

# United States Department of Agriculture National Agricultural Statistics Service

## Crop Land Data Layer & Acreage Estimates

Presented by Audra Zakzeski





# United States Department of Agriculture

## National Agricultural Statistics Service



Provide timely, accurate, and useful statistics  
in service to U.S. agriculture

A sample of surveys and programs:

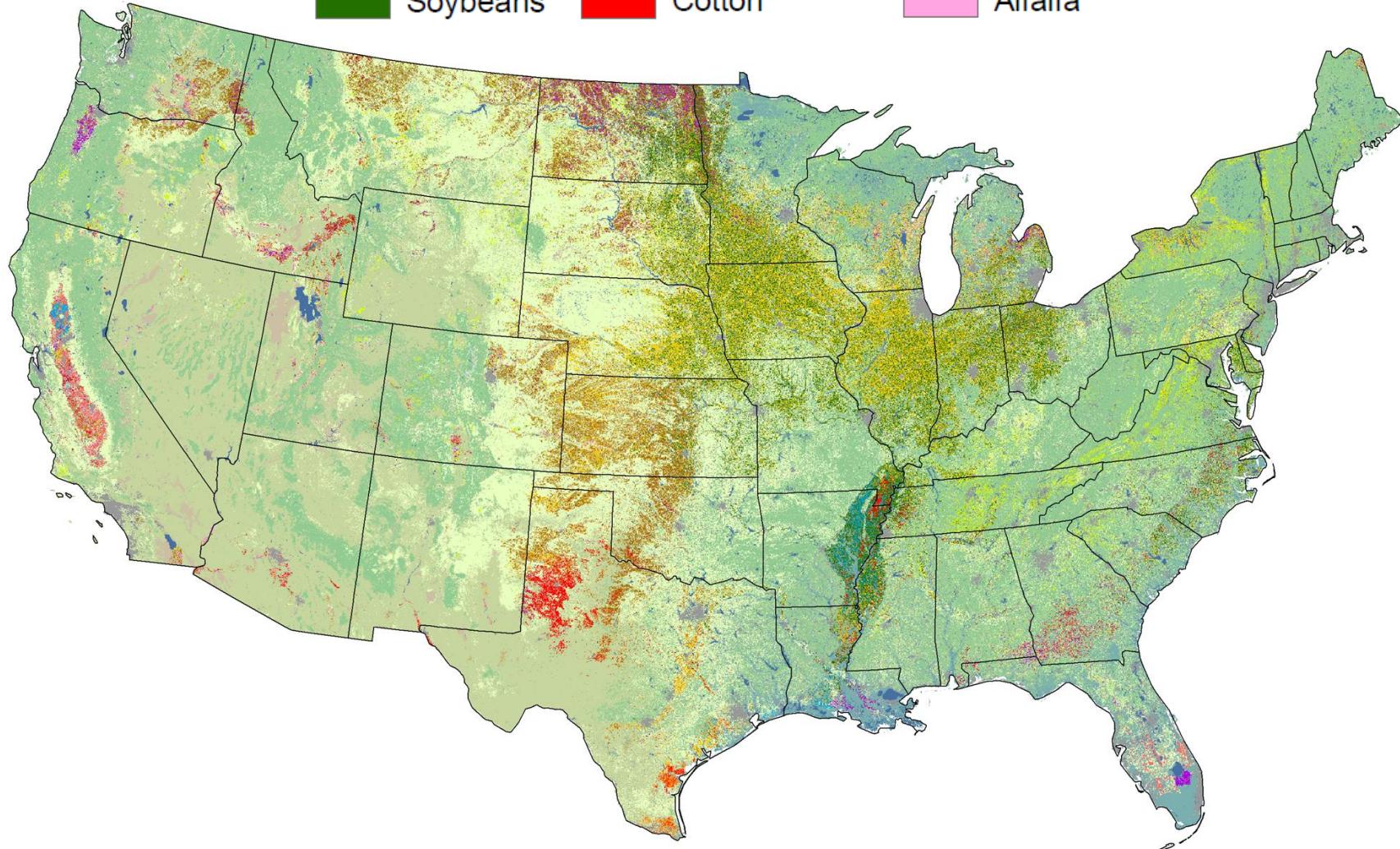
Census of Agriculture	<b>Crop Acreage</b>	Agricultural Yield
Crops / Stocks	Crop Progress & Condition	Farm Labor
June Area Survey	Agricultural Resource Management (ARMS)	Chemical Use
Cattle Inventory	Census of Horticulture	Bee & Honey

# What is a Crop Land Data Layer (CDL)?

A tool to identify agriculture type and location

Each pixel represents a type of crop or land cover

A sample:



# 2010 CDL Production Schedule

January						
S	M	T	W	T	F	S
					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						

February						
S	M	T	W	T	F	S
		1	2	3	4	5
7	8	9	10	11	12	13
14	15	16	17	18	19	20
21	22	23	24	25	26	27
28						

March						
S	M	T	W	T	F	S
		1	2	3	4	5
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			

April						
S	M	T	W	T	F	S
					1	2
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	

Acreage Report – Winter Wheat

May						
S	M	T	W	T	F	S
					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					

Crop Production Report – Corn & Soybeans

July						
S	M	T	W	T	F	S
					1	2
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

August						
S	M	T	W	T	F	S
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				

Crop Production Report – CDL Cotton, Rice, & Peanuts

September						
S	M	T	W	T	F	S
			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		

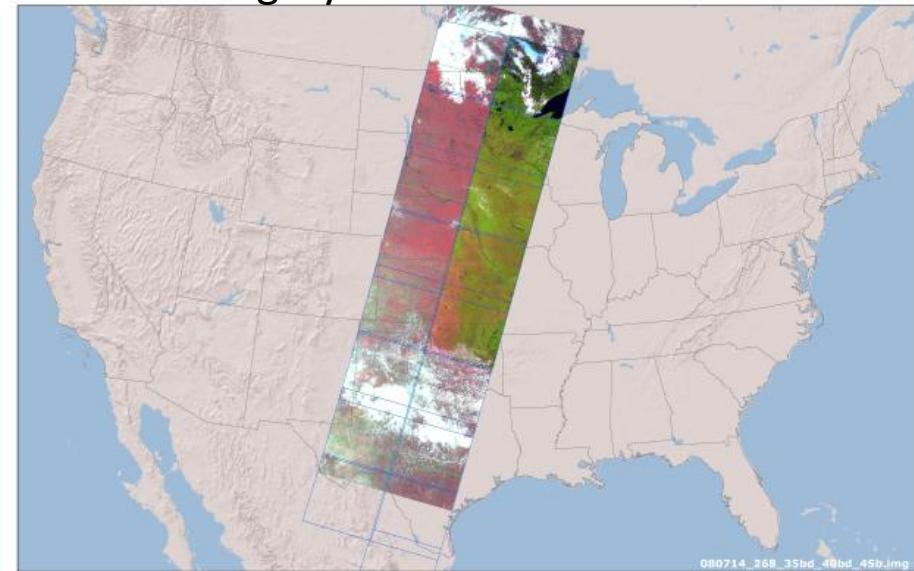
November						
S	M	T	W	T	F	S
			1	2	3	4
7	8	9	10	11	12	13
14	15	16	17	18	19	20
21	22	23	24	25	26	27
28	29	30				

Small Grains Summary

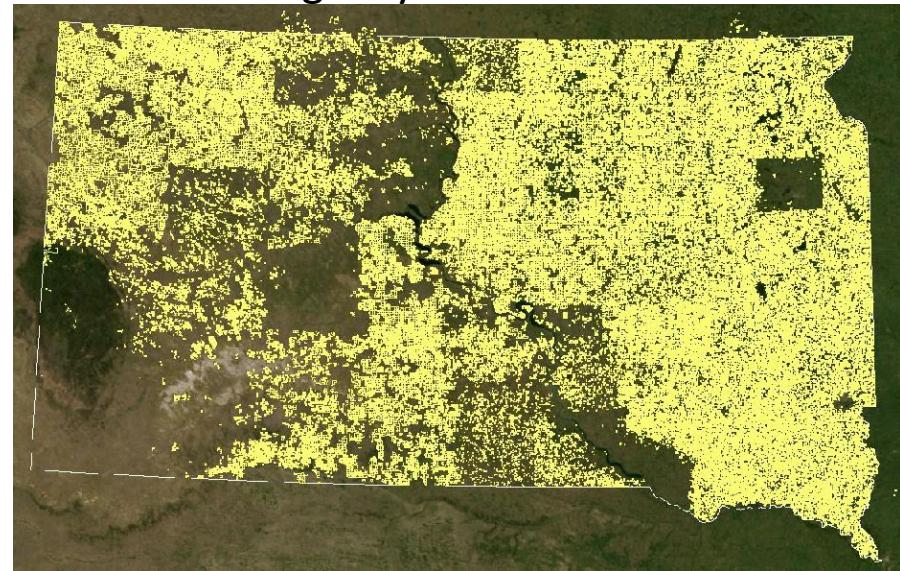
Crop Production Report – All Crops

# Inputs

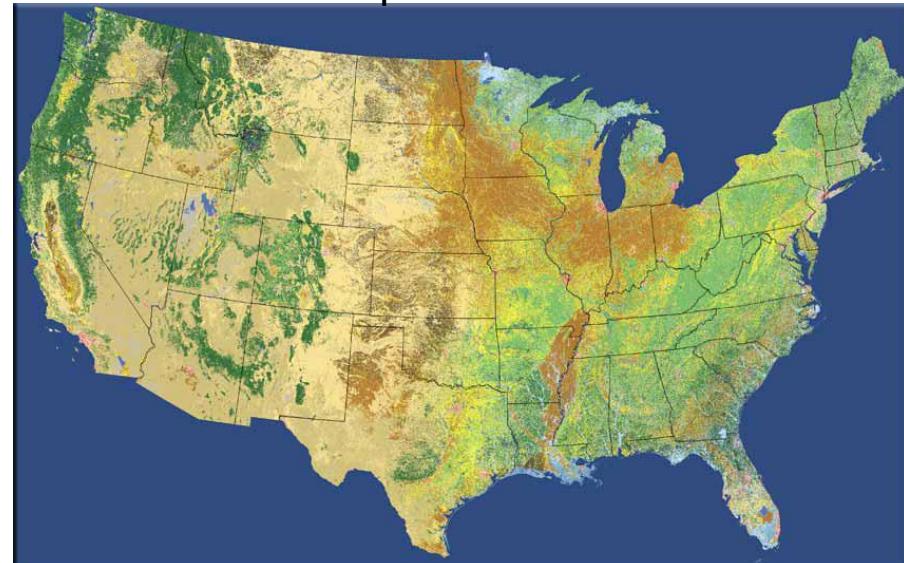
Satellite Imagery - AWiFS & Landsat TM



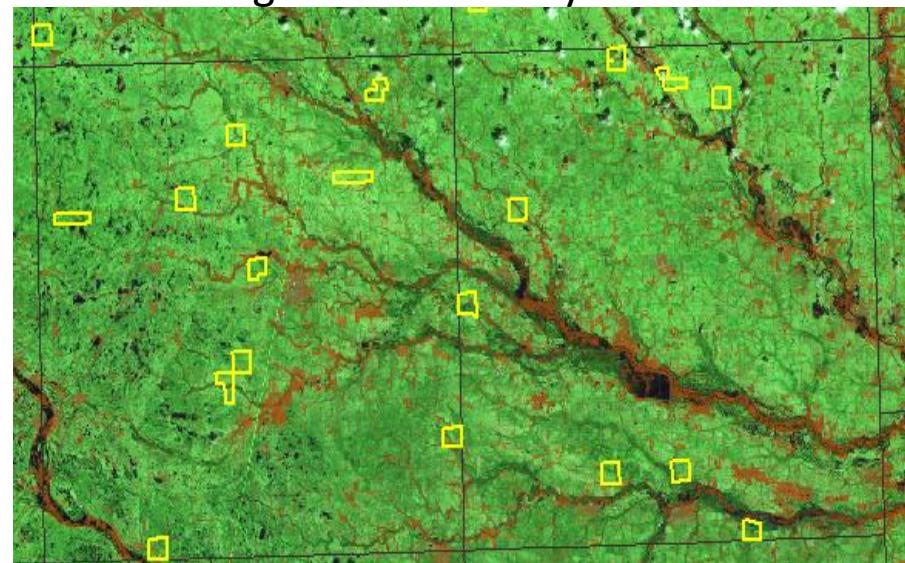
Farm Service Agency – Common Land Unit



NLCD & Derivative products



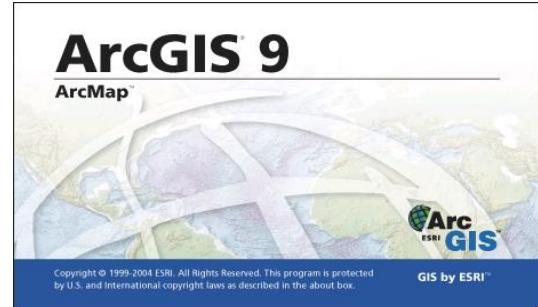
NASS June Agriculture Survey



# Software Suite

## Ground Truth Preparation

- ESRI ArcMap



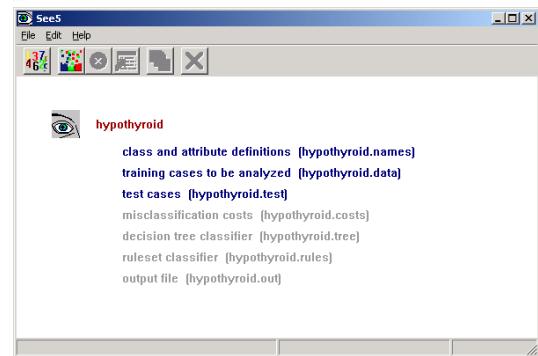
## Image Preparation

- Leica Geosystems ERDAS Imagine 9.1



## Image Classification

- See 5

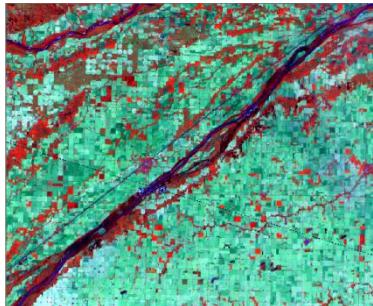


## Acreage Estimates

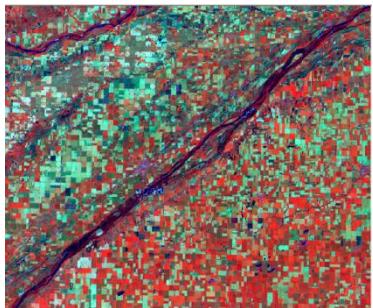
- SAS/IML Workshop



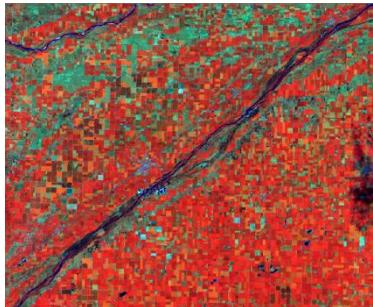
# Satellite Images over time



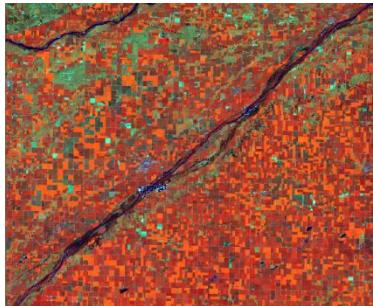
May 18



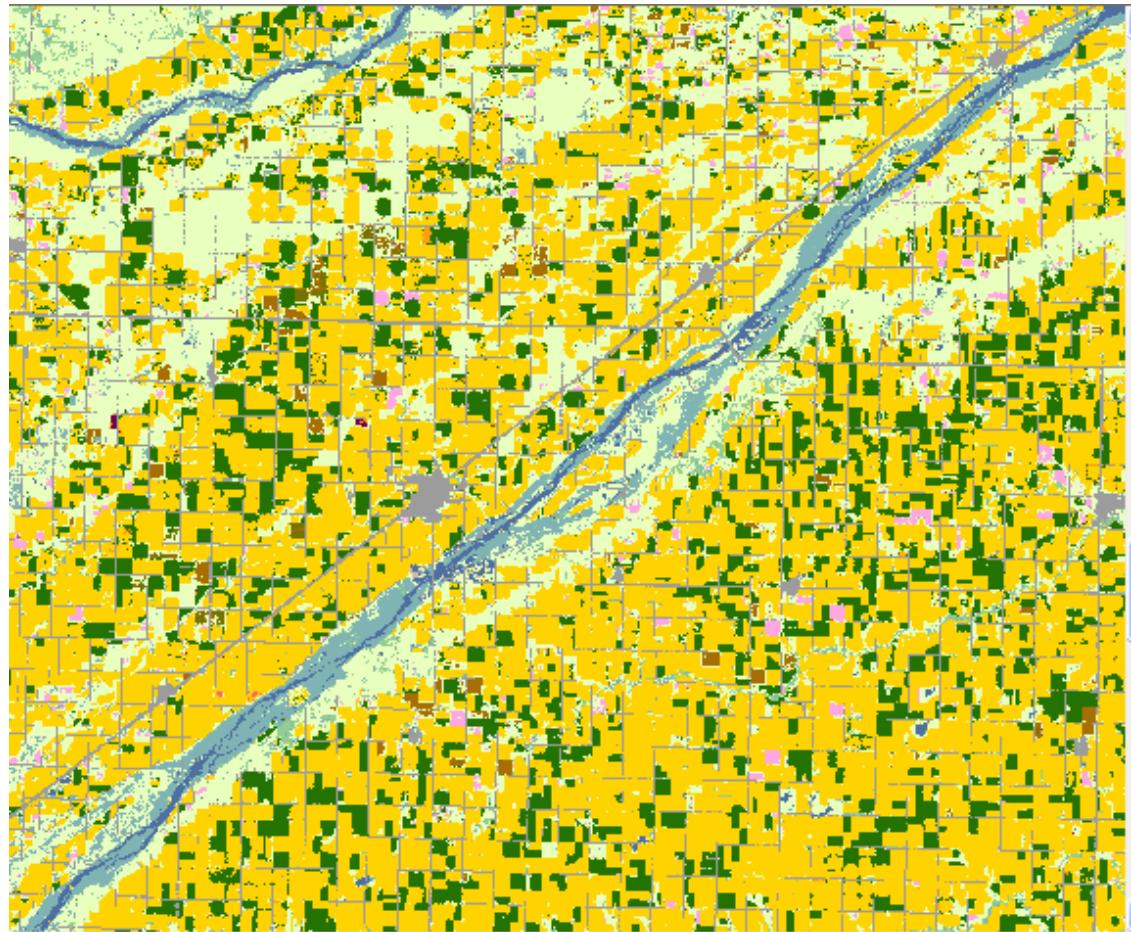
June 21



July 15



Aug 27



# Ground Truth – Land Cover

## Agriculture Ground Truth

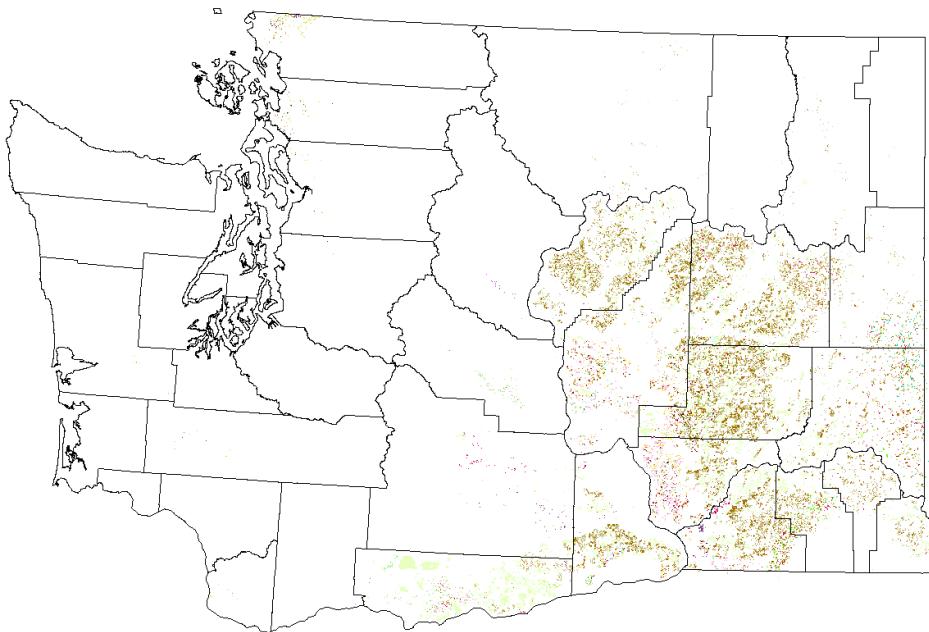
Provided by Farm Service Agency

Identifies known fields and crops

Divide known fields into 2 sets

½ used for training software

½ used for validating results

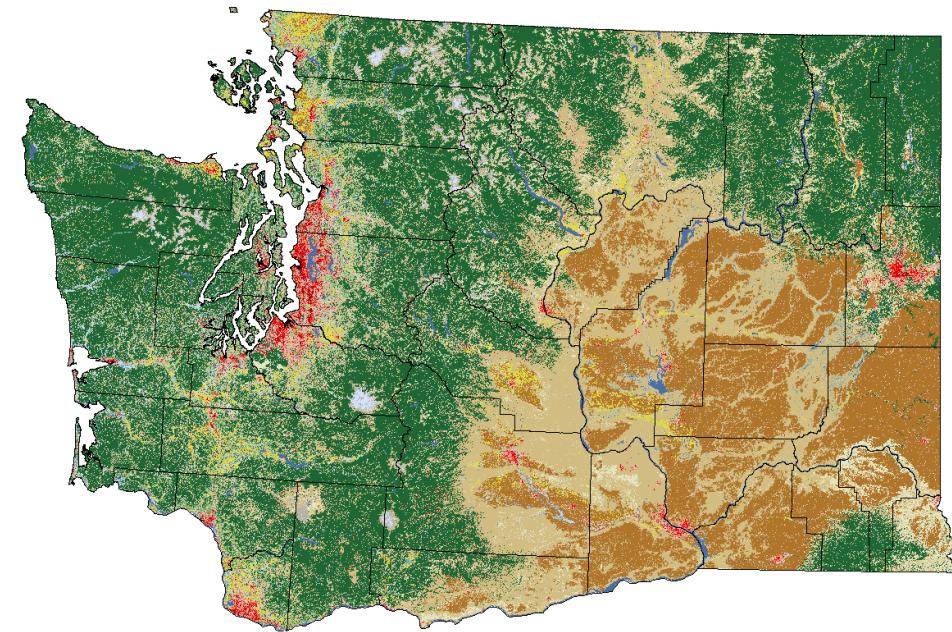


## Non-Agriculture Ground Truth

USGS National Land Cover Dataset

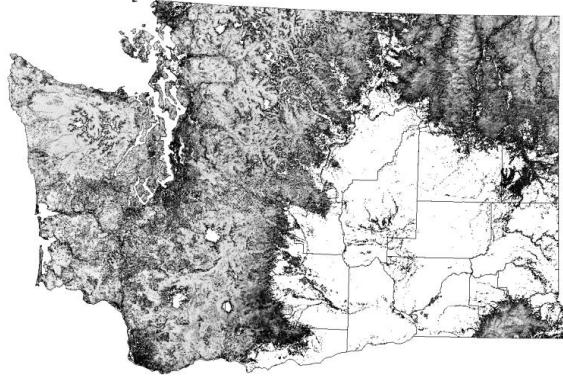
Identifies urban infrastructure and non-agriculture land cover

Forest, grass, water, cities

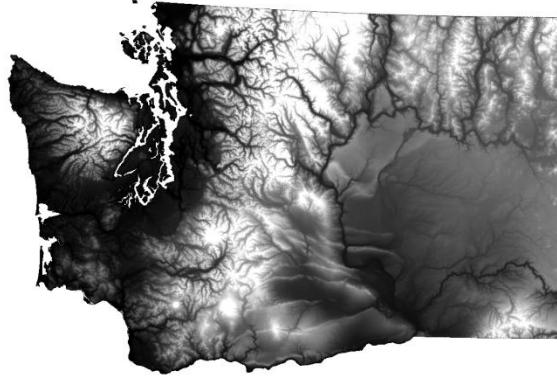


# Ground Truth – Ancillary US Geological Survey

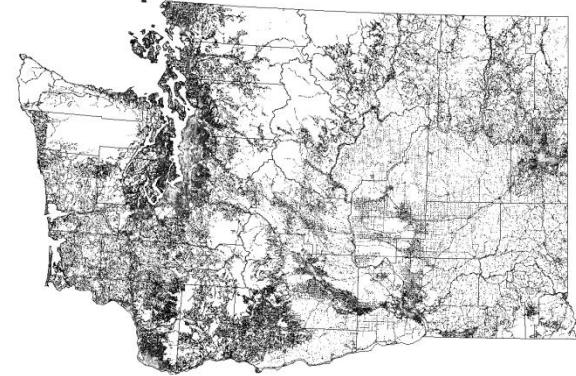
Forest Canopy



Elevation

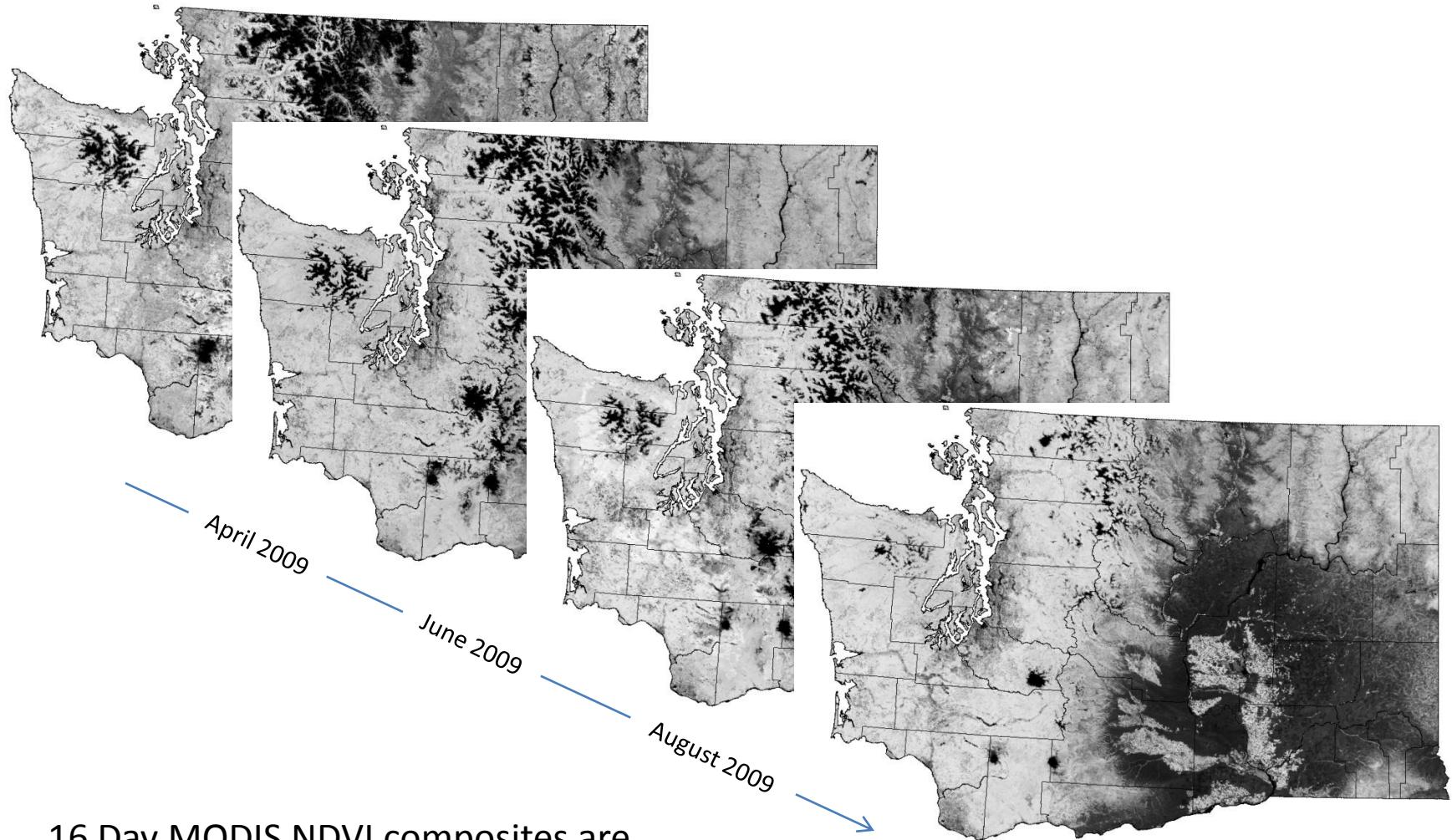


Impervious Surfaces



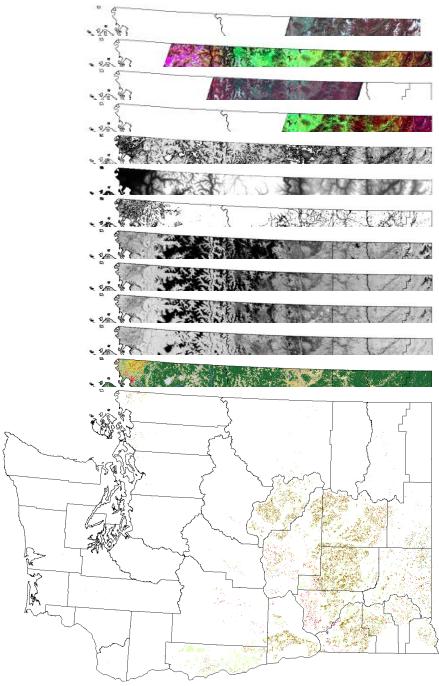
Ancillary datasets help separate the agricultural landscape;  
determining agricultural potential

# MODIS

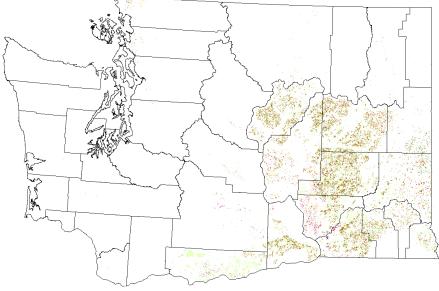


16 Day MODIS NDVI composites are used to identify winter wheat fields or to fill in gaps were there is little satellite coverage.

# Processing a CDL



Satellite Imagery



Ancillary Data

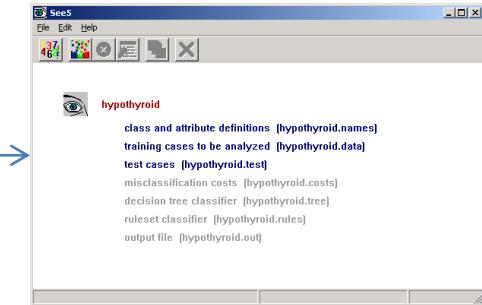
MODIS Data

Ground Truth

## Sampling



See5



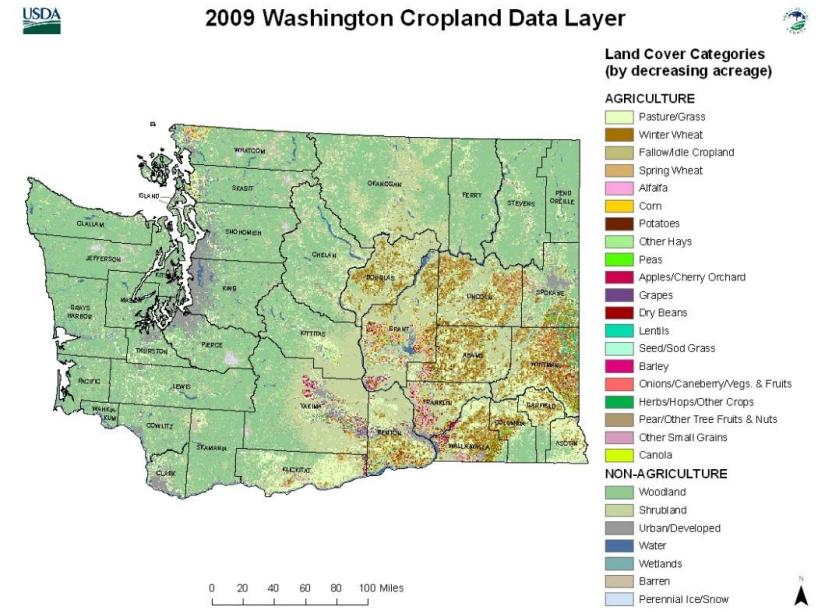
## Decision Tree

```
rule46 = 0:  
  band146 > 17:  
    1...band146 > 48:  
      ...band146 <= 76:  
        ...band146 <= 161: 123 (1224/384)  
        ...band146 > 161: 123 (7/1)  
      ...band146 <= 50:  
        ...band146 <= 48:  
          ...band146 <= 39: 122 (102/10)  
          ...band146 > 39: 123 (6)  
        ...band146 <= 49:  
          ...band146 <= 49: 123 (93/40)  
          ...band146 > 49: 122 (48/32)  
        ...band146 > 50:  
          ...band146 <= 49: 122 (46/32)  
          ...band146 > 49: 123 (6/2)  
    band146 > 76:  
      ...band113 <= 109:  
        ...band113 <= 140: 123 (58/156)  
        ...band113 > 140: 122 (401/327)  
      ...band113 > 109:  
        ...band113 <= 129: 124 (2/2)  
        ...band113 > 129:  
          ...band113 <= 233: 123 (6/2)  
          ...band113 > 233: 122 (21/8)  
    band146 = 76:  
      ...band146 <= 121: 123 (4)  
      ...band146 > 121:  
        ...band146 <= 81:  
          ...band146 <= 59: 124 (338/233)  
          ...band146 > 59: 123 (57/5)  
        ...band146 > 81:  
          ...band146 <= 129: 124 (149/1)  
          ...band146 > 129:  
            ...band142 <= 4701: 124 (22/3)  
            ...band142 > 4701: 123 (4)  
          ...band142 <= 307:  
            ...band142 > 307:  
              ...band109 <= 122: 124 (149/14)  
              ...band109 > 122: 123 (2)  
            ...band109 <= 404:  
              ...band109 <= 324: 124 (208/1)  
              ...band109 > 324:  
                ...band69 <= 181: 123 (1)  
                ...band69 > 181: 124 (21)  
  band146 <= 49:  
    ...band113 > 91:  
      ...band113 <= 82: 124 (4/2)  
      ...band113 > 92:  
        ...band113 <= 122: (8/2)  
        ...band113 > 122:  
          ...band113 <= 134:  
            ...band113 <= 134: 122 (30/22)  
            ...band113 > 134:  
              ...band113 > 139: 122 (3313/376)  
              ...band113 <= 149:  
                ...band146 <= 44: 122 (1045/149)  
                ...band146 > 44:  
                  ...band116 <= 89: 123 (10/2)  
                  ...band116 > 89:  
                    ...band116 <= 91:  
                      ...band116 > 91:
```

## Classification



## 2009 Washington Cropland Data Layer



## 2009 Washington Cropland Data Layer



## 2009 North Dakota Cropland Data Layer



### Land Cover Categories (by decreasing acreage)

#### AGRICULTURE

- Pasture/Grass
- Winter Wheat
- Fallow/Idle Cropland
- Spring Wheat
- Alfalfa
- Corn
- Potatoes
- Other Hays
- Peas
- Apples/Cherry Orchard
- Grapes
- Dry Beans
- Lentils
- Seed/Sod Grass
- Barley
- Onions/Caneberry/Vegs. & Fruits
- Herbs/Hops/Other Crops
- Pear/Other Tree Fruits & Nuts
- Other Small Grains
- Canola

#### NON-AGRICULTURE

- Woodland
- Shrubland
- Urban/Developed
- Water
- Wetlands
- Barren
- Perennial Ice/Snow

0 20 40 60 80 100 Miles

### Land Cover Categories (by decreasing acreage)

#### AGRICULTURE

- Pasture/Grass
- Spring Wheat
- Soybeans
- Other Hays
- Corn
- Durum Wheat
- Canola
- Sunflowers
- Dry Beans
- Barley
- Winter Wheat
- Peas
- Alfalfa
- Fallow/Idle Cropland
- Flaxseed
- Sugarbeets
- Lentils
- Oats
- Potatoes
- Other Crops/Vegs./Fruits
- Millet
- Safflower
- Sorghum
- Rye
- Seed/Sod Grass

#### NON-AGRICULTURE

- Urban/Developed
- Wetlands
- Water
- Woodland
- Shrubland

## 2009 Kansas Cropland Data Layer



### Land Cover Categories (by decreasing acreage)

#### AGRICULTURE

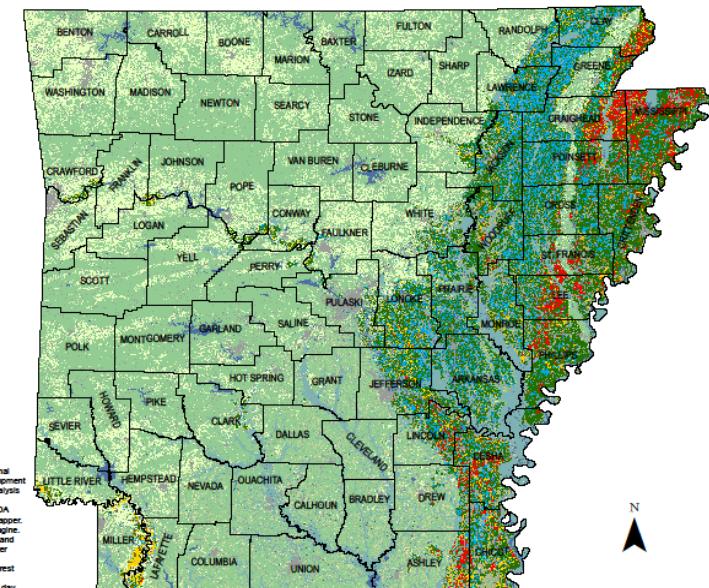
- Pasture/Grass
- Soybeans
- Rice
- Cotton
- Fallow/Idle Cropland
- Corn
- W. Wht./Soy. Dbl. Crop
- Winter Wheat
- Sorghum
- Aquaculture
- Other Crops/Vegs. & Fruits
- Other Tree Nuts
- Alfalfa
- W. Wht./Soy. Dbl. Crop
- Sunflowers
- Rye
- Cotton
- Other Crops/Vegs./Tree Nuts
- Other Small Grains
- Oats

#### NON-AGRICULTURE

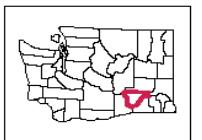
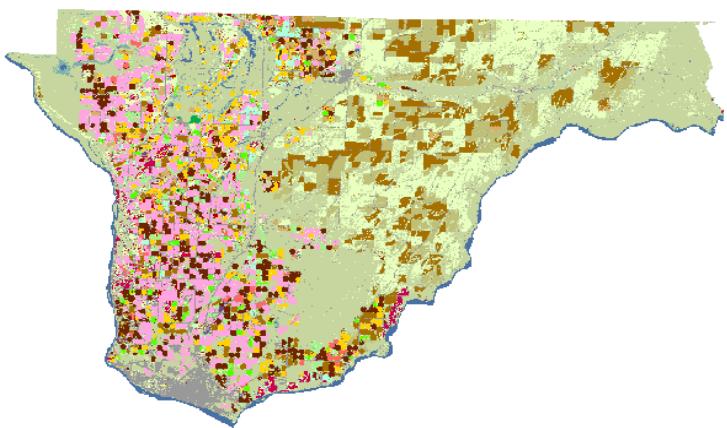
- Urban/Developed
- Woodland
- Wetlands
- Water
- Wetlands
- Shrubland
- Barren

0 20 40 60 80 100 Miles

## 2009 Arkansas Cropland Data Layer



## 2009 Franklin County, Washington



### Land Cover Categories

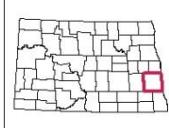
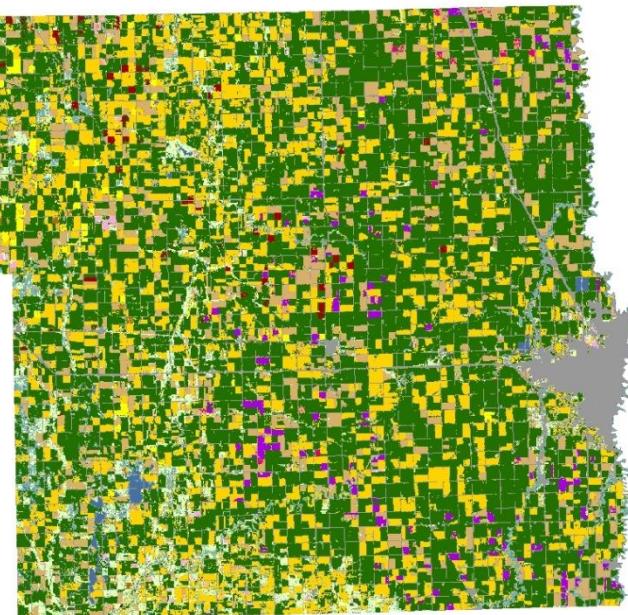
#### AGRICULTURE

- Pasture/Grass
- Winter Wheat
- Fallow/Idle Cropland
- Spring Wheat
- Afalfa
- Corn
- Potatoes
- Other Hays
- Peas
- Apples/Cherry Orchard
- Grapes
- Dry Beans
- Lentils
- Seed/Sod Grass
- Barley
- Onions/Caneberry/Vegs. & Fruits
- Herbs/Hops/Other Crops
- Pear/Other Tree Fruits & Nuts
- Other Small Grains
- Canola

#### NON-AGRICULTURE

- Woodland
- Shrubland
- Urban/Developed
- Water
- Wetlands
- Baren
- Perennial Ice/Snow

## 2009 Cass County, North Dakota



### Land Cover Categories

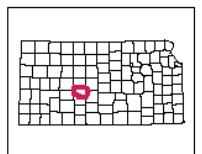
#### AGRICULTURE

- Pasture/Grass
- Spring Wheat
- Soybeans
- Other Hays
- Corn
- Durum Wheat
- Canola
- Sunflowers
- Dry Beans
- Barley
- Winter Wheat
- Peas
- Afalfa
- Fallow/Idle Cropland
- Flaxseed
- Sugarbeets
- Lentils
- Oats
- Potatoes
- Other Crops/Vegs./Fruits
- Millet
- Safflower
- Sorghum
- Rye
- Seed/Sod Grass

#### NON-AGRICULTURE

- Urban/Developed
- Vietlands
- Water
- Woodland
- Shrubland
- Baren

## 2009 Pawnee County, Kansas



### Land Cover Categories

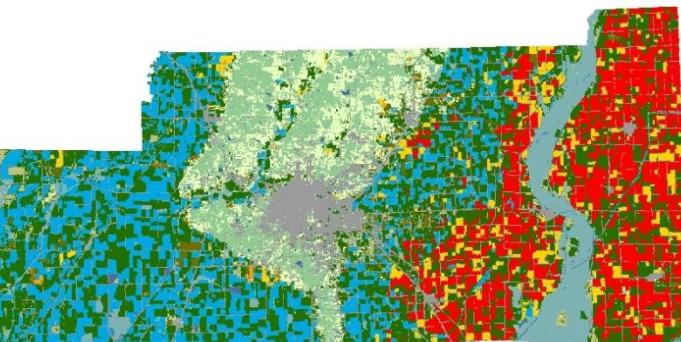
#### AGRICULTURE

- Pasture/Grass
- Winter Wheat
- Corn
- Fallow/Idle Cropland
- Soybeans
- Sorghum
- Afalfa
- W. Whl/Soy. Dbl. Crop
- Sunflowers
- Rye
- Cotton
- Other Crops/Vegs./Tree Nuts
- Other Small Grains
- Oats

#### NON-AGRICULTURE

- Urban/Developed
- Woodland
- Water
- Wetlands
- Shrubland
- Baren

## 2009 Craighead County, Arkansas



### Land Cover Categories

#### AGRICULTURE

- Pasture/Grass
- Soybeans
- Rice
- Cotton
- Fallow/Idle Cropland
- Winter Wheat
- W. Whl/Soy. Dbl. Crop
- Sorghum
- Aquaculture
- Other Crops/Vegs. & Fruits
- Other Tree Nuts

#### NON-AGRICULTURE

- Woodland
- Vietlands
- Urban/Developed
- Shrubland
- Water
- Baren

# Validating CDLs

We measure the accuracy of each CDL

Compare

Classified pixels from CDL

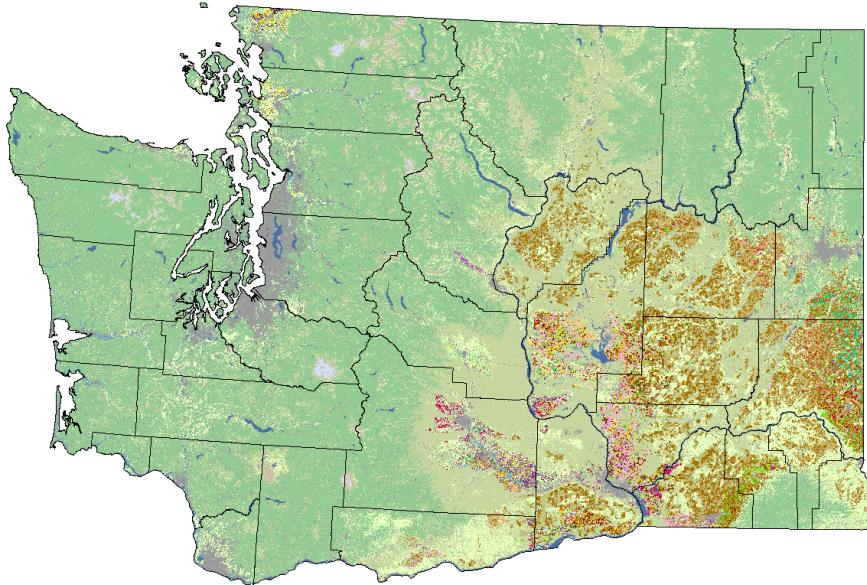
Known pixels, not used for classifying imagery, from FSA

Track

Producer Accuracy & Errors of Omission - % of pixels from category missing

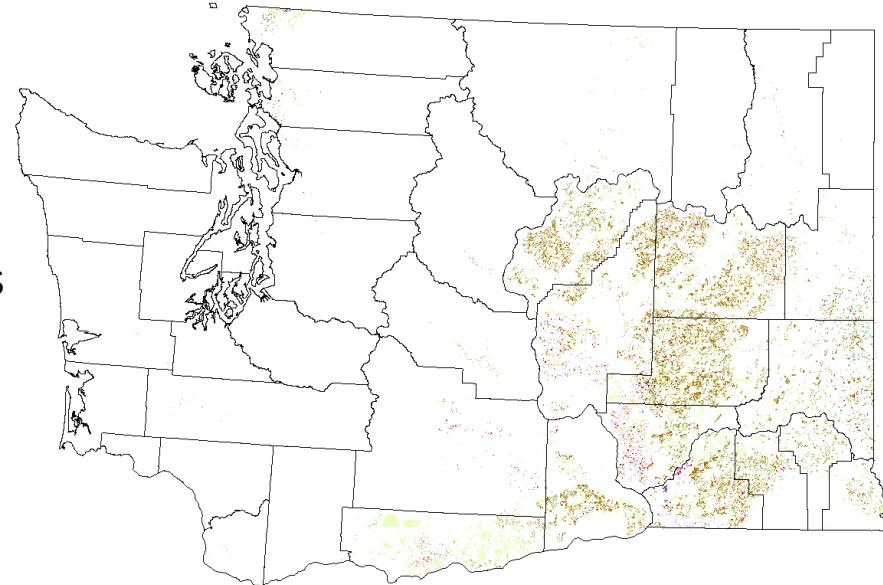
User Accuracy & Errors of Commission - % of pixels from category that are over classified

Cropland Data Layer



Groundtruth –  $\frac{1}{2}$  saved for validation

versus



# Accuracy Assessments

## STATEWIDE AGRICULTURAL ACCURACY REPORT

Crop-specific covers only   \*Correct Pixels   Accuracy   Error   Kappa

OVERALL ACCURACY**	645164	90.05%	9.95%	0.8663
--------------------	--------	--------	-------	--------

Cover Type	Attribute Code	*Correct Pixels	Producer's Accuracy	Omission Error	User's Kappa	Commission Error	Cond'l Kappa
----	----	-----	-----	-----	-----	-----	-----
Corn	1	13258	84.61%	15.39%	0.8438	90.54%	9.46% 0.9039
Sorghum	4	0	0.00%	100.00%	0.0000	n/a	n/a n/a
Soybeans	5	0	0.00%	100.00%	0.0000	0.00%	100.00% 0.0000
Sweet Corn	12	5671	74.53%	25.47%	0.7436	87.17%	12.83% 0.8707
Mint	14	475	69.55%	30.45%	0.6953	81.76%	18.24% 0.8174
Barley	21	3229	52.89%	47.11%	0.5269	77.49%	22.51% 0.7735
Spring Wheat	23	58526	85.00%	15.00%	0.8393	87.80%	12.20% 0.8690
Winter Wheat	24	254045	95.94%	4.06%	0.9446	95.30%	4.70% 0.9361
Other Small Grains	25	85	9.00%	91.00%	0.0898	30.36%	69.64% 0.3029
Rye	27	0	n/a	n/a	n/a	0.00%	100.00% 0.0000
Oats	28	3	0.53%	99.47%	0.0052	6.25%	93.75% 0.0620
Speltz	30	0	0.00%	100.00%	0.0000	n/a	n/a n/a
Canola	31	269	38.21%	61.79%	0.3819	66.92%	33.08% 0.6689
Safflower	33	0	n/a	n/a	n/a	0.00%	100.00% 0.0000
Rape Seed	34	0	n/a	n/a	n/a	0.00%	100.00% 0.0000
Mustard	35	494	61.83%	38.17%	0.6180	75.30%	24.70% 0.7529
Alfalfa	36	27815	85.17%	14.83%	0.8471	91.30%	8.70% 0.9100
Other Hays	37	8786	42.27%	57.73%	0.4165	83.41%	16.59% 0.8305
Camelina	38	0	0.00%	100.00%	0.0000	n/a	n/a n/a
Sugarbeets	41	286	83.87%	16.13%	0.8387	99.65%	0.35% 0.9965
Dry Beans	42	4822	77.36%	22.64%	0.7722	77.05%	22.95% 0.7691
Potatoes	43	16223	90.74%	9.26%	0.9058	96.82%	3.18% 0.9676
Other Crops	44	9	4.35%	95.65%	0.0435	39.13%	60.87% 0.3912
Misc. Veggies. & Fruits	47	513	38.69%	61.31%	0.3865	87.10%	12.90% 0.8708
Watermelon	48	0	0.00%	100.00%	0.0000	n/a	n/a n/a
Onions	49	2937	91.38%	8.62%	0.9135	95.08%	4.92% 0.9506
Lentils	52	4083	75.86%	24.14%	0.7574	80.41%	19.59% 0.8030
Peas	53	9554	76.09%	23.91%	0.7581	82.74%	17.26% 0.8252

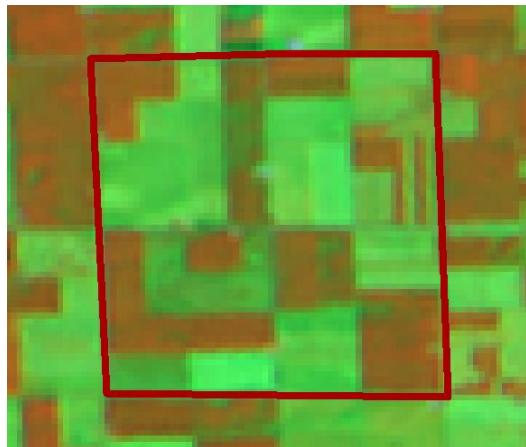
\*Correct Pixels represents the total number of independent validation pixels correctly identified in the error matrix.

# Regression-based Acreage Estimator

Acreage not just about counting pixels

The Goal: Identify areas with defined acreage totals to compare CDL pixel counts

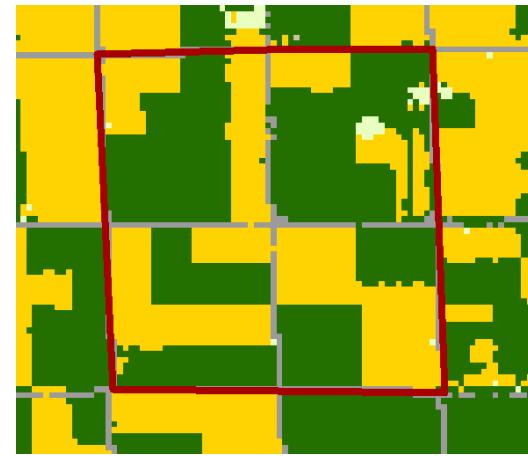
Current Solution: June Agriculture Survey Segments



June Ag Segment 

Farmers within segment  
report 220 acres of corn

Vs.



Crop Land Data Layer

Pixel Counting   
estimates 180 acres of corn

# Regression-based Acreage Estimator

Acreage not just about counting pixels

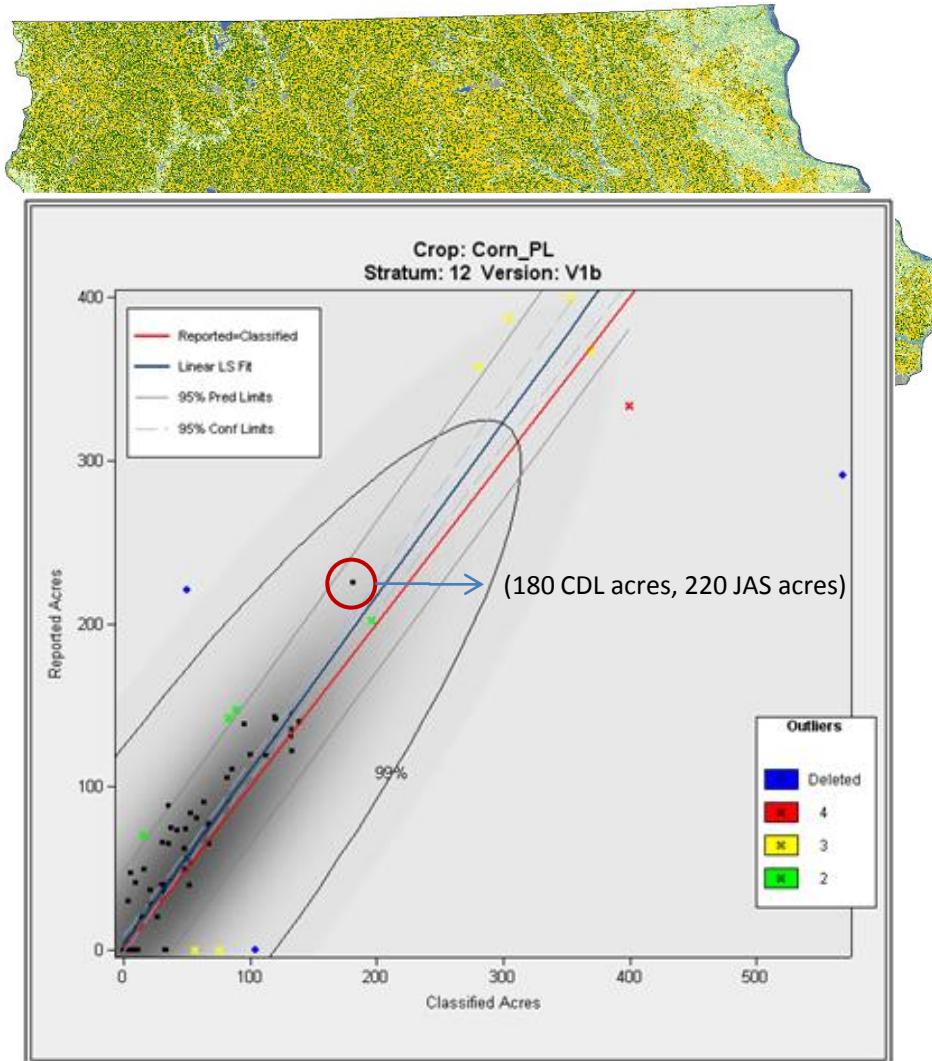
## Simple Linear Regression

Regression used to relate categorized pixel counts to the ground reference data

- (X) – Cropland Data Layer (CDL) classified acres
- (Y) – June Agricultural Survey (JAS) reported acres

Outlier segment detection - removal from regression analysis

Using regression results in estimates reduces error rates over using JAS alone



# 2008 State Level Estimates +/- 2 CVs

Corn

Soybeans

- Crop acreage reported by Ag Statistics Board
- JAS — Crop acreage estimated from June Ag Survey
- Reg+ — Crop acreage estimated using CDL & Regression techniques
- Pix — Number of pixels in CDL
- CV — Coefficient of Variation

% Over/Under ASB Final

0

JAS  
Reg+  
Pix

Things to note:

- Remote Sensing techniques (CDL & Regression) produce acreage estimates with smaller variability
- Pixel counting tends to underestimate crop acreage

Source of Estimate

CRP

Climate

Ecosystem

Water Use

Transportation

Soil Utilization

Pest Control

Land Cover

Epidemiology

Agribusiness

Wildlife Habitat

Irrigation

Forest

Ethanol

Biodiesel

Erosion

Carbon

Crop Rotation

Yield

Crop Intensity

Modeling

Planning

Watersheds

Acreage Estimates

Change Detection

Commodity

Environmental Risk

Land Management

Mapping

Data Mining

Ecology

Biofuel

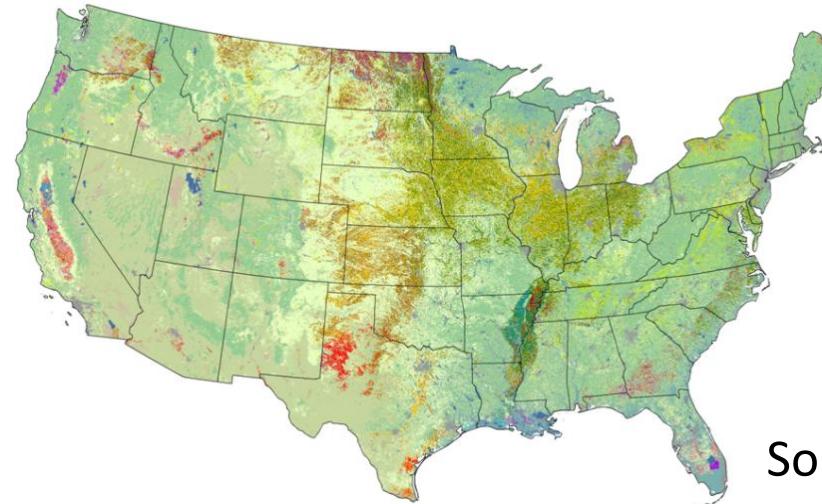
Disaster Assessment

Fertilizer

Land Use

Water Quality

Crop Protection

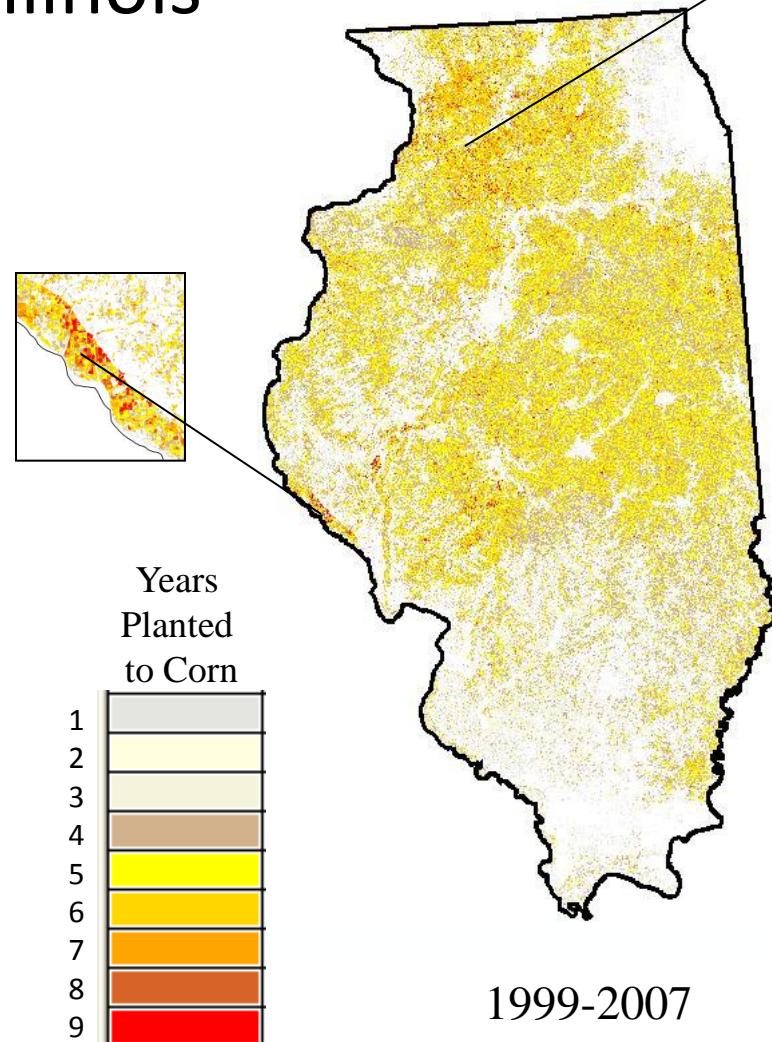
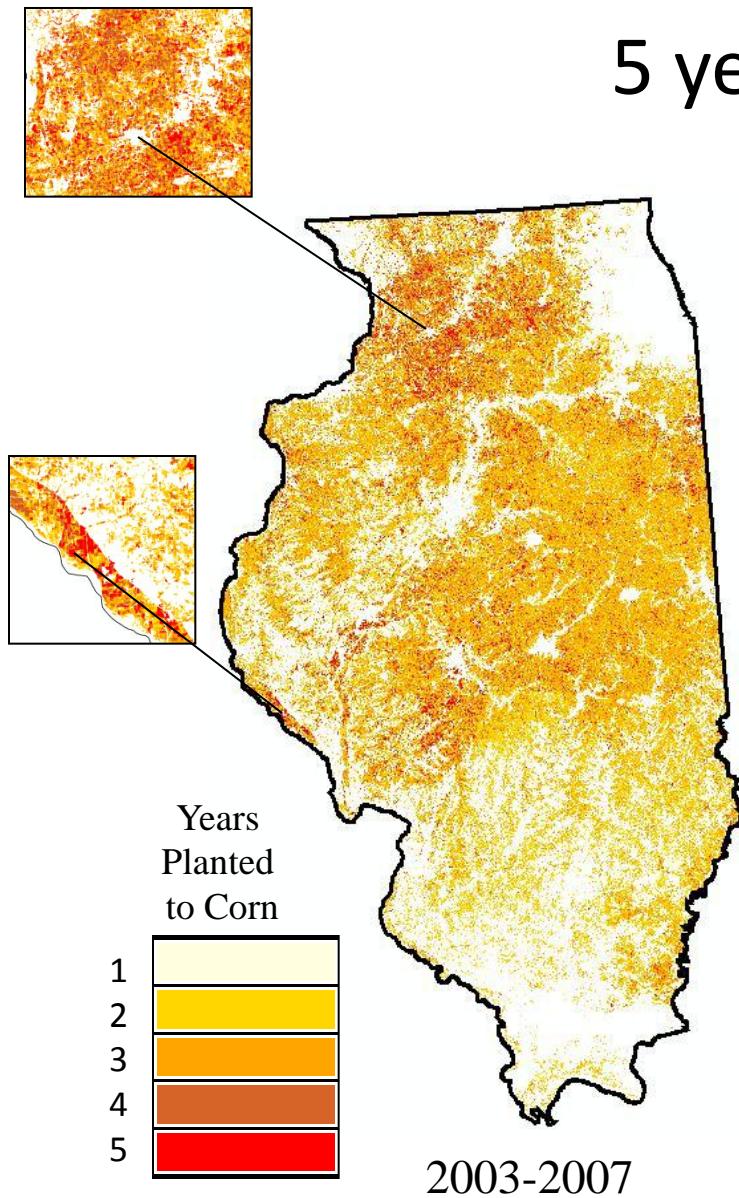


Research

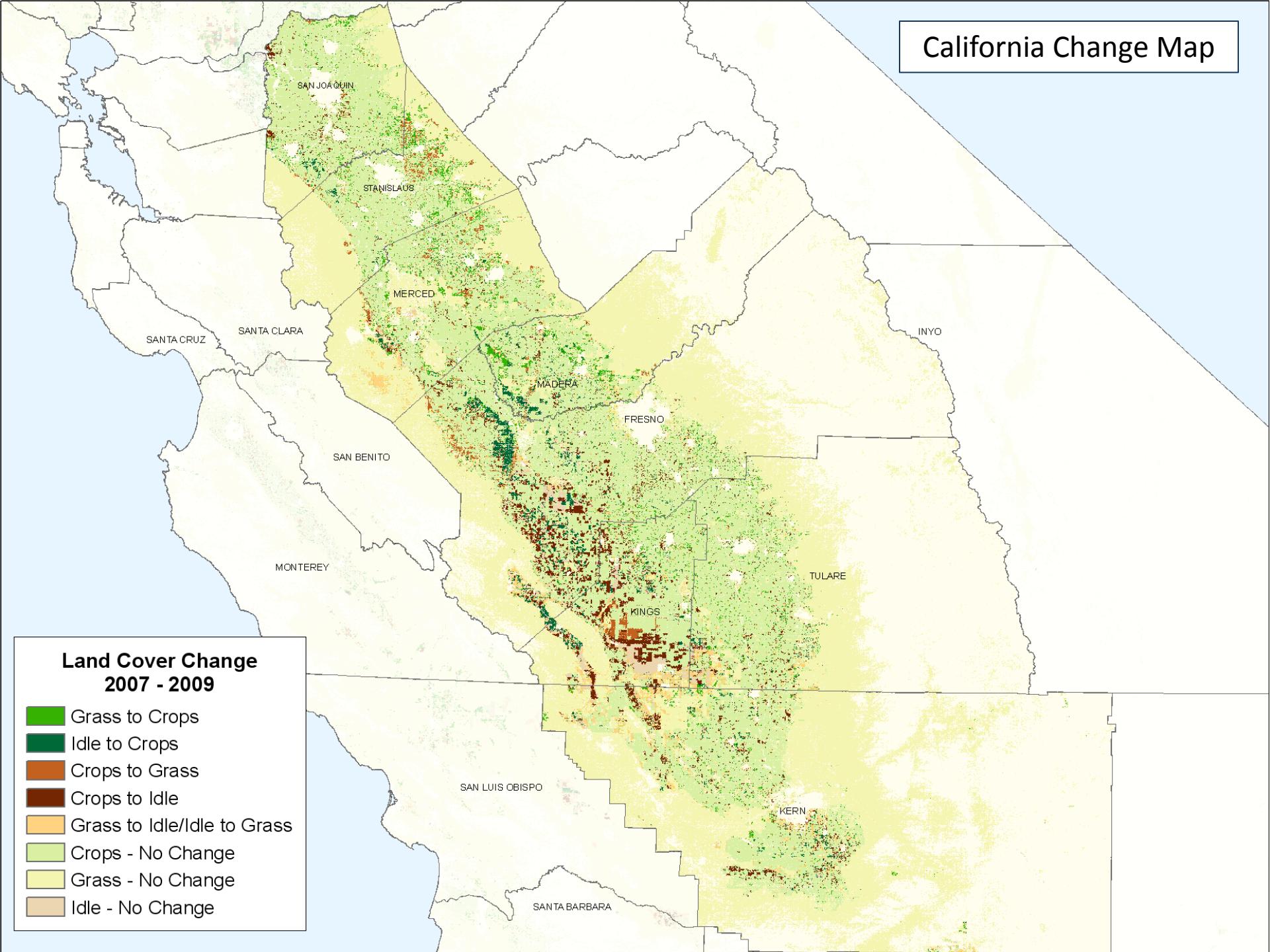
# Corn Planting Intensity

## 5 years vs. 9 years

### Illinois



# California Change Map



## Land Cover Change 2007 - 2009

- Grass to Crops
- Idle to Crops
- Crops to Grass
- Crops to Idle
- Grass to Idle/Idle to Grass
- Crops - No Change
- Grass - No Change
- Idle - No Change

# Thank You Any Questions?

Hosted @ [NRCS Geospatial Data Gateway](#) &  
<http://www.nass.usda.gov/research/Cropland/SARS1a.htm>

