

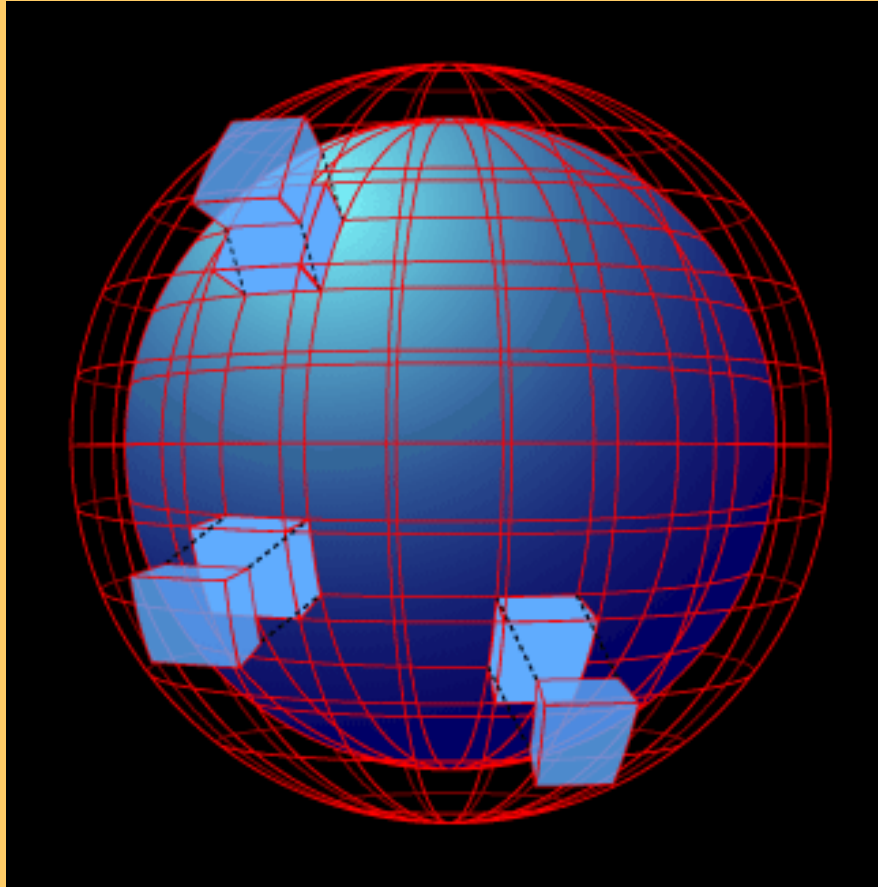
Application of the  
Integrated Aerobiology Modeling System  
to Soybean Rust Forecasting in 2006

Scott A. Isard  
Penn State University

&

Joseph M. Russo  
ZedX Inc.

# Integrated Aerobiology Modeling System (IAMS)



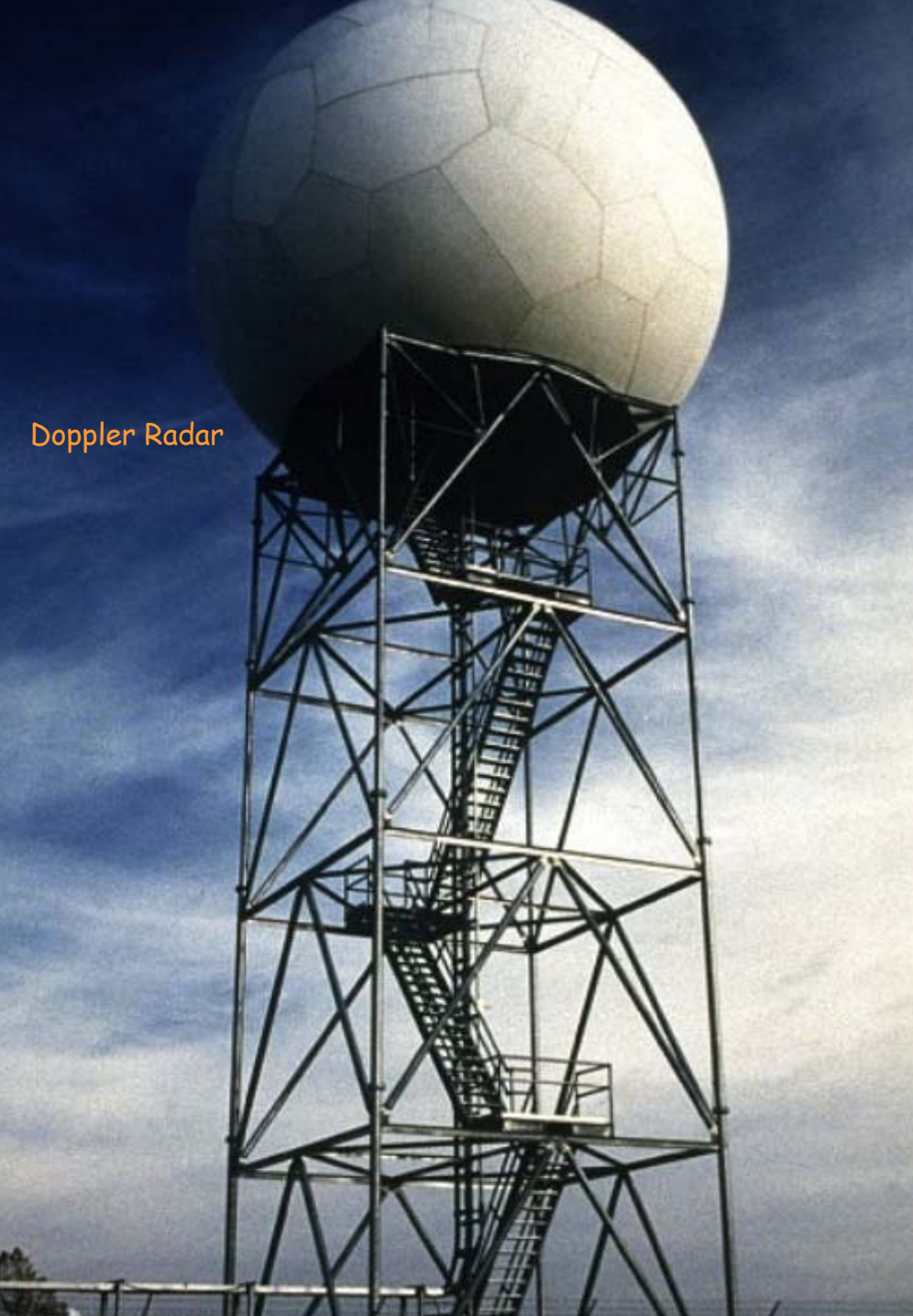
## Spatial and Temporal Considerations

Model domain is 7-50 °N latitude and 60-130 °E longitude

Grid resolution = 10 km<sup>2</sup>

Standard pressure levels (surface, 1000, 900, 800, 700, 600, 500 mb)

Model time step = 1 hr



Doppler Radar

## Data Sources

NOAA Models (winds, temperatures...)  
Rapid Update Cycle Forecast (RUC)  
North American Mesoscale (NAM)  
Global Forecast System (GFS)

NEXRAD stage-4 radar (precipitation)

NOAA satellites (precipitation)

USDA crop statistics (soybean acreage  
for counties)

Sentinel plot and mobile scout  
observations (crop stage, disease  
severity)

Epidemiology field studies (aerobiological  
and epidemiological relationships)



**Spore Release in Source Areas**

**Sentinel plot**

Source area, growth stage, and disease incidence and severity derived from observations

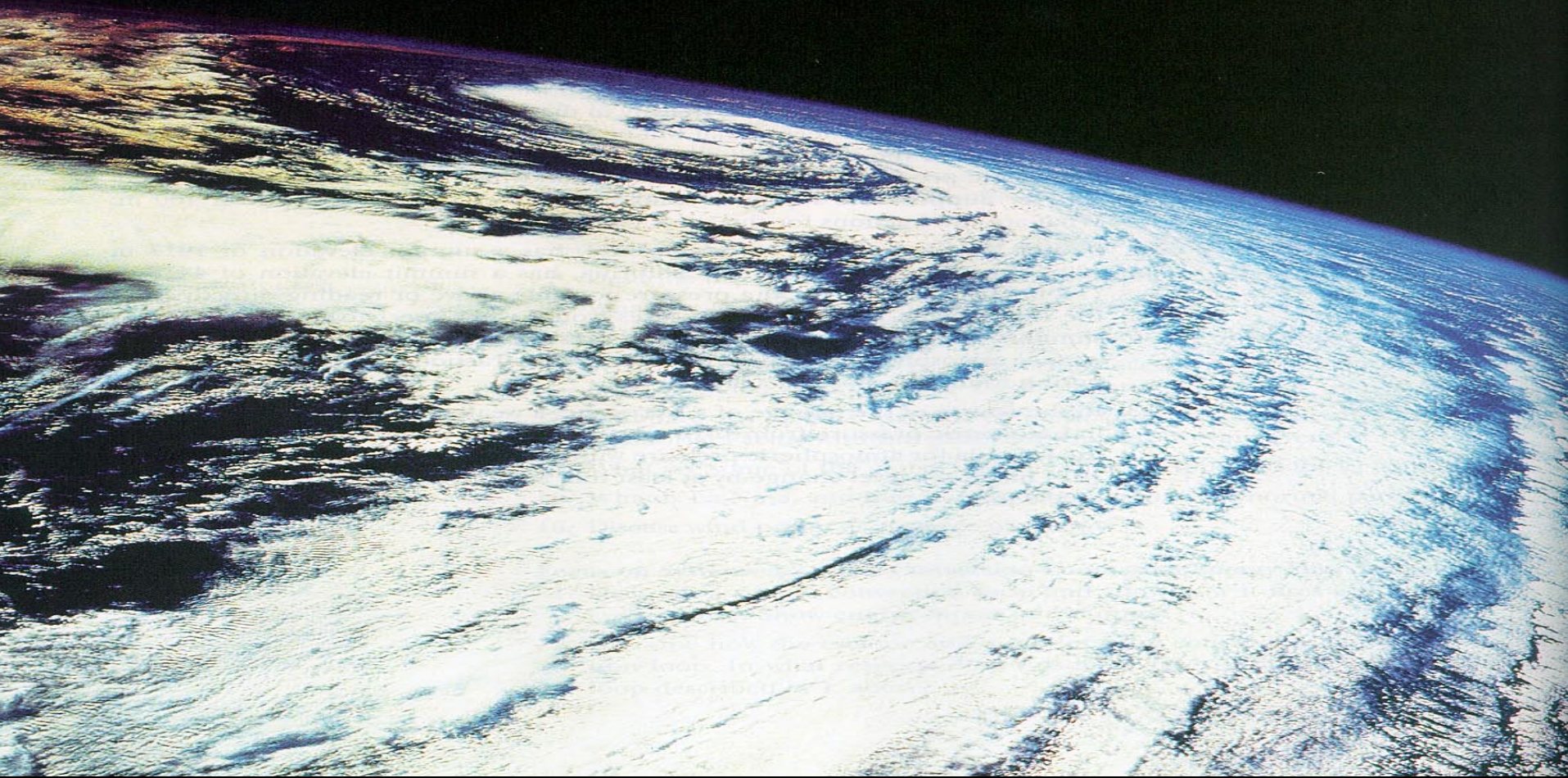
Spore release occurs over a 6 hr mid-morning to mid-afternoon period

# Escape of Spores from Infected Soybean Canopy



*Spore escape fraction is calculated as a function of surface wind speed*

# Spore Transport and Mortality



Escaped spores spread out from mid-point of a grid cell along radii comprising a  $15^\circ$  arc centered on the wind vector

Transport distance along each radii equals the wind run for the period of calculation

Mortality by UV radiation is proportional to cloud-adjusted, surface solar radiation

# Wet and Dry Deposition of Soybean Rust Spores



Dry deposition occurs when it is not raining and is calculated as a linear function of mean downward vertical velocity for the period of calculation

Wet deposition occurs when it is raining and is proportional to the precipitation total for the period of calculation

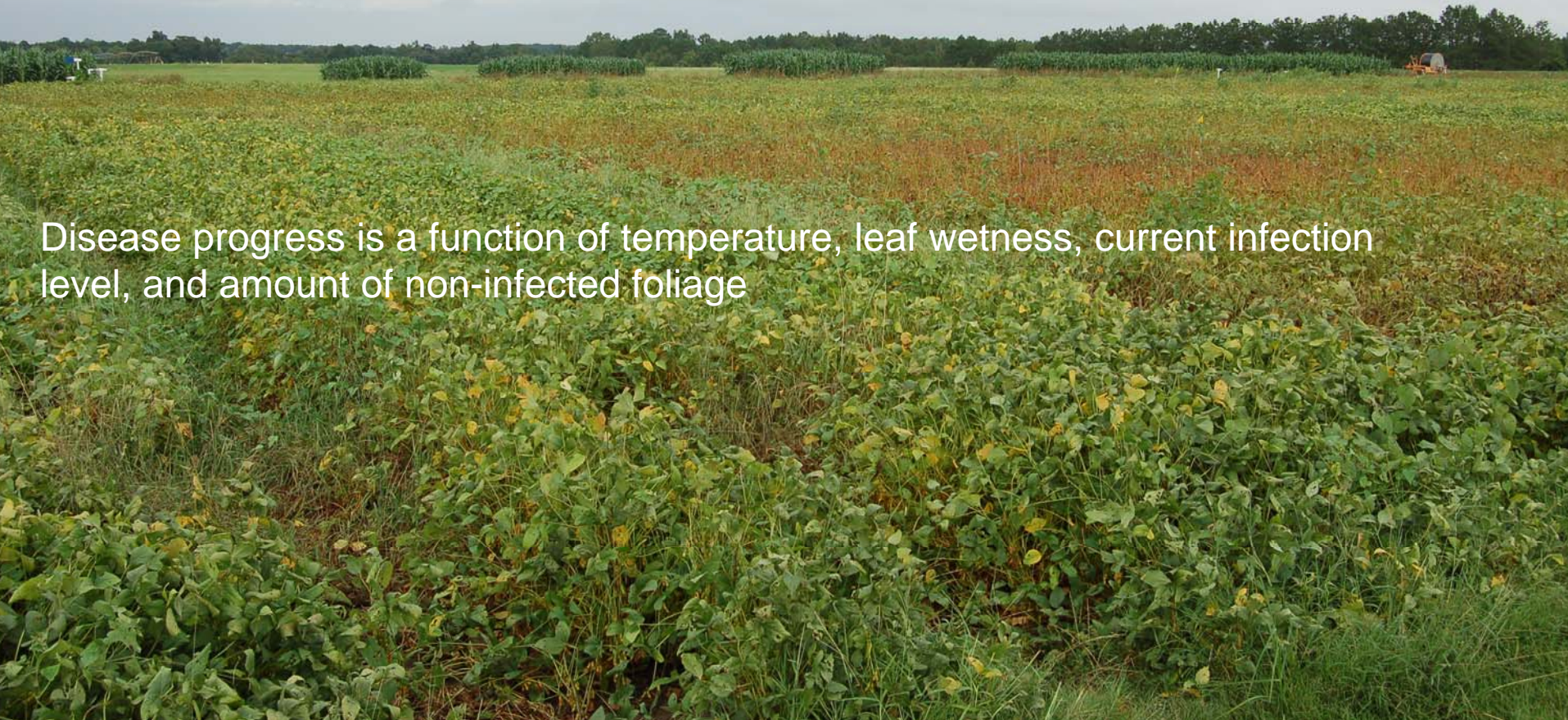
# Soybean Plant Growth and Soybean Rust Disease Submodels

Growing degree soybean crop model that calculates both LAI and phenological stages

Soybean cohorts in a grid cell are “planted” over a 8 week period

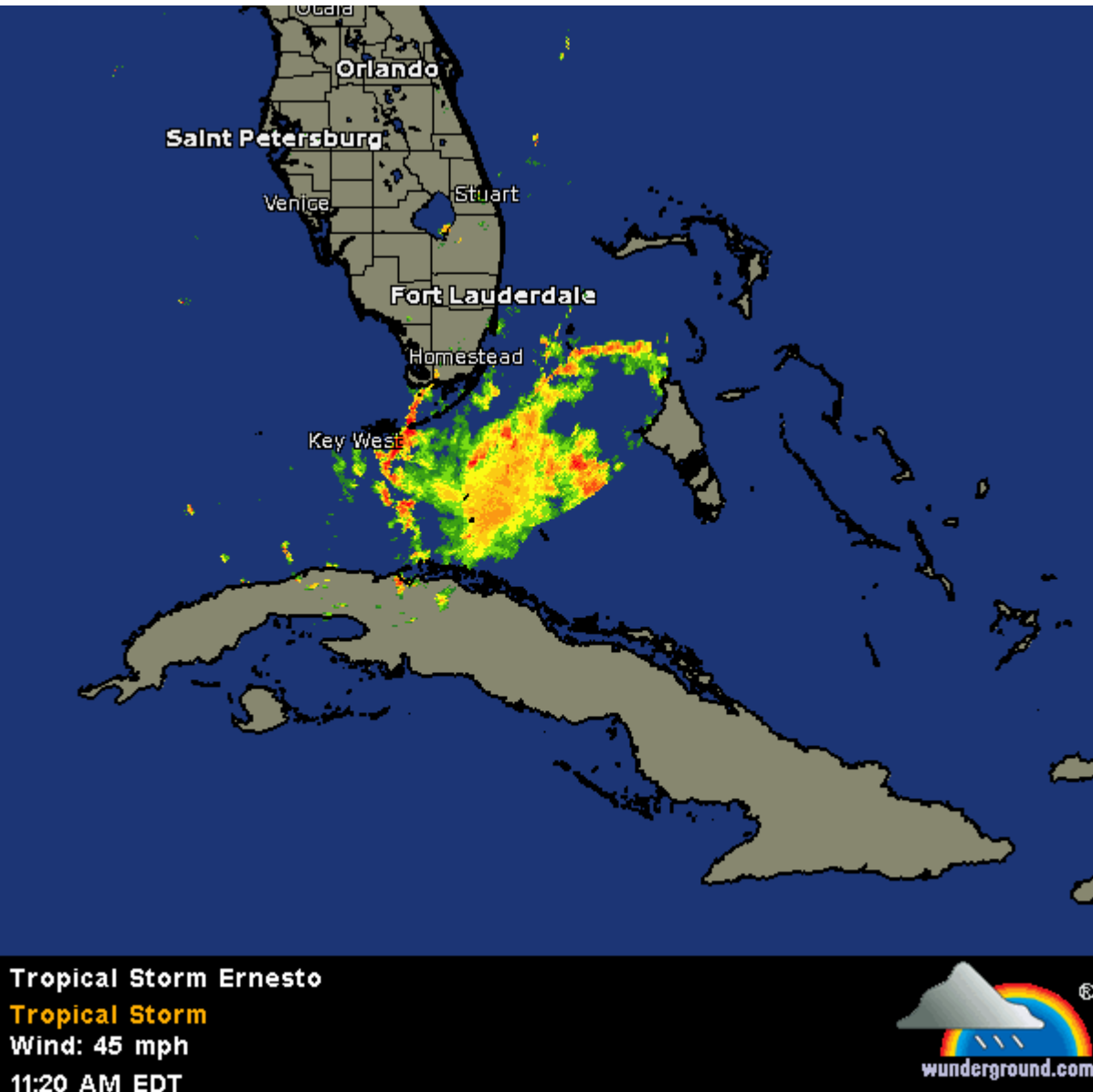
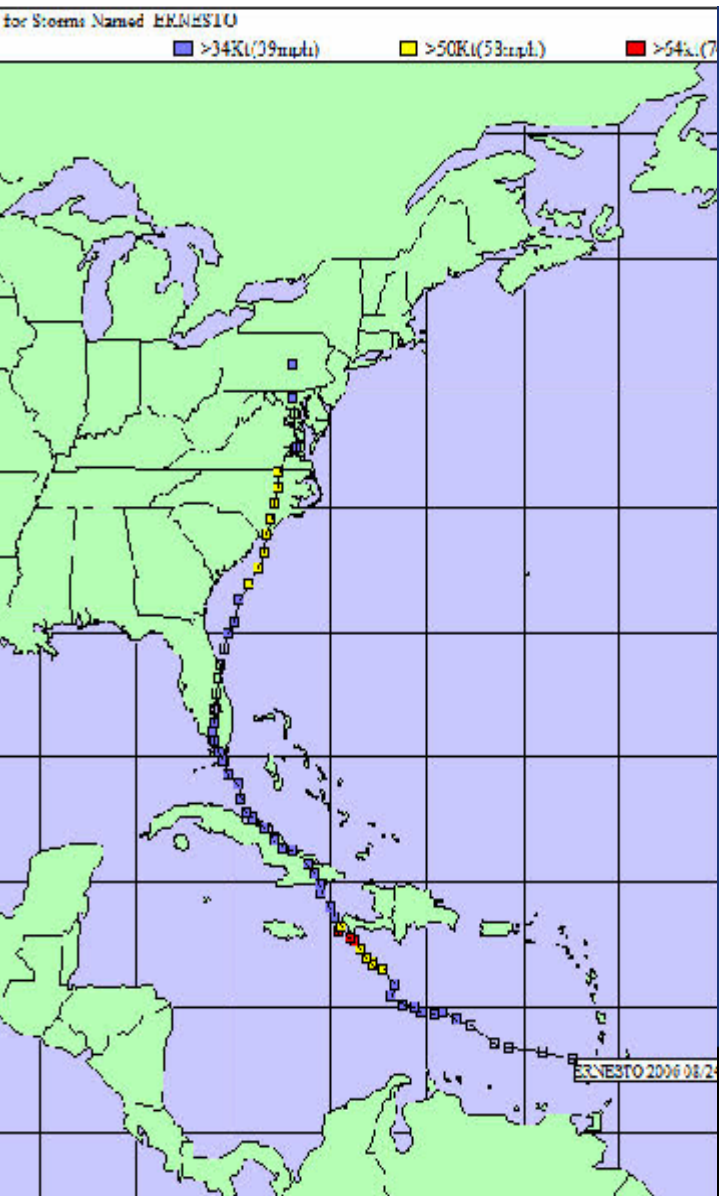
Soybean plant emergence and growth are functions of weather variables

Disease progress is a function of temperature, leaf wetness, current infection level, and amount of non-infected foliage





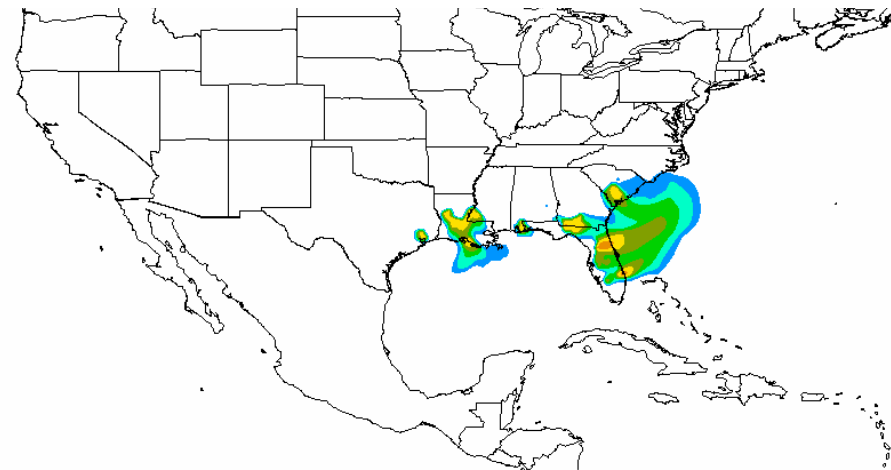
# Tropical Storm Ernesto (Aug 29-Sept 2)



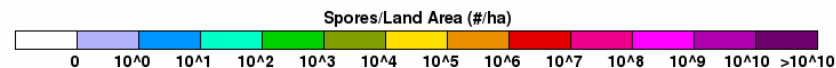
# Integrated Aerobiology Model System

August 31, 2006

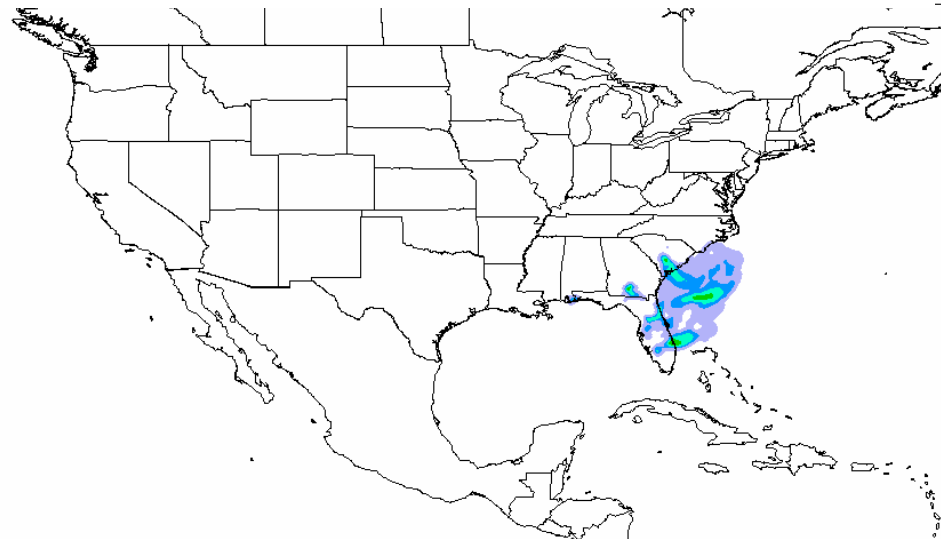
## Aerial Concentration of Viable SBR Spores



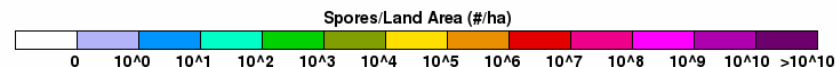
20060901



## Daily Wet Deposition of Viable SBR Spores



20060901



### Map Interpretation



Extremely low levels

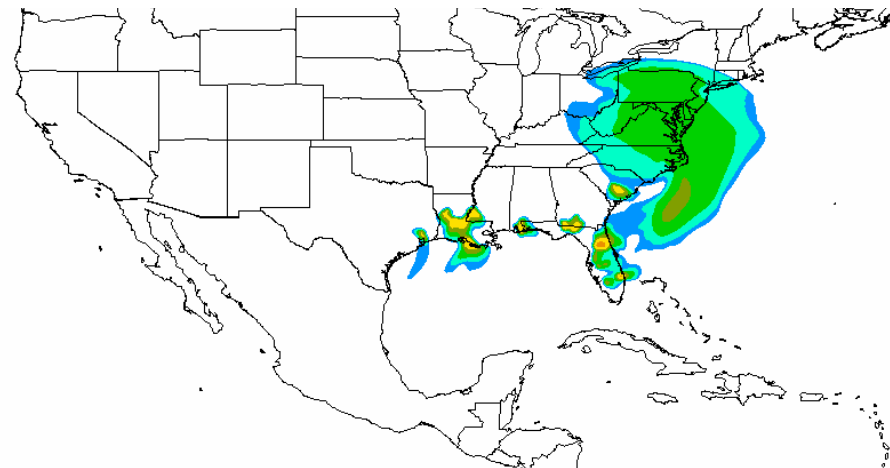


Moderate levels

# Integrated Aerobiology Model System

## September 1, 2006

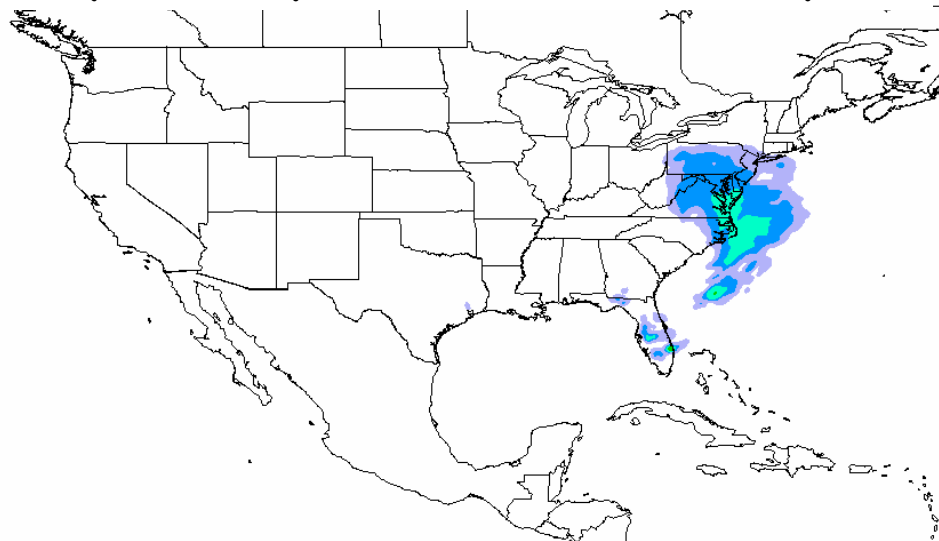
### Aerial Concentration of Viable SBR Spores



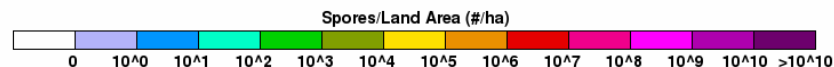
20060902



### Daily Wet Deposition of Viable SBR Spores



20060902



### Map Interpretation



Extremely low levels

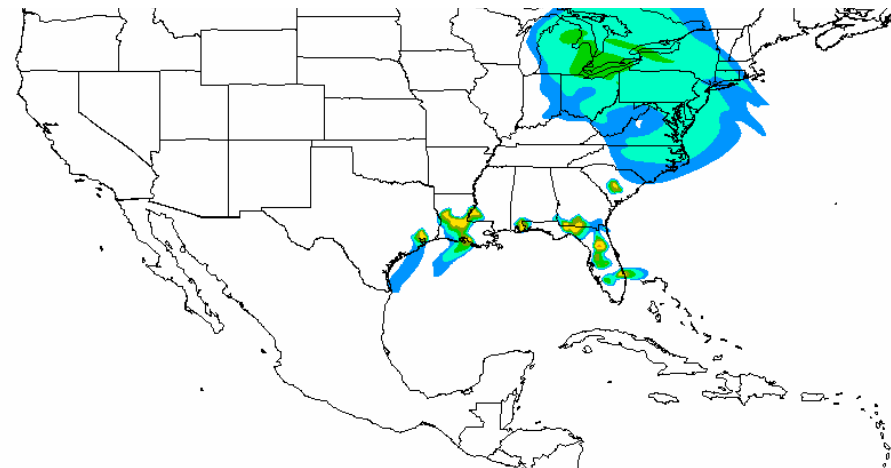


Moderate levels

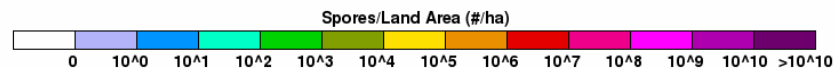
# Integrated Aerobiology Model System

## September 2, 2006

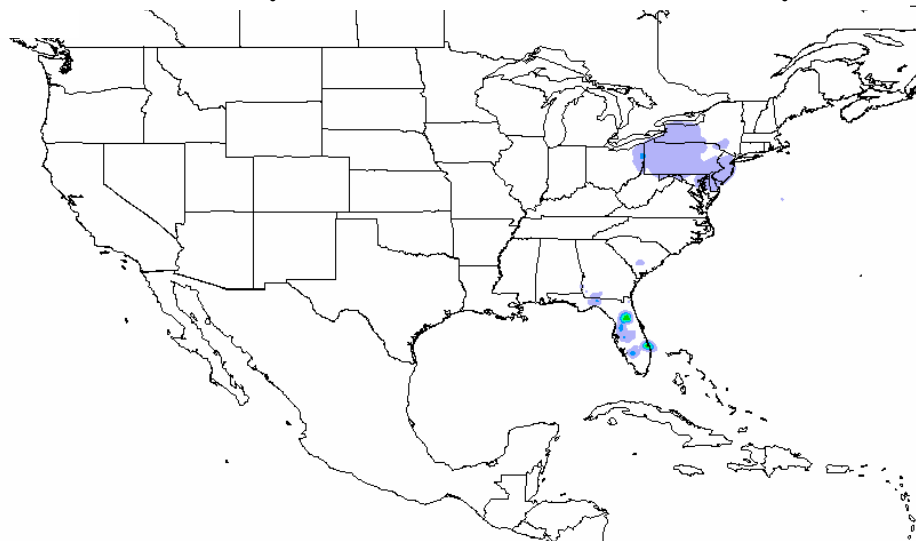
### Aerial Concentration of Viable SBR Spores



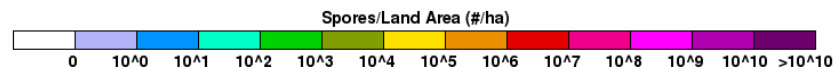
20060903



### Daily Wet Deposition of Viable SBR Spores



20060903



#### Map Interpretation



Extremely low levels



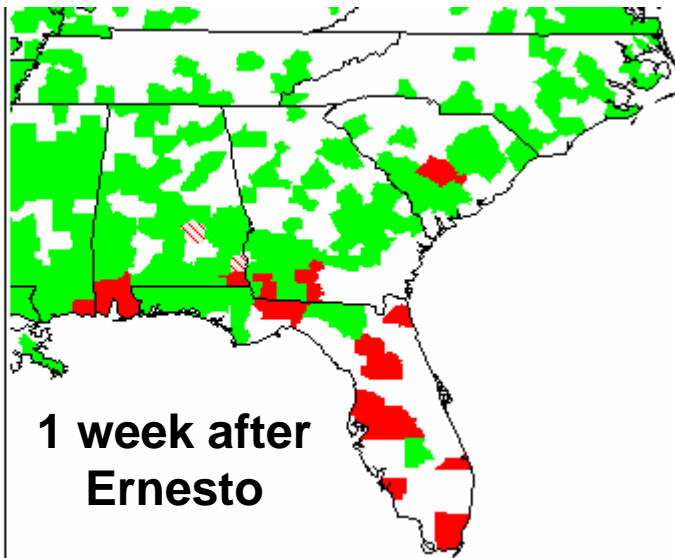
Moderate levels

# Soybean Rust Observation Maps

August - 2006												
		1	2	3	4	5						
6	7	8	9	10	11	12						
13	14	15	16	17	18	19						
20	21	22	23	24	25	26						
27	28	29	30	31								

September - 2006												
										1	2	
3	4	5	6	7	8	9						
10	11	12	13	14	15	16						
17	18	19	20	21	22	23						
24	25	26	27	28	29	30						

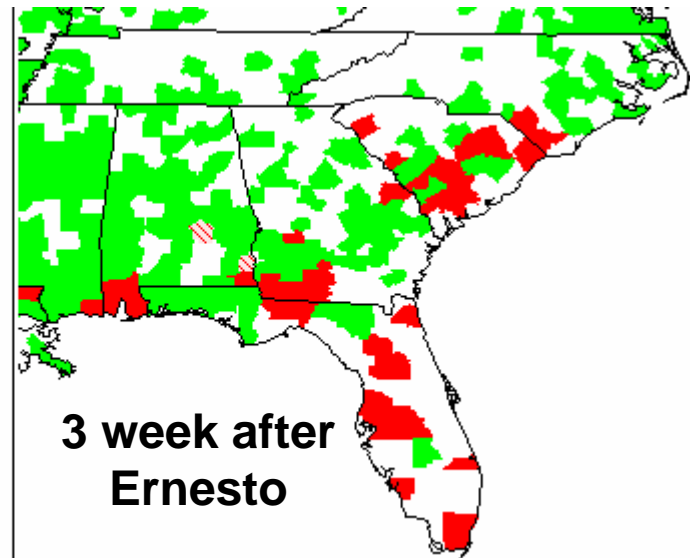
October - 2006												
1	2	3	4	5	6	7						
8	9	10	11	12	13	14						
15	16	17	18	19	20	21						
22	23	24	25	26	27	28						



August - 2006												
		1	2	3	4	5						
6	7	8	9	10	11	12						
13	14	15	16	17	18	19						
20	21	22	23	24	25	26						
27	28	29	30	31								

September - 2006												
										1	2	
3	4	5	6	7	8	9						
10	11	12	13	14	15	16						
17	18	19	20	21	22	23						
24	25	26	27	28	29	30						

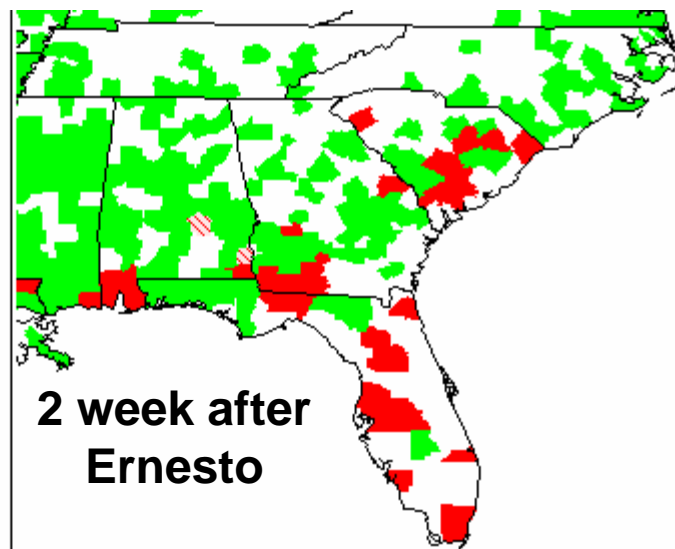
October - 2006												
1	2	3	4	5	6	7						
8	9	10	11	12	13	14						
15	16	17	18	19	20	21						
22	23	24	25	26	27	28						



August - 2006												
		1	2	3	4	5						
6	7	8	9	10	11	12						
13	14	15	16	17	18	19						
20	21	22	23	24	25	26						
27	28	29	30	31								

September - 2006												
										1	2	
3	4	5	6	7	8	9						
10	11	12	13	14	15	16						
17	18	19	20	21	22	23						
24	25	26	27	28	29	30						

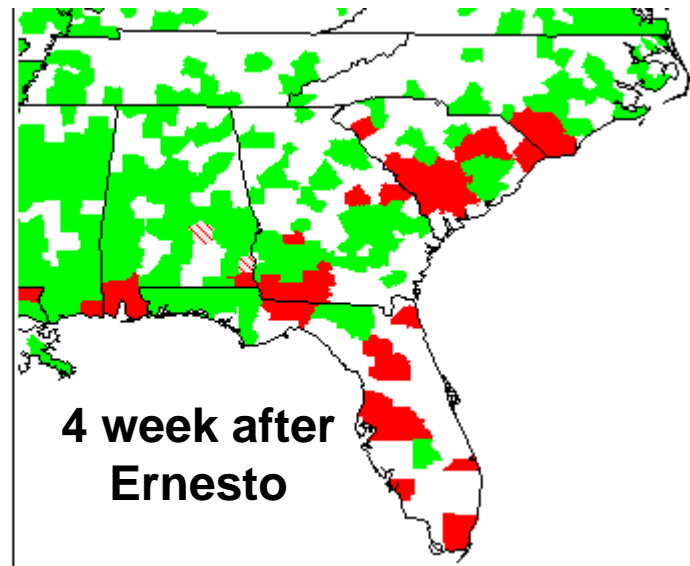
October - 2006												
1	2	3	4	5	6	7						
8	9	10	11	12	13	14						
15	16	17	18	19	20	21						
22	23	24	25	26	27	28						



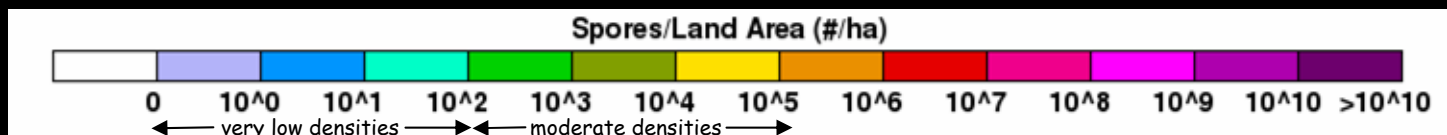
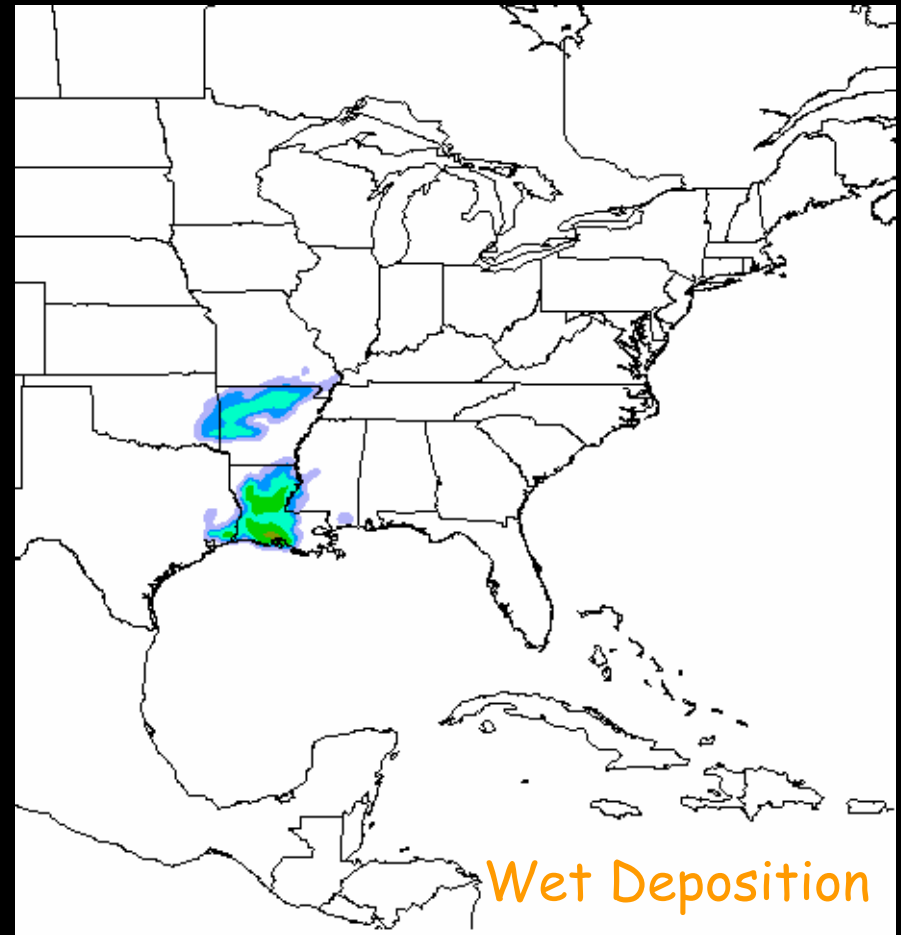
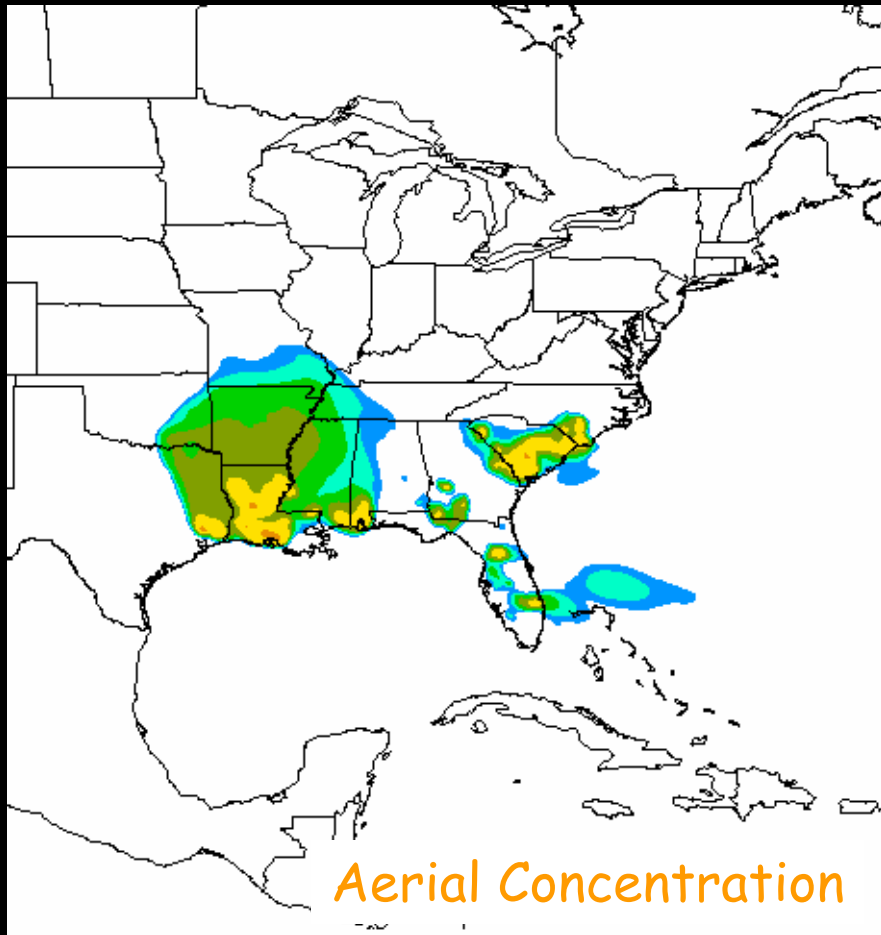
August - 2006												
		1	2	3	4	5						
6	7	8	9	10	11	12						
13	14	15	16	17	18	19						
20	21	22	23	24	25	26						
27	28	29	30	31								

September - 2006												
										1	2	
3	4	5	6	7	8	9						
10	11	12	13	14	15	16						
17	18	19	20	21	22	23						
24	25	26	27	28	29	30						

October - 2006												
1	2	3	4	5	6	7						
8	9	10	11	12	13	14						
15	16	17	18	19	20	21						
22	23	24	25	26	27	28						

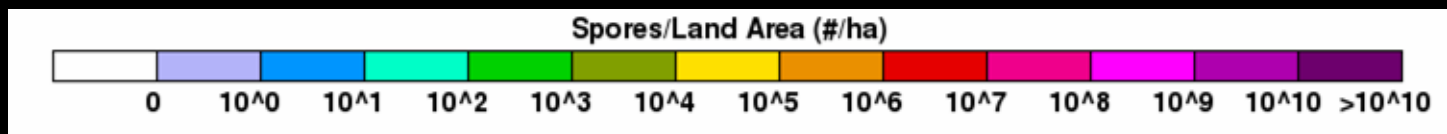
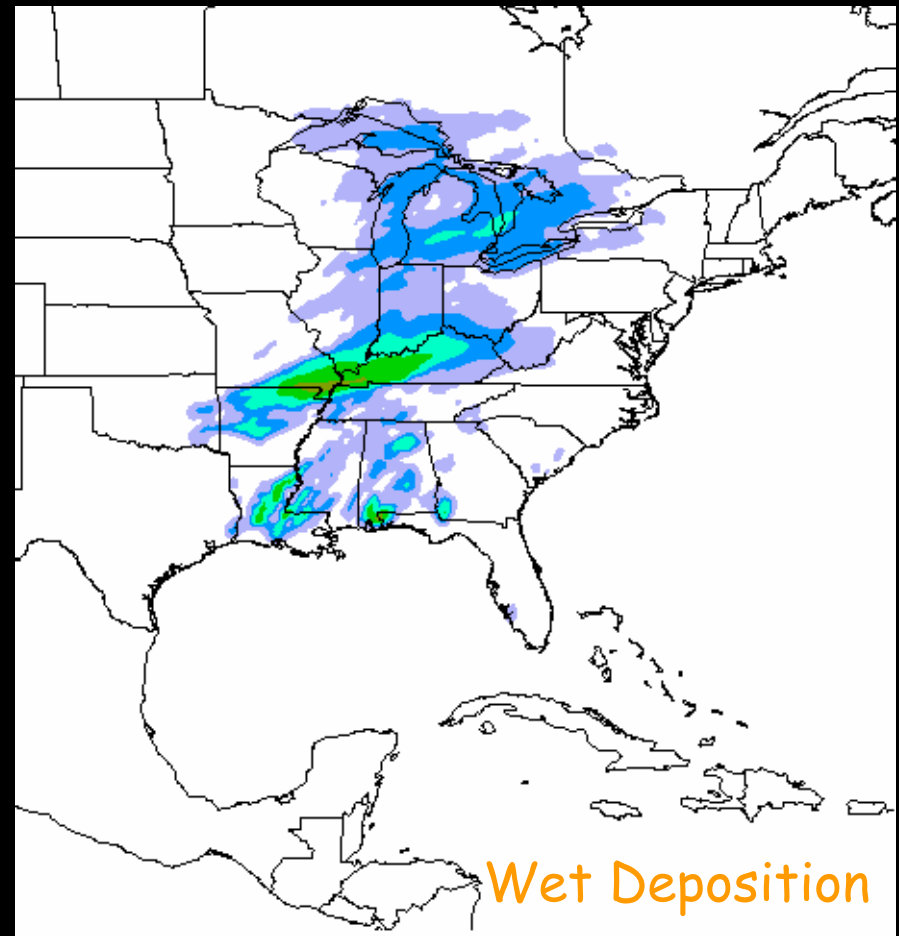
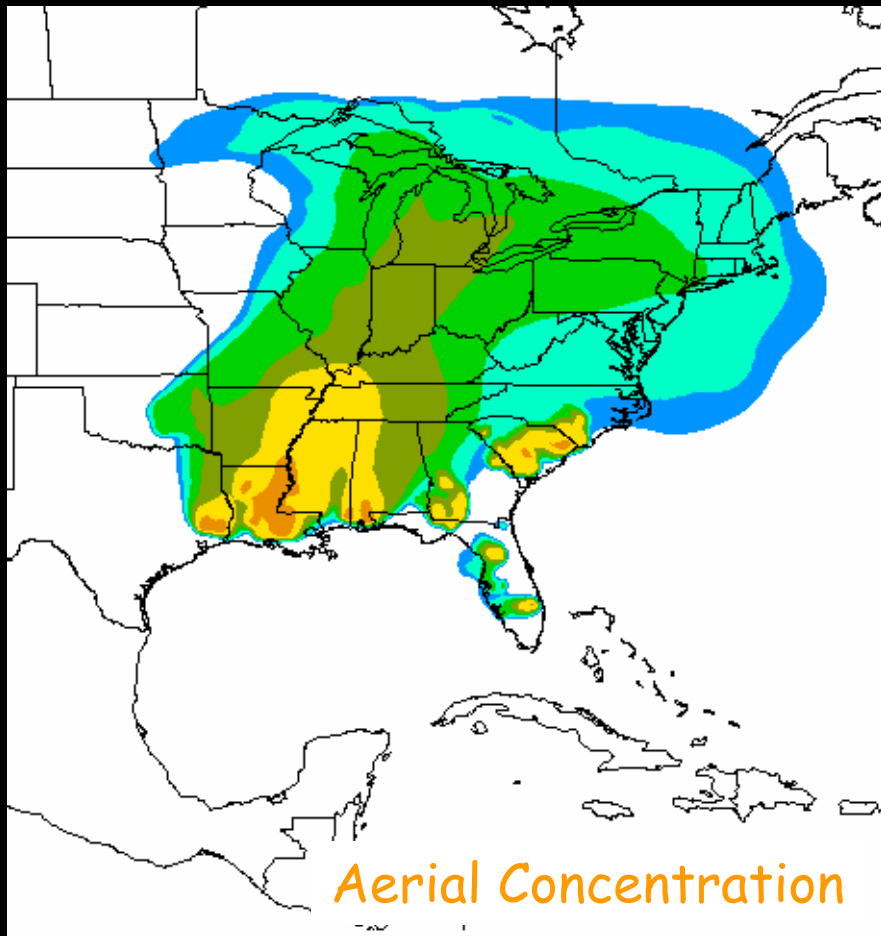


# Integrated Aerobiology Modeling System Output



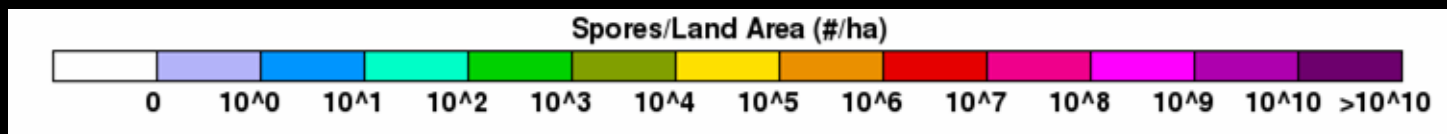
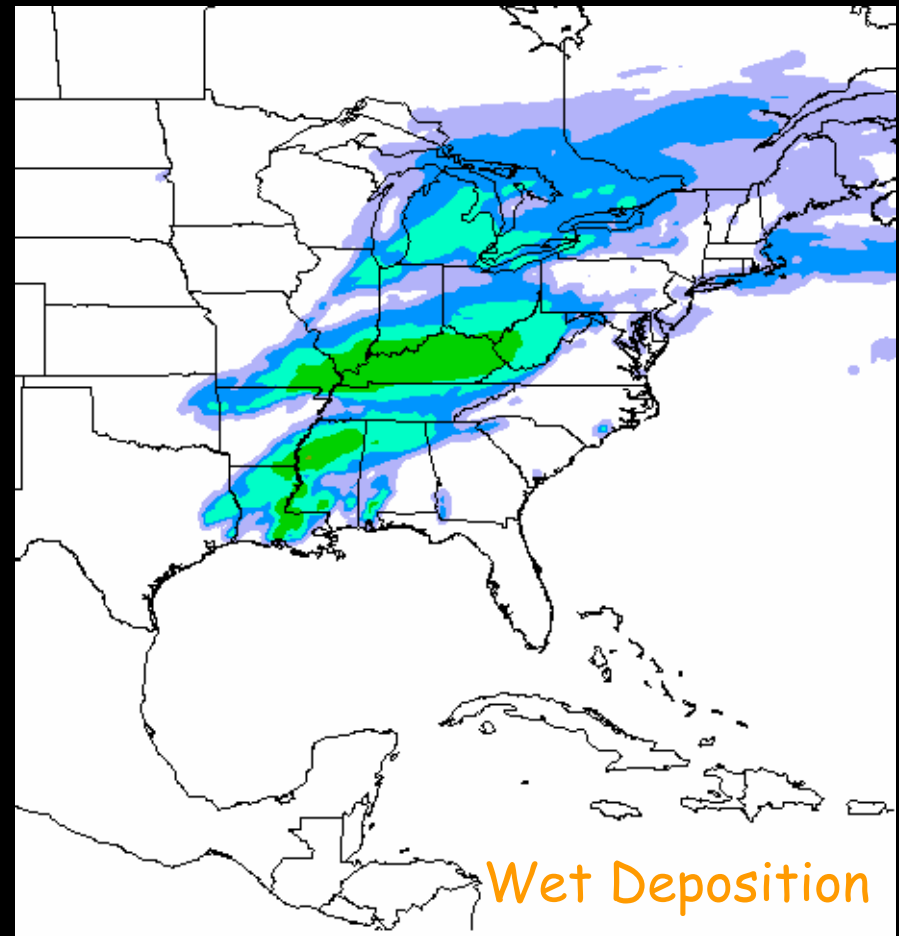
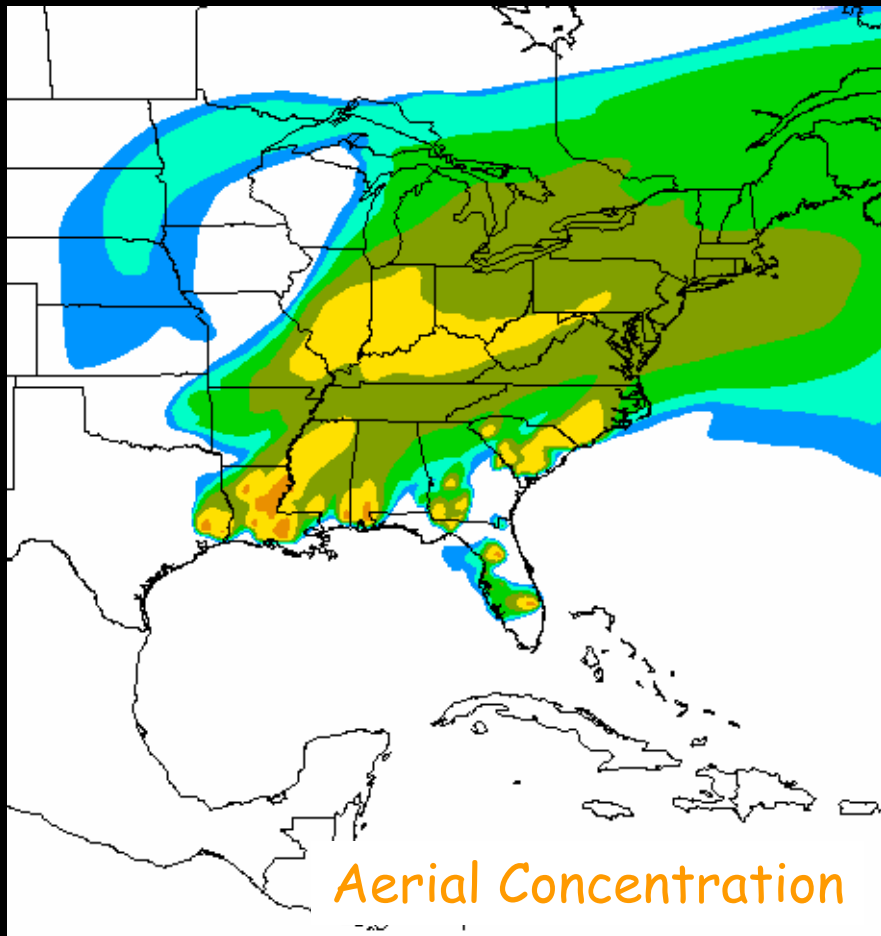
22 September 2006

# Integrated Aerobiology Modeling System Output



23 September 2006

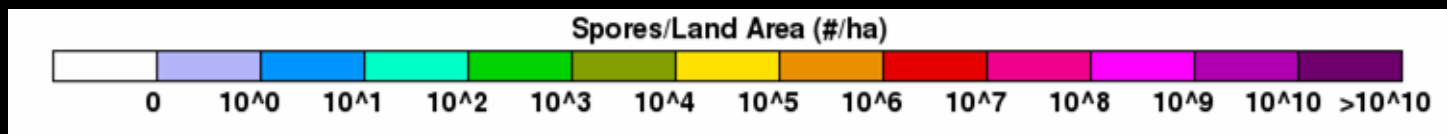
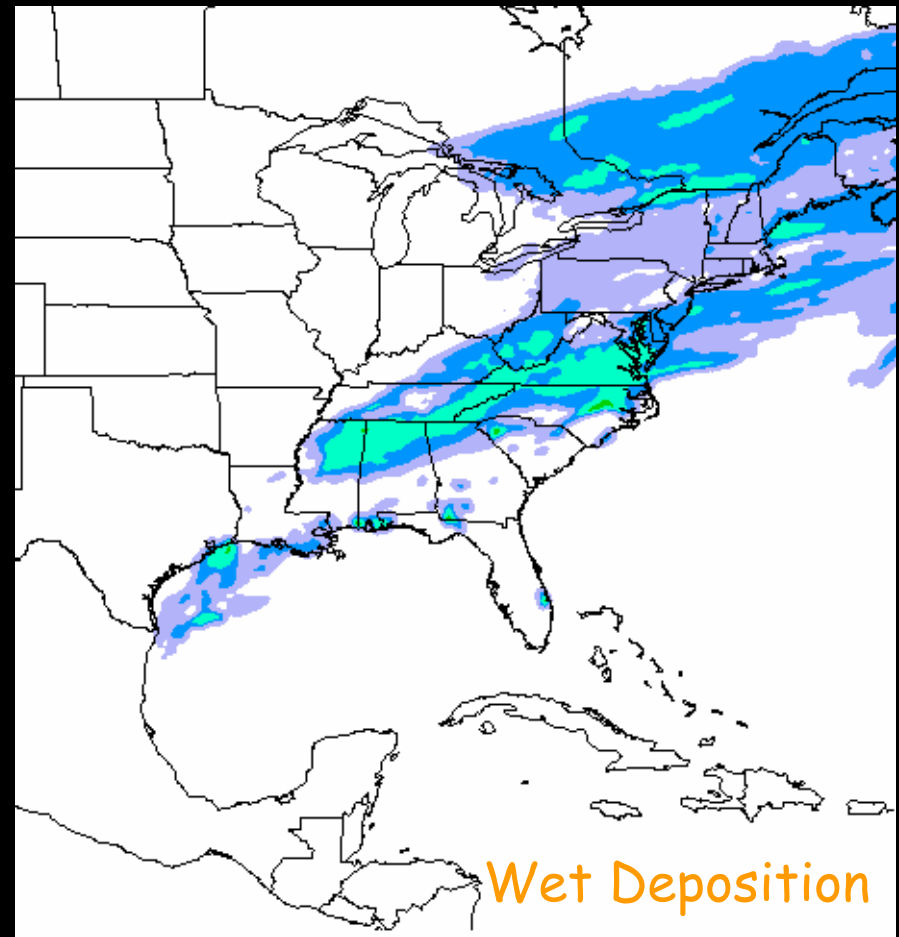
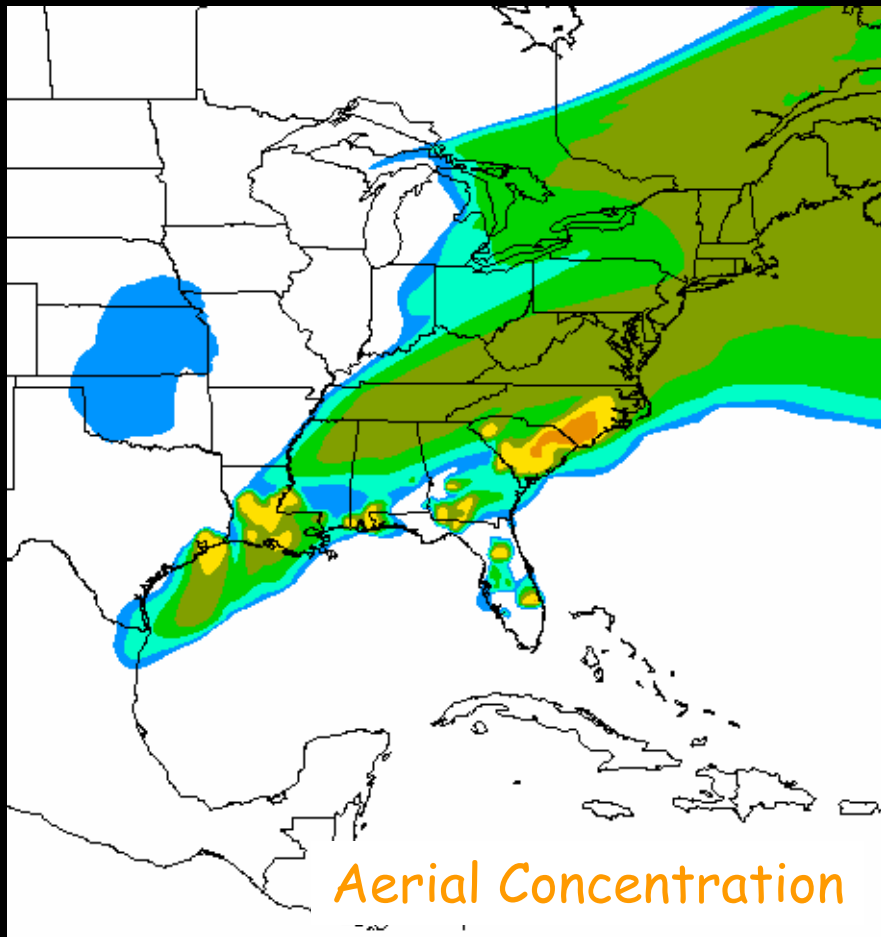
# Integrated Aerobiology Modeling System Output



24 September 2006



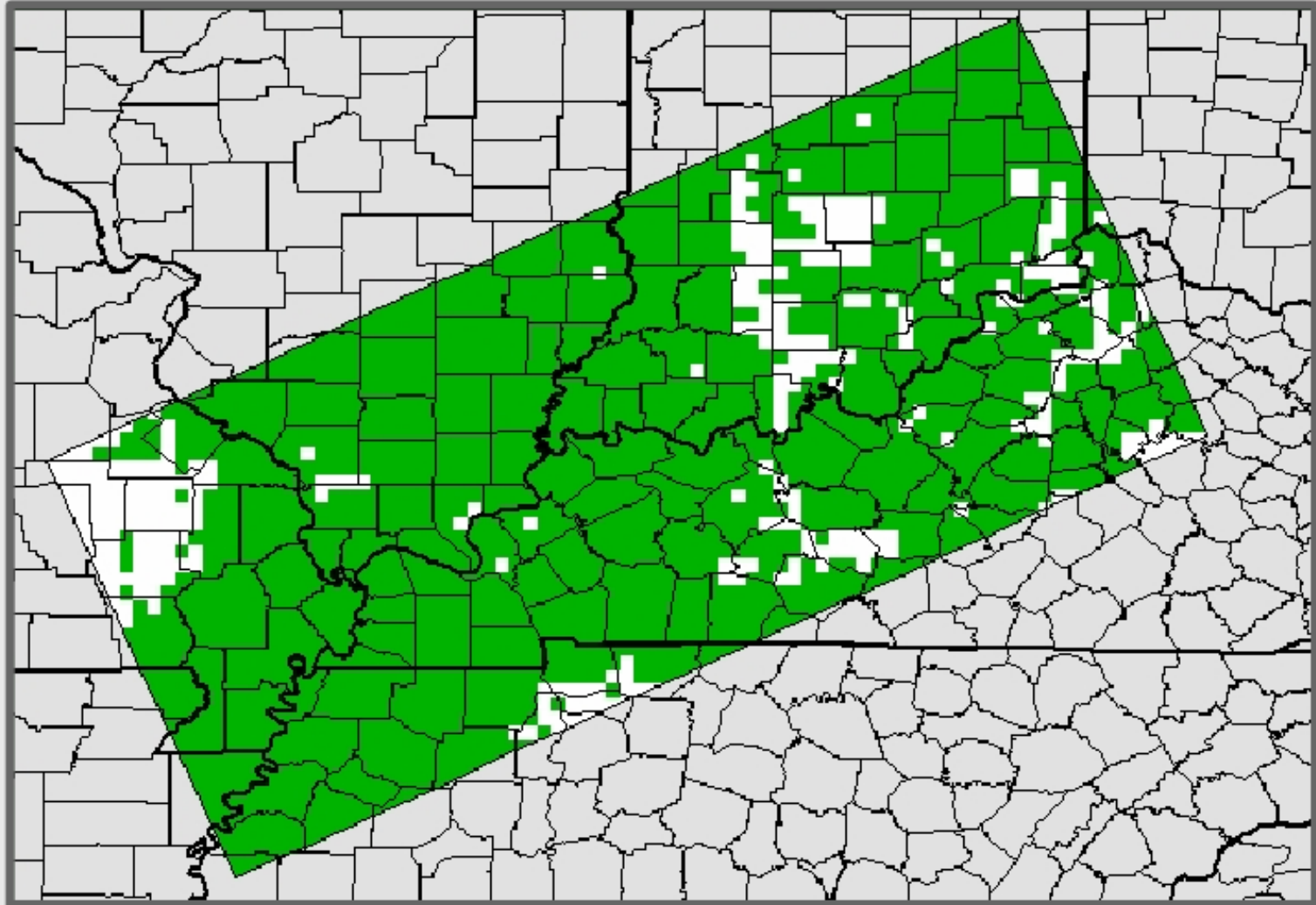
# Integrated Aerobiology Modeling System Output



25 September 2006

# Aerobiology Model Predictions of Soybean Rust Disease Severity

Sentinel Plants -  
early to mid  
reproductive stage  
("infection ready")



Days on the calendar below are clickable

21 Sep	22 Sep	23 Sep	24 Sep	25 Sep	26 Sep	27 Sep	28 Sep	29 Sep	30 Sep	01 Oct	02 Oct	03 Oct	04 Oct	05 Oct	06 Oct	07 Oct	08 Oct	09 Oct	10 Oct	
11 Oct	12 Oct	13 Oct	14 Oct	15 Oct	16 Oct	17 Oct	18 Oct	19 Oct	20 Oct	21 Oct	22 Oct	23 Oct	24 Oct	25 Oct	26 Oct	27 Oct	28 Oct	29 Oct	30 Oct	31 Oct

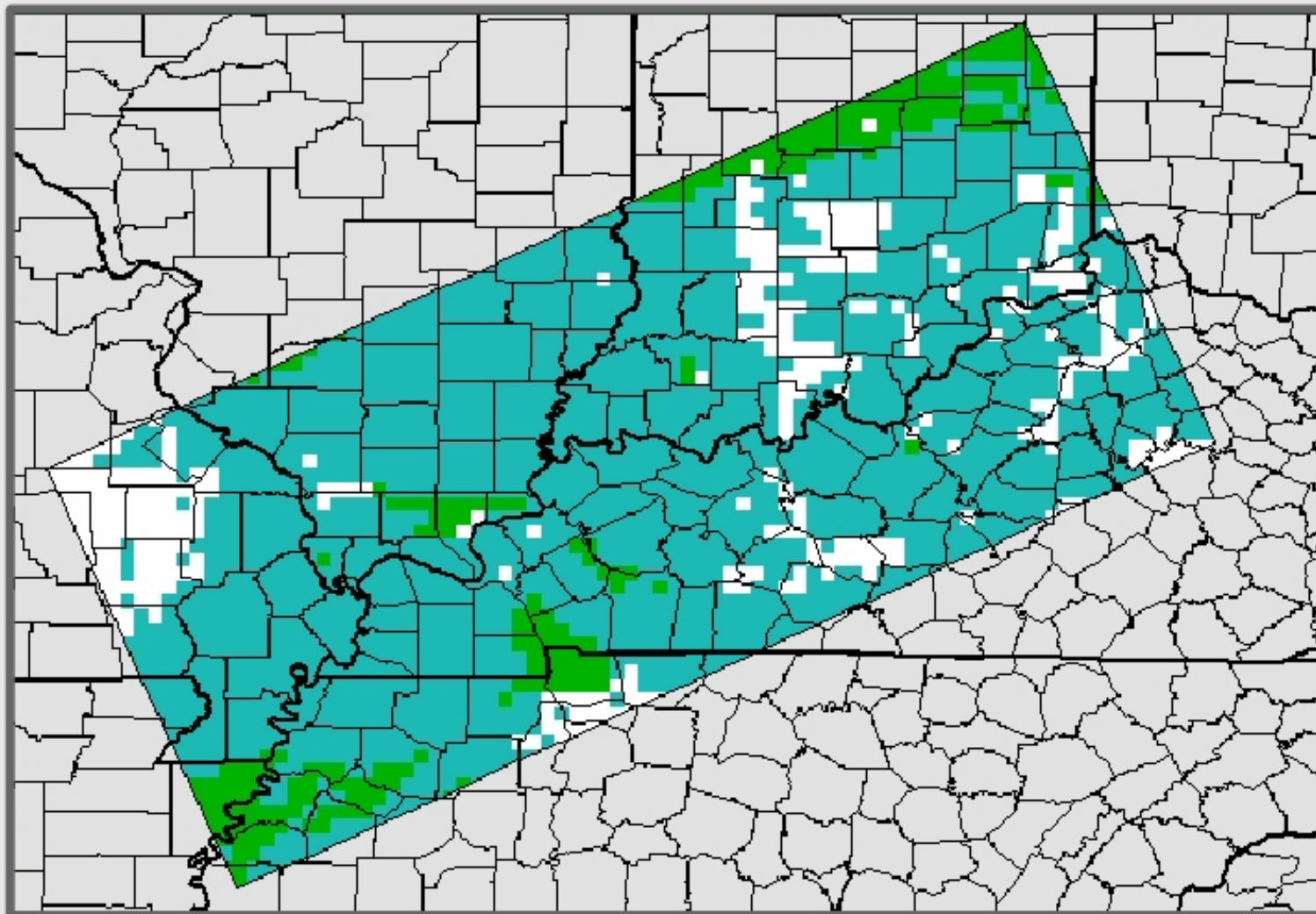
Disease Severity



no crop    no spores    latent    0-20%    21-40%    41-60%    61-80%    81-100%

# Aerobiology Model Predictions of Soybean Rust Disease Severity

"Sentinel Plants" on which viable spores were deposited showed latent infections the following week.



Days on the calendar below are clickable

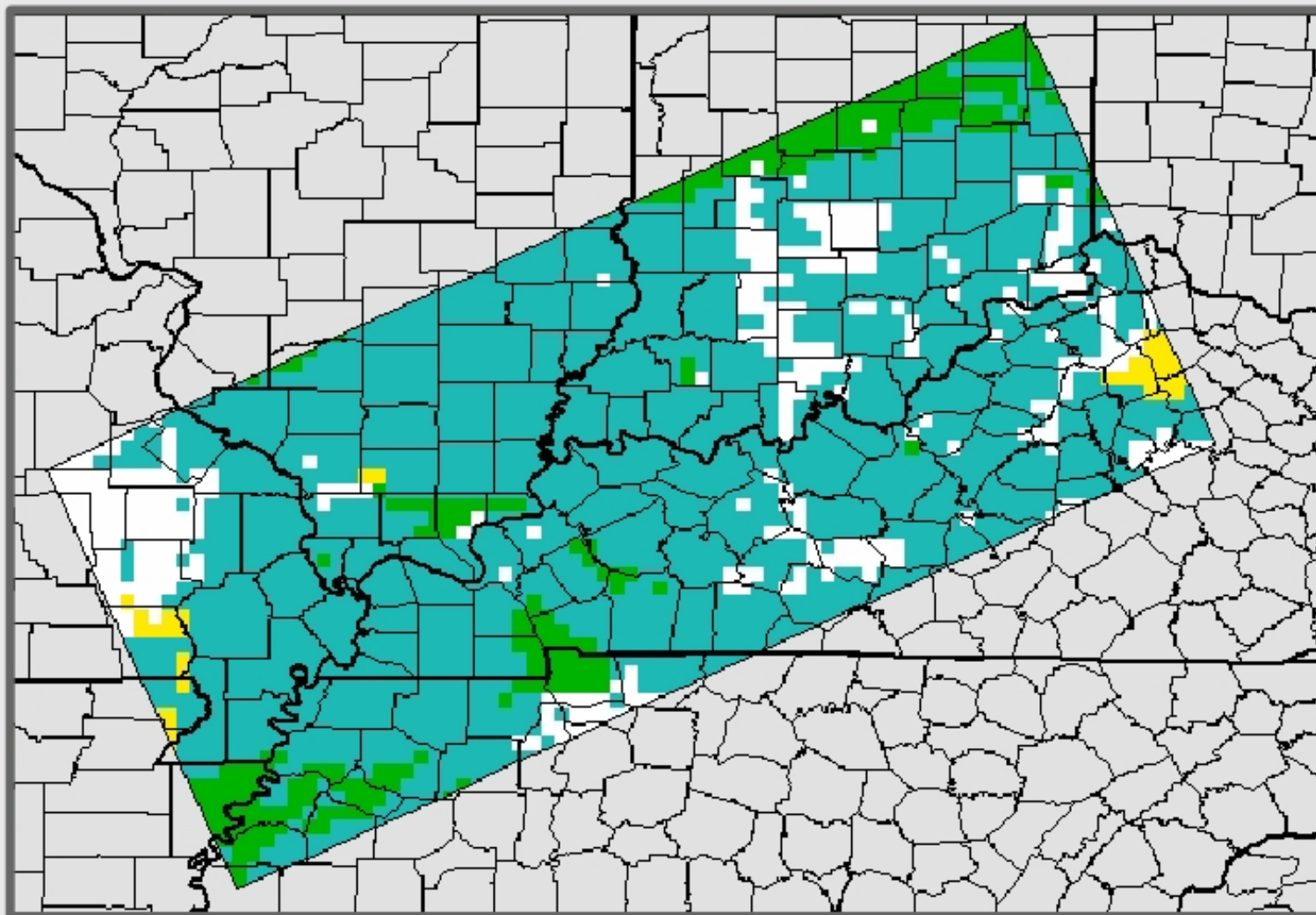
21	22	23	24	25	26	27	28	29	30	01	02	03	04	05	06	07	08	09	10	
Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	
11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31
Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct

Disease Severity



## Aerobiology Model Predictions of Soybean Rust Disease Severity

The IAMS indicates that the first symptoms of soybean rust would become visible in a few counties scattered across the lower Ohio River Valley on the 11<sup>th</sup> day after spore deposition



Days on the calendar below are clickable

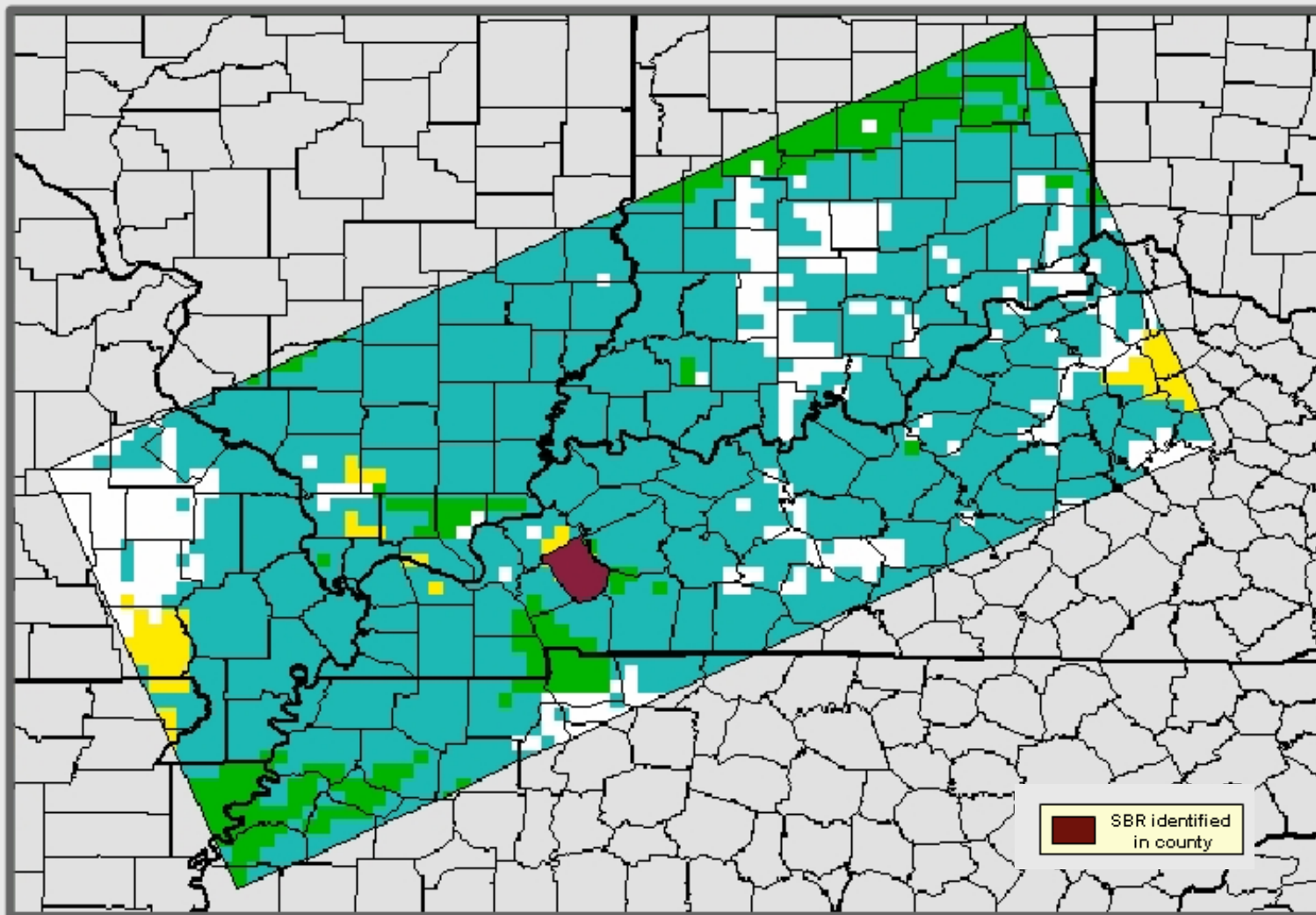
21	22	23	24	25	26	27	28	29	30	01	02	03	04	05	06	07	08	09	10	
Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	
11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31
Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct

Disease Severity



# Aerobiology Model Predictions of Soybean Rust Disease Severity

The first discovery of soybean rust in the region was made on the 13<sup>th</sup> day after deposition



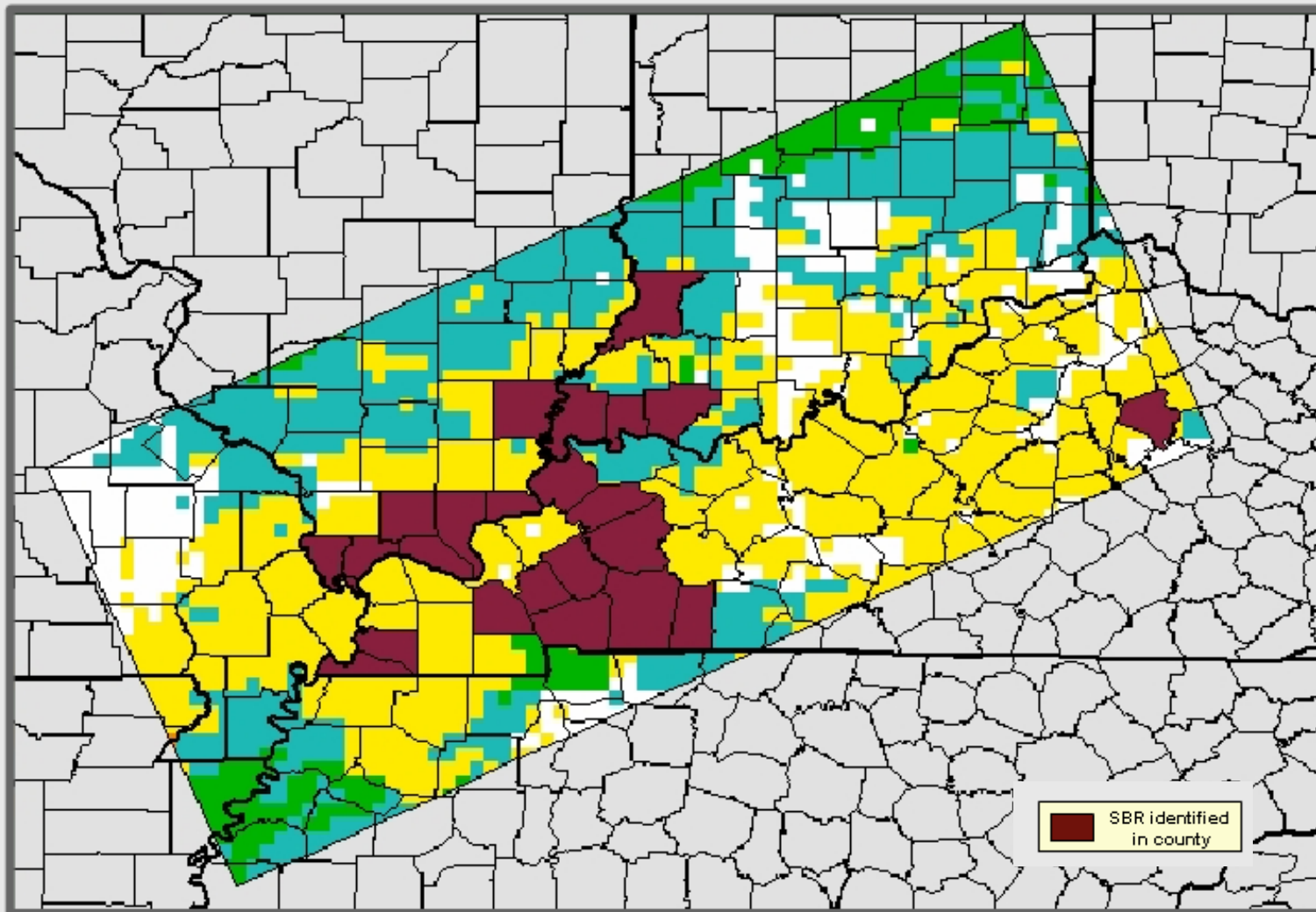
Days on the calendar below are clickable

21	22	23	24	25	26	27	28	29	30	01	02	03	04	05	06	07	08	09	10	
Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	
11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31
Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct

Disease Severity



## Aerobiology Model Predictions of Soybean Rust Disease Severity



Days on the calendar below are clickable

21	22	23	24	25	26	27	28	29	30	01	02	03	04	05	06	07	08	09	10	
Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	
11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31
Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct

Disease Severity



One week later, soybean rust had been discovered in numerous counties within the region.

The model predicted pustules would become visible before infections were actually found.

Possible reasons for the discrepancy are:

1-Use of "sentinel plants" in IAMS

2-Paucity of green soybean plants in field

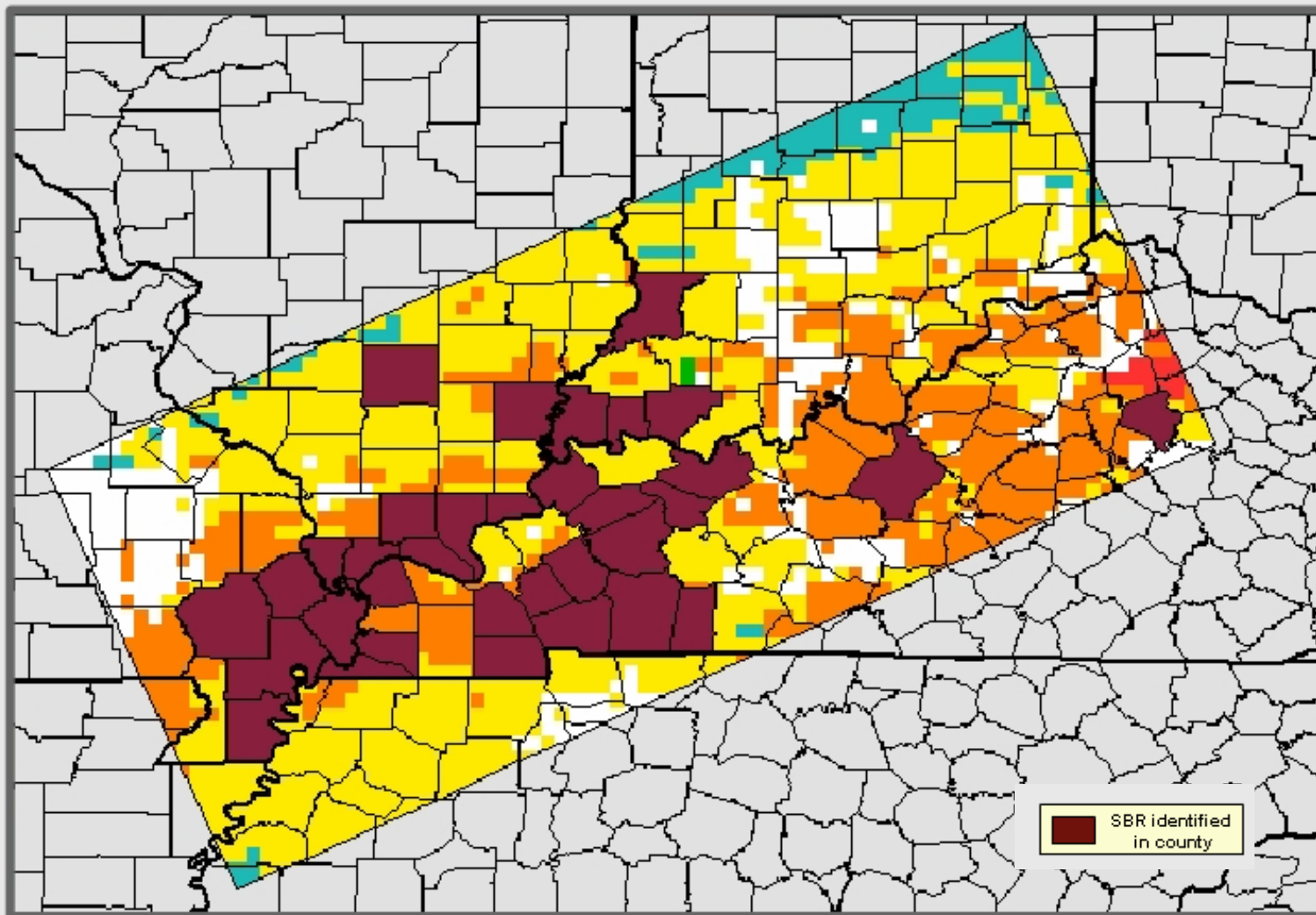
3-Little urgency to scout

4-Model simplifications

5-Lack of model validation

# Aerobiology Model Predictions of Soybean Rust Disease Severity

One month after soybean rust spores had been deposited, symptoms of the disease had been discovered in 36 counties in the region



Days on the calendar below are clickable

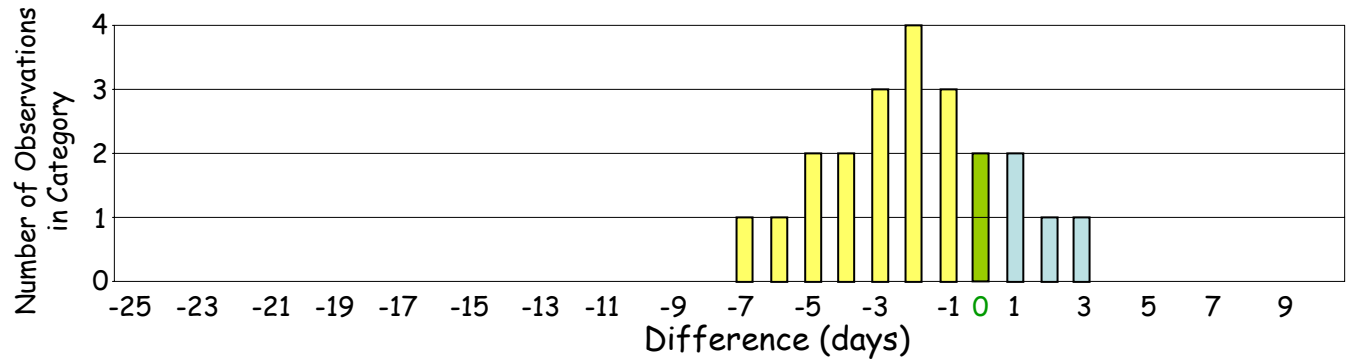
21	22	23	24	25	26	27	28	29	30	01	02	03	04	05	06	07	08	09	10	
Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Sep	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	
11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31
Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct	Oct

Disease Severity



# Evaluation of Aerobiology Model

## Target "hypothetical" distribution



IAMS Model  
Prediction of Symptom  
Appearance  
vs  
Discovery

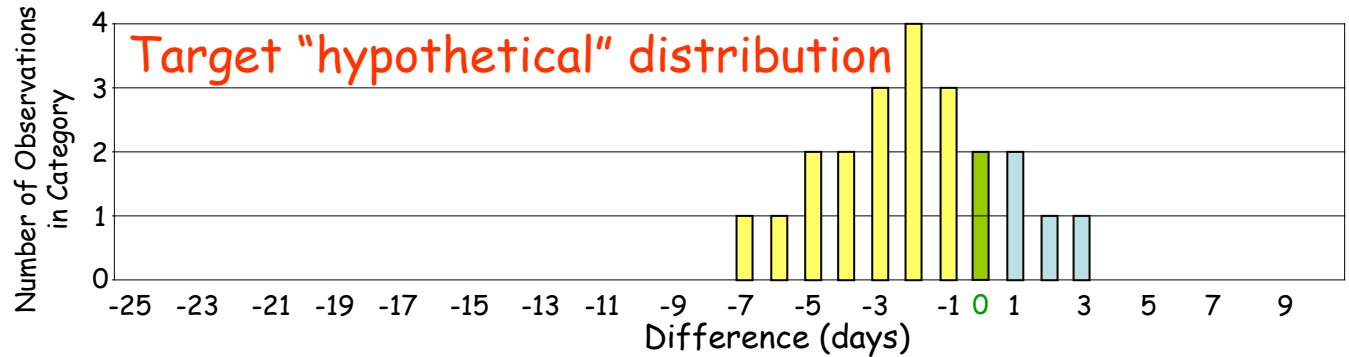
Each observation in the histogram above represents the first positive find in a county.

Negative differences (yellow bars) in the histogram indicate that the model predicts symptom appearance prior to observation (i.e., for 1 county the model was 7 days ahead, for 1 county the model was 6 days ahead, for 2 counties it was 5 days ahead.... Positive differences (observations precede model predictions) are represented by blue bars.

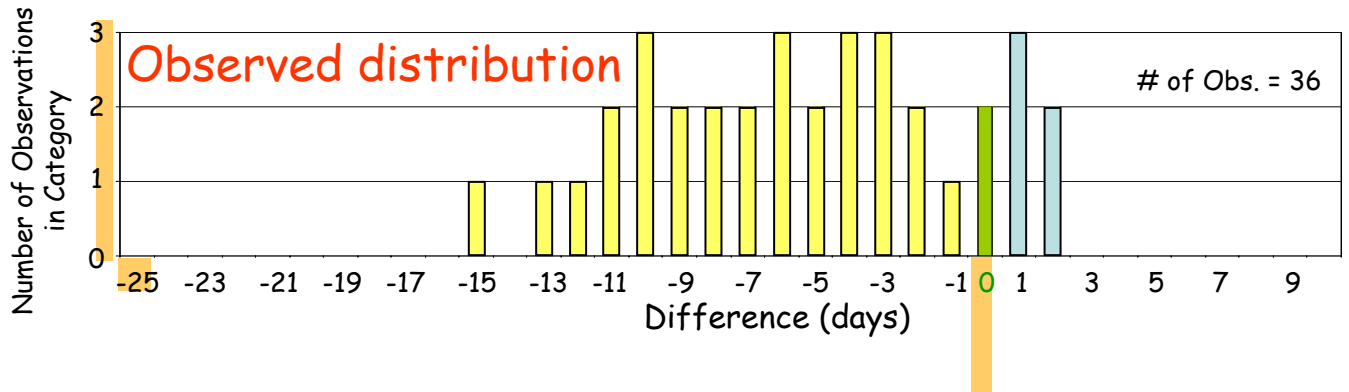


# Evaluation of Aerobiology Model Using Data from 23-24 September 2006 Soybean Rust Spore Incursion into the Lower Ohio River Valley (KY, IN, IL & MO)

IAMS Model  
Prediction of Symptom  
Appearance  
vs  
Discovery

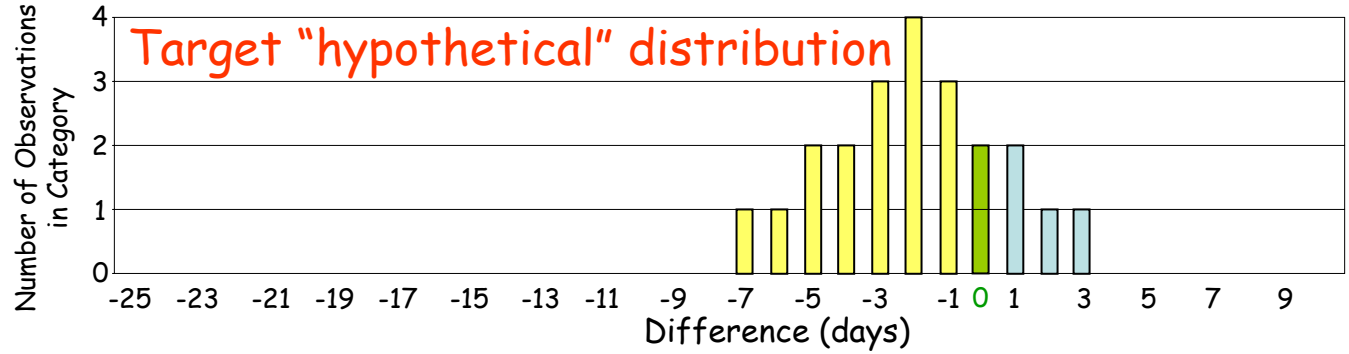


IAMS Model  
Prediction of Symptom  
Appearance  
vs  
Discovery

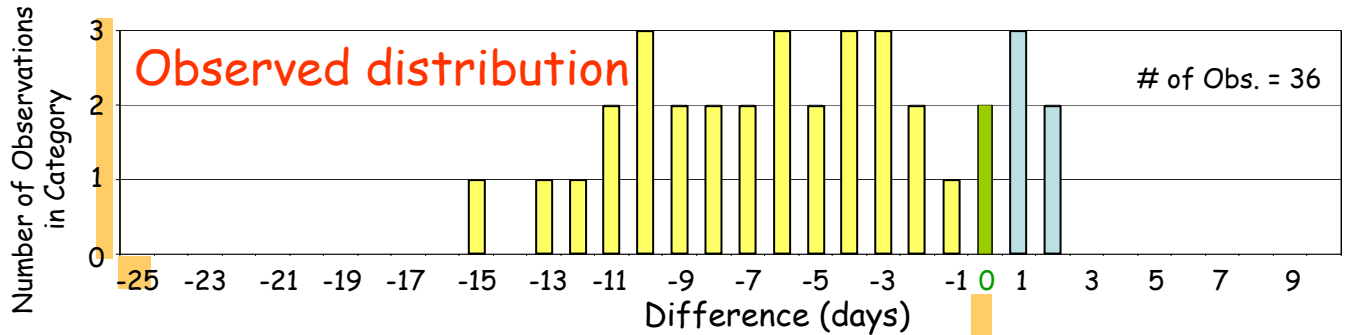


# Difference Between Prediction and When County Turned Red on USDA Website

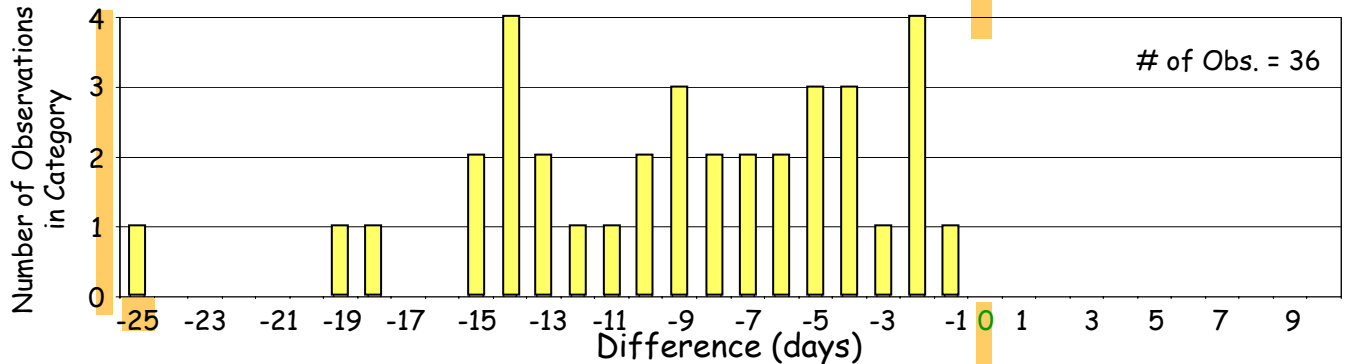
IAMS Model  
Prediction of Symptom  
Appearance  
vs  
Discovery



IAMS Model  
Prediction of Symptom  
Appearance  
vs  
Discovery



IAMS Model  
Prediction of Symptom  
Appearance  
vs  
Confirmation



# Anticipated Changes in Aerobiology Model for 2007

- Sentinel soybean plant ("infection-ready") - risk assessment tool for mobile scouting.
- Improved canopy escape parameter - function of wind speed and crop stage (results of field research in FL).
- Automated soybean growth stage "biofix" for sentinel plot model runs.
- Adjustment of infection development for drought and extreme temperatures.
- Expanded multiple model ensemble approach with updated training for human interpretation.