

Differentiating Soybean Response from Two Classes of Bleaching Herbicides: An Opportunity for Phenotyping Technology

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Diflufenican (DFF)

- First HRAC Group 12 herbicide to be available in the US for soybean production
 - Inhibits phytoene desaturase
 - Targets *Amaranthus* species
- Injury to soybean ranged from 3% to 42% when heavy rainfall occurred within 3 days after emergence¹



Mesotrione Carryover

- Late season applications of mesotrione in corn may occasionally result in carryover to soybean¹
 - Stunted growth
 - Bleaching, necrosis
 - Reduced grain yield
- Characteristics that increase persistence in the soil^{2,3}
 - High organic matter
 - Drought conditions
 - Cool temperature
 - Low soil pH levels



Image adapted from Hartzler 2020¹

Research Justification



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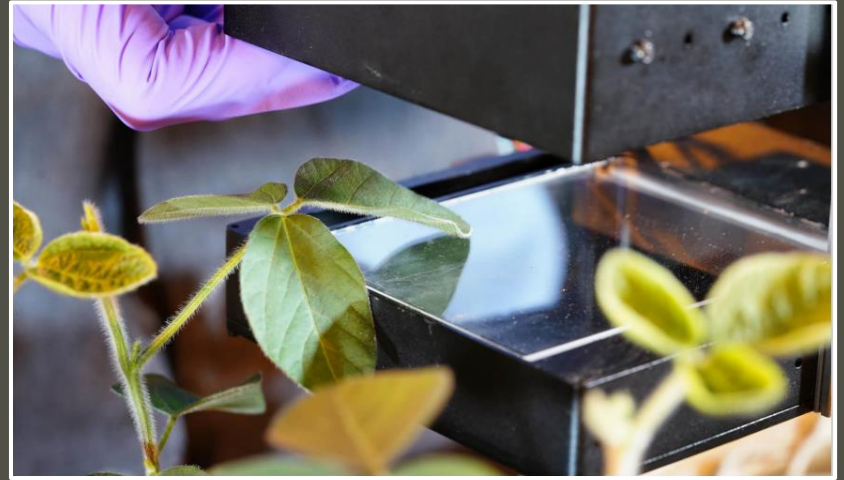


Imaging in Herbicide Research

- Hyperspectral imaging can predict the ability of corn to recover from varying levels of glyphosate injury with high accuracy¹
- High throughput imaging using a UAV sensor is more precise in evaluating the severity of crop injury from herbicide stress than visual evaluation²
- UAV hyperspectral imaging faces challenges including³
 - Spatial resolution irregularities
 - Rough leaf surfaces
 - Shadows
 - Dead pixels

LeafSpec Imager

- Handheld, high resolution hyperspectral imager
- LeafSpec can accurately distinguish between damage caused by off-target 2,4-D and dicamba injury on soybean¹



Hypothesis & Objectives

Null Hypothesis

The LeafSpec imager will not be able to distinguish soybean injury from herbicides causing similar bleaching symptomology.

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1. Characterize soybean response to simulated mesotrione carryover, diflufenican preemergence applications, and their interaction
2. Evaluate the capability of hyperspectral technology to identify and differentiate herbicide injury from preemergence applications of diflufenican and carryover rates of mesotrione

Materials & Methods

- Field trials conducted near Lafayette, IN
- Planted May 15th and repeated June 24th
- Two-factor RCBD design, 4 replicates
- Rates
 - Diflufenican: 0, 150, 300 g ai ha⁻¹
 - Mesotrione: 0, 26 g ai ha⁻¹
- Soybean
 - AG29XF4
 - 345,000 seeds ha⁻¹
 - 76 cm rows



Data Collection

Visible injury rating (0-100%)

- 14, 21, 28, and 35 days after application (DAA)
- Overall injury
- Chlorosis
- Stunting

LeafSpec Images

- 26 DAA
- 15 scans/treatment
- All scans collected from the first trifoliolate
- 1.5 cm² leaflet



Analysis

Visual Injury

- ANOVA was conducted using RStudio[®]
- Means separation $\alpha=0.05$ (Tukey's HSD test)
- Colby's Method:¹ $E = (X*Y)/100$



Analysis

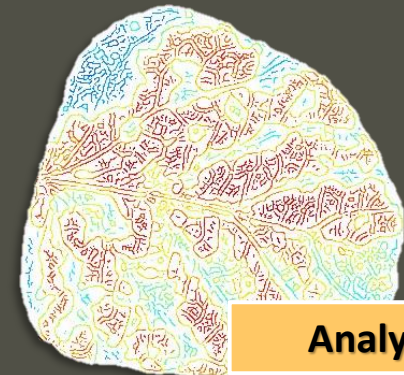
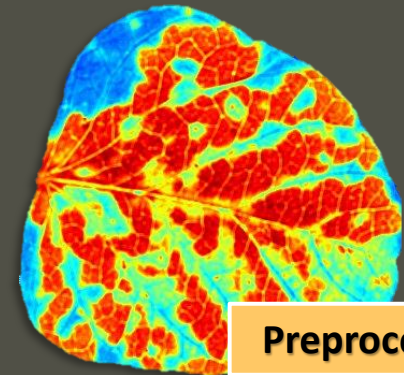
All data processing was performed using MATLAB®

Preprocessing

- White reference calibration
- Image segmentation

Spectroscopic Data Prediction

- Partial least squared discriminant analysis



An aerial photograph of a large agricultural field. The field is divided into several sections, some of which are planted with crops in neat rows. A road runs horizontally across the upper portion of the image, with several vehicles, including a white semi-truck, driving on it. In the background, there are several white farm buildings or barns. The overall scene is a typical rural agricultural landscape.

Results

Hypothesis & Objectives

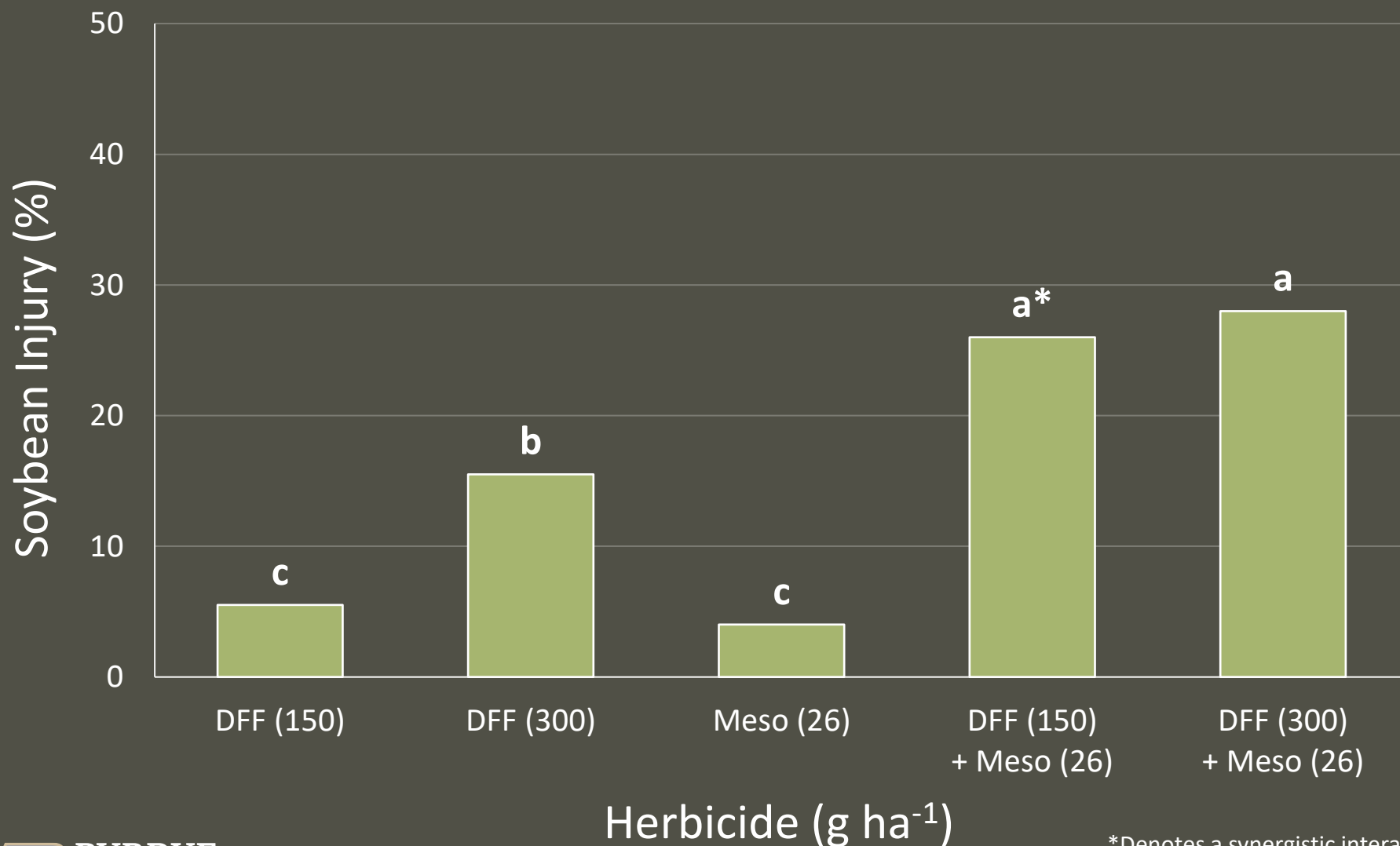
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Soybean Injury 21 DAA



Soybean Injury 21 DAA



Nontreated



150 g ha⁻¹ DFF



300 g ha⁻¹ DFF



26 g ha⁻¹ Meso



150 g ha⁻¹ DFF
+ 26 g ha⁻¹ Meso



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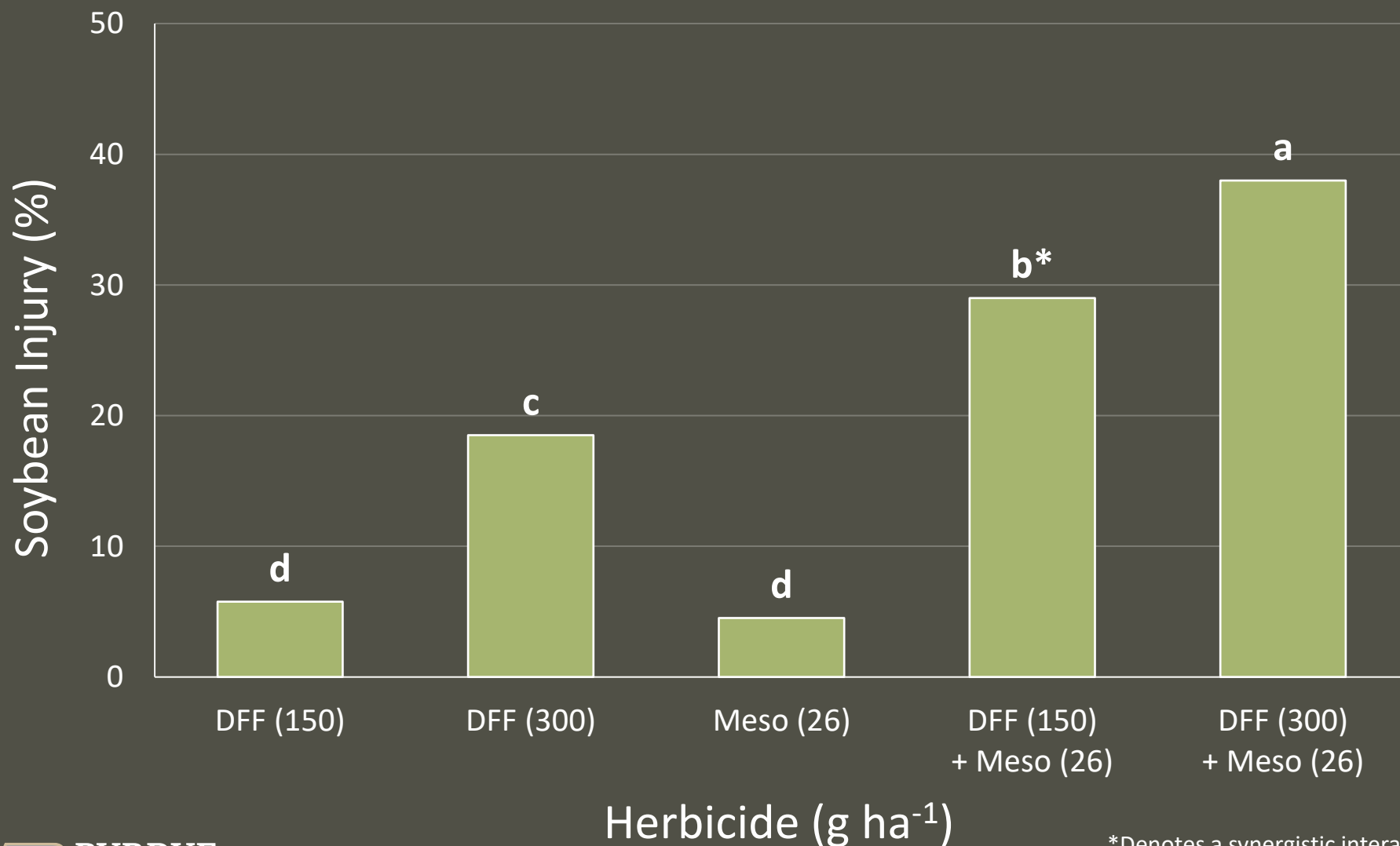


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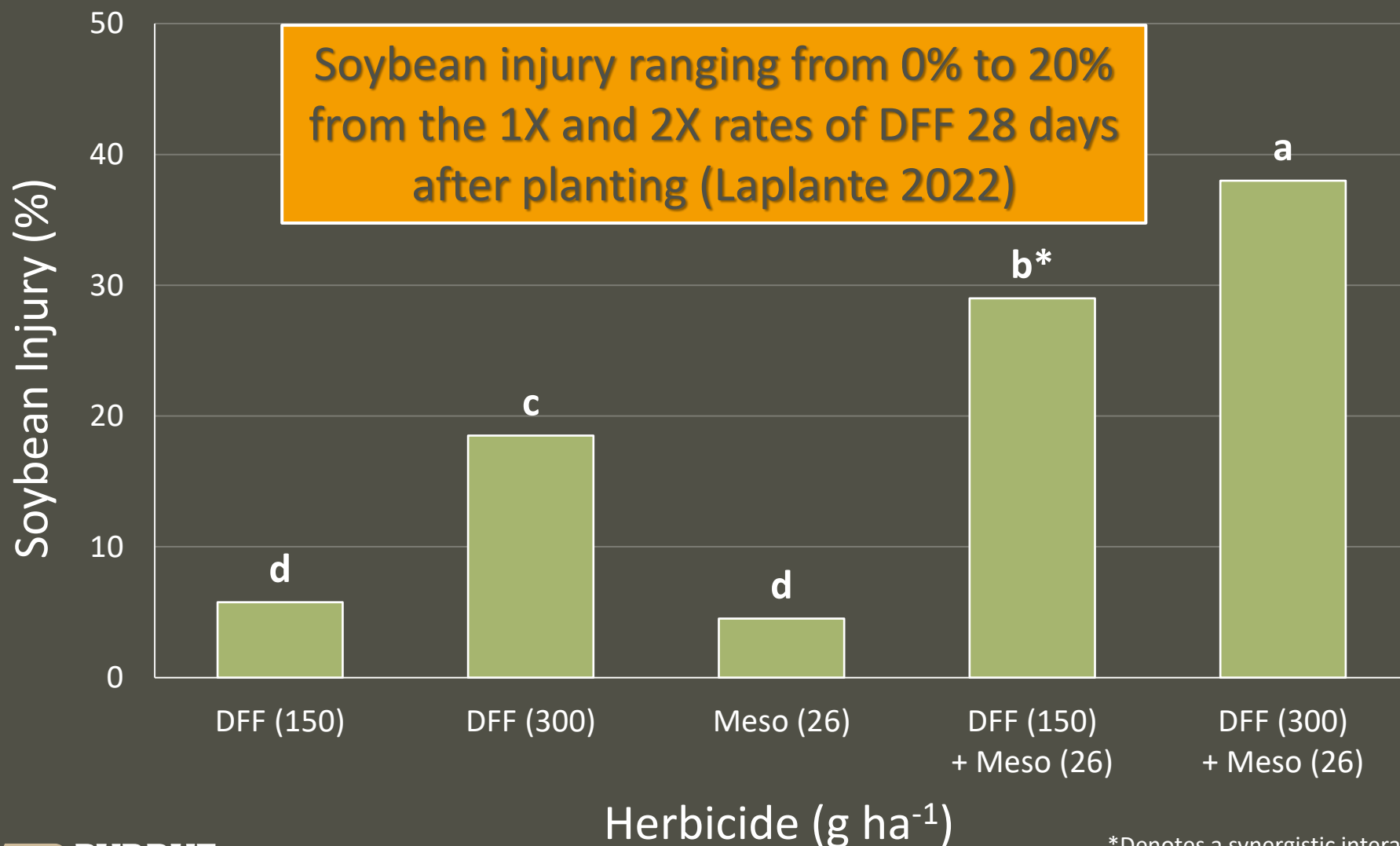
Soybean Injury 28 DAA



*Denotes a synergistic interaction
Data pooled over runs

Soybean Injury 28 DAA

Soybean injury ranging from 0% to 20% from the 1X and 2X rates of DFF 28 days after planting (Laplante 2022)



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Injury Confusion Matrix

True Class	DFF + Meso				15	100%
	DFF		1	13	1	87%
	Meso		13	2		87%
	NT	15				100%
		NT	Meso	DFF	DFF + Meso	Total: 93.5%
		Predicted Class				

Injury Confusion Matrix

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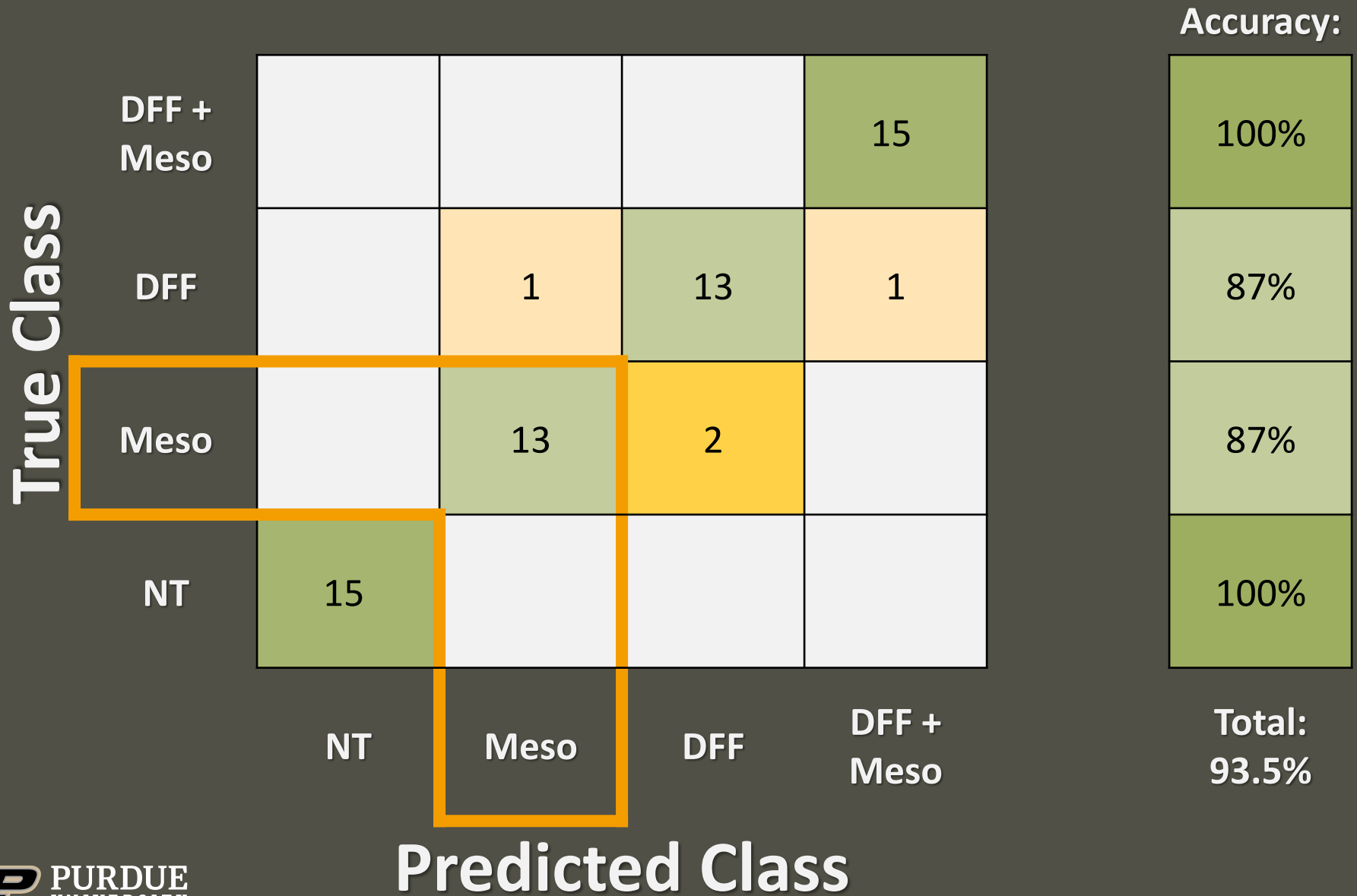
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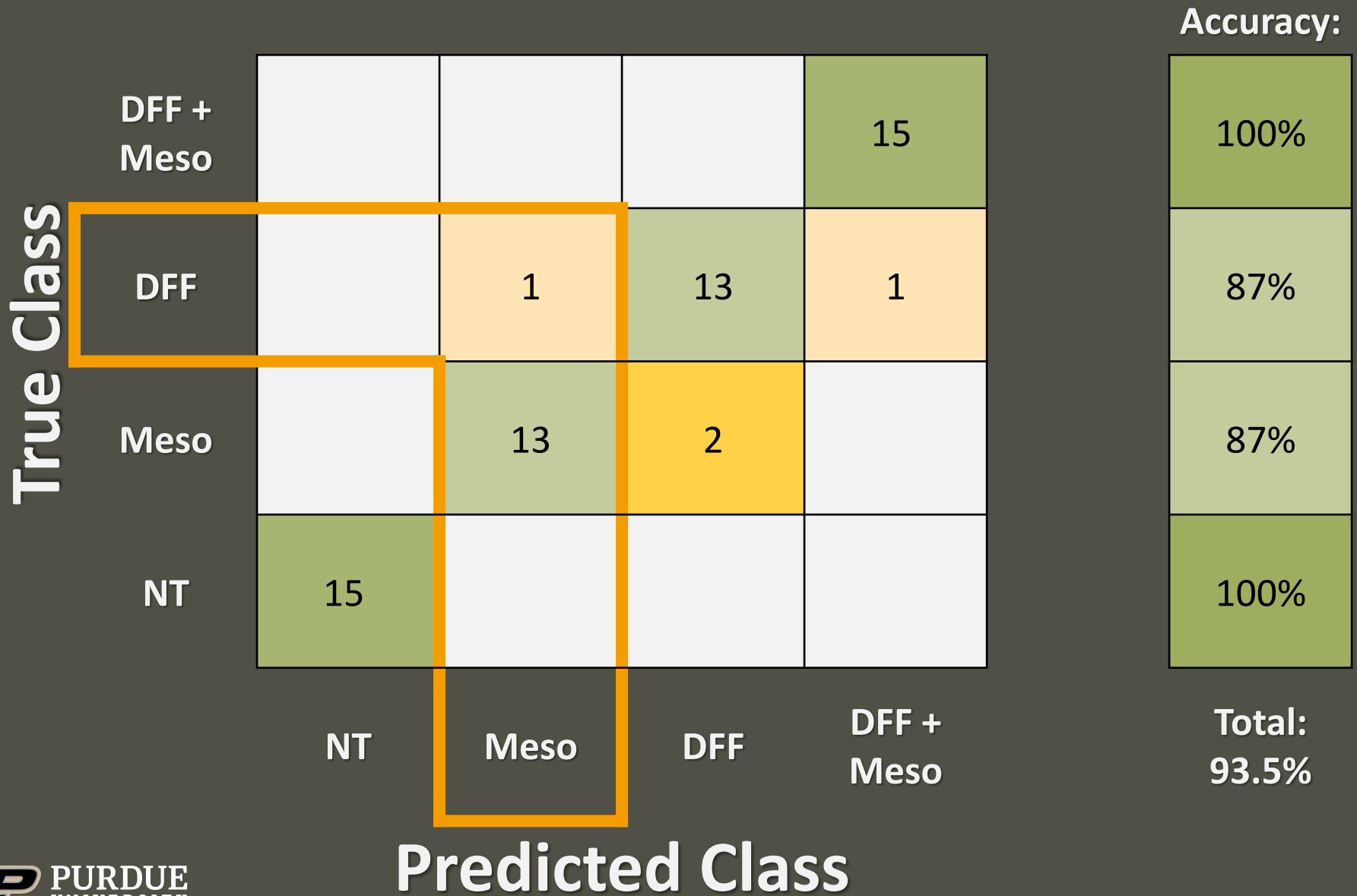
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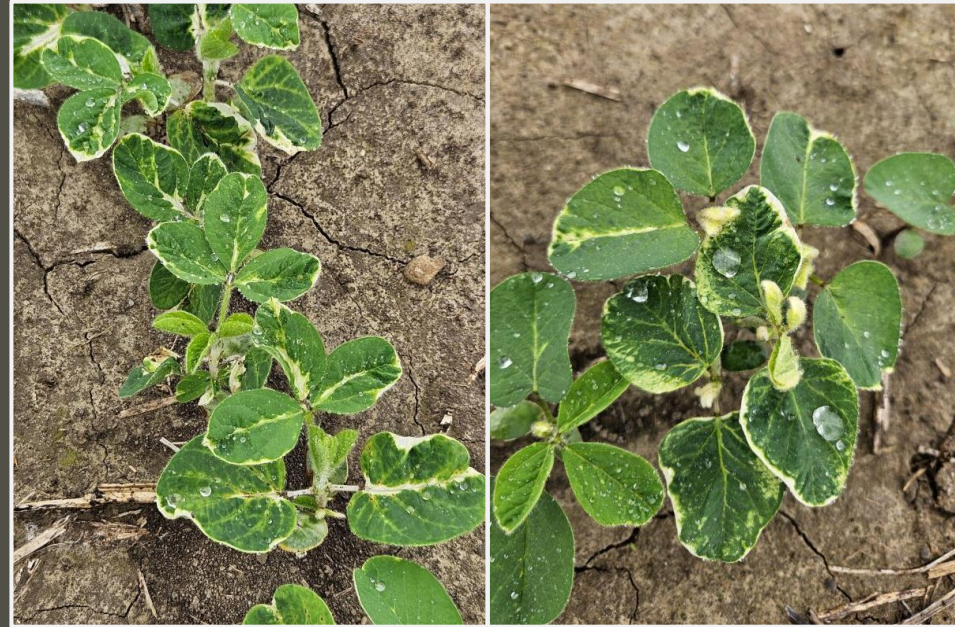
Discussion

Herbicide Injury

- A synergistic interaction at 14, 21, and 28 DAA between mesotrione and 150 g ha⁻¹ of diflufenican

LeafSpec Imaging

- Greater than 93% accuracy was achieved in classifying herbicides
- Previous research achieved 75% accuracy when classifying post-emergence herbicides¹



Diflufenican (150 g ha⁻¹)

Mesotrione (26 g ha⁻¹)

Conclusions

Objective 1

- The interaction between diflufenican and simulated mesotrione carryover resulted in a synergistic crop injury response

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Objective 2

- Distinguishing herbicides with similar bleaching symptomology is possible with the LeafSpec
 - Reject the null hypothesis

Implication & Future Research

Practical Implication

- LeafSpec technology has the utility to identify herbicide injury and can help inform crop management decisions

Future Research

- Controlled environment experiments will be conducted
 - Greater focus on dose response
 - Evaluate the utility of spectral analysis for evaluating herbicide interactions



Acknowledgements



Thank you Purdue Weed Science staff and Dr. Jin's Lab

An aerial photograph of a rural farm. In the foreground, there are large, rectangular agricultural fields with distinct rows of crops, some appearing to be corn. A dirt road runs through the fields, with several vehicles parked along it, including a white van, a blue car, and a silver car. In the background, a paved road with a white line runs horizontally. Above this road, there is a cluster of several white, rectangular farm buildings or barns. A white semi-truck is driving on the road, and a red car is visible further down. The overall scene is a typical agricultural landscape.

Questions?