

# 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

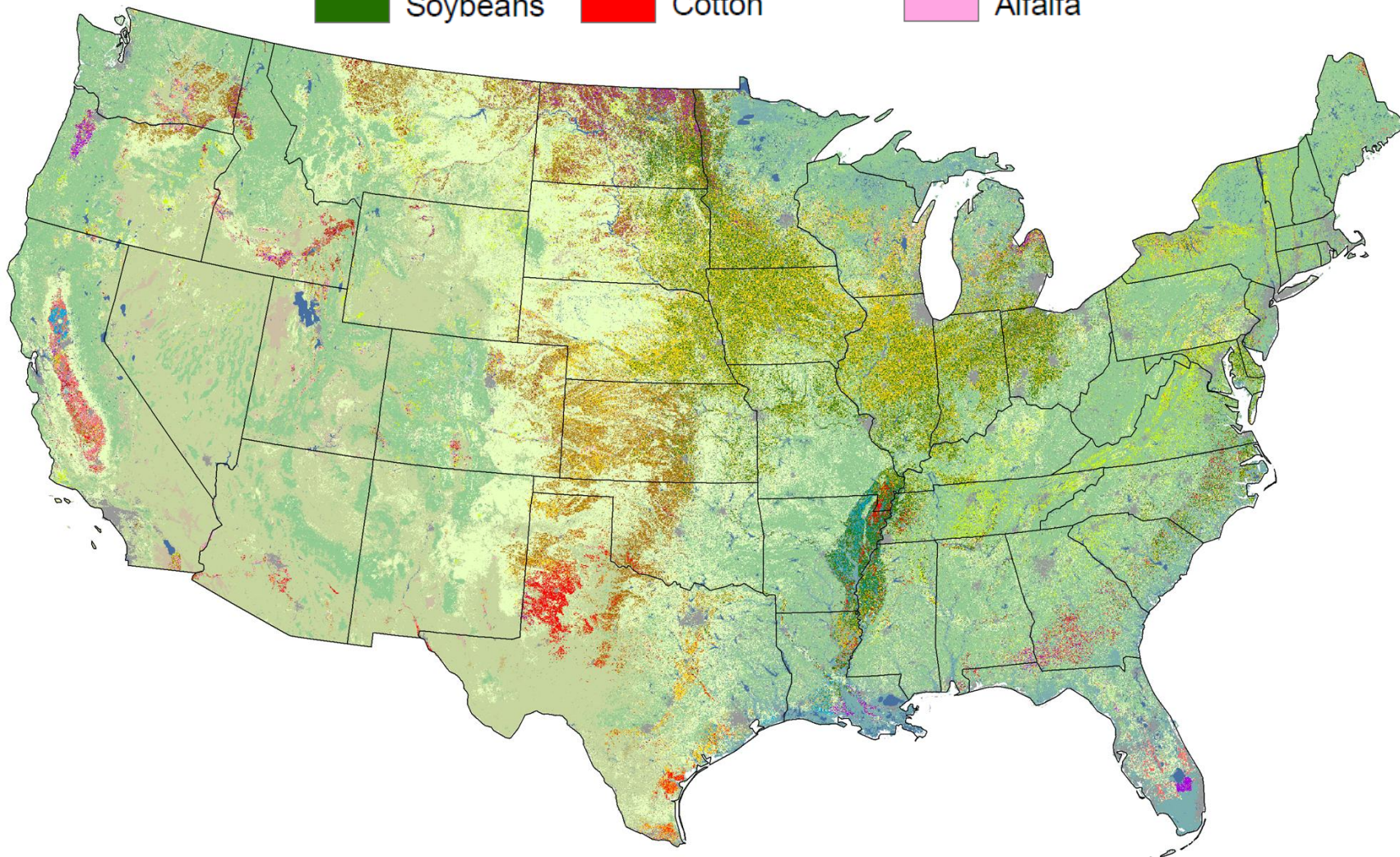
# What is a Crop Land Data Layer (CDL)?

A tool to identify agriculture type and location

Each pixel represents a type of crop or land cover

A sample:

	Corn		Winter Wheat		Rice
	Soybeans		Cotton		Alfalfa



# 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	6
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	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			

April						
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	

Acreage Report – Winter Wheat

Crop Production Report – Corn & Soybeans

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					

June						
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			

July						
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

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		

October						
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						

November						
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				

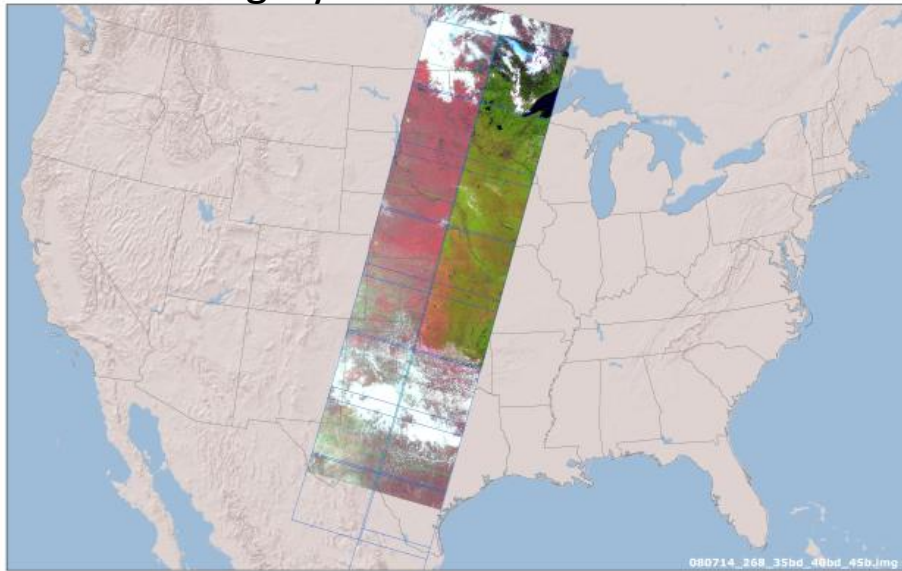
December						
S	M	T	W	T	F	S
			1	2	3	4
5	6	7	8	9	10	11
12	13	14	15	16	17	18
19	20	21	22	23	24	25
26	27	28	29	30	31	

Small Grains Summary

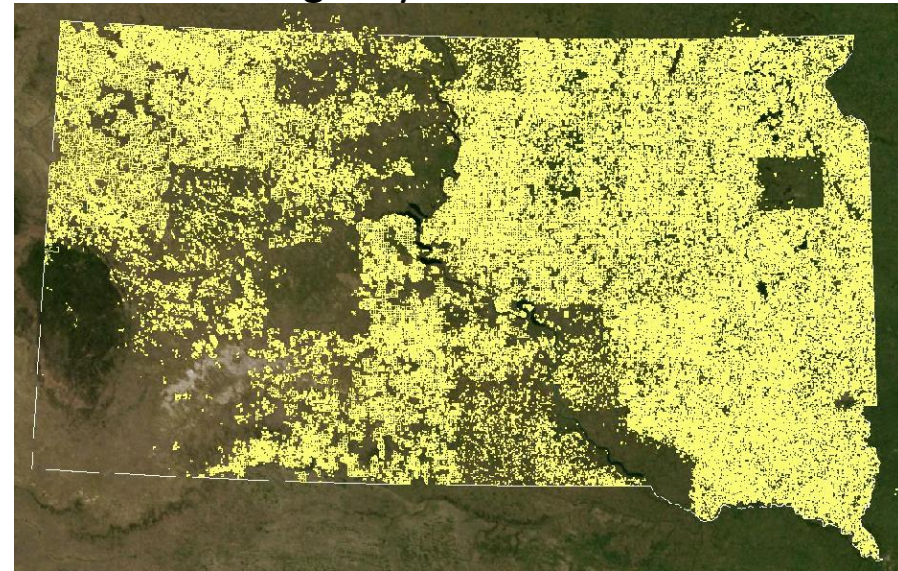
Crop Production Report – All Crops

# Inputs

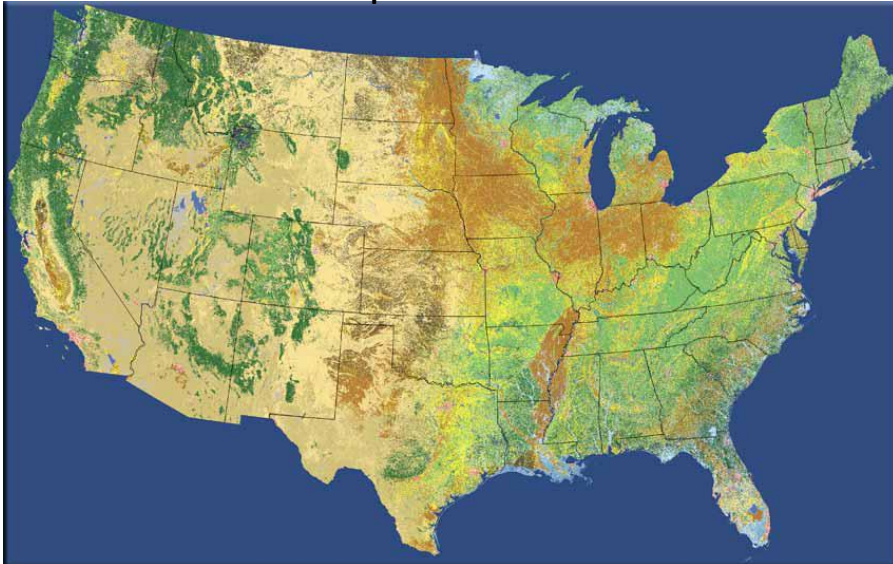
Satellite Imagery - AWiFS & Landsat TM



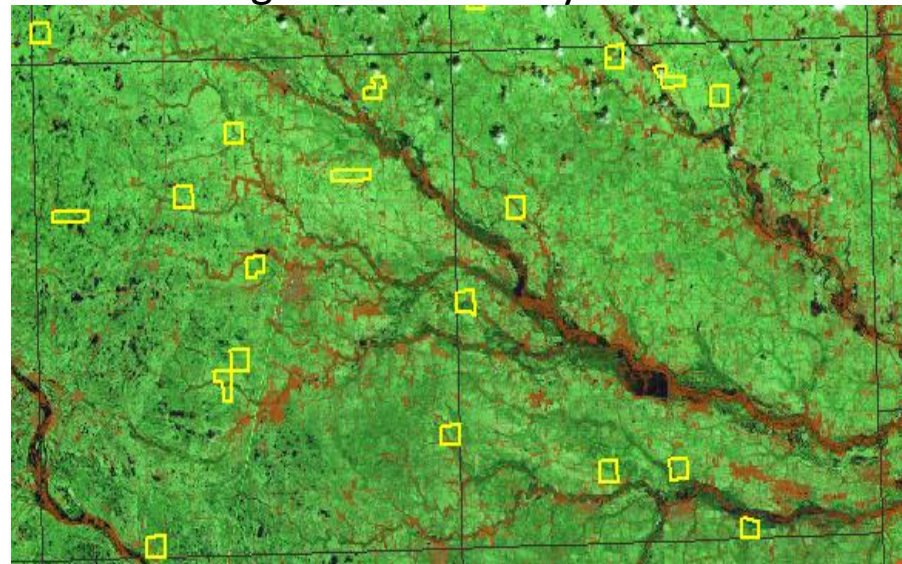
Farm Service Agency – Common Land Unit



NLCD & Derivative products



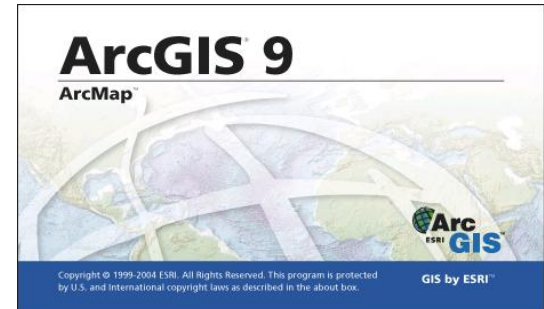
NASS June Agriculture Survey



# Software Suite

## Ground Truth Preparation

- ESRI ArcMap



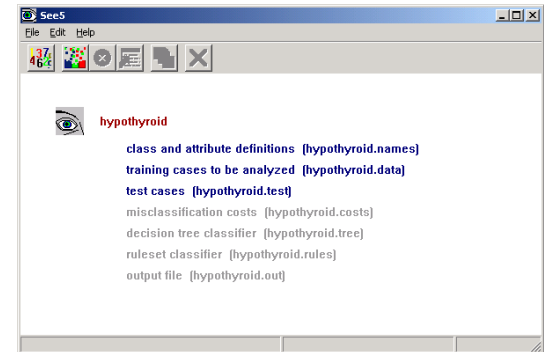
## Image Preparation

- Leica Geosystems ERDAS Imagine 9.1



## Image Classification

- See 5

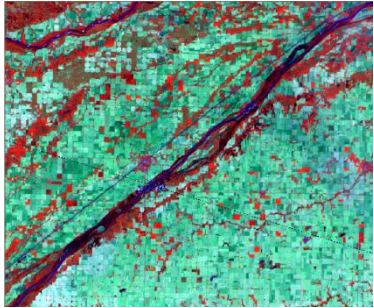


## Acreage Estimates

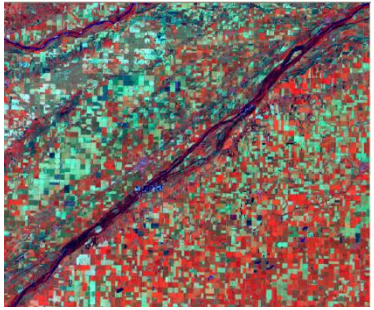
- SAS/IML Workshop



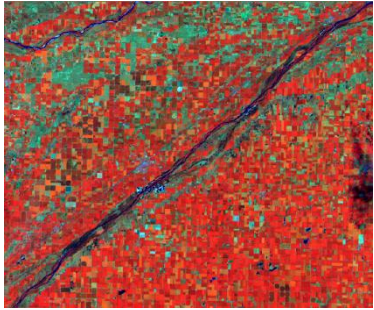
# Satellite Images over time



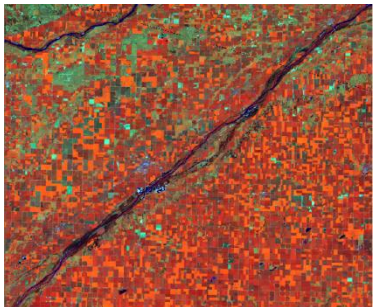
May 18



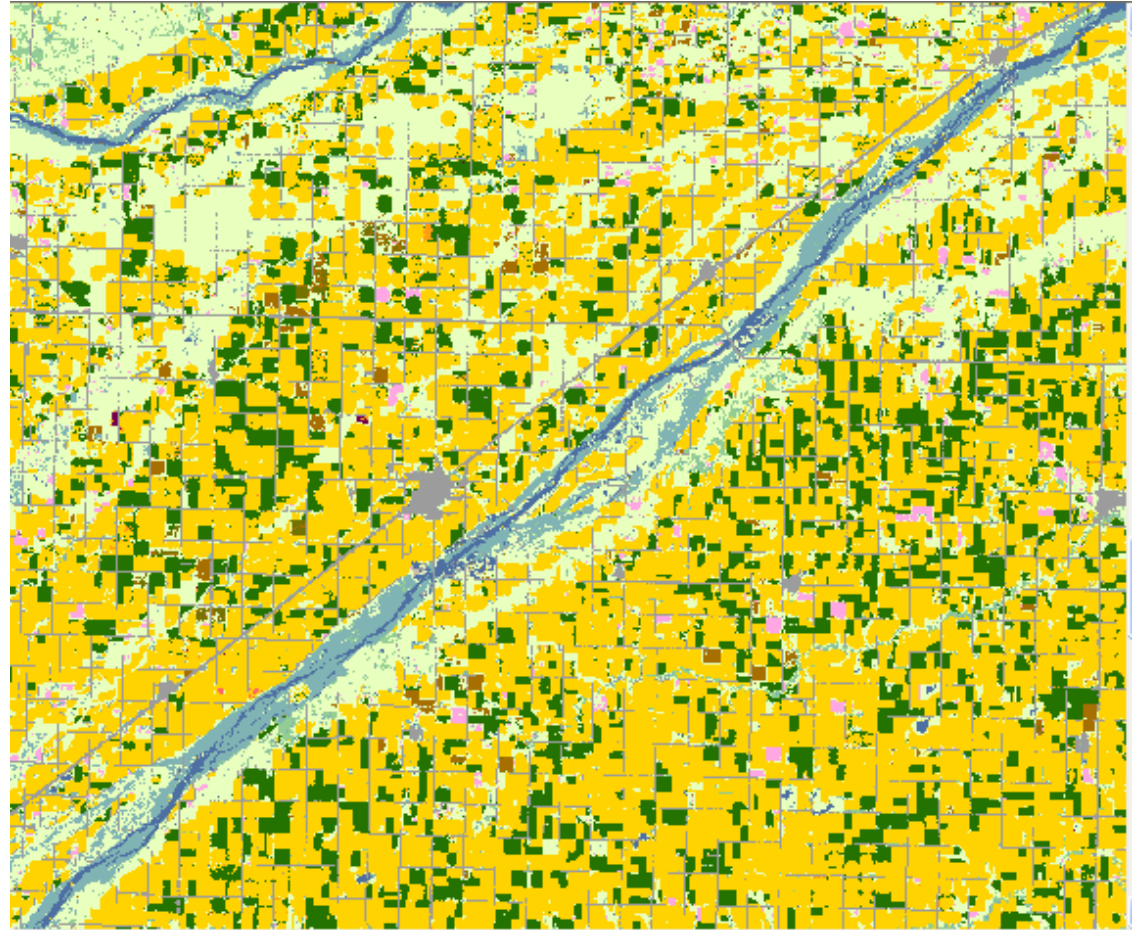
June 21



July 15



Aug 27



# Ground Truth – Land Cover

## Agriculture Ground Truth

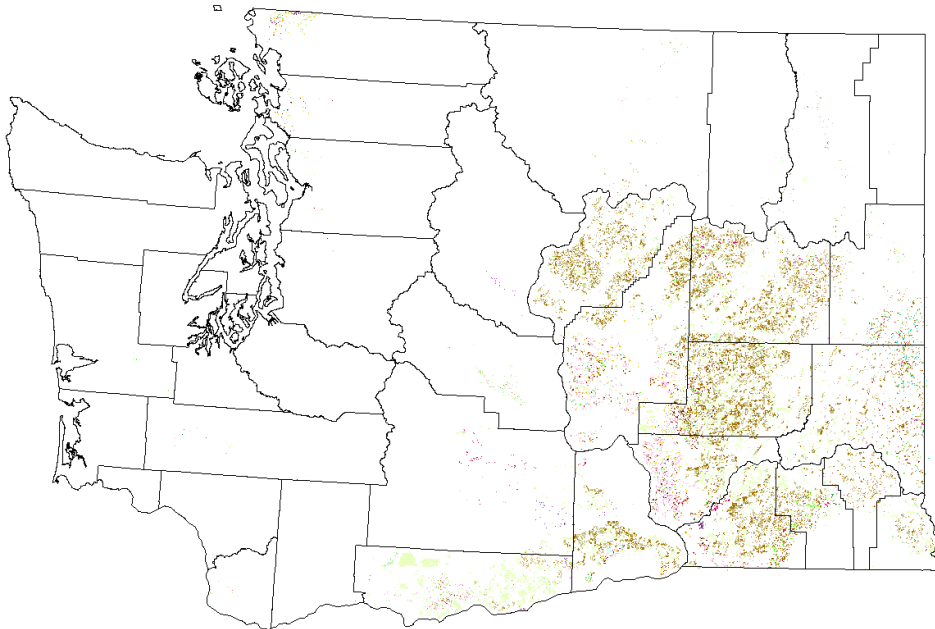
Provided by Farm Service Agency

Identifies known fields and crops

Divide known fields into 2 sets

½ used for training software

½ used for validating results

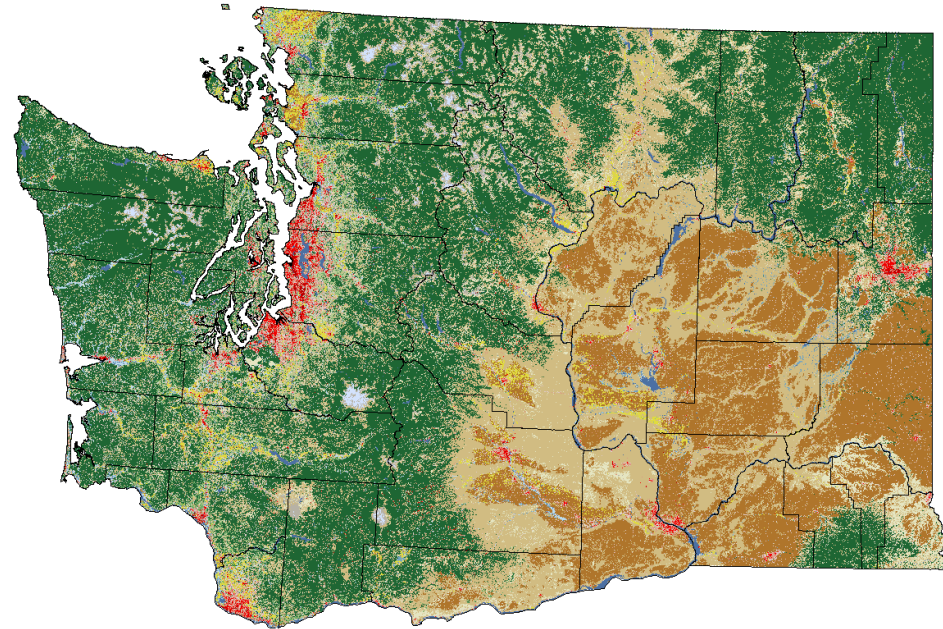


## Non-Agriculture Ground Truth

USGS National Land Cover Dataset

Identifies urban infrastructure and non-agriculture land cover

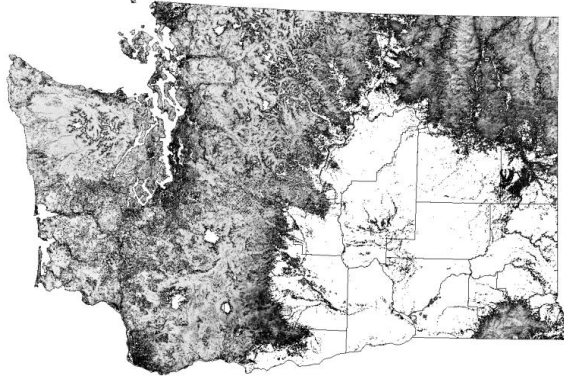
Forest, grass, water, cities



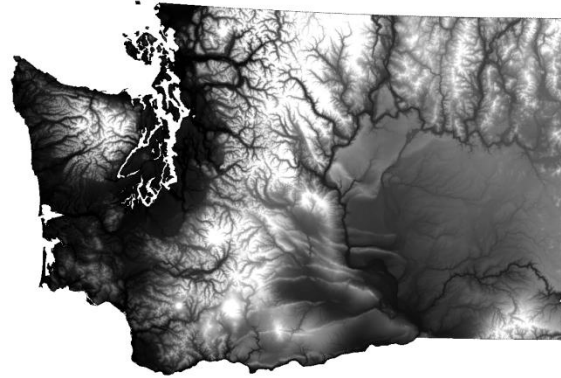


# Ground Truth – Ancillary US Geological Survey

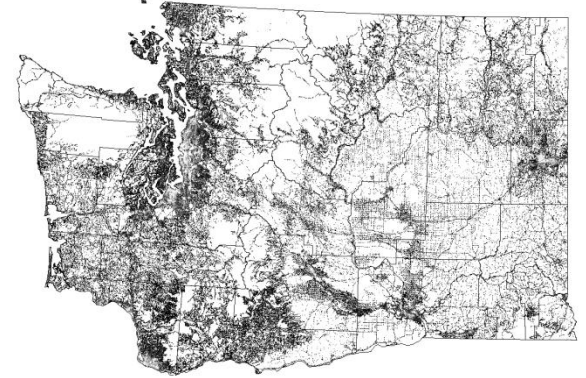
Forest Canopy



Elevation

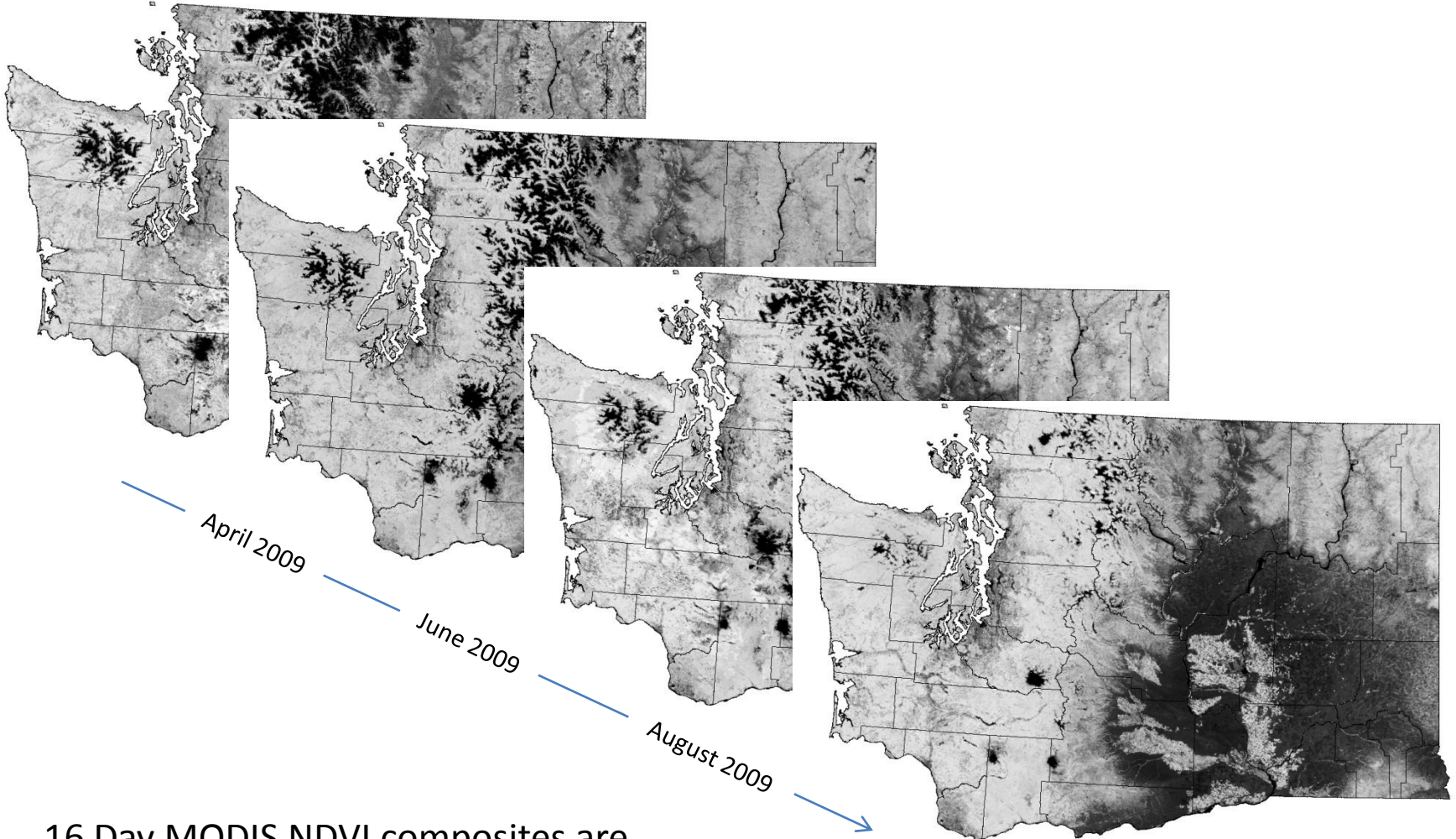


Impervious Surfaces



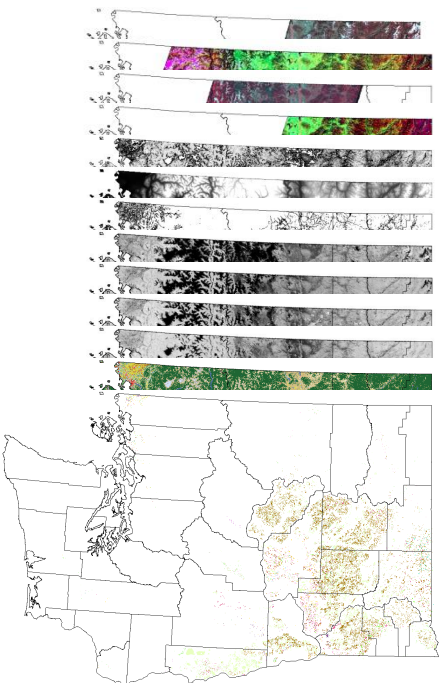
Ancillary datasets help separate the agricultural landscape;  
determining agricultural potential

# MODIS



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

# Processing a CDL



Satellite Imagery

Ancillary Data

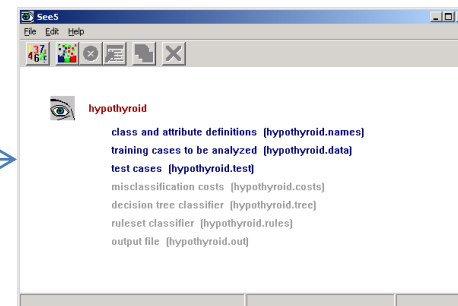
MODIS Data

Ground Truth

## Sampling



See5

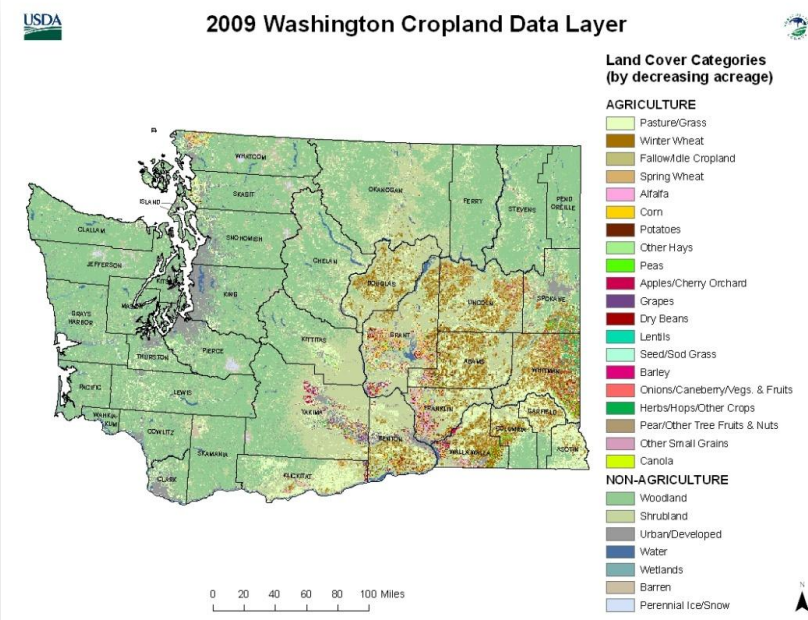


## Decision Tree

```

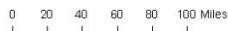
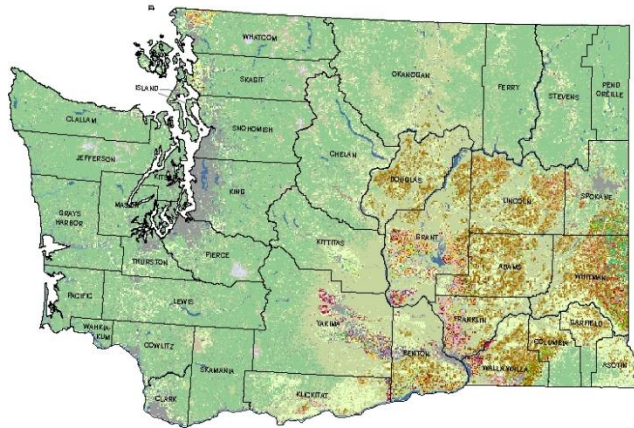
node46 > 01:
  --band146 <= 171:
    ...band146 <= 481:
      ...band146 <= 761:
        ...band146 > 561 123 (1224/184)
        band146 <= 56:
          ...band09 <= 701 123 (7/1)
          band09 <= 701:
            ...band146 <= 50:
              ...band142 > 4181:
                ...band140 <= 591 122 (102/10)
                band140 <= 591 123 (6)
                band142 <= 4181:
                  ...band146 > 481 123 (91/40)
                  band146 <= 491:
                    ...band18 <= 416: 122 (68/12)
                    band18 <= 416: 123 (8/1)
              ...band16 <= 109:
                ...band11 <= 340: 123 (182/156)
                band11 <= 340: 122 (24/8)
                ...band14 <= 187: 1 (2/1)
                band14 <= 187:
                  ...band16 <= 233: 123 (6/2)
                  band16 > 233: 122 (21/9)
            band146 <= 76:
              ...band14 <= 121 123 (4)
              band14 <= 121:
                ...band14 <= 831:
                  ...band20 <= 591 124 (318/133)
                  band20 <= 591: 123 (17/2)
                  band14 <= 81:
                    ...band1 <= 129: 124 (148/1)
                    band1 <= 129:
                      ...band27 > 307:
                        ...band14 <= 4761 124 (22/3)
                        band14 <= 4761: 123 (4)
                      band27 <= 307:
                        ...band14 <= 881:
                          ...band10 <= 122: 124 (148/24)
                          band10 <= 122: 123 (2)
                          band14 <= 881:
                            ...band12 <= 404: 124 (208/1)
                            band12 <= 404:
                              ...band09 <= 181: 123 (1)
                              band09 <= 181: 123 (1)
            band146 <= 481:
              ...band14 <= 581:
                ...band11 <= 92: 121 (4/2)
                band11 <= 92:
                  ...band21 <= 134: 122 (8/2)
                  band21 <= 134:
                    ...band08 <= 661 123 (10/12)
                    band08 <= 661: 122 (0/1)
                    band11 <= 91:
                      ...band14 <= 191: 122 (332/176)
                      band14 <= 191:
                        ...band14 <= 149:
                          ...band14 <= 44: 122 (1045/149)
                          band14 <= 44:
                            ...band116 > 89: 123 (10/2)
                            band116 <= 89:
  
```

## Classification



## 2009 Washington Cropland Data Layer

## 2009 North Dakota Cropland Data Layer



### Land Cover Categories (by decreasing acreage)

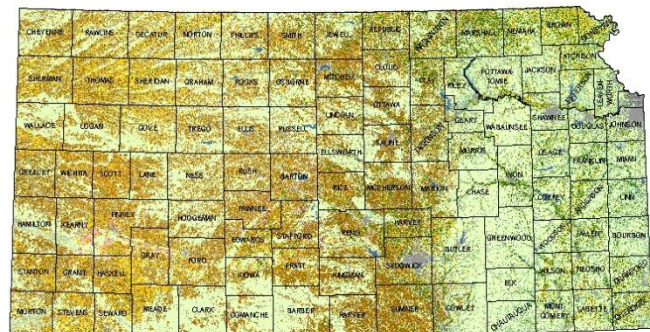
#### AGRICULTURE

- Pasture/Grass
  - Winter Wheat
  - Fallow/Idle Cropland
  - Spring Wheat
  - Alfalfa
  - Corn
  - Potatoes
  - Other Hays
  - Apples/Cherry Orchard
  - Grapes
  - Dry Beans
  - Lentils
  - Seed/Sod Grass
  - Barley
  - Onions/Caneberry/Veags. & 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



## 2009 Kansas Cropland Data Layer

## 2009 Arkansas Cropland Data Layer



### Land Cover Categories (by decreasing acreage)

#### AGRICULTURE

- Pasture/Grass
  - Winter Wheat
  - Corn
  - Fallow/Idle Cropland
  - Soybeans
  - Sorghum
  - Alfalfa
  - W. Wht./Soy. Dbl. Crop
  - Sunflowers
  - Rye
  - Cotton
  - Other Crops/Veags./Tree Nuts
  - Other Small Grains
  - Oats
- #### NON-AGRICULTURE
- Urban/Developed
  - Woodland
  - Water
  - Wetlands
  - Shrubland
  - Barren



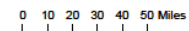
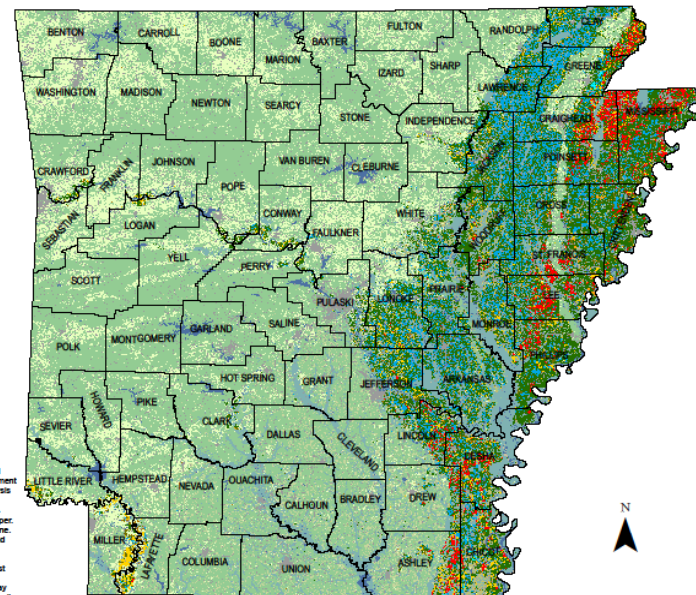
### Land Cover Categories (by decreasing acreage)

#### AGRICULTURE

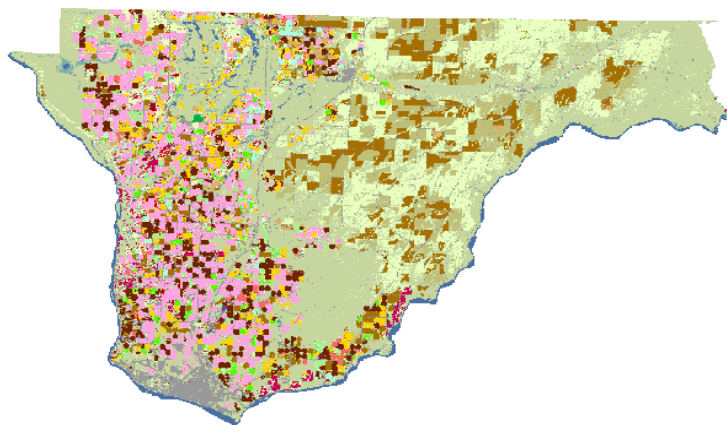
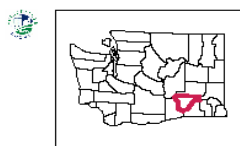
- Pasture/Grass
  - Soybeans
  - Rice
  - Cotton
  - Fallow/Idle Cropland
  - Corn
  - W. Wht./Soy. Dbl. Crop
  - Winter Wheat
  - Sorghum
  - Aquaculture
  - Other Crops/Veags. & Fruits
  - Other Tree Nuts
- #### NON-AGRICULTURE
- Woodland
  - Wetlands
  - Urban/Developed
  - Shrubland
  - Water
  - Barren

Produced by: U. S. Department of Agriculture, National Agricultural Statistics Service, Research and Development Division, Geospatial Information Branch, Spatial Analysis Research Section.  
 Data Source: Resourcesat-1 AMPS courtesy of USDA Foreign Agricultural Service, Landsat 5 Thematic Mapper; Image Processing, Ruleset2 Seeds and ERDAS Imagine; Ground Truth: The Farm Service Agency Common Land Unit for crop classes, and 2001 National Land Cover Dataset (NLCD) for non-agricultural classes.  
 Ancillary Data: NLCD Impervious Surface, NLCD Forest Canopy, National Elevation Dataset, and Moderate Resolution Imagery Spectroradiometer (MODIS) 16 day Normalized Difference Vegetation Index (NDVI) composite.  
 Projection: UTM zone 15, WGS84 datum.  
 Map Production: ESRI ArcGIS 9.3.1.

## 2009 Arkansas Cropland Data Layer



USDA 2009 Franklin County, Washington



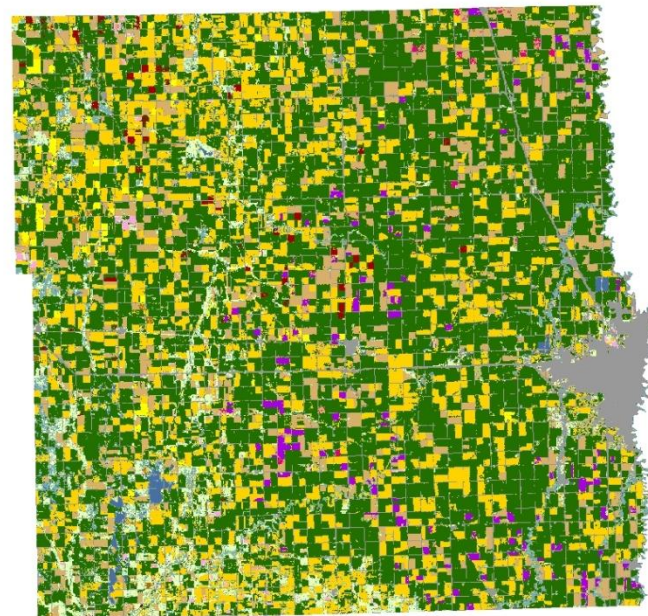
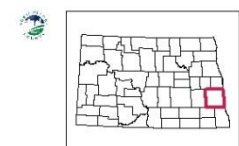
Land Cover Categories

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/Veigs. & 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



USDA 2009 Cass County, North Dakota



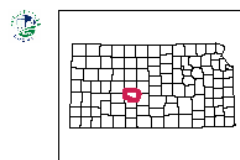
Land Cover Categories

AGRICULTURE

- Pasture/Grass
  - Spring Wheat
  - Soybeans
  - Other Hays
  - Corn
  - Durum Wheat
  - Canola
  - Sunflowers
  - Dry Beans
  - Barley
  - Winter Wheat
  - Peas
  - Alfalfa
  - Fallow/Idle Cropland
  - Flaxseed
  - Sugarbeets
  - Lentils
  - Oats
  - Potatoes
  - Other Crops/Veigs./Fruits
  - Millet
  - Saltwater
  - Sorghum
  - Rye
  - Seed/Sod Grass
- NON-AGRICULTURE**
- Wetlands
  - Water
  - Woodland
  - Shrubland
  - Barren



USDA 2009 Pawnee County, Kansas



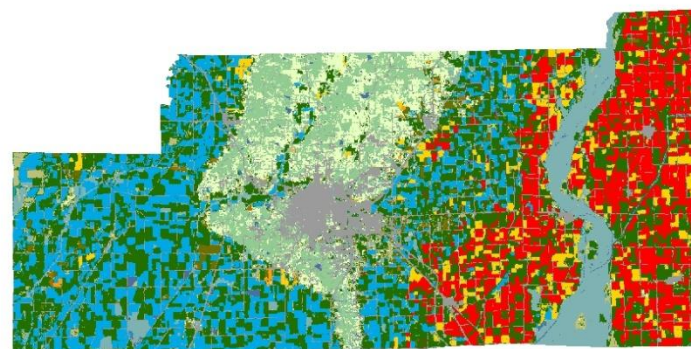
Land Cover Categories

AGRICULTURE

- Pasture/Grass
  - Winter Wheat
  - Corn
  - Fallow/Idle Cropland
  - Soybeans
  - Sorghum
  - Alfalfa
  - W. Wht./Soy. Dbl. Crop
  - Sunflowers
  - Rye
  - Cotton
  - Other Crops/Veigs./Tree Nuts
  - Other Small Grains
  - Oats
- NON-AGRICULTURE**
- Urban/Developed
  - Woodland
  - Water
  - Wetlands
  - Shrubland
  - Barren



USDA 2009 Craighead County, Arkansas



Land Cover Categories

AGRICULTURE

- Pasture/Grass
  - Soybeans
  - Rice
  - Cotton
  - Fallow/Idle Cropland
  - Corn
  - W. Wht./Soy. Dbl. Crop
  - Winter Wheat
  - Sorghum
  - Aquaculture
  - Other Crops/Veigs. & Fruits
  - Other Tree Nuts
- NON-AGRICULTURE**
- Woodland
  - Wetlands
  - Urban/Developed
  - Shrubland
  - Water
  - Barren



# Validating CDLs

We measure the accuracy of each CDL

## Compare

Classified pixels from CDL

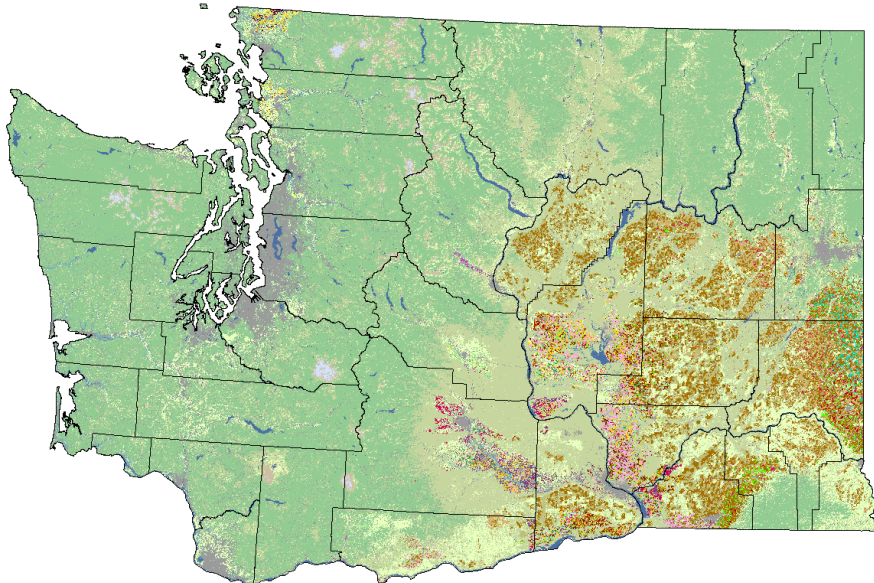
Known pixels, not used for classifying imagery, from FSA

## Track

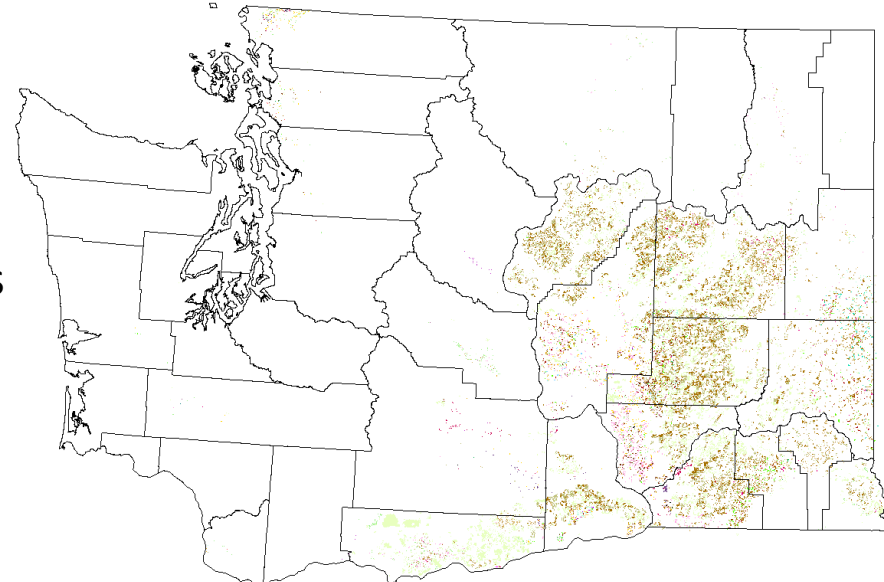
Producer Accuracy & Errors of Omission - % of pixels from category missing

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

Cropland Data Layer



Groundtruth – ½ saved for validation



versus

# Accuracy Assessments

## STATEWIDE AGRICULTURAL ACCURACY REPORT

Crop-specific covers only \*Correct Accuracy Error Kappa

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

Cover Type	Attribute Code	*Correct Pixels	Producer's Accuracy	Omission Error	Kappa	User's Accuracy	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. Vegs. & 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

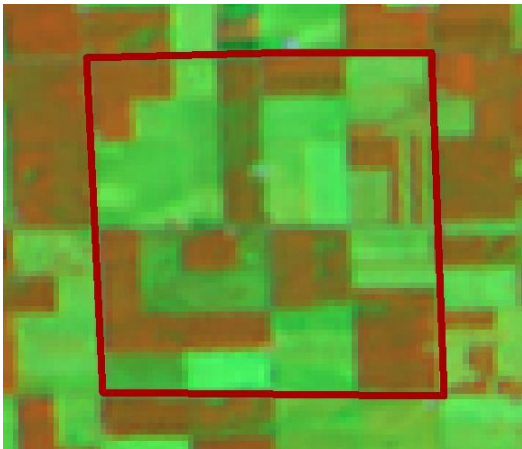
\*Correct Pixels represents the total number of independent validation pixels correctly identified in the error matrix.

# 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

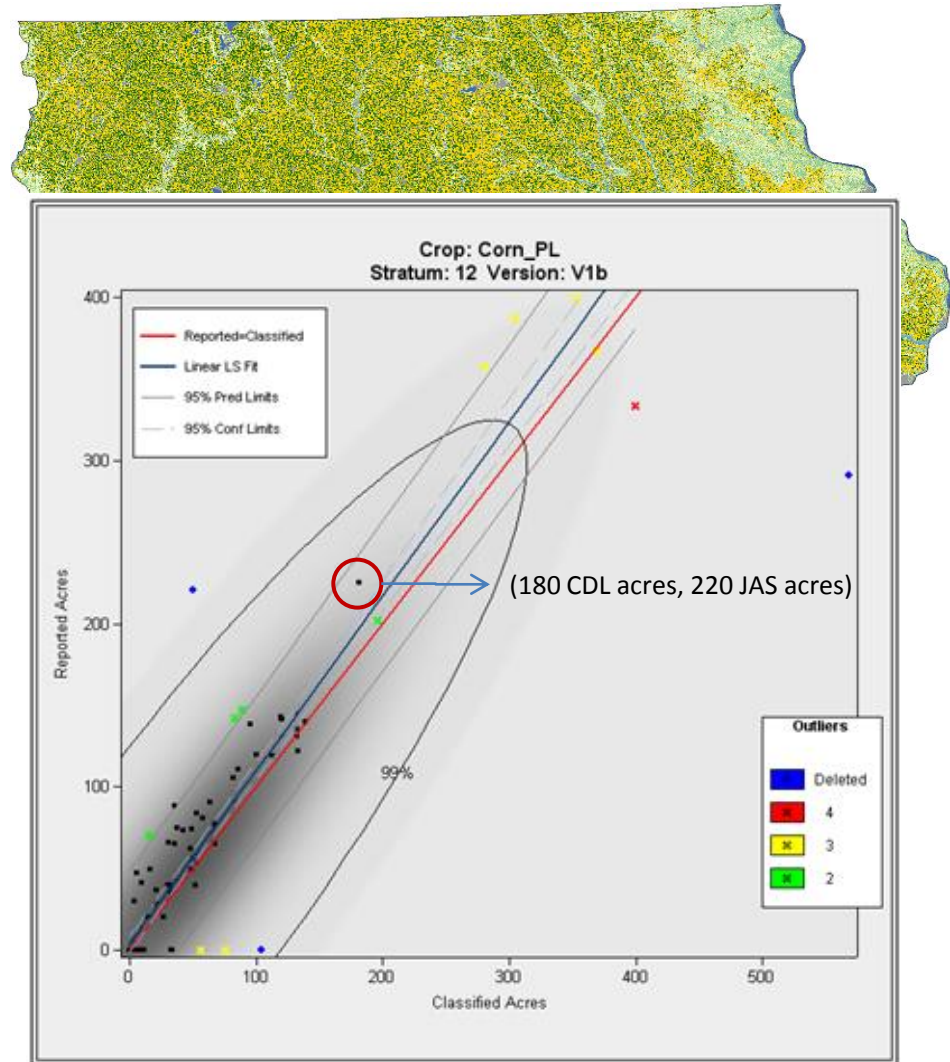
## Simple Linear Regression

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

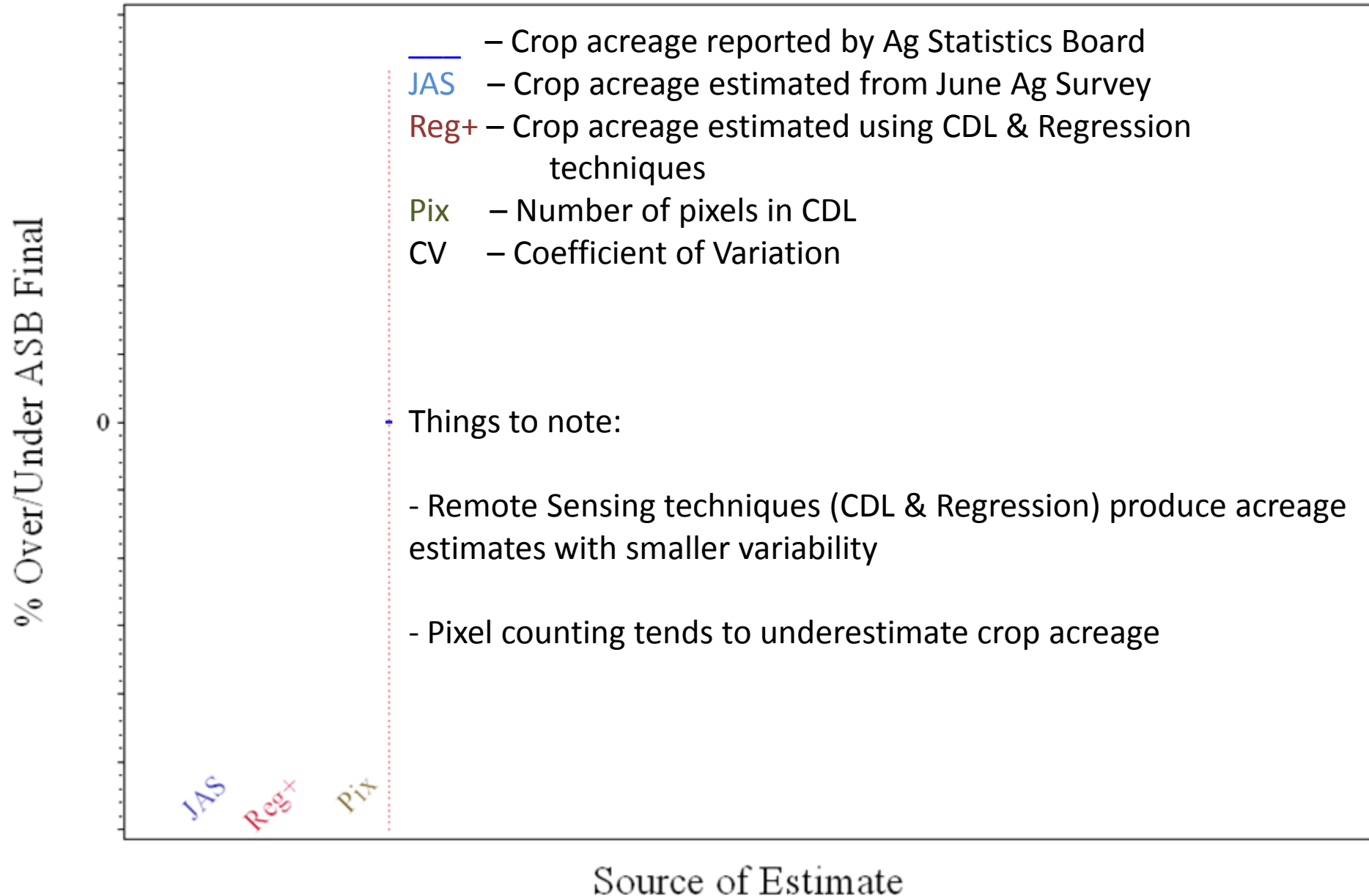
Using regression results in estimates reduces error rates over using JAS alone

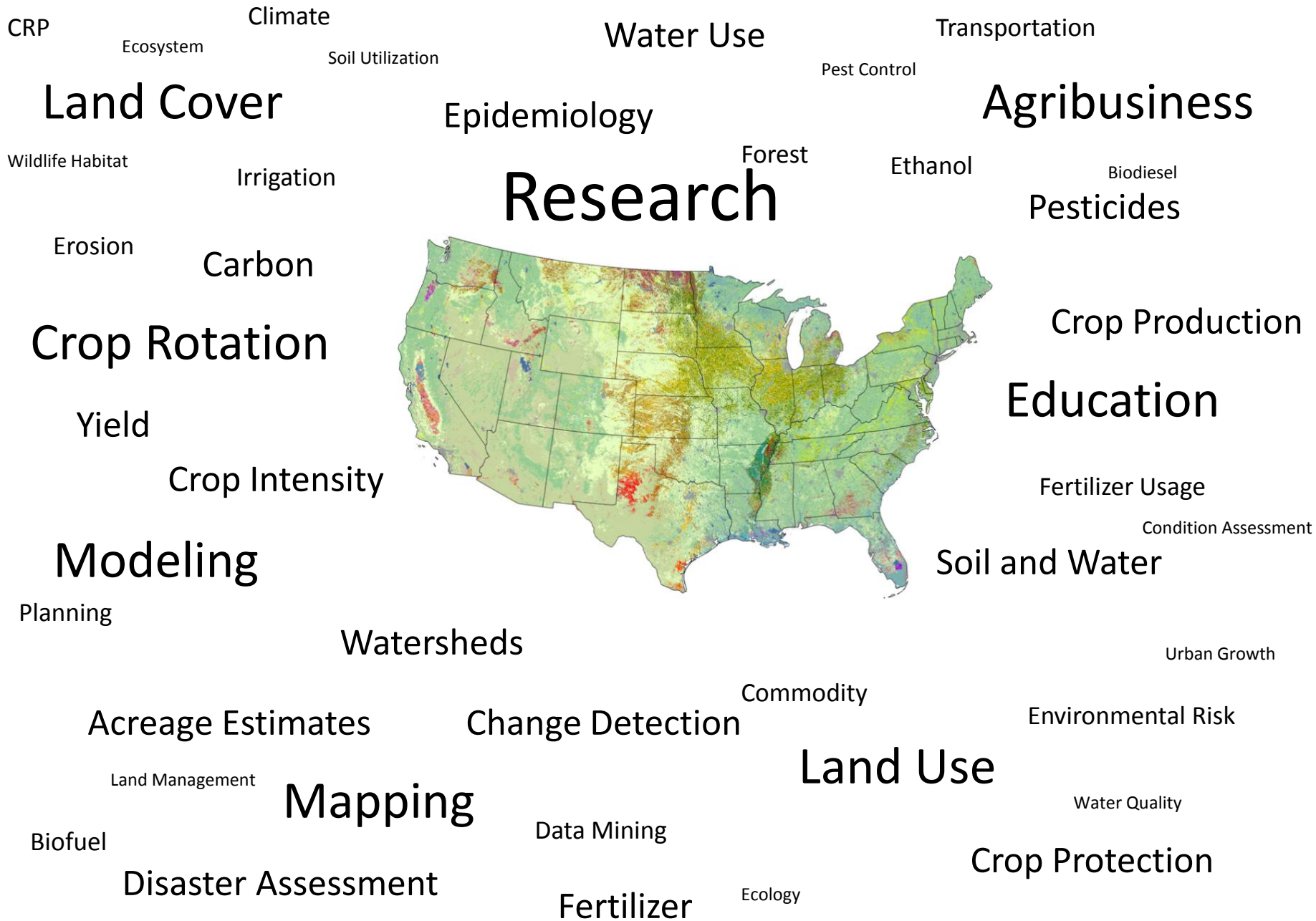


# 2008 State Level Estimates +/- 2 CVs

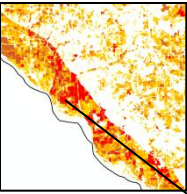
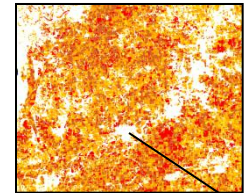
Corn

Soybeans

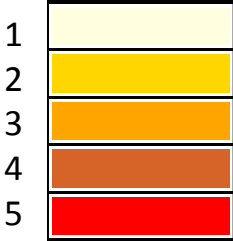




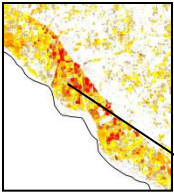
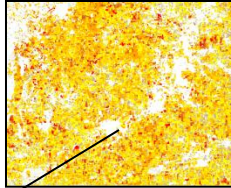
# Corn Planting Intensity 5 years vs. 9 years Illinois



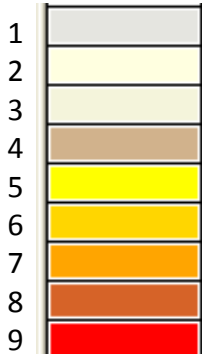
Years  
Planted  
to Corn



2003-2007



Years  
Planted  
to Corn

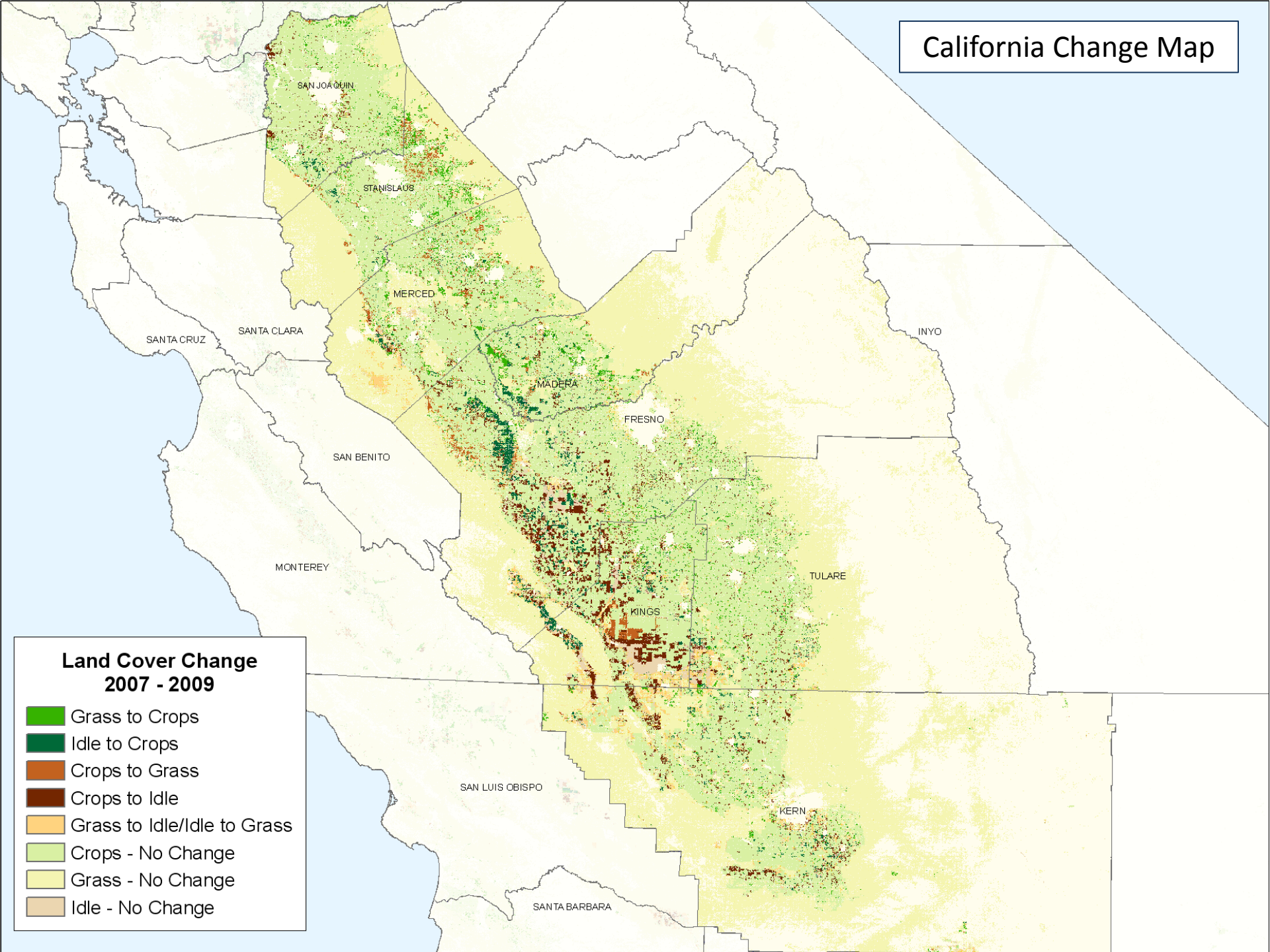


1999-2007

# 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.nrcs.usda.gov/research/Cropland/SARS1a.htm) &  
<http://www.nass.usda.gov/research/Cropland/SARS1a.htm>

