

# **Breeding for Physiological Improvement of Crop Yield**

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# How can a Physiologist work with a Breeder?

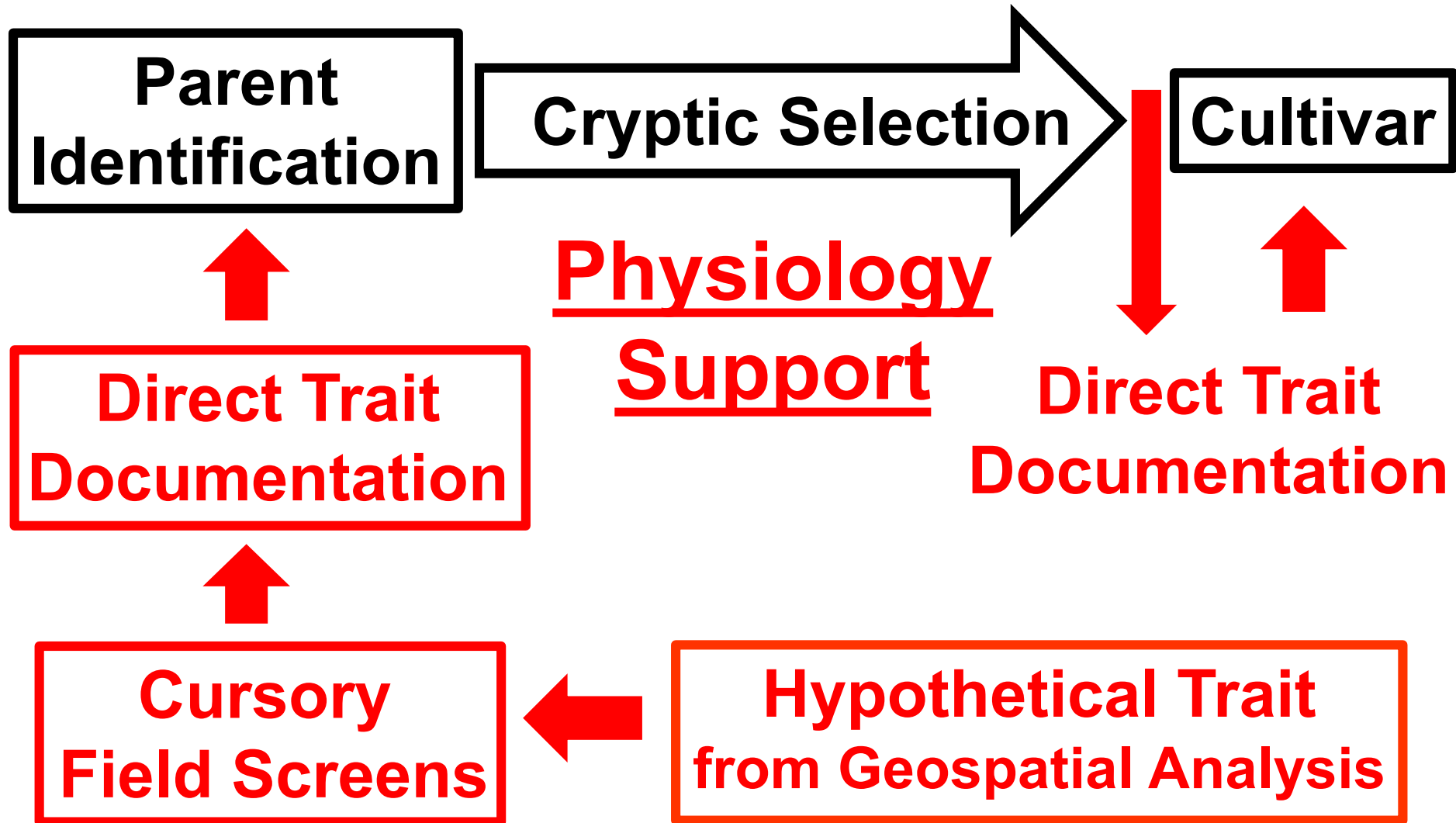


**GOAL: Put superior cultivars  
in farmers' fields**

# Major Inputs to Support Breeding

1. ***A priori geospatial yield assessment* of location and environment appropriate for specific physiological process.**
2. **Develop and apply multi-tier screening to identify genotypes expressed desired physiological response.**

# Breeding Path



# **Geospatial Assessment by Model**

## **Red Flags**

### **1. “Calibrated” models**

- a. Makes model empirical fits to data**
- b. SSM not calibrated**

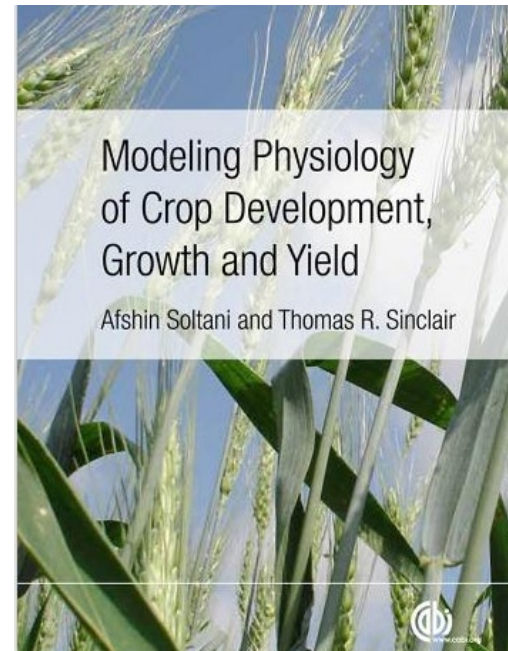
### **2. “Validated” models**

- a. Hypotheses cannot be validate, i.e. biological models**
- b. Robustness evaluation using all available data**

# **Model Approach**

- 1. Only two levels of hierarchy**
  - a. Organizational: Canopy → Crop**
  - b. Temporal: Daily → Season**
- 2. Use “summary” descriptions justified by both experimental and theoretical evidence**

# Simple Simulation Model (SSM)



- **Leaf area development function of temperature and soil water**
- **Growth function of RUE, radiation interception, and soil water**
- **Transpiration function of growth**

# **Transpiration Prediction**

## **Failings of Energy Balance Approach**

- **Energy balance is instantaneous description, not integral**
- **Penman Eqn. is not descriptive for vegetative surfaces**
- **Empirical in application**
- **Penman- Monteith requires ill-defined “canopy conductance”**
- **‘Crop coefficient’ purely empirical**



$$T = G \cdot (e^* - e) / k_d$$

where:  $G$  = plant growth

$T$  = transpiration

$(e^* - e)$  = atm. vapor pressure deficit

$$k_d = b \ c \ (P \ C_a / 1.5 \ p \ \epsilon) \ (L_D / L_T)$$

$b$  = photosynthate conversion to plant mass

$c = (1 - C_i / C_a)$ ;  $C_3 = 0.3$ ,  $C_4 = 0.7$

**Tanner and Sinclair (1983)**

# **Transpiration Efficiency Coefficient ( $k_d$ )**

**$C_4$  (maize, sorghum, millet)                      9 Pa**

**$C_3$  grasses (wheat, rice)                              6 Pa**

**$C_3$  legumes (soybean, peanut)                      5 Pa**

# **Key SSM Inputs**

- **Ontogeny Intervals (cum. temperature)**
- **Phyllochron**
- **Leaf area = f(node number)**
- **Species parameters**
  - **Radiation Use Efficiency**
  - **Transpiration Coefficient ( $k_d$ )**
- **Response functions to Fraction Transpirable Soil Water**
- **Linear increase in harvest index**

# Daily Weather Input

## GIS Data Base

(Pioneer Hi-Bred International, Inc.)

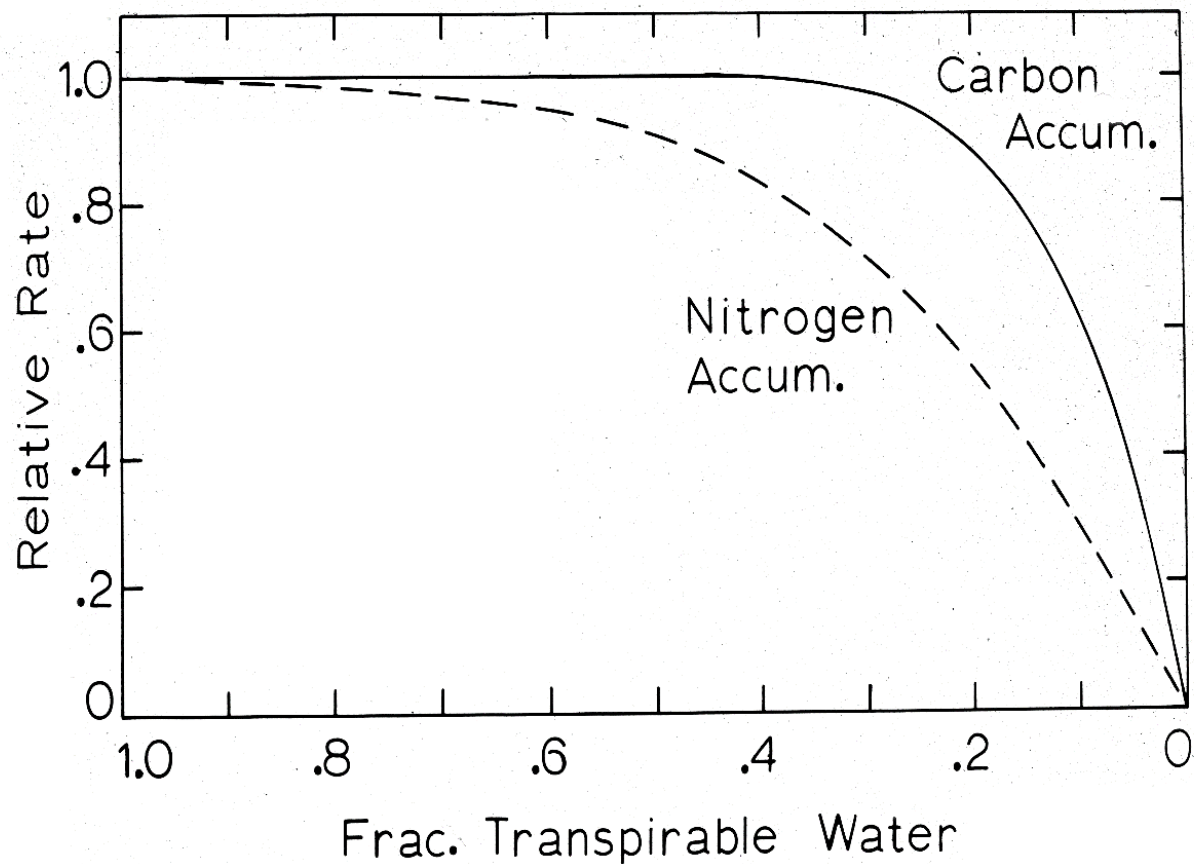
- **30 x 30 km grid system for U.S cropping areas (2655 grid locations)**
- **Weather (50 years for most grids)**
- **Soil**
- **Crop ontogeny by grid location**
- **Sowing Date**

**Each test required >130,000 model runs**

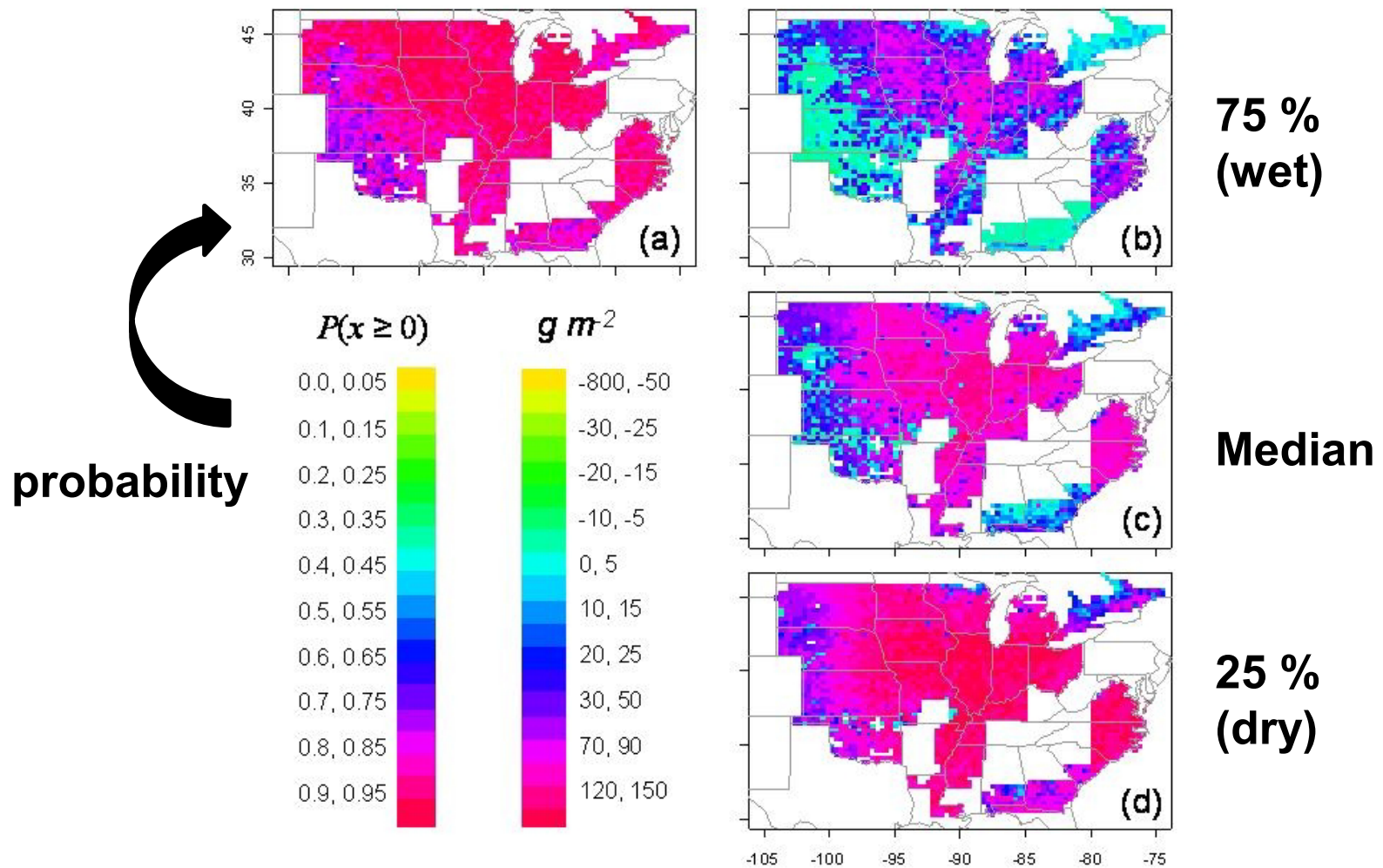
## **Case Studies**

- 1. Nitrogen fixation drought resilience in soybean.**
- 2. Stomata closure at low values of vapor pressure deficit.**
- 3. Early stomata closure with soil drying in peanut.**

# Case 1: Soybean $N_2$ Fixation Limited by Soil Water



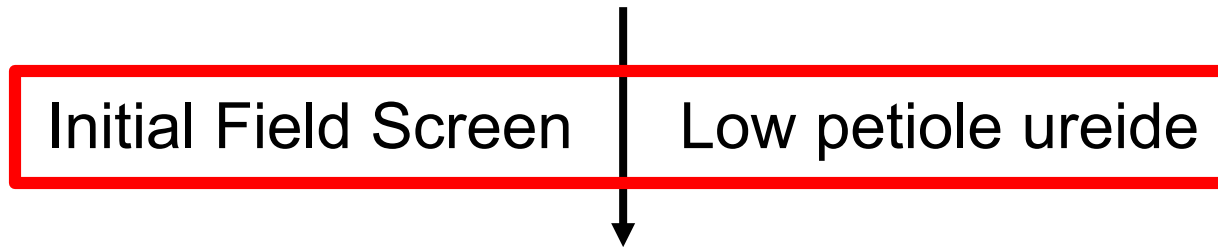
# Simulated Yield Response to N<sub>2</sub> Fixation Drought Resilience



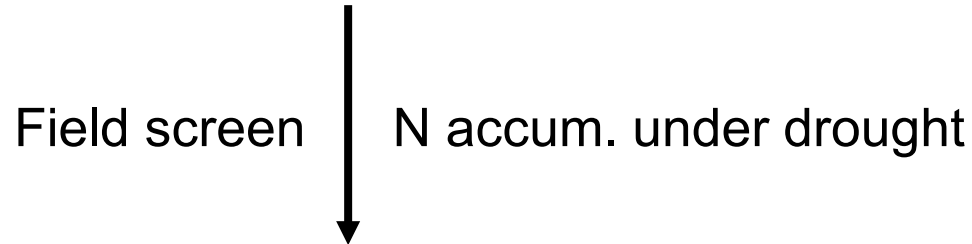
Sinclair et al. (2010)

# Identification of N<sub>2</sub> Tolerant Germplasm

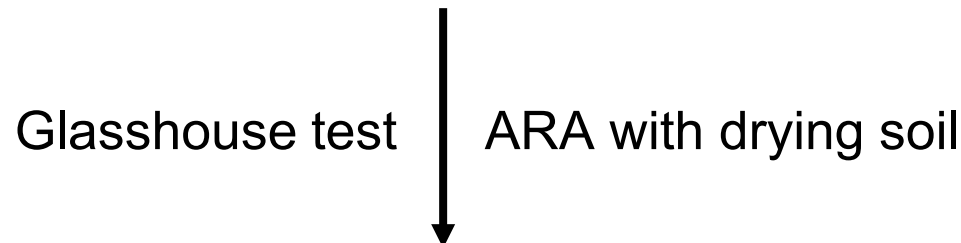
~ 3 500 plant introductions



~ 250 PI selections



24 PI selections

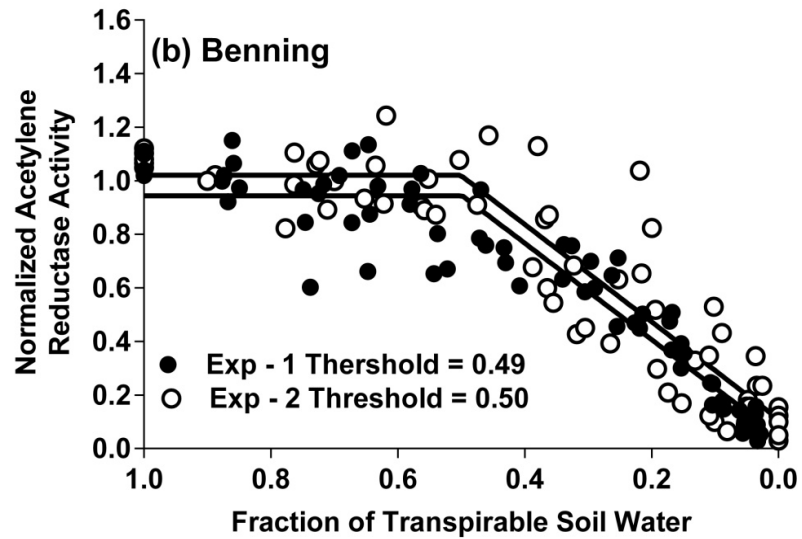


11 Tolerant PIs

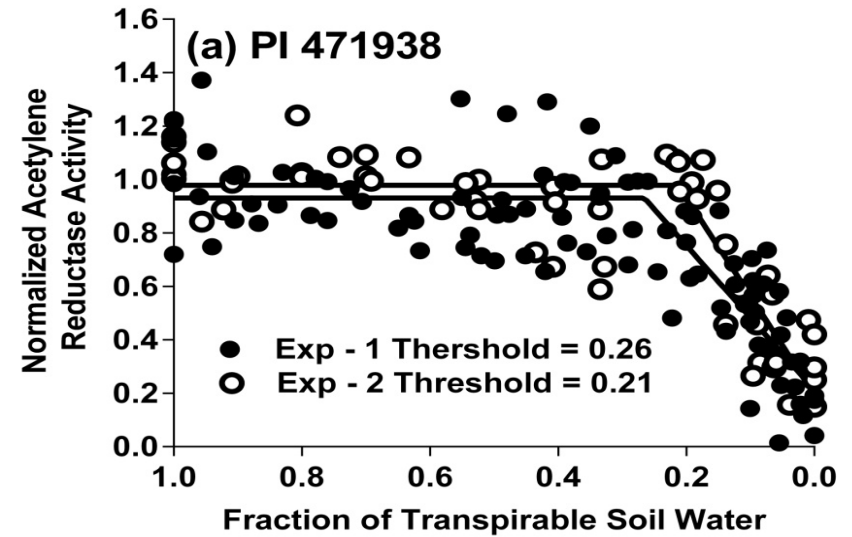




## Normal - sensitive



## Selected - tolerant

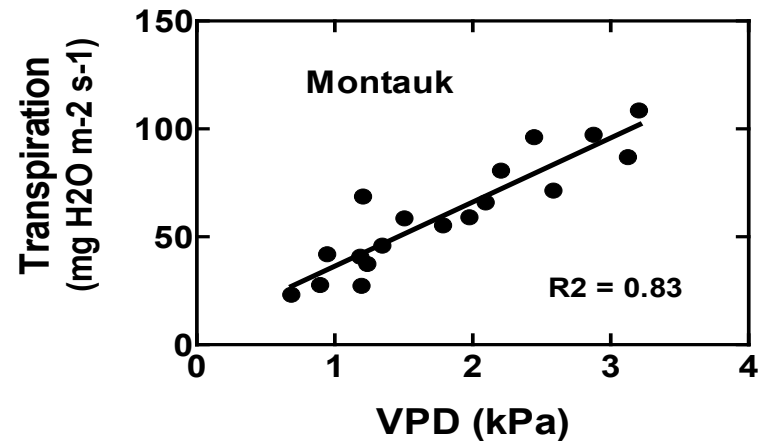
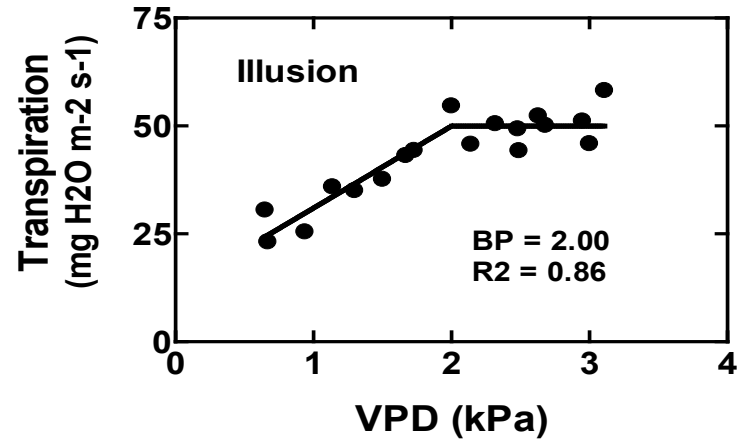
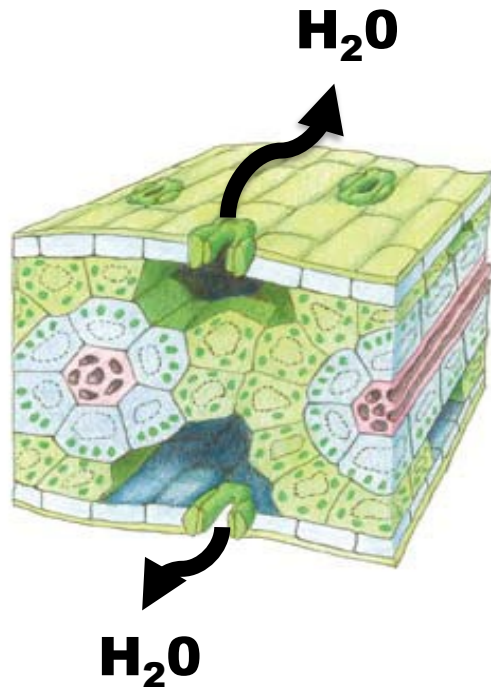


Soil Drying →

# Cultivars: Elite Breeding Lines (AR & NC)

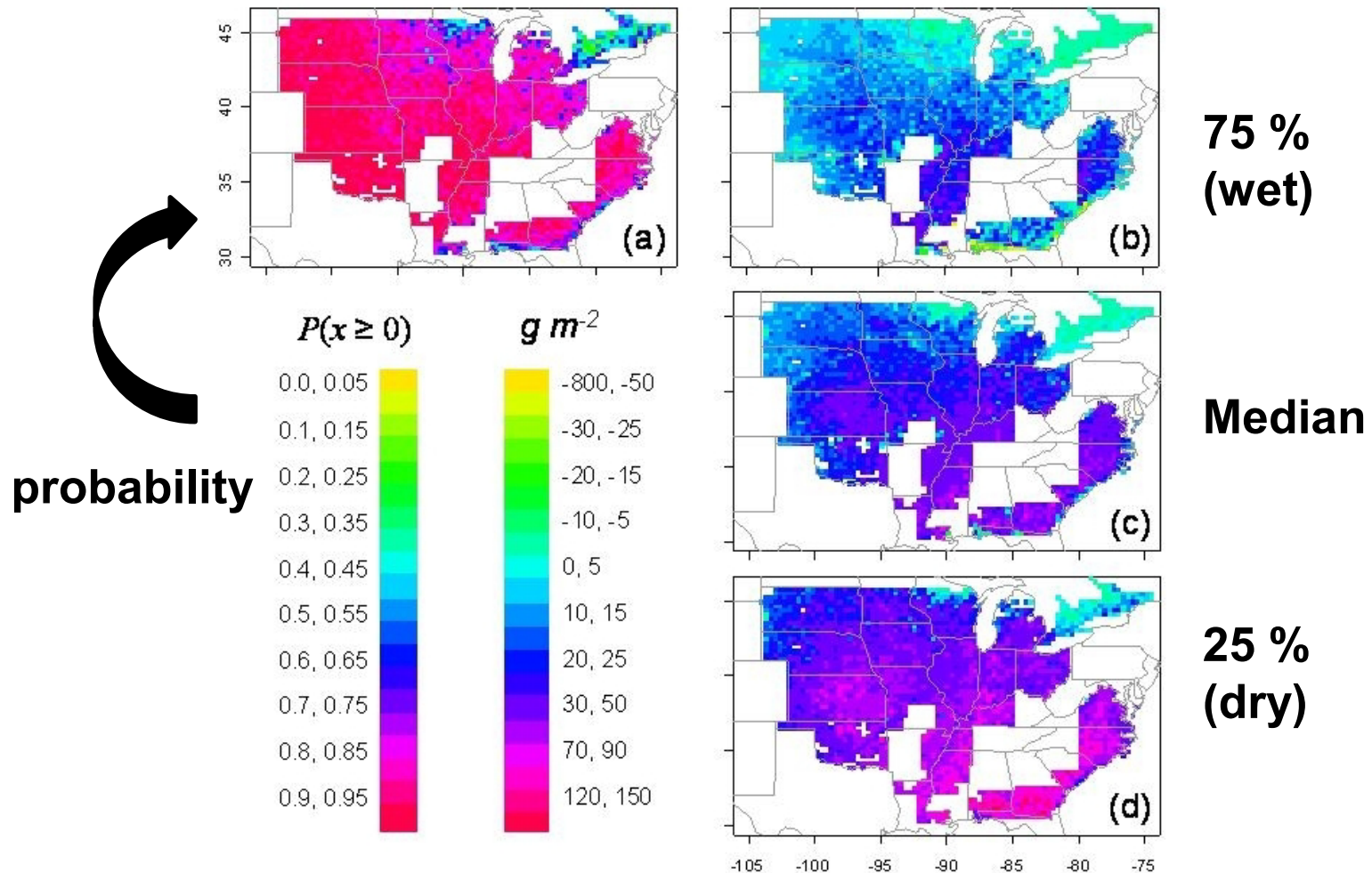
|                  |                |                                |                                                                                                             | N <sub>2</sub> Fixation Drought Tolerance |                              | Limited Transpiration |                       |
|------------------|----------------|--------------------------------|-------------------------------------------------------------------------------------------------------------|-------------------------------------------|------------------------------|-----------------------|-----------------------|
|                  | Maturity Group | Parental Pedigree <sup>1</sup> | Antecedents <sup>2</sup>                                                                                    | Rank                                      | Antecedent With Trait        | Rank                  | Antecedent With Trait |
| R02-1325         | V              | 93705-35-1 x PI 227557         | 93705-35-1 = Jackson x KS 4895                                                                              | 1                                         | 50% PI 227557<br>25% Jackson | 8                     | No known source       |
| N05-7432 (N8002) | VIII           | N7002 x N98-7265               | N7002 = N7001 x Cook<br>N98-7265 = Hutcheson x PPI 471938                                                   | 2                                         | 25% PI 471938                | 3                     | 12.5% PI 416937       |
| R05-5559         | V              | UA4805 x PI 471938             | UA4805 = Hartz 5545 x KS 4895                                                                               | 3                                         | 50% PI 471938                | linear                | No known source       |
| N04-9646         | VII            | Boggs x NTCPR94-5157           | Boggs = G81-152 x Coker 6738<br>NTCPR94-5157 = Davis x N73-1102<br>N73-1102 = Tracy x Ransom                | 4                                         | No known source              | 4                     | No known source       |
| N06-7194         | VIII           | N98-7265 x N93-110-6           | N98-7265 = Hutcheson x PI 471938<br>N93-110-6 = Young x PI 416937                                           | 5                                         | 25% PI 471938                | 5                     | 25% PI 416937         |
| R09-1069         | V              | R01-52F x Ozark                | R01-52F = R93-5455 x Minsoy<br>R93-5455 = Jackson-derived line x PI 416937<br>Ozark = Holladay x DP 415     | 6                                         | 6.25% Jackson                | 1T                    | 12.5% PI 416937       |
| N06-7543         | VII            | NC-Roy x N8001                 | NC-Roy = Holladay x Brim<br>N8001 = N7001 x Cook                                                            | 7                                         | No known source              | 7                     | 12.5% PI 416937       |
| R07-5235         | V              | R01-52F x R02-6268F            | R01-52F = R93-5455 x Minsoy<br>R93-5455 = Jackson-derived line x PI 416937<br>R02-6268F = KS 4895 x Jackson | 8                                         | 31.25% Jackson               | 9                     | 12.5% PI 416937       |
| R09-1121         | V              | R01-888F x R05-5559            | R01-888F = Jackson x KS 4895<br>R05-5559 = UA 4805 x PI 471938                                              | 9                                         | 25% Jackson<br>25% PI 471938 | 1T                    | No known source       |
| R07-7044         | V              | Lonoke x NTCPR94-5157          | Lonoke = Manokin x Asgrow 6297<br>NTCPR94-5157 = Davis x N73-1102<br>N73-1102 = Tracy x Ransom              | 10                                        | No known source              | 6                     | No known source       |

## Case 2: Partial Stomata Closure at Elevated VPD



Jafarikouhini et al. (2020)

# Simulated Yield Response of Soybean to Elevated VPD



Sinclair et al. (2010)

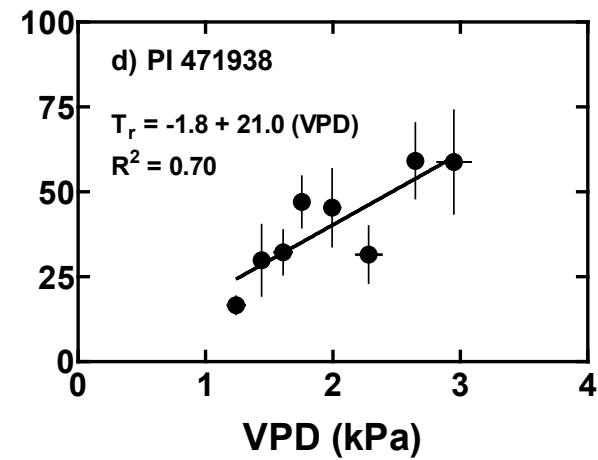
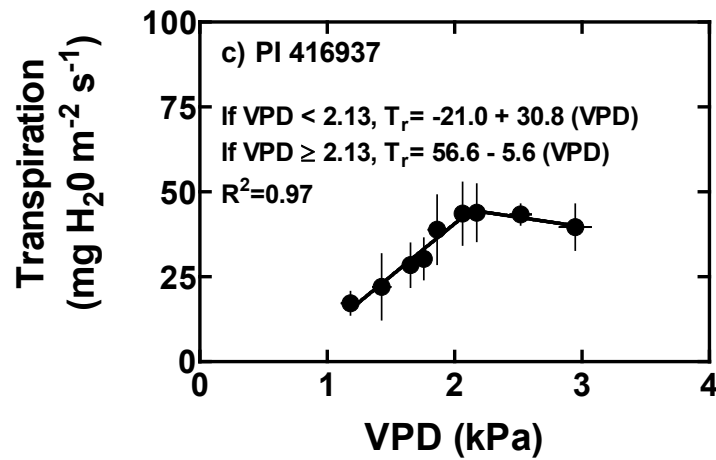
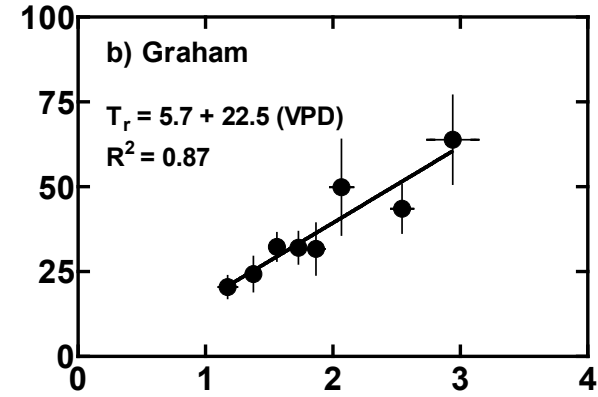
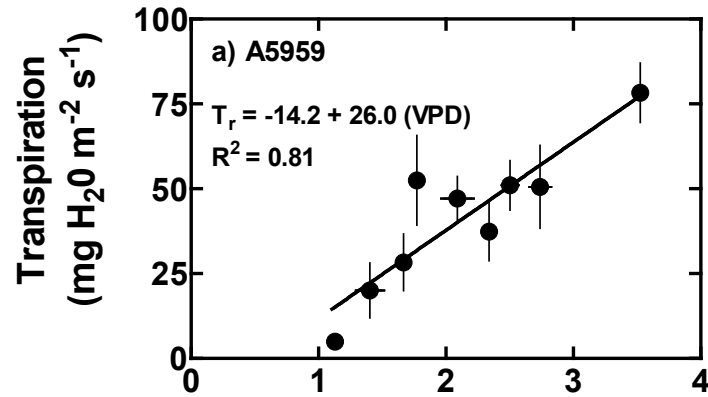
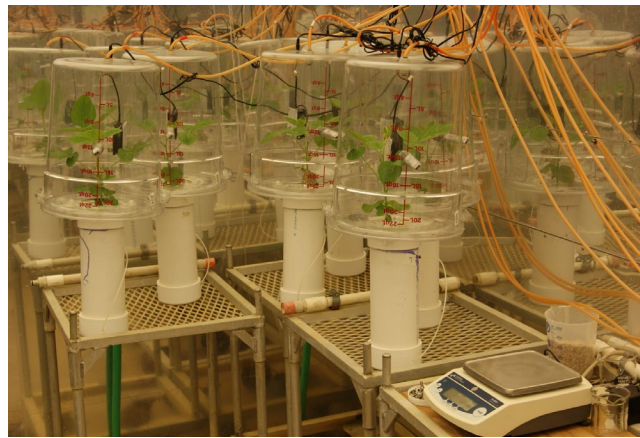


# Initial Field Screen



**Normal**

**PI 416937**



# Cultivars: Elite Breeding Lines (AR & NC)

|                  |                |                                |                                                                                                             | N <sub>2</sub> Fixation Drought Tolerance |                              | Limited Transpiration |                       |
|------------------|----------------|--------------------------------|-------------------------------------------------------------------------------------------------------------|-------------------------------------------|------------------------------|-----------------------|-----------------------|
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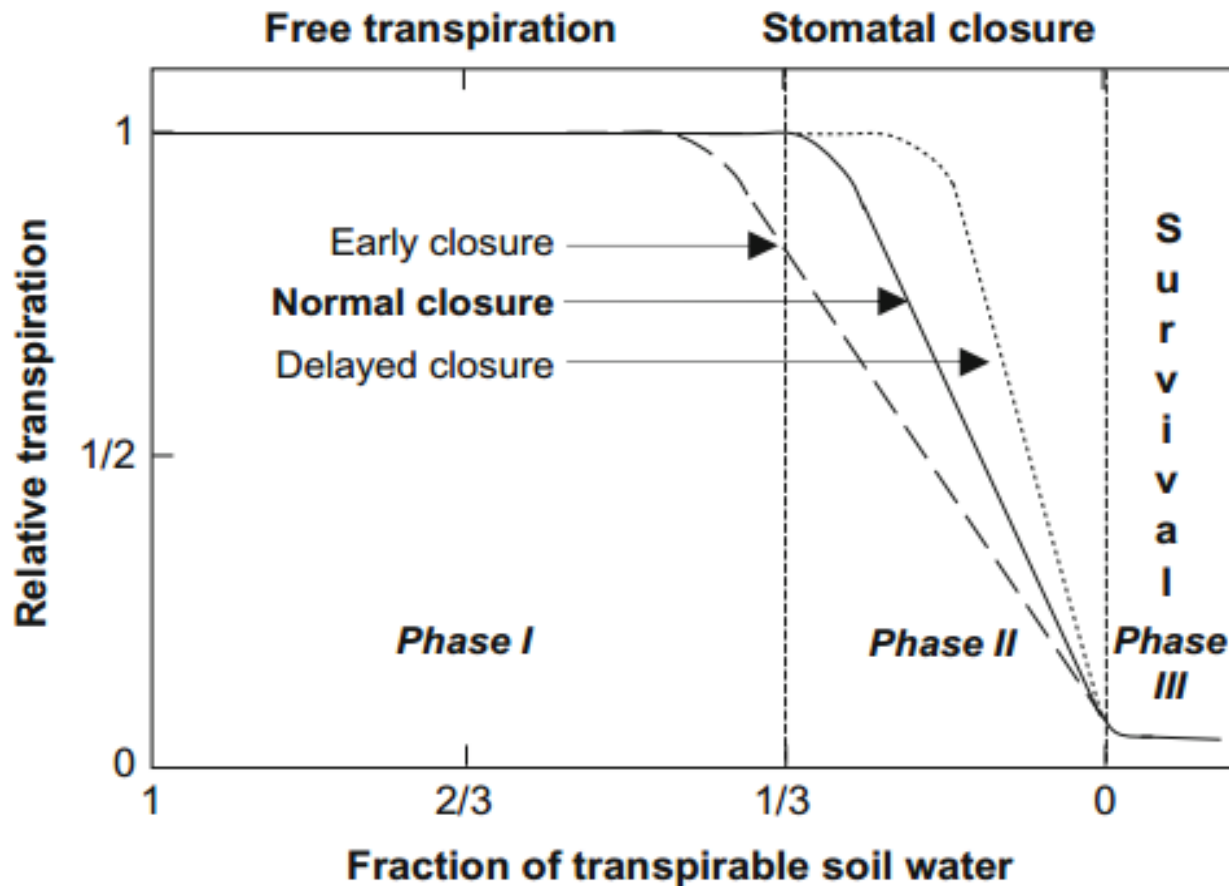


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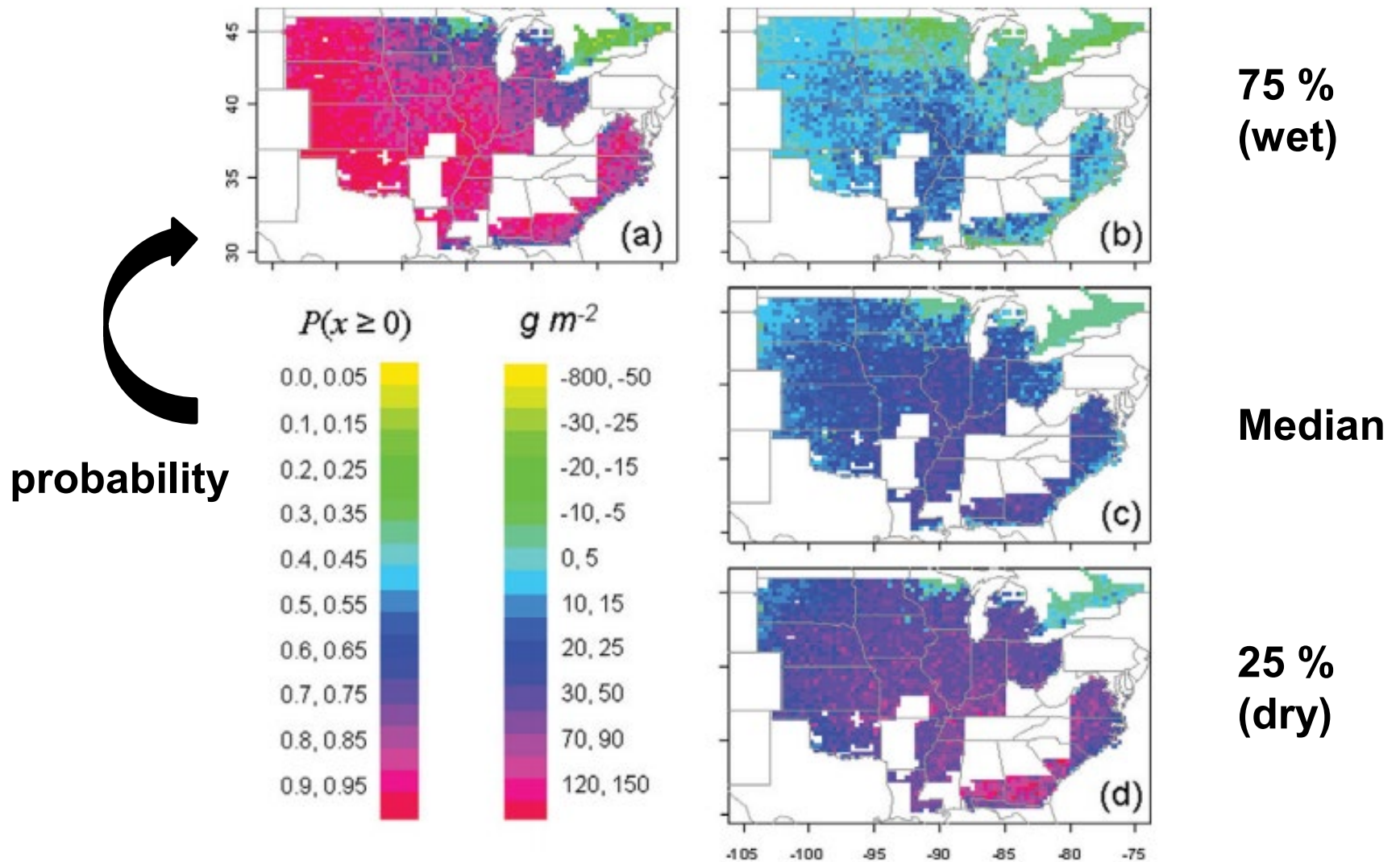
Competitive Check



# Case 3: Water Conservation by Early Stomata Closure with Soil Drying

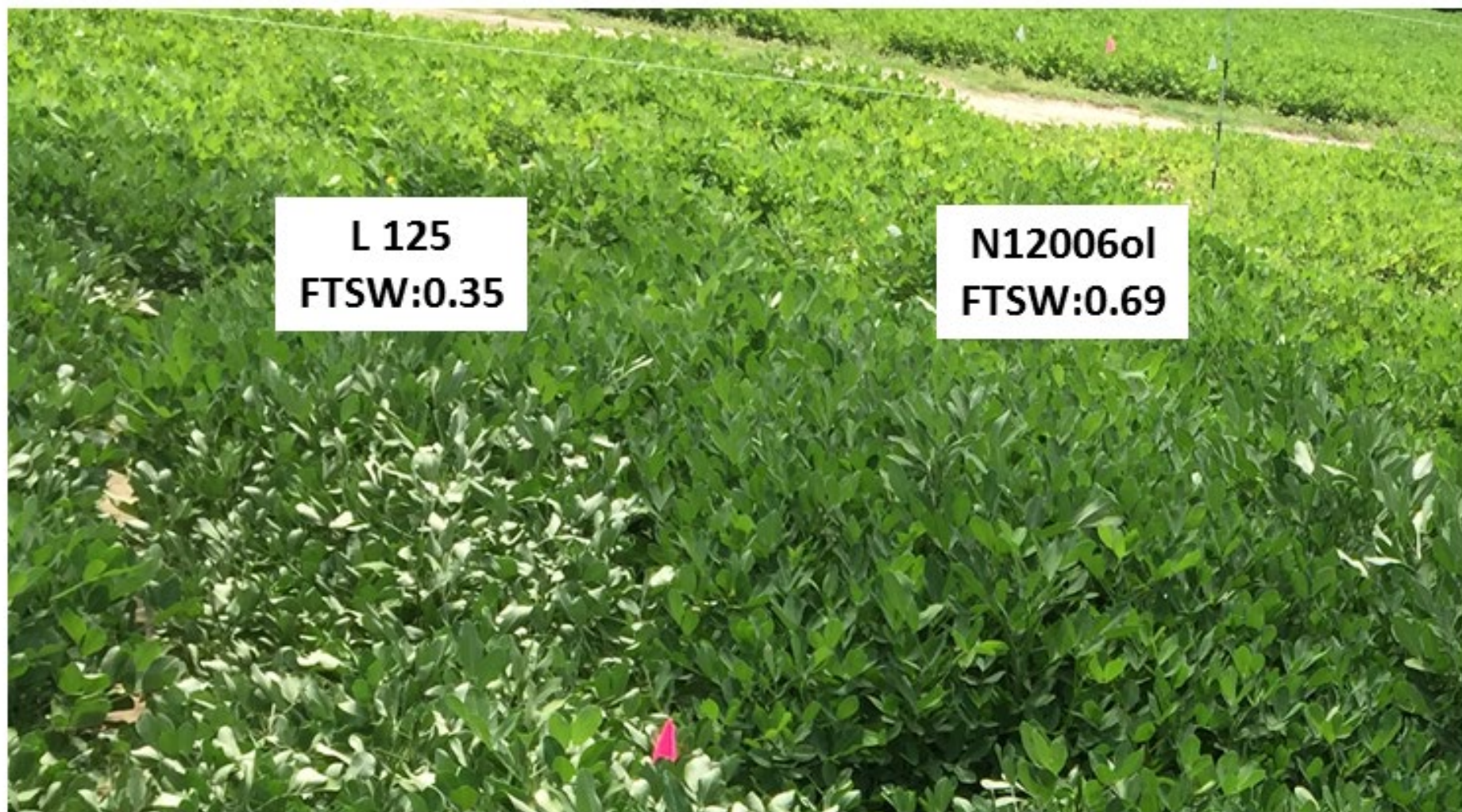


# Simulated Benefit of Early Stomatal Closure

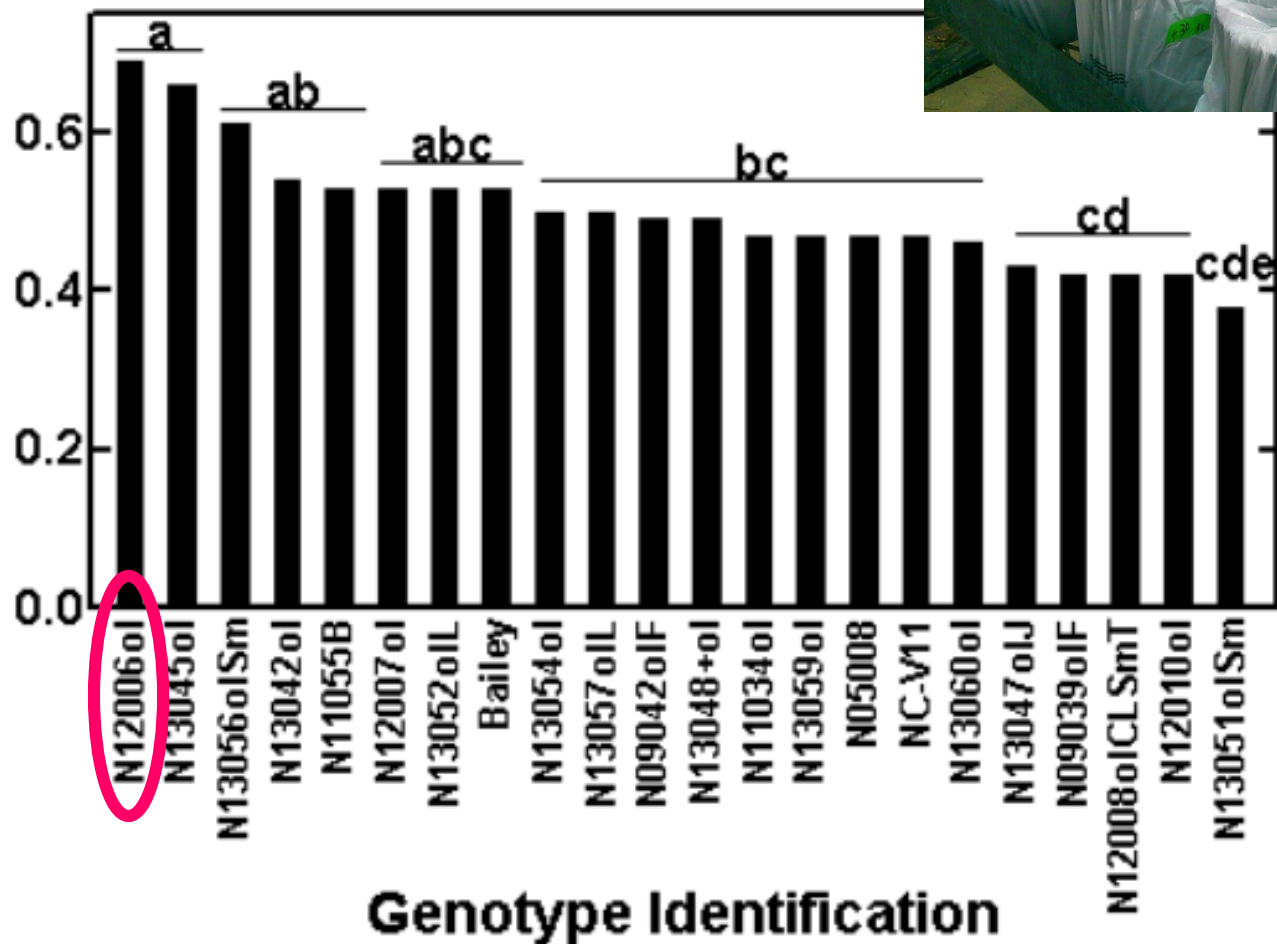


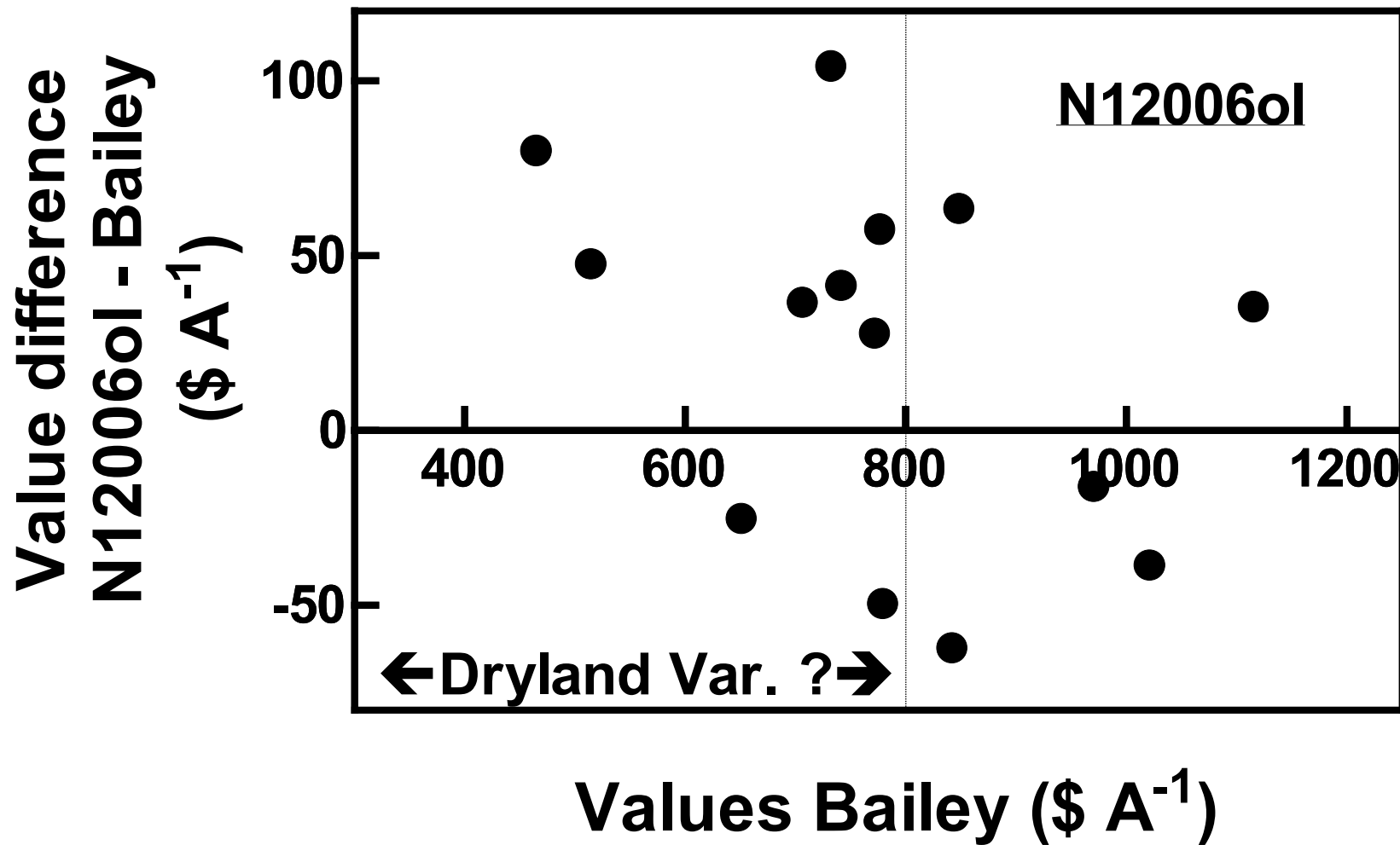


# Initial Visual Field Screen

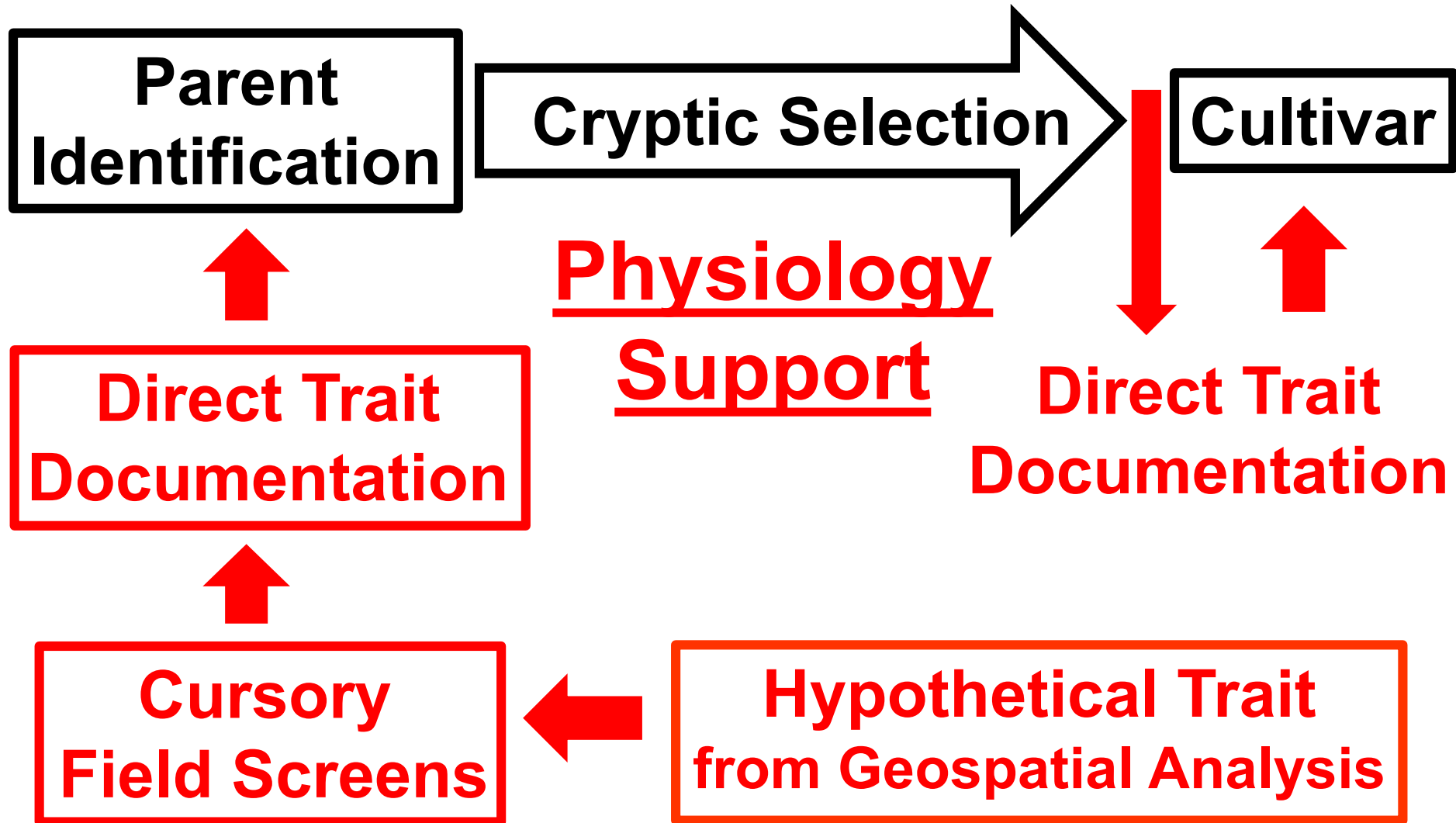


FTSW Threshold





# Breeding Path









# **Physiological Input and Breeding**

## **Approach**

- **Mechanistic model for geospatial analysis**
- **Develop tiers of physiological screens for parent selection**
- **Confirmation of trait expression in high-yielding progeny**

# Chemically Induced VDP Response

