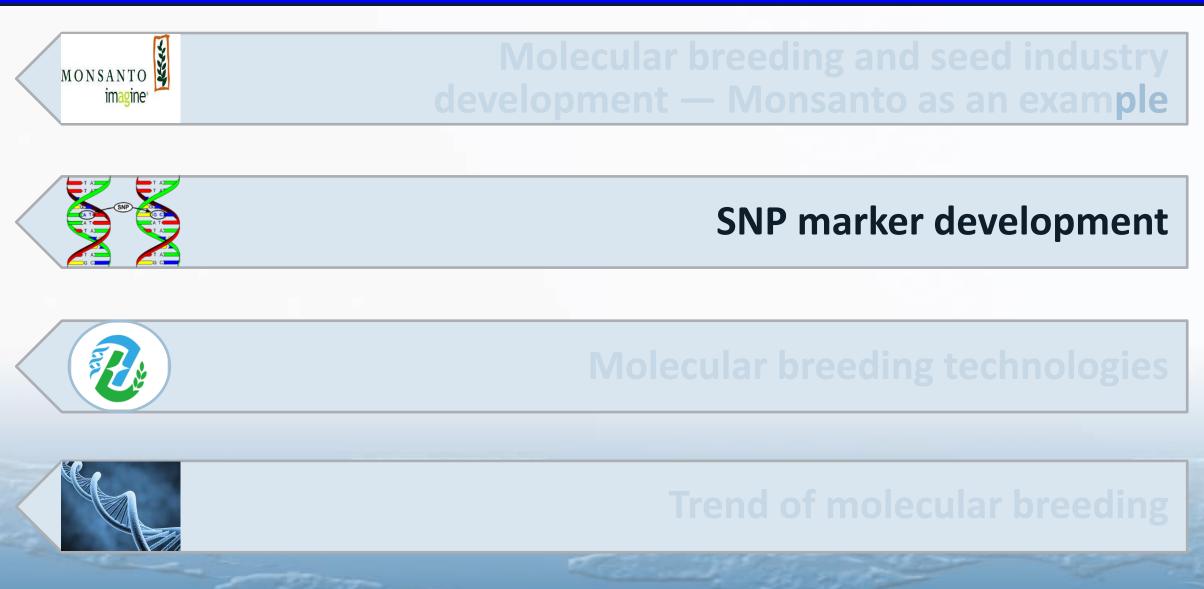
### **Molecular breeding**



- a new field emerging in early 1990s developed from plant genomics, molecular biology, molecular genetics, quantitative genetics, and breeding
- applications of molecular markers and genomics tools in plant breeding
- innovation in breeding methodologies
- discovery/creation of novel genetic variation
- core competitive advantages of multi-national seed industry giants

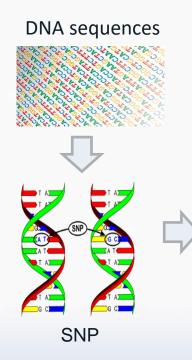


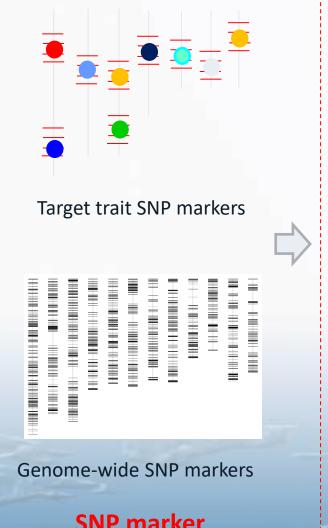
### Outline





### From DNA sequences to molecular breeding: Overview







- Genetic diversity assessment
- Parental line selection

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- Cross design
- F1 hybrid confirmation
- MAS
- Linkage drag elimination
- MARS
- MABC
- GWS
- Seed genetic purity assessment
- Variety IP protection

Molecular breeding technologies

#### SNP discovery

SNP marker development

SNP genotyping production

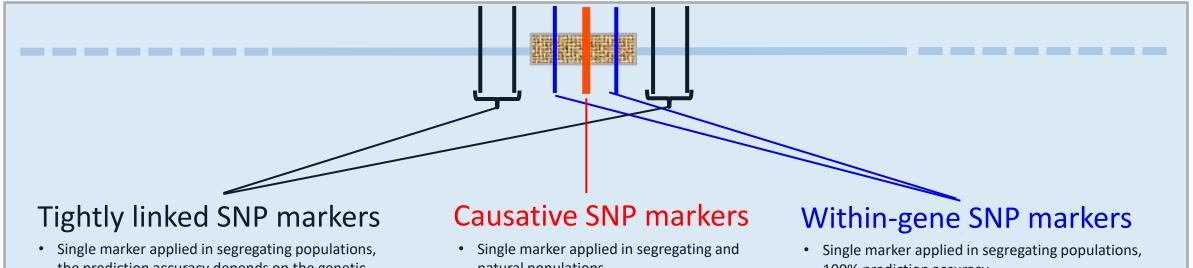


### **SNP** discovery

Line 01: .....AGACGGCCTTACTTGCGAATCCAGGCAACCGTACGGCTA..... Line 02: .....AGACGGCCTTACTTGCGAATCCAGGCAACCGTACGGCTA..... Line 03: .....AGACGGCCTTACTTGCGAATCCAGGCAACCGTACGGCTA..... Line 04: .....AGACGGCCTTACTTGCGAATCCAGGCAACCGTACGGCTA..... Line 05: .....AGACGGCCTTACTTGCGAATCCAGGCAACCGTACGGCTA..... Line 06: .....AGACGGCCTTACTTGCGAATCCAGGCAACAGTACGGCTA..... Line 07: .....AGACGGCCTTACTTGCGAATCCAGGCAACAGTACGGCTA..... Line 08: .....AGACGGCCTTACTTGCGAATCCAGGCAACAGTACGGCTA..... Line 09: .....AGACGGCCTTACTTGCGAATCCAGGCAACAGTACGGCTA..... Line 10: .....AGACGGCCTTACTTGCGAATCCAGGCAACAGTACGGCTA..... Line 11: .....AGACGGCCTTACTTGCGAATCCAGGCAACAGTACGGCTA.....

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### Three types of SNP markers associated with major gene/QTL



- the prediction accuracy depends on the genetic distance between the gene and the marker
- Haplotype applied in natural populations, the prediction accuracy depends on LD between the gene and the haplotype

- natural populations
- 100% prediction accuracy

100% prediction accuracy

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Haplotype applied in natural populations, the prediction accuracy depends on LD between the gene and the haplotype

#### Avenues to discovering target gene SNP markers:

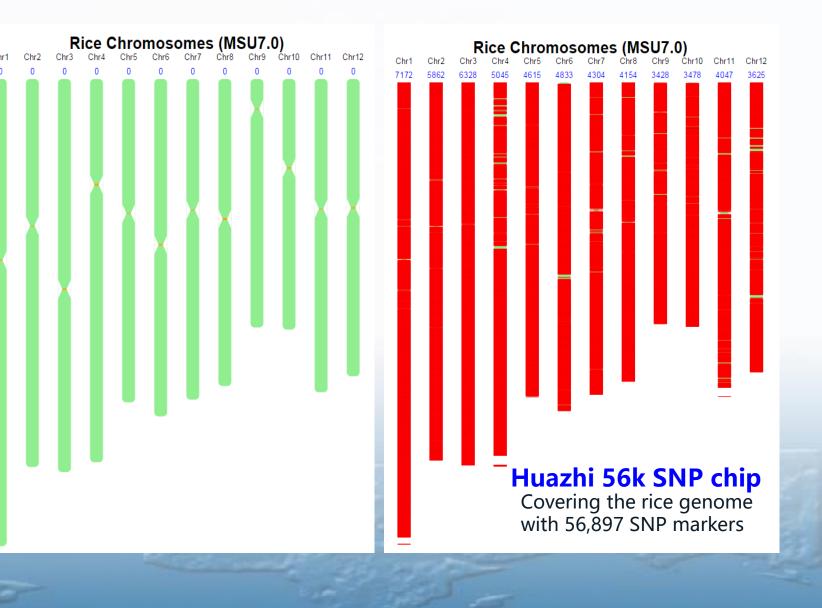
- DNA sequences of cloned genes
- *de novo* mapping
- association mapping



### **Genome-wide SNP marker development**

#### **Requirements:**

- Locus-specific
- High PIC value
- High assay quality
- Even distributed across the entire genome
- Marker density matching breeding application type

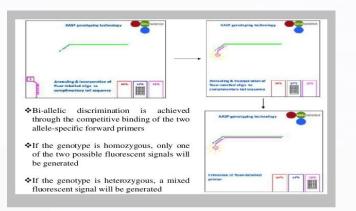


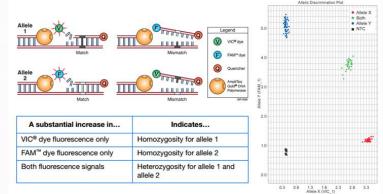


### **SNP** genotyping technologies

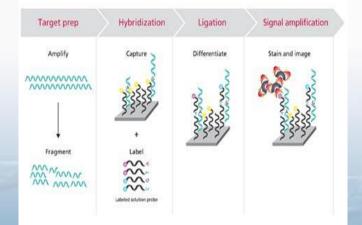
#### • PCR-based

- KASP
- End-point TaqMan
- one sample, one marker at a time

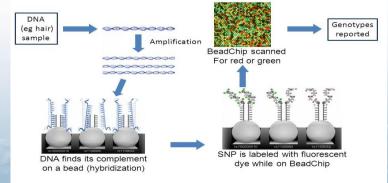




- DNA fragment hybridization-based parallel microarray
  - Affymetrix Axiom SNP chip
  - Illumina Infimium SNP chip
  - One sample, many markers (100s-1,000,000) simultaneously



#### Illumina Infinium SNP genotyping





#### KASP, TaqMan SNP markers

- Major genes/QTL
  - ✓ MAS
  - ✓ MARS
  - ✓ Haplotype-based discovery of novel alleles

#### • Genome-wide

- ✓ MABC
- ✓ Low density-marker based DNA fingerprinting
- $\checkmark\,$  Linkage drag elimination or minimization
- ✓ genetic diversity assessment (low density markerbased)
- ✓ Reconstruction of parents of hybrids
- ✓ F1 hybrid confirmation
- ✓ Seed genetic purity assessment
- ✓ Variety identity verification

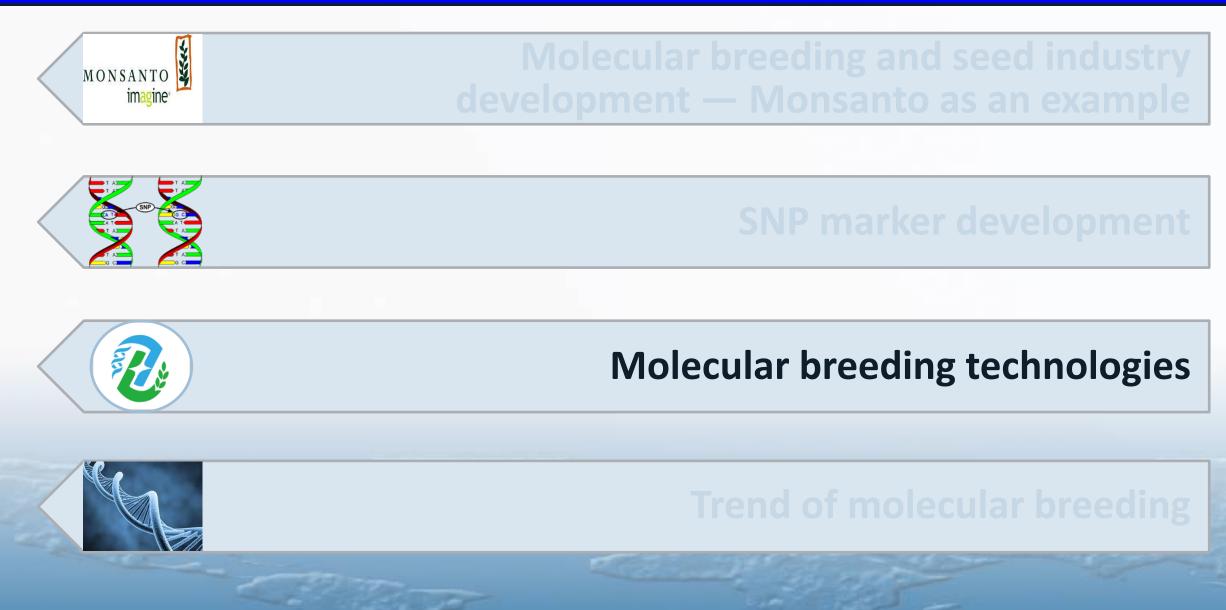
### SNP chip

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- High density
  - ✓ Genome-wide selection (GWS)
  - ✓ High density variety DNA fingerprint
  - ✓ Detailed genome-wide genetic diversity assessment
  - ✓ Variety identity verification
- Low density?

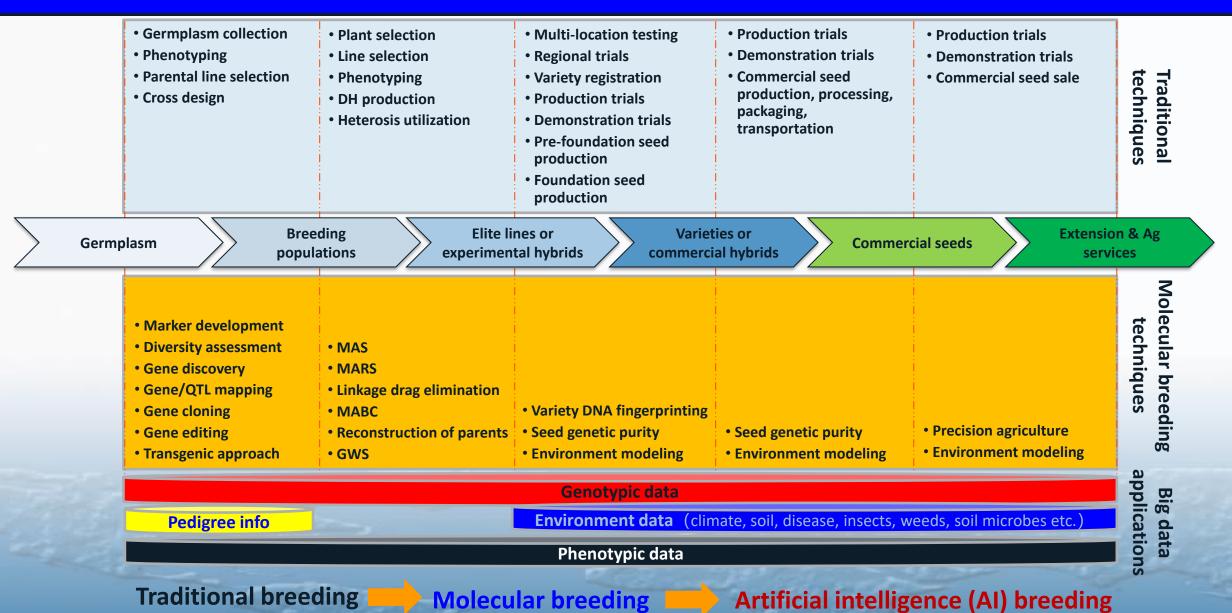


### Outline





#### Molecular breeding technologies deployed into variety development & commercialization pipeline



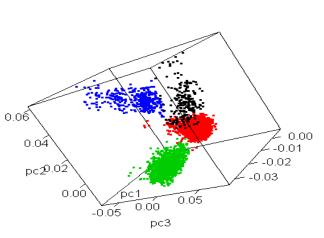
### **Genetic diversity assessment of parental lines**

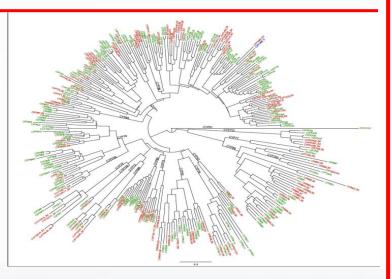
#### **Traditional methods**

- Phenotypes such as plant height, plant type, growth duration, adaptability, photo-sensitivity, biotic resistance, abiotic tolerance, yield, quality traits, etc.
- Originating sources
- relationship
- Pedigree info

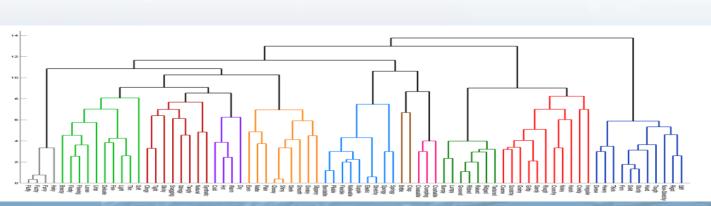


#### Based on SNP markers covering the entire genome

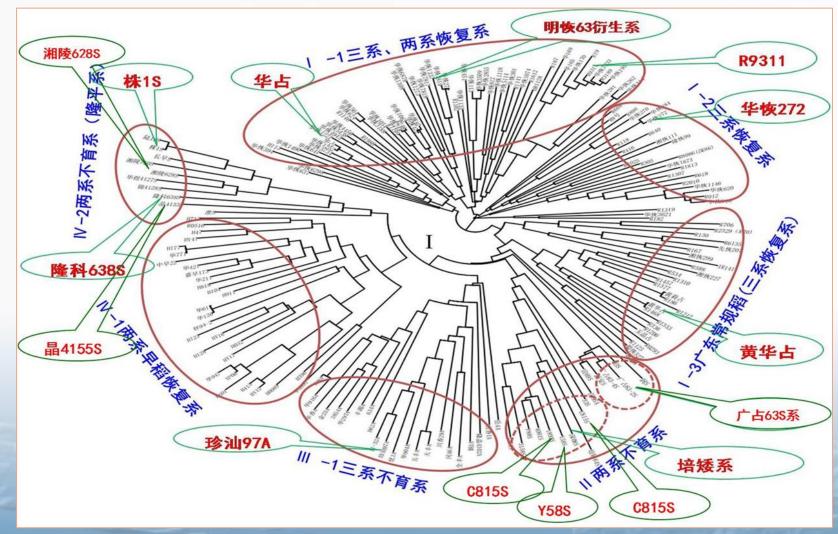




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### Clustering of a core set of 190 hybrid rice parental lines from LPHT



华智水稻生物技术有限公司

 Guide the design of crosses to construct breeding populations

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- Predict the performance of potential hybrids
- Variety IP protection



#### Traditional

- Trait complementation
- Adaptability of target growing regions
- Pedigree info
- Originating sources

#### Outcome

- ✓ Many crosses
- ✓ High genetic duplication of crosses
- ✓ Low predictability

#### **Molecular marker-assisted**

- Trait complementation
- Adaptability of target growing regions
- Pedigree info
- Originating sources
- Major genes of target traits
- Genome-wide diversity  $\sim$  similarity and distance

#### Outcome

- ✓ Fewer crosses and highly selective
- ✓ Low genetic duplication of crosses
- ✓ higher predictability



### F1 hybridity confirmation

#### Traditional

• F1 plant trait observation

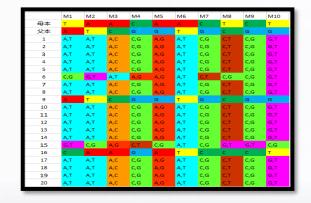


#### Outcome

- ✓ Low accuracy
- ✓ May require to grow to maturity
- May delay F1 crossing or backcrossing a generation

#### **Molecular markers**

• Trait or non-trait markers



#### Outcome

- ✓ High accuracy
- ✓ Fast (typically 5 business days)
- ✓ Low cost

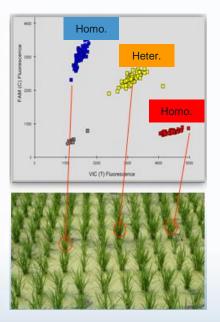
### Selection of favorable genotype of major genes/QTL

#### **Traditional phenotype selection**

- Trait phenotype required
- Low accuracy in natural environment (high rate of false-positive such as disease resistance, insect-resistance)
- Costly in controlled environment and low throughput
- Cannot distinguish between homo. and heter. genotype of a dominant gene (progeny evaluation required)
- Typically cannot perform selection at more than one gene locus

#### **Marker-assisted selection (MAS)**

- No phenotype required
- Low cost
- High throughput
- fast
- High selection accuracy
- Early selection
- distinguish between homo. and heter. genotype of a dominant gene
- Selection of multi-gene loci simultaneously





### MAS: low cost, fast, accurate – a rice example

#### A breeder needs to identify 500-600 F2 blast resistant plants homozygous at Pi2 from a F2 population

#### IF traditional artificial inoculation employed

3,069 F2 plants:

F2 seed sowing  $\rightarrow$  plant labeling  $\rightarrow$  fungi culturing  $\rightarrow$  inoculating  $\rightarrow$  resistant/susceptible phenotype observation  $\rightarrow$  transplanting into field  $\rightarrow$  F3 seed harvest

**2,213 F2:3 progeny inoculating to identify homozygous F2 plants :** F2:3 seed sowing  $\rightarrow$  labeling  $\rightarrow$  fungi culturing  $\rightarrow$  inoculating  $\rightarrow$  resistant/susceptible phenotype observation



Cost: ¥~355,000

Time: ~ 200 days

Accuracy: ~80%

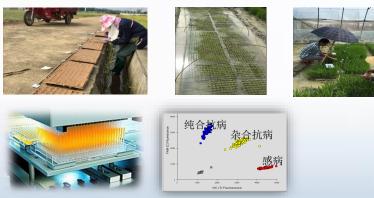






MAS

F2 seed sowing  $\rightarrow$  plant labeling  $\rightarrow$  leaf tissue sampling  $\rightarrow$  DNA extracting  $\rightarrow$  SNP genotyping  $\rightarrow$  identified 566 F2 resistant plants homozygous at Pi2 from 3,069 F2 plants



Cost: ¥~30,000 Time: 21 days Accuracy: >99%



### MAS: low cost, fast, accurate – sunflower examples



Downy Mildew

- Two different sources of resistance
- Prediction accuracy in segregating populations: >99%



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Orobanche

- A major gene originating from wild sunflower
- Prediction accuracy in segregating populations: ~98%

### Accumulation of the favorable alleles at multiple independent loci

## Traditional recurrent selection

- Require phenotype of desirable plants to intermat
- Almost impossible to purposely accumulate the favorable alleles of more than 6 independent loci
- Very time-consuming (20 independent loci would need about 60 years)

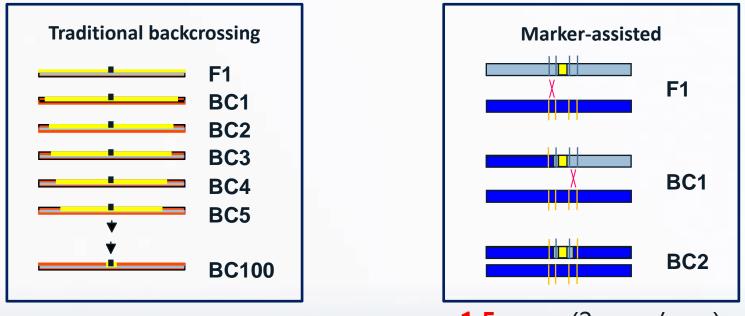
#### Marker-assisted recurrent selection (MARS)

	Frequency					
Recurrent selection cycle	Favorable allele	Desirable genotype (homo for favorable allele at all the loci)				
		No. of independent loci under selection				
		20	15	10	5	
0 (F2)	0.51	1 in 500 billion	7 in 4 billion	3 in 2 million	1 in 1,000	
1	0.62	1 in 200 million	3 in 5 million	7 in 100,000	8 in 1,000	
2	0.81	1 in 5,000	9 in 5,000	3 in 2 million	3 in 25	
3	0.96	1 in 5	3 in 10	9 in 20	6 in 10	
associated v		en ~10 plants are	o sample ~200 plar to be selected for i	• // •		

In the forward breeding, where it is necessary to accumulate the favorable alleles at multiple independent loci, MARS is the most powerful tool to achieve this.



### Linkage drag elimination or minimization



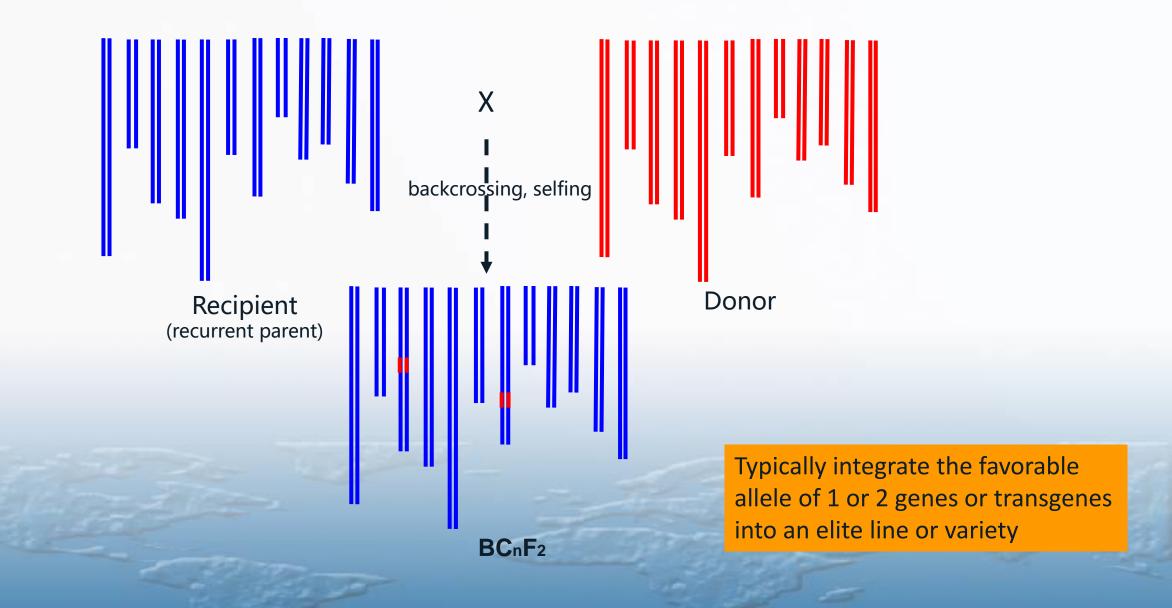
50.5 years (2 gens/year)

1.5 years (2 gens/year)



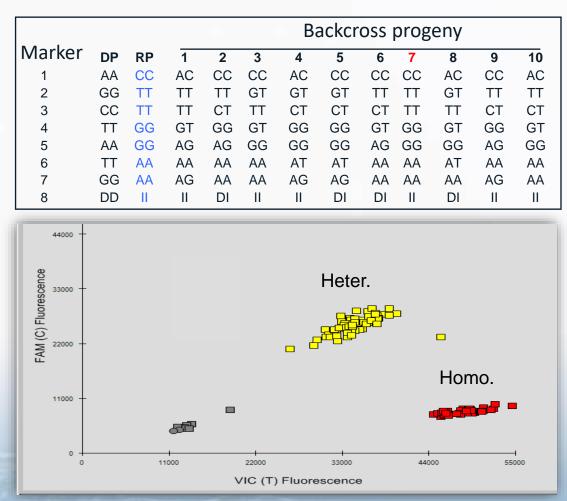


### **Backcrossing conversion**





### Marker-assisted backcrossing conversion (MABC)



Foreground selection

**Background selection:** use markers covering the entire genome to identify the backcross progeny most similar to the recurrent parent.

Traditional A recurrent x B donor F1 (50% recurrent) BC1 (75% recurrent) BC2 (87% recurrent) BC3 (94% recurrent) BC4 (97% recurrent) BC5 (98% recurrent) BC6 (99% recurrent)

Marker-assisted A recurrent x B donor (50% recurrent) BC1 (88-92% recurrent) BC2 (95-97% recurrent) BC3 (98-99% recurrent)

Benefit: improved variety gets into seed market two years earlier

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### **Bacterial blight resistance integration into an elite line through MABC**

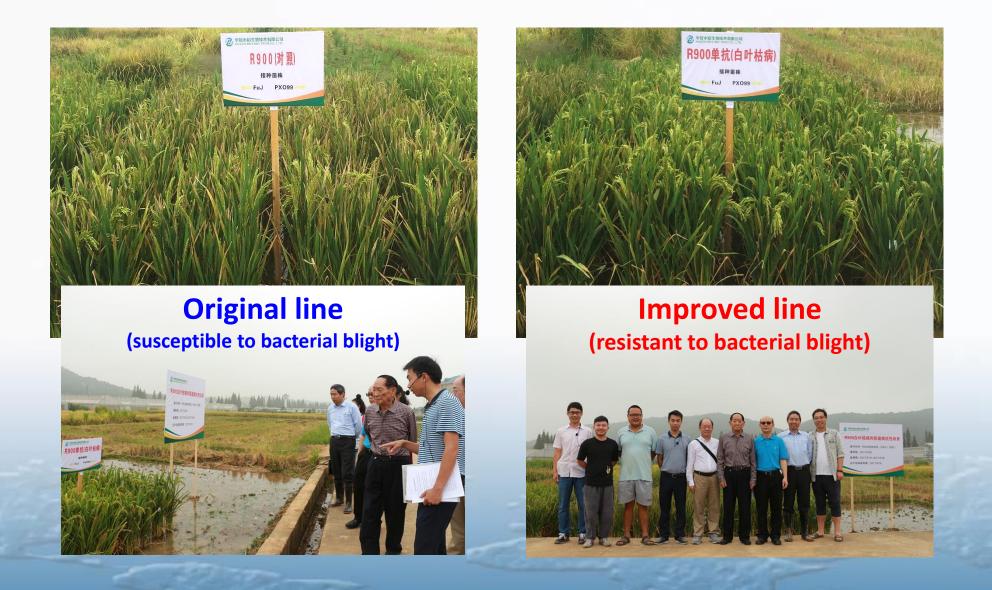
### 16 months: April, 2016 – August, 2017



Improved line (resistant to bacterial blight) Huazhi Confidential



### **Bacterial blight resistance integration into R900 through MABC**



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### MABC to speed up transgene integration: corn examples

At least one BC3F1 plant whose recurrent parent genome recovery is >98.5% in all 20 inbreds for insect-resistance and herbicide-tolerance transgene conversions



### MAS, MARS only applicable to selection of major genes/QTL

#### Suitable for selection of qualitative or simple quantitative traits such as racespecific disease resistance, biotype-specific insect resistance

- ✓ Genotype-independent
- ✓ Environment has no or little effect on
- ✓ Controlled by one or few major genes or QTL

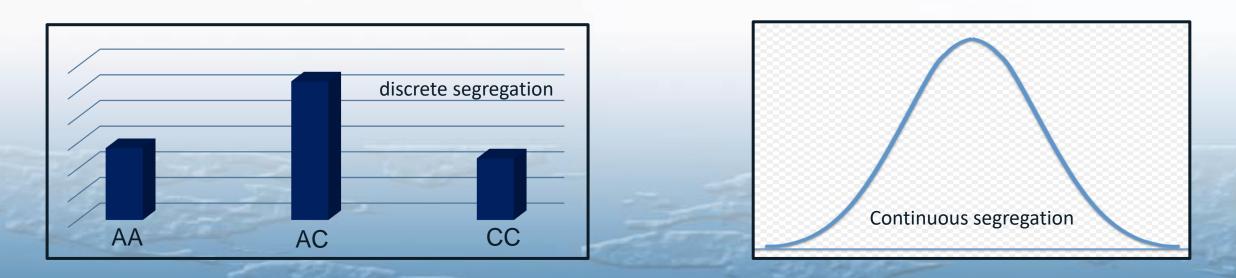
#### Not suitable for selection of

**complex traits** such as yield, abiotic stress tolerance, polygenic biotic stress resistance

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- ✓ Genotype-dependent
- ✓ Affected largely by the environment
- ✓ Polygenic control

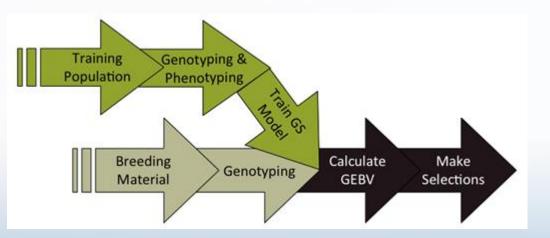




### **Genome-wide selection (GWS): concept**

Meuwissen, T. H., Hayes, B. J., & Goddard, M. E. (2001). Prediction of Total Genetic Value Using Genome-Wide Dense Marker Maps. *Genetics*, *157* (4), 1819-1829.

Individual or Family	Genotype	Phenotype	Genomic Estimated Breeding Value
1	x	x	x
2	x	x	x
3	x	x	x
	x	x	x
	x	x	x
	x	x	x
k	x	x	x
<i>k</i> + 1	x		x
<i>k</i> + 2	x		x
<i>k</i> + 3	x		x
	x		x
	x		x
	x		x
N	x		x





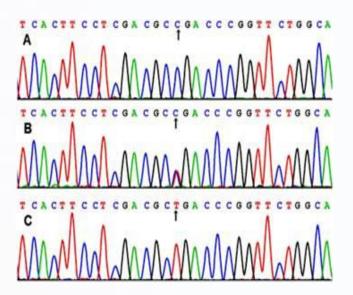
### SNP genotyping cost lower then phenotyping cost made GWS possible



Illumina Genotyping Solutions. Acomplete range of tools

A complete range of tools and services for every need.





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## One line field tested at 5 locations with 1 plot each



\$200

One line genotyped at 50, 000 SNP markers



\$50



### **GWS:** rationale and advantages

- Designed for phenotypic value prediction of polygenic traits such as yield, abiotic stresses
- All QTL are in LD when the density of markers covering the entire genome is high enough

- GWS is the core technology of molecular breeding
- Only multi-national seed industry giants such as Bayer-Monsanto and Dow-DuPont have integrated GWS into traditional breeding process
- Advantages of GWS
  - Higher genetic gain: ~two times of traditional breeding's
  - Reducing cost: reduce number of lines or hybrids to be conducted for field trials
  - Speeding up breeding cycles: reduce one or two field testing seasons
  - Faster recycling of parental lines: advanced breeding lines as parental lines for new breeding population



### **GWS-guided creation of heterotic hybrids: flowchart**

#### **Model building**

(SNP marker and trait data known)

- Select female and male parents (3,000 5,000)
- Purify parental lines genetically
- Conduct SNP genotyping
- Perform genetic and clustering analyses
- Design hybrid combinations for model training
- Produce F1 hybrid seeds
- Design field experiment
- Conduct field trials
- Normalize trait data
- Deduce the SNP genotypes of F1 hybrids
- Perform model fitting and crossvalidation (hybrid, female, and male models)

3 years

#### Model validation

(SNP marker and trait data known)

- Design hybrid combinations for model validation
- Produce F1 hybrid seeds
- Design field experiment
- Conduct field trials
- Normalize trait data
- Deduce the SNP genotypes of F1 hybrids

2 years

- Assess the accuracy of model prediction
- Re-build and refine models

#### Model application

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(SNP marker data known)

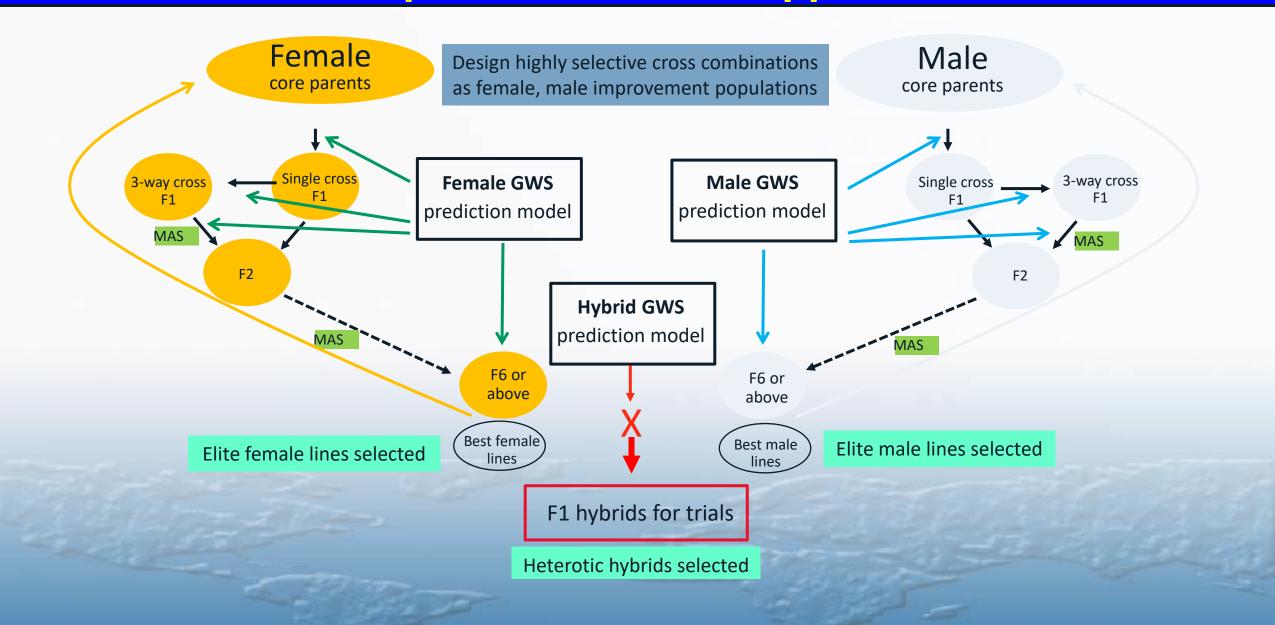
- Hybrid model to predict the performance of hybrids
- Female model to select elite female lines from female improvement populations
- Male model to select elite male lines from male improvement populations
- Female model to simulate cross combinations and design highly selective combinations as female improvement populations
- Male model to simulate cross combinations and design highly selective combinations as male improvement populations

 $y = a + b_1 x_1 + b_2 x_2 + b_3 x_3 + \dots + b_n x_n$ 

Where, X = SNP genotype



### **GWS** prediction model application





## **GWS increases genetic gains**





### Seed genetic purity/plant genetic mixture assessment

### **Traditional**

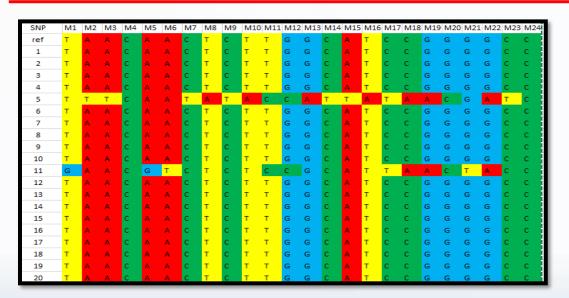
• Field observation of plant uniformity



#### Outcome

- ✓ Low accuracy
- ✓ May require to grow to maturity
- ✓ costly

### **SNP** markers



#### Outcome

- ✓ Highly accurate
- Fast (about a week after seed or leaf tissue sampling)
- ✓ Low cost



# Variety identity verification and proprietary germplasm protection

### **Traditional**

Observation in the field

### **SSR** standard

• 48 pairs of SSR

#### Outcome

✓ Indistinguishable in many cases

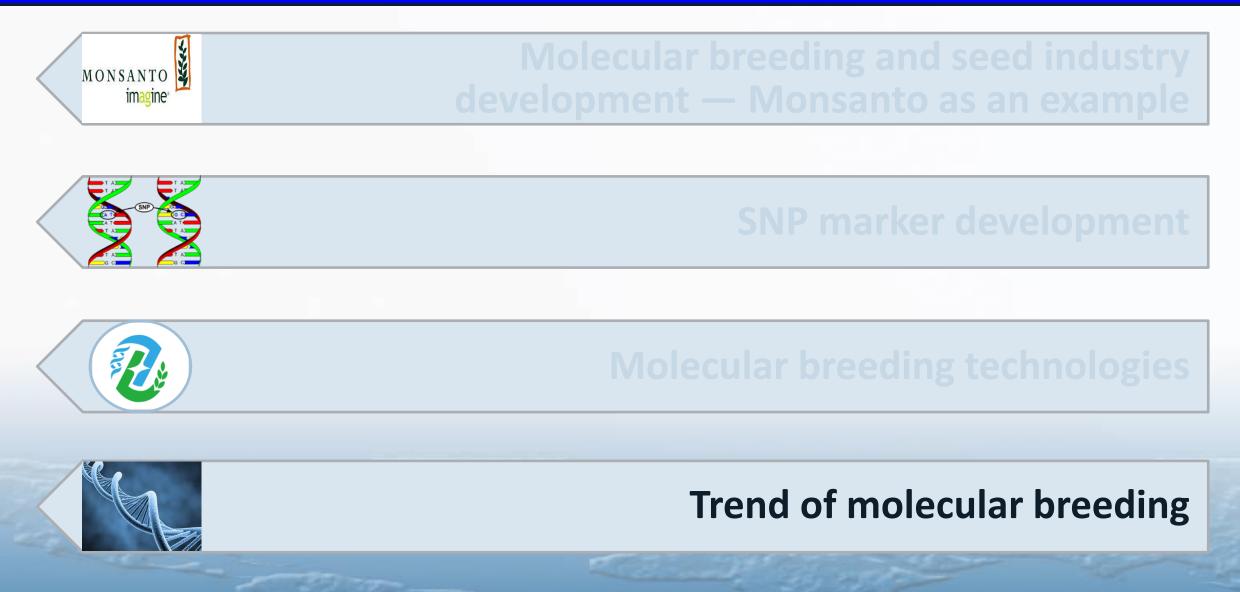
**DNA fingerprint based on genome-wide SNP markers** 

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## Outline

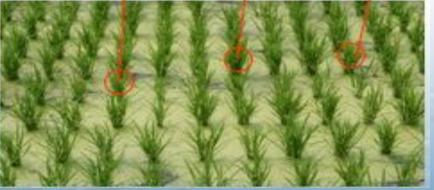




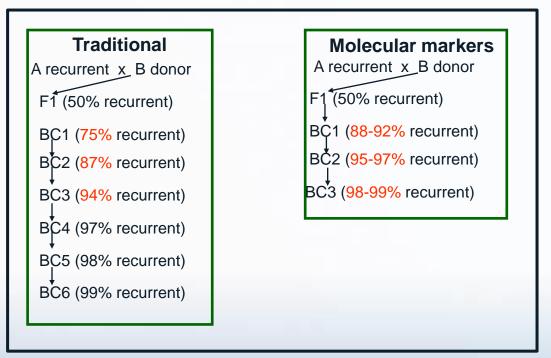
# MAS, MABC are becoming routine

# Homo. Heter. Homo. Homo. Homo.

MAS: accurate, fast, low cost



#### MABC: accurate, fast, high success

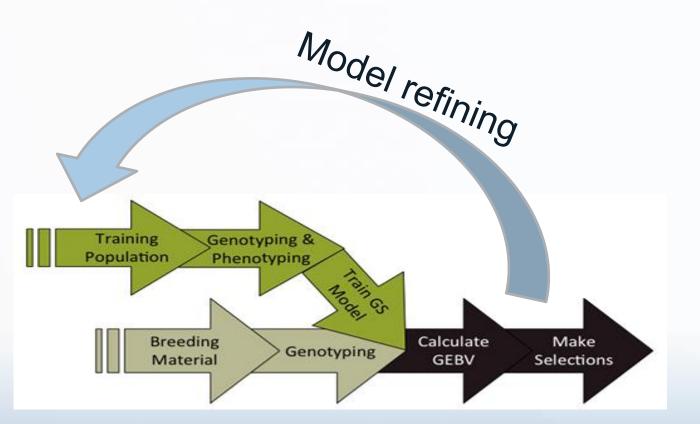


MAS and MABC have been applied to breeding programs in a large scale at multi-national seed companies for decades. But, they just got started in other seed industry, are becoming routine.



GWS is becoming the theme of molecular breeding

Individual or Family	Genotype	Phenotype	Genomic Estimated Breeding Value
1	x	x	x
2	x	x	x
3	x	x	x
	x	x	x
	x	x	x
	x	x	x
k	x	x	x
<i>k</i> + 1	x		x
<i>k</i> + 2	x		x
<i>k</i> + 3	x		x
•	x		x
-	x		x
•	x		x
N	x		x



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GWS is the core technology of molecular breeding. Only multi-national seed industry giants such as Bayer-Monsanto and Dow-DuPont have integrated GWS into traditional breeding process. Higher genetic gains, reducing cost, speeding up breeding cycles, faster recycling of parental lines.

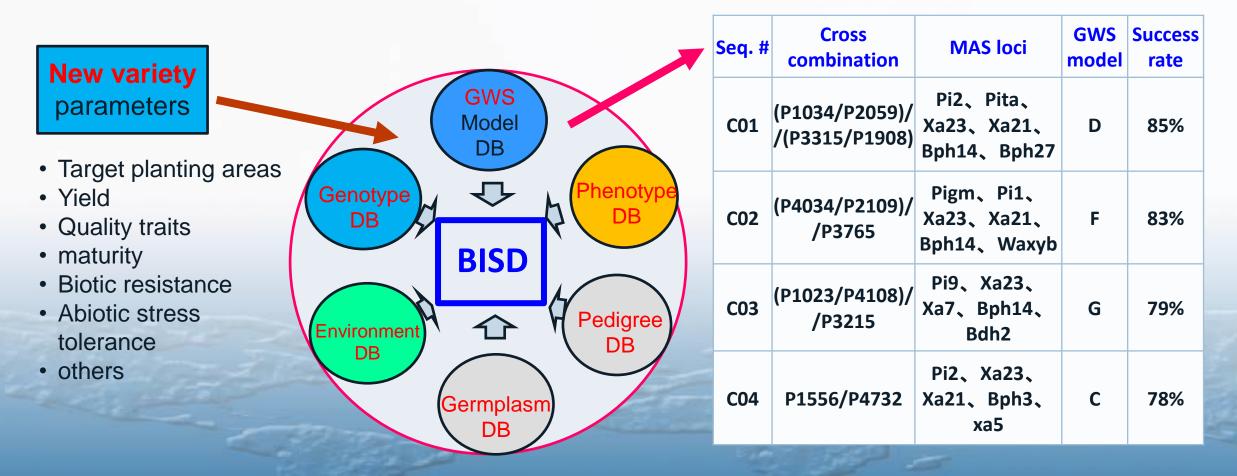


# BISD will open the door to artificial intelligence (AI) breeding

# **BISD** = Breeding by *In Silicon* Design<sup>®</sup>

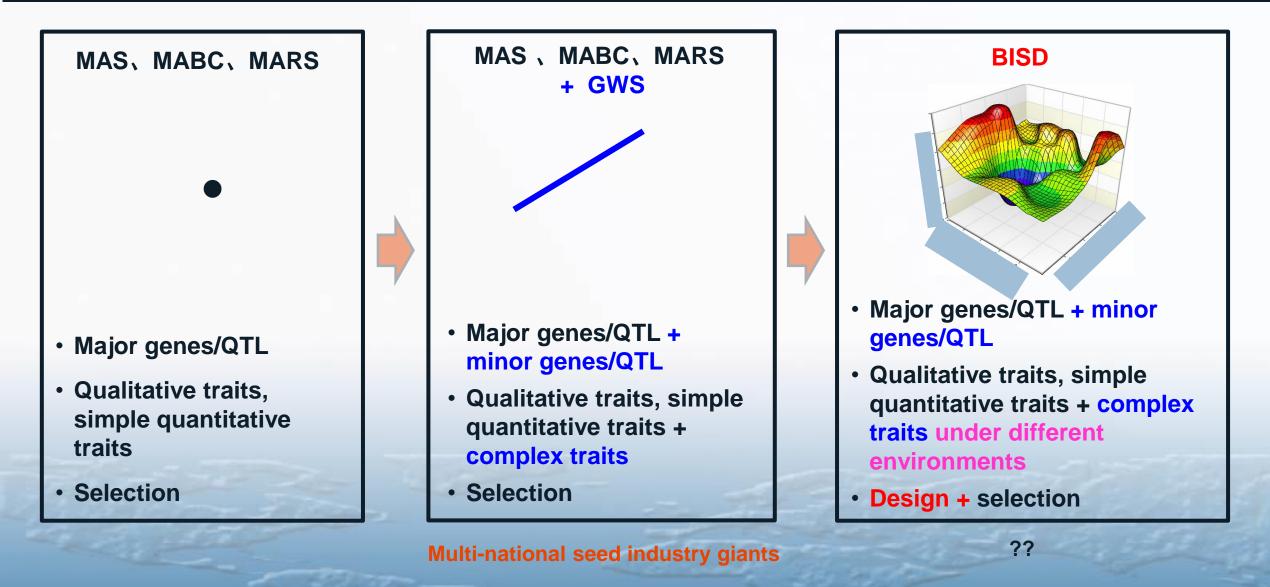
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*In Silico* breeding aims at increasing genetic gains through computer simulations, while reducing the needs for field and lab work tremendously.





## **Evolution of molecular breeding**

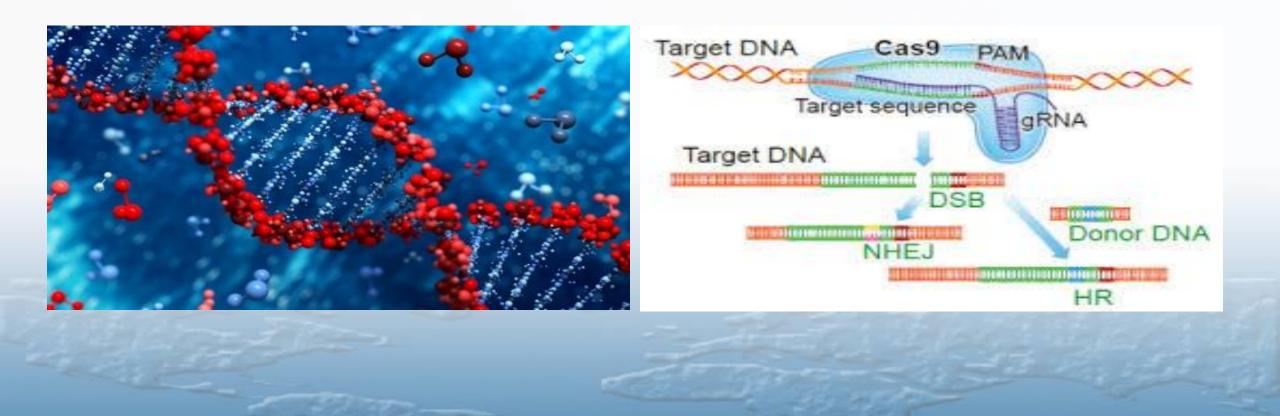




### Gene editing will become the mainstream in creating novel genetic variation

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- creating novel superior alleles at known genes/QTL
- changing a minor gene into a major gene





# Gene editing will replace foreign gene transfer approach

# Traditional gene transfer approach: random insertion of foreign gene

GENE identified and CRISPR/Cas9 isolated в Α Agrobacterium Gene Gun replication gene inserted bacterium mixed nto ti plasmid with plant cells gold particles coated with DNA NHEJ HDR Repair dsDNA ti plasmid moves into plant cell and cells shot with gene gun and DNA inserts DNA into incorporated into plant chromosome plant cell chromosome Donor DNA Screening for cells with indel transgene transgenic plant cells screened transformed cells selected with regenerated from single for transgene selectable marker transformed cell

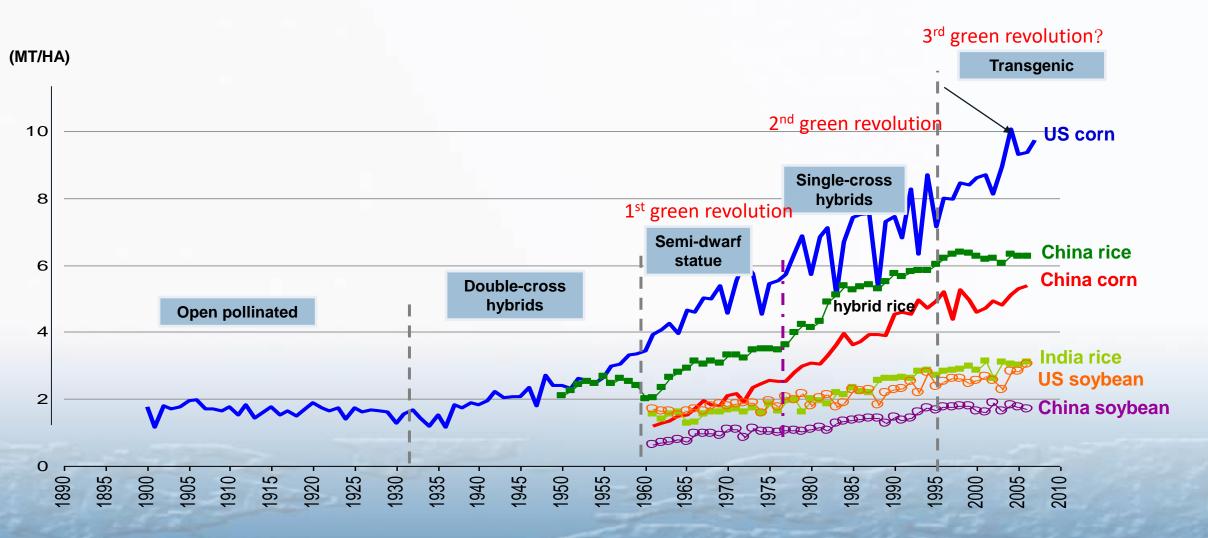
Gene editing will replace foreign gene transfer approach for moving genes between sexual incompatible species

Gene editing approach: site predefined insertion of foreign gene

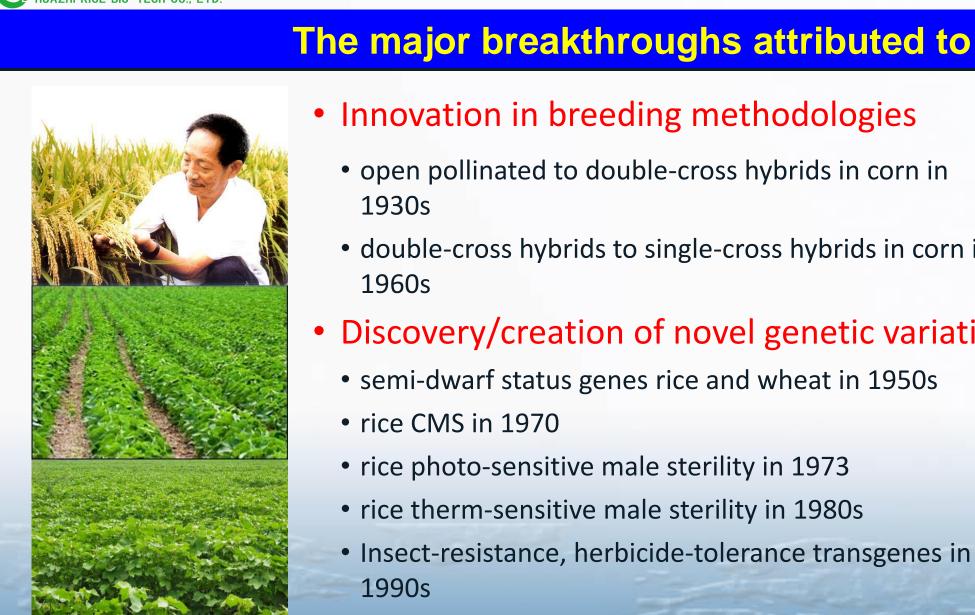
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# Major breakthroughs in the history of crop genetic improvement



Source : USDA, IRRI and FAO



### Innovation in breeding methodologies

- open pollinated to double-cross hybrids in corn in 1930s
- double-cross hybrids to single-cross hybrids in corn in 1960s
- Discovery/creation of novel genetic variation
  - semi-dwarf status genes rice and wheat in 1950s
  - rice CMS in 1970
  - rice photo-sensitive male sterility in 1973
  - rice therm-sensitive male sterility in 1980s
  - Insect-resistance, herbicide-tolerance transgenes in 1990s



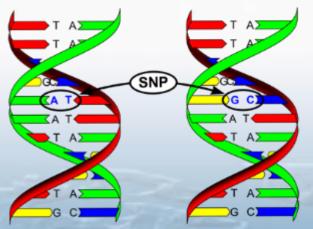
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### Molecular breeding will bring the next breakthrough in crop genetic improvement



# **Innovation** in breeding methodologies



**Discover/create** novel traitimproving genetic variation

# "Molecular Breeding, Seeds of the Future"





## Thanks!

#### Website: www.wiserice.com.cn



#### WeChat: huazhi-rice



# Huazhi, leading commercial crop molecular breeding in China!