



LOUISIANA STATE UNIVERSITY

College of Agriculture

School of Plant, Environmental, and Soil Sciences

Rice Research Station



# Modeling in Plant breeding

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# What is prediction-based breeding?



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## Phenotype

Year & lines  
1 = 20K  
2 = 8K  
3 = 1K  
4 = 500  
5 = 50  
6 = 5  
7 = 1

### Image analysis (HTP)

Accurate characterization  
Complex and simple traits  
Replace/complement  
Traditional trait evaluation  
\$50 / plot

+



## Genotype

### Genomic selection

Reduce costs  
< \$5 / line

Complex and simple traits  
Reduce the funnel length  
Increase the funnel width

+



## Environment

### Envirotyping

Stability over years  
Across many locations  
The best genotype  
for each location

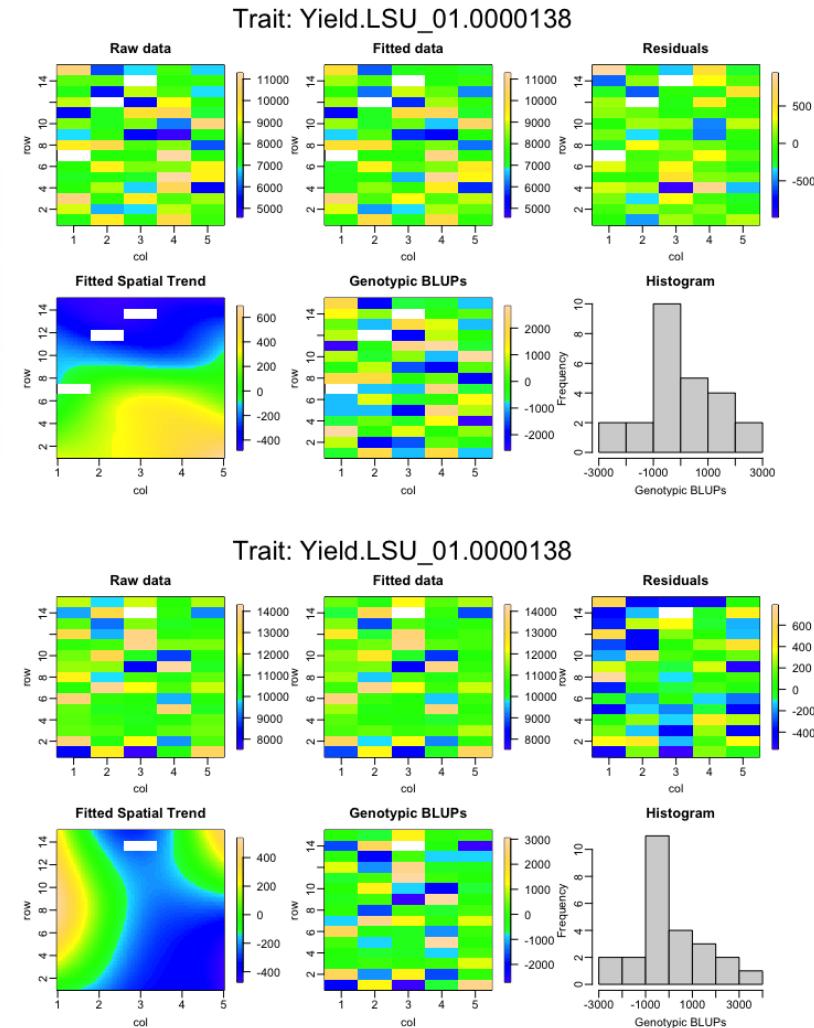
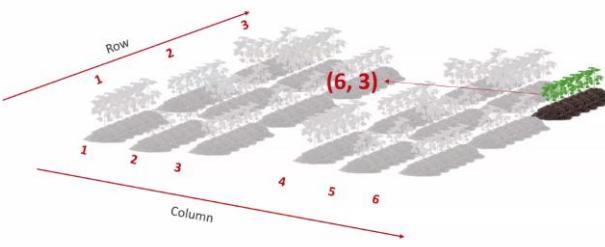


**BRAD PITT**  
**MONEYBALL**  
JONAH HILL PHILIP SEYMOUR HOFFMAN  
BASED ON A TRUE STORY

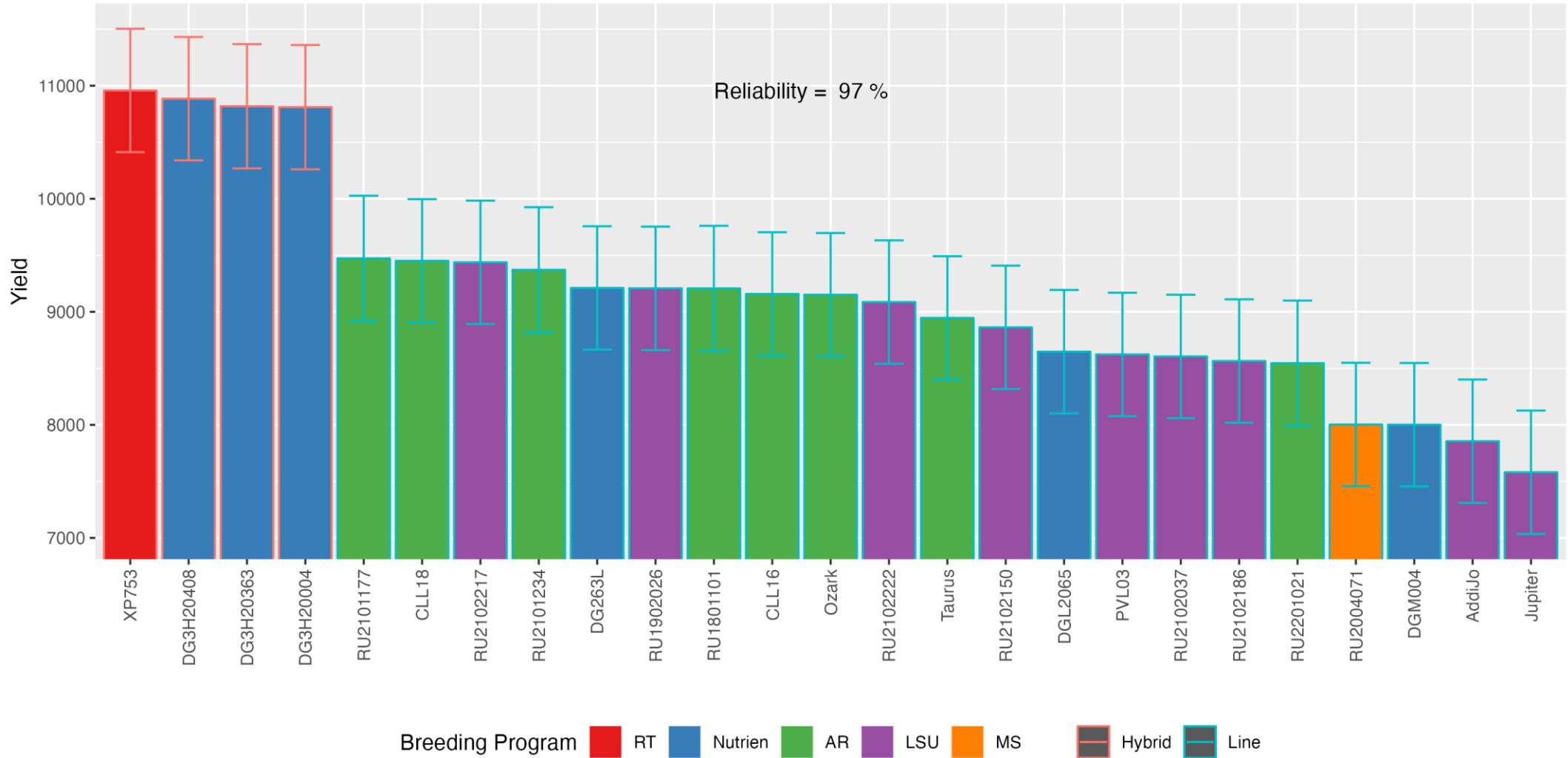


# Modelling using spatial variation

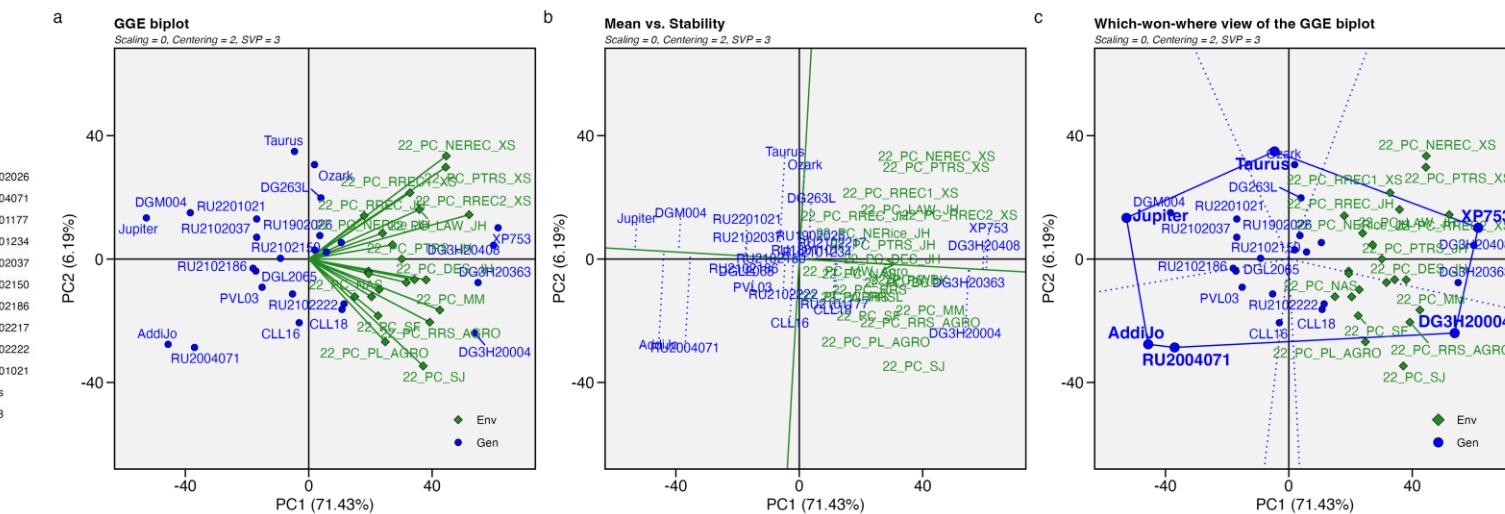
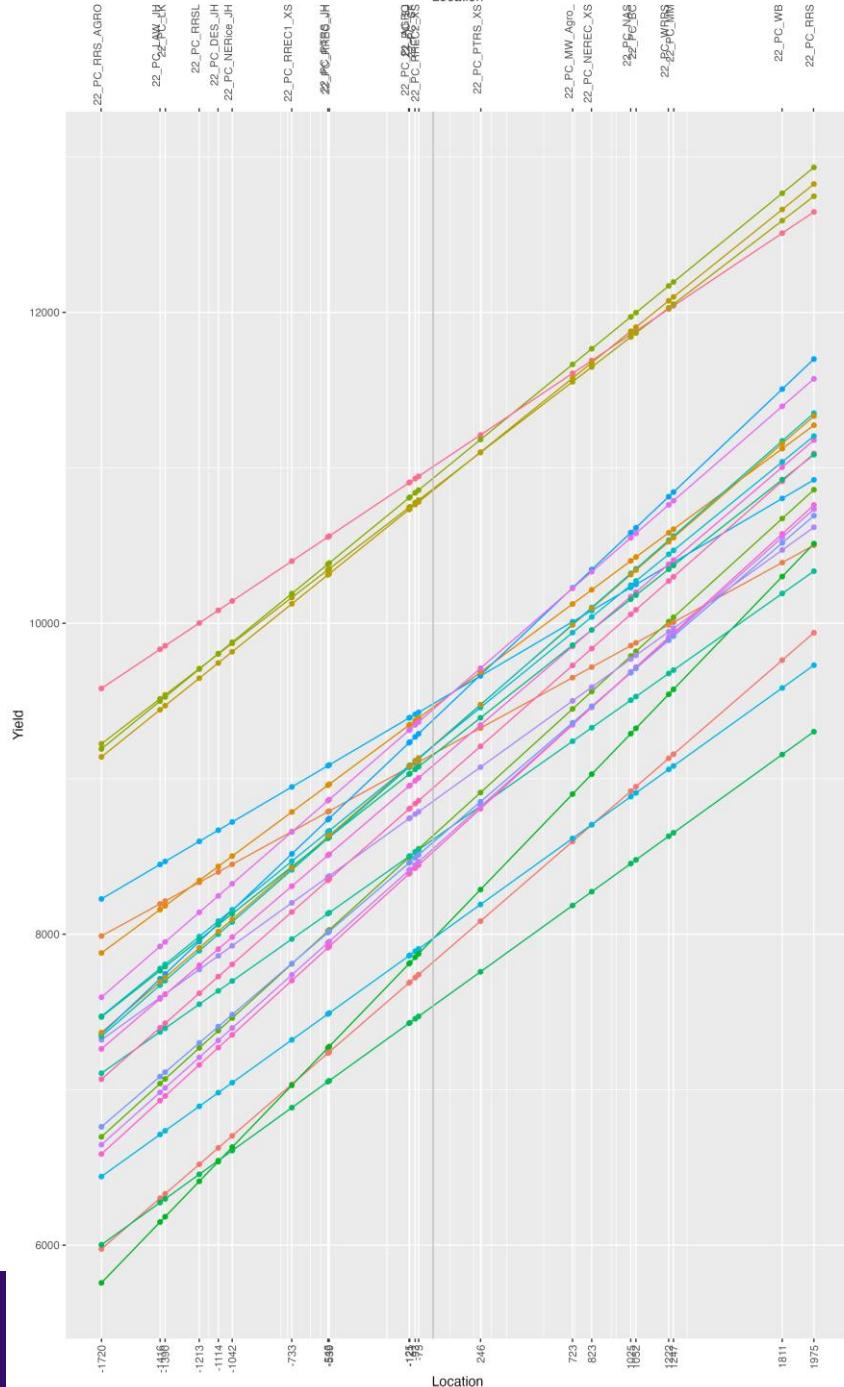
- 18 locations – Pre-Commercial
- Mixed model equation
- Spatial variation information
- Heritability (selection accuracy):
- $H^2g: Vg / Vp$
- Using the classical method: 0.88
- Using the current approach = 0.97



# Predicting performances and confidence intervals

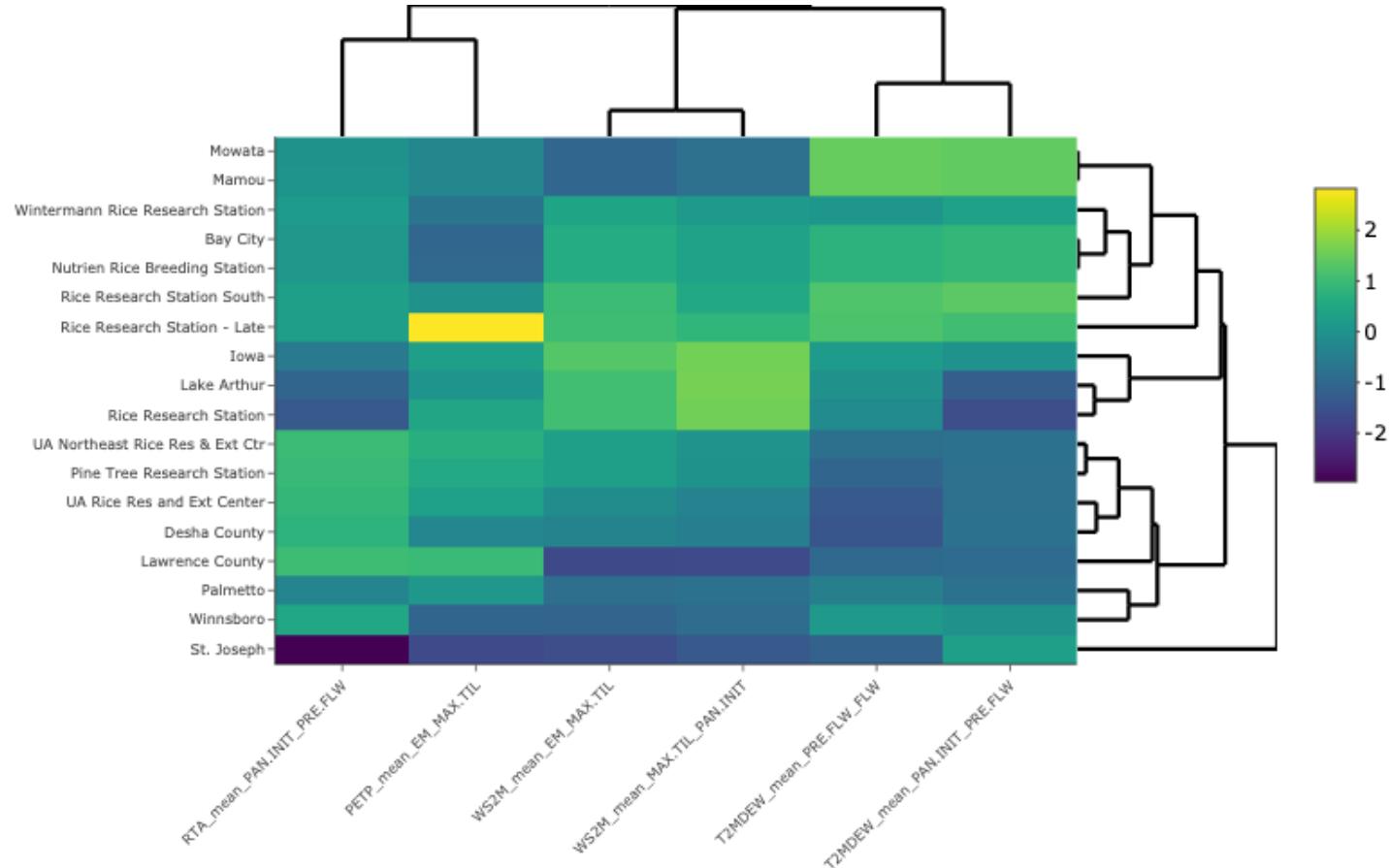


# GxE

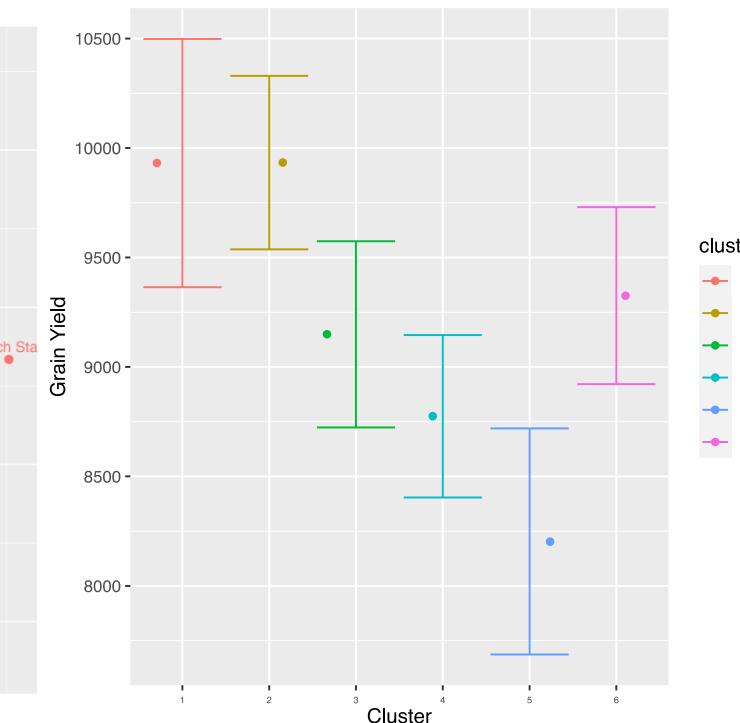
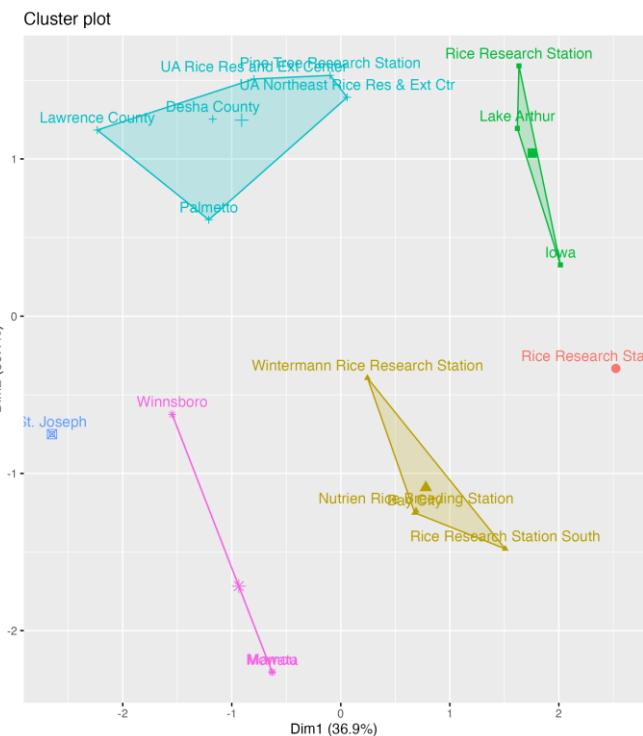
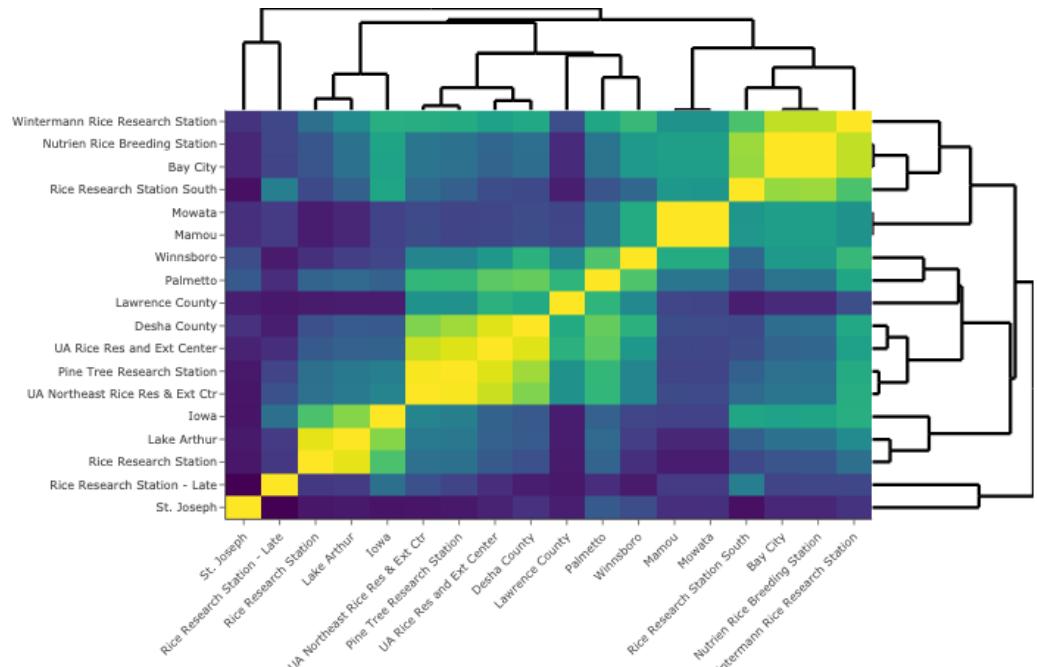


# Predictions using historical weather data

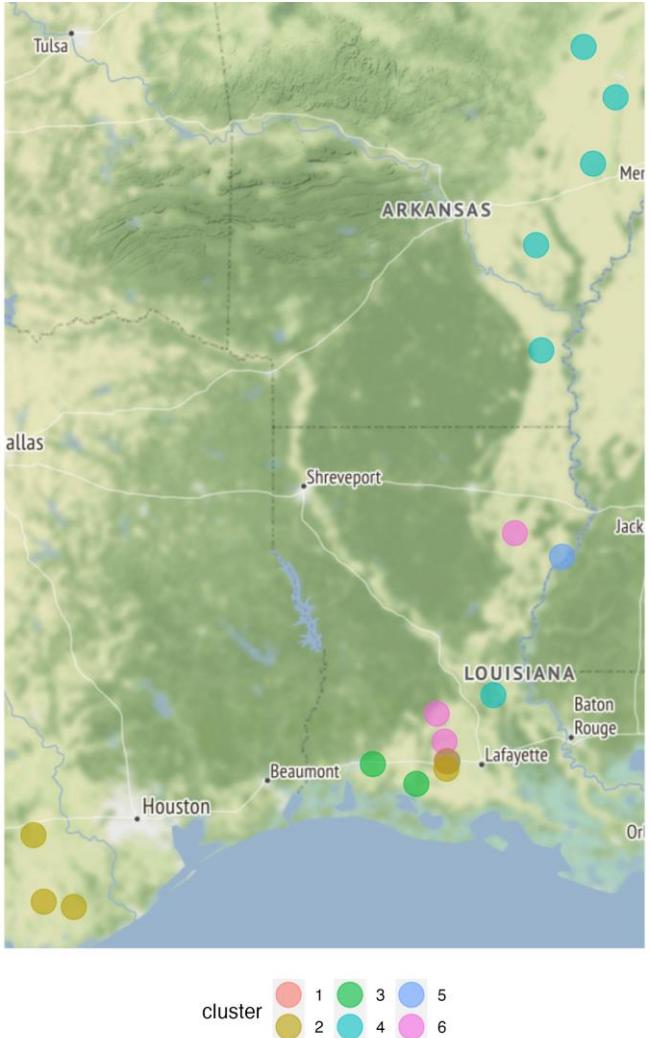
- 18 locations – Pre-Commercial
- 10 years of weather data - NASA
- During rice growing season
- Adjust to rice response
- 2 years of yield data
- Predictions:
- Linear mixed models
- Artificial Intelligence



# Predictions using historical weather data

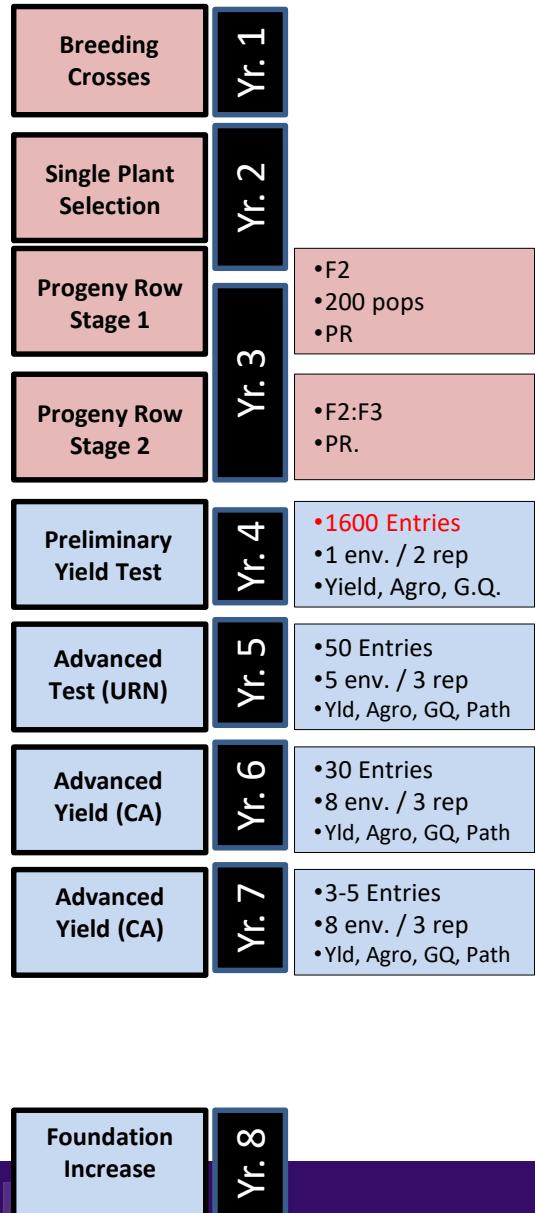


# Predictions using historical weather data

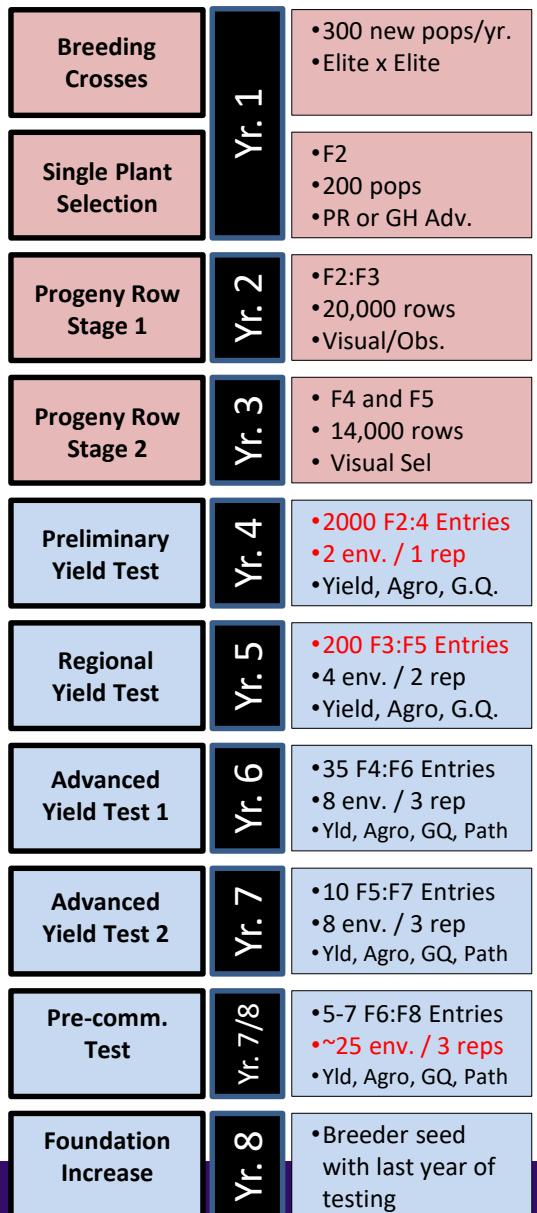


- Consequences:
- Better allocate trials in advance, matching the demand
- Borrow information from other regions
- Support the rice breeding program to recommend/identify the best variety for each location
- Reduce costs and increase precision

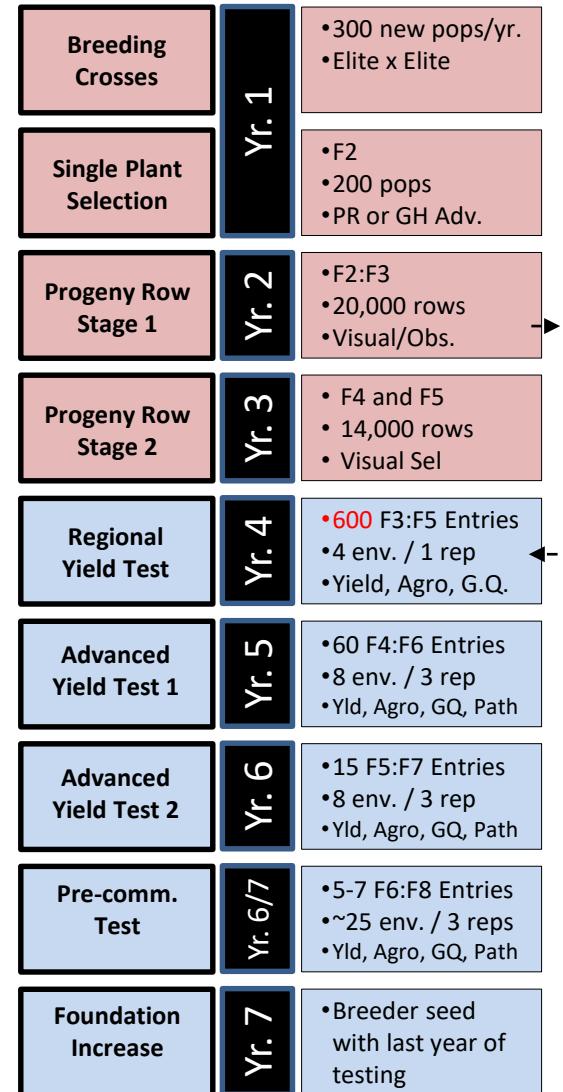
## Previous



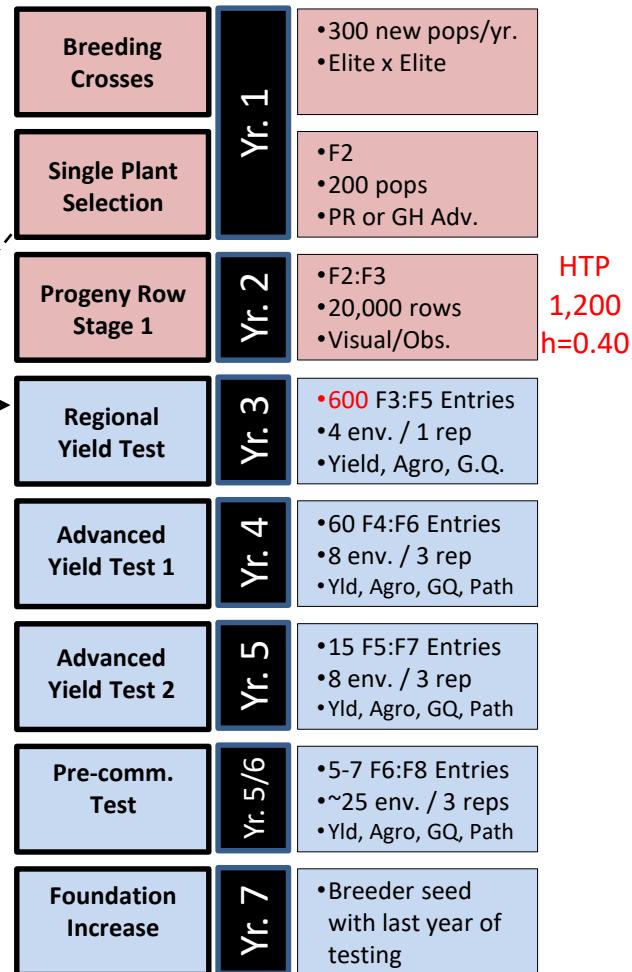
## Current Trad



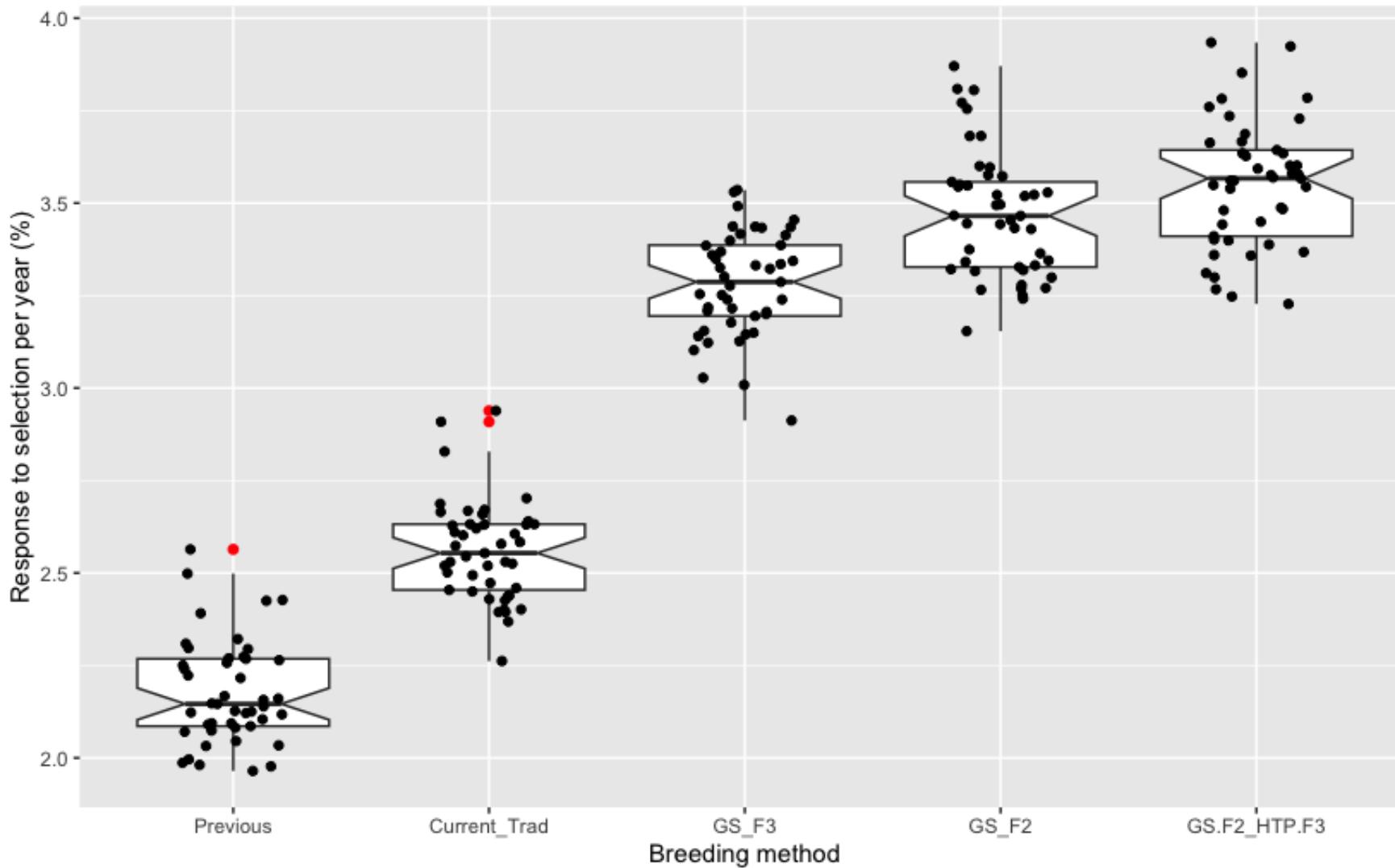
## GS in F3



## GS in F2



# Optimizing breeding schemes



# Next steps

- Extrapolated the envirotyping analyses to all counties in the US that have rice
- Develop image-based indices to select for:
  - *Sheath blight and blast resistance*
  - *Overall performance in early breeding stages ( $F_3$  row plots)*
- Make the analytic pipelines available on web-based platforms - all breeding stages, including Genomic Prediction
- Optimize breeding numbers - crosses, parents, progeny size, optimal parent contributions...



Thank you!

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