# 2015 KANSAS LAND COVER PATTERNS PHASE II - FINAL REPORT

Kansas Applied Remote Sensing Program Kansas Biological Survey University of Kansas Lawrence, Kansas 66047

**December 28, 2018** 

**Report Prepared by:** 

Dana L. Peterson

## **Credits**

The 2015 Kansas Land Cover Patterns map was created at the Kansas Applied Remote Sensing Program of the Kansas Biological Survey.

**Funding Sources:** Funding Sources: The land cover mapping project was co-funded by the Kansas GIS Policy Board with funds from the Kansas Water Plan that are administered by the Kansas Water Office under the grant titled "Kansas Land Cover Mapping Initiative: A 10-Year Update" and the Kansas Department of Wildlife, Parks and Tourism under the granted titled "Geographic Information System (GIS) and Remote Sensing Support Services".

### **Principal Investigators:**

Edward A. Martinko, Mike Houts, Stephen L. Egbert and Dana Peterson

#### **Principal Project Personnel:**

Dana L. Peterson, John M. Lomas, and Chris Bishop

#### **Recommended Citation:**

Peterson, D.L., S.E. Egbert. 2018. 2015 Kansas Land Cover Patterns Phase II: Final Report. Kansas Biological Survey, University of Kansas, 19pp.







## **Executive Summary**

The 2015 Kansas Land Cover Patterns III map represents an update of the 2005 Kansas Land Cover Patterns map. The update, designed to be explicitly comparable to the 1990 and 2005 Kansas Land Cover Patterns maps, uses the similar source data (Landsat and MODIS), classification scheme (Modified Level III), classification approach (supervised classification), and spatial resolution (minimum mapping unit (MMU)). Using a similar methodology to produce the 2015 Kansas Land Cover Patterns map allows end-users to identify and examine changes in the Kansas landscape.

The Modified Level III map was produced from multi-seasonal Landsat 8 and MODIS NDVI imagery acquired during the 2014 and 2015 growing seasons. The map contains seventeen land use/land cover classes and has a positional accuracy and spatial resolution appropriate for producing 1:50,000 scale maps. The MMU varies by land cover class and ranges between 0.22 to 5.12 acres.

The 2015 Kansas Land Cover Patterns map represents PhaseII of a two-phase mapping initiative occurring over a three-year period. During Phase 2, subclasses were mapped to produce a Modified Level III map of Kansas using a combination of 250-meter resolution time-series MODIS NDVI imagery, Landsat imagery and the 2015 Cropland Data Layer.

Digital versions of the map, metadata, and accuracy assessment can be accessed from the Data Access and Support Center (DASC) website of the Kansas Geological Survey (<a href="http://www.kansasgis.org/">http://www.kansasgis.org/</a>).

### Introduction

The Next-Generation Statewide Land Cover Mapping Initiative was co-funded by the Kansas State GIS Policy Board and Kansas Department of Wildlife, Parks and Tourism. Work on the mapping initiative was split into two phases. The work and products described in this report correspond to Phase I of the land cover mapping initiative.

The modified Anderson Level III (Anderson *et al.*, 1976) land cover map developed in Phase II was generated to make land cover data comparable to previous land cover maps created by the Kansas Applied Remote Sensing Program of the Kansas Biological Survey. The four other statewide land cover maps were (1) Kansas Land-Use Patterns: Summer 1973 (non-digital, hard copy only) (KARS, 1973), (2) the 1990 Kansas Land Cover Patterns map (KARS, 1997; Whistler *et al.*, 1996), (3) the 1992 Kansas Vegetation Map created for the Gap Analysis Program (Egbert *et al.*, 2001; KARS, 2002), and (4) the 2005 Kansas Land Cover Patterns map (KARS, 2009).

## Methods

The land cover map contains ten land use/land cover (LULC) classes and was designed to be explicitly comparable to the 1990 and 2005 Kansas Land Cover Patterns database. A three-stage generalization technique was used to refine the map classes to their specified minimum mapping units. A formal accuracy assessment was conducted using both existing databases and high-resolution digital aerial photography (using manual photo interpretation techniques) as ground reference data.

## **Mapping Standards and Data Sources**

Table 1 summarizes the mapping standards used and data products developed for this land cover mapping initiative. The primary data source for map development was the 2015 Cropland Data Layer. The land cover map has thematic detail based on an Anderson Modified Level I classification scheme and a minimum mapping unit that varies by class type. The goal for overall map accuracy was 85% or greater. The map is distributed as a statewide digital database as Erdas Imagine file format (.img).

Table 1. Mapping standards, data sources and products for the 2015 Kansas Land Cover Patterns map.

Item	Standard or Product			
Primary Data Source	Landsat Thematic Mapper (30m resolution)			
Thematic Detail	Anderson Modified Level III; 17 classes total			
Minimum Mapping Unit	Varies by LULC class (0.2224 to 5.115 acres)			
(MMU)				
Spatial Reference	Albers Conic Equal-Area (A Kansas Projection Standard)			
	Spheroid GRS 1980			
	Datum NAD83			
	Latitude of 1 <sup>st</sup> standard parallel: 29:50:00 N			
	Latitude of 2 <sup>nd</sup> standard parallel: 45:50:00 N			
	Longitude of central meridian: 96:00:00 W *			
	Latitude of origin of projection: 23:00:00 N *			
	* National projection parameters			
Spatial Accuracy	15 meters (0.5 pixels)			
Thematic Accuracy	As determined through accuracy assessment; goal 85% or			
	greater			
Tiling Scheme	Statewide database			
Format	Erdas Imagine Raster			
Product	Digital land cover database			

## Data Sources:

The data sources in Table 2 were used to generate the 2015 KLCP.

Table 2. Ancillary data sets used to create the 2015 statewide land cover map.

Data Set	Source	Purpose
2015 Cropland Data Layer	USDA NASS	General Classification Scheme
2005 KLCP	KBS/KARS	Classification QAQC and
		modifications.
2015 FSA National Agriculture Imagery	USDA	Create Urban Mask,
Program (NAIP)		Classification QAQC, and
		Accuracy Assessment
2015 Common Land Unit (CLU)	USDA/NRCS	Training Data and Accuracy
Database		Assessment
Field-Level Boundaries	KARS/NASS	Generalization
Kansas State Highway System	KDOT	Generalization
Kansas Public Land Survey System	KGS	Accuracy Assessment
(PLSS)		
Kansas GAP Vegetation Database	KBS/KARS	Accuracy Assessment

## Thematic Detail:

The classification scheme was designed to be explicitly comparable to the 1990 and 2005 Kansas Land Cover Patterns database (Table 3).

LULC Class Code and Name	Level II	Level III
10, Urban	11, Urban Commercial/Industrial	110, Urban Commercial/Industrial
	12, Urban Residential	120, Urban Residential
	13, Urban Openland	130, Urban Openland
	14, Urban Woodland	140, Urban Woodland
	15, Urban Water	150, Urban Water
20, Cropland	21, Summer Crop	211, Corn
		212, Soybeans
		213, Sorghum
	22, Spring Crop	221, Winter Wheat

	23, Alfalfa	231, Alfalfa
	24, Fallow	240, Fallow
	25, Double-Crop	250, Double-Crop
30, Grassland	32, Warm-Season Grassland	320, Warm-Season Grassland
	33, Cool-Season Grassland	330, Cool-Season Grassland
40, Woodland	40, Woodland	400, Woodland
50, Water	50, Water	500, Water
60, Other	60, Other	600, Other

### The seventeen mapped classes are defined as:

- (110) Commercial/Industrial commercial/industrial land consists of areas of intensive use with much of the land covered by structures or other hard surfaces. These areas are used predominantly for the manufacture and sale of products and/or services. This category includes the central business districts of cities, towns, and villages; suburban shopping centers and strip developments; educational, governmental, religious, health, correctional and institutional facilities; industrial and commercial complexes; and communications, power, and transportation facilities. The main buildings, secondary structures, and areas supporting the basic use are all included office buildings, warehouses, driveways, parking lots, landscaped areas, streets, etc. Highways or interstate systems running through the core of urban areas are also included in this class.
- (120) Residential residential land consists of areas of medium density housing characterized by a more or less even distribution of vegetative cover and houses/garages, to high density housing characterized by multi-unit structures such as apartment complexes. Linear residential developments along transportation routes extending outward from urban areas are included. Rural subdivisions not directly connected to the core of an urbanized area are also included. The main buildings, secondary structures, and immediate surrounding landscape are all included (i.e., houses, apartment complexes, streets, garages, driveways, parking areas, lawns, trees, etc.).
- (130) Urban-Openland urban-openland consists primarily of areas of open grassland, sometimes mixed with trees, with uses such as golf courses, zoos, urban parks, cemeteries, and undeveloped land within an urban setting. Low density rural residential areas may also be included in this category. This category also includes tracts of land that have been zoned residntial or commercial, but have yet to be developed.

- (140) Urban-Woodland urban-woodland consists of wooded tracts within a town or city. These wooded tracts maybe associated with golf courses, zoos, urban parks, and other undeveloped land.
- (150) Urban-Water urban-water consists of any open surface water within a town or city. This includes ponds, lakes, sewage settling ponds, etc.
- (211) Corn land used for the production of corn.
- (212) Soybeans land used for the production of soybeans.
- (213) Sorghum land used for the production of sorghum.
- (221) Winter Wheat land used for the production of winter wheat.
- (231) Alfalfa land used for the production of alfalfa.
- (240) Fallow land used for the production of crops that are idle for no more than 2 years. Typically these areas are bare soil or stubble, or have a low percentage of vegetative cover, either voluntary crop plants or pioneer herbaceous species.
- (250) Double-Crop land used for the production of two or more crops during one growing season. Typical double-cropping in Kansas consists of planting and harvesting Winter Wheat followed by Soybeans during the same growing season.
- (320) Warm-Season Grassland this class includes native prairies (i.e. tallgrass, mixed-grass, and shortgrass prairie) that are dominated by warm-season grasses and areas planted to warm-season dominated grasslands (e.g. mitigation areas). This class includes warm-season grasslands used for pasture (hayed land) and rangeland or Conservation Reserve Program (CRP) land.
- (330) Cool-Season Grassland this class includes grasslands dominated by introduced or non-native cool season grassland species, primarily smooth brome and tall fescue. This class includes cool-season grasslands used for pasture (hayed land) and rangeland.
- (400) Woodland this class includes any wooded areas having a canopy closure of 50% and greater.
- (500) Water this class consists of all open water bodies, including reservoirs, lakes, ponds, rivers and streams. Ephemeral streams may not be represented.
- (600) Other the "other" class is used to identify land cover / land use classes not previously defined. In general, this class is used for exposed, bare ground other than cropland. Examples include rock quarries, sand and gravel pits, sandbars, and built-up areas less than 40 acres.

Table 4. Minimum mapping units by LULC class.

LULC Class	Landsat Pixels	Acres
Urban Commercial/Industrial	15	3.11
Urban Residential	15	3.11
Urban Openland	15	3.11
Urban Woodland	3	0.67
Urban Water	1	0.22
Cropland	23	5.12
Grassland	23	5.12
Rural Woodland	3	0.67
Rural Water	1	0.22
Other	15	3.11

## Generalization Procedures

#### Introduction

Thematic generalization of the land cover was performed to align thematic classes to match the 1990 and 2005 classification schemes. Cartographic generalization of the land use/land cover data was performed to eliminate "noise" in the classification and simplify the map. Noise is comprised of either extraneous misclassified pixels or small clumps of pixels that are insignificant at the suggested mapping scale of the map (1:50,000) (Figure 1a). Noise tends to create visual confusion and obscure overall patterns. Before designing and running the generalization procedures, the minimum mapping unit (MMU) was chosen for each land use/land cover class. The MMU size, or smallest number of contiguous pixels, chosen for a particular class was based on the following factors:

- 1) Is the class reliably detected by the classification?
- 2) Is the class accurately represented?
- 3) What level of thematic detail (i.e., how small an area) should be preserved at the suggested mapping scale?
- 4) MMUs that would be comparable to the 1990 and 2005 Kansas Land Cover Patterns databases.

Taking these factors into account, the MMU for each land use/land cover class was established. MMUs are listed in Table 4 (above).

#### **Overview of the Generalization Procedure**

Generalization was accomplished in two stages. In the first stage, conventional automated generalization procedures were used to simplify the manually cleaned classification by removing misclassified or spatially insignificant clumps of pixels (Figure 1b). During this stage, the objective was to achieve the MMU standard for the individual classes. In the secondthird stage, the field-level database was used to fit the Cropland and Grassland classes from the mosaic into fields delineated in the field-level database (Figure 1c). The objective was to utilize the spatial precision of field boundaries provided by combining multi-years of CLU data and manual splits of fields to better depict the spatial extent of Cropland and Grassland.

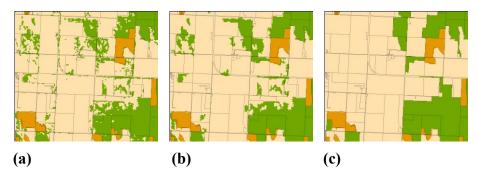


Figure 1. An example of a map (a) prior to generalization, (b) following generalization using traditional techniques and (c) following generalization using CLU data.

#### Stage I Generalization – Manual Cleanup of Woods and Water

Manual cleanup was performed using ArcGIS. The procedure was initiated by displaying the map and corresponding 2015 NAIP imagery and the 2005 KLCP map. The 2015 map was then examined by an analyst who looked for classification errors. For the woodland and water map components, the analyst focused on eliminating errors of commission and delineating areas of omission that were correctly mapped in the 2005 map. When errors were found, the analyst would digitize the misclassified pixels and assign an attribute to indicate if it was an error of omission or commission. Upon investigation, the CDL had a high omission error. Digitizing all existing omission of water would be extremely time-consuming, therefore omitted water that was classified in the 2005 KLCP was added to the 2015 water class. The digitized locations of omission and commission were used in model builder to reassign pixels accordingly.

#### Stage II Generalization – Eliminating Small Clusters of Pixels

Generalization – Water

There was no generalization of the water class.

#### Generalization – Woodland

The generalization of the woodland class was accomplished using two functions in ERDAS Imagine 2015. The first step utilized the CLUMP function to identify all contiguous pixels (i.e., clumps) of woodlands using the eight connected neighbors rule. The second step used the ELIMINATE function to remove clumps with less than three pixels.

#### Generalization – Urban Classes

The generalization of the Urban classes Industrial/Commercial, Residential, and Openland was accomplished using two functions in ERDAS Imagine 2015. The first step utilized the CLUMP function to identify all contiguous pixels (i.e., clumps) of each class using the four connected neighbors rule. The second step used the ELIMINATE function to remove clumps with less than 15 pixels. Woods and water were added back and the EXPAND function in ArcGIS 10.4 was used to fill remaining Zero areas. This function fills the Zero area with surrounding class value(s) excluding Woodland and Water. This step is run iteratively until Zero areas are filled.

Recode any remaining Zero areas (e.g., areas embedded in Woodland, a class that was not allowed to expand in the previous step), as Woodland.

#### *Generalization – Cropland, Grassland, and Other Classes*

The generalization of the classes Cropland, Grassland, and Other was accomplished using a S functions and running under ArcGIS 10.4 and ERDAS Imagine.2015. The following outlines the generalization procedure for these classes.

- 1. Recode the Cropland around 4-lane highways to Grassland. Use a 45m buffer around the highway's centerline (90m total; 3 TM pixels wide) to delineate the recode area.
- 2. Use the CLUMP function to identify all contiguous areas of Grassland and Cropland.
- 3. Use the ELIMINATE function to remove clumps less than the MMU for Grassland, Cropland, and Other.
- 4. Add Water and Woodland to the Cropland/Grassland map.

## **Mosaic of Stage II Generalizations**

#### Stage III Generalization – Fitting to CLU Boundaries

To conduct the Stage III generalization, multi-year field-boundary dataset consisting of multiple years of CLU data and manual splits of fields were converted to a raster grid and used to create a field-level representation of rural land cover. Output raster cells were assigned the feature identifier (FID) of the shapefile during the conversion to a grid because the value was unique and thus could be used to identify unique zones. The following outlines the procedures for the Stage III generalization.

- 1. Create a Cropland/Grassland grid by recoding all values other than Cropland (20) and Grassland (30) on the Stage I generalization to NODATA.
- 2. For each Zone in the CLU grid, calculate the ZONALMAJORITY for the Cropland/Grassland grid.

- 3. Using the Stage I generalization grid, write all values other than Cropland and Grassland to a new output grid, recoding Cropland and Grassland areas to Zero (0)
- 4. Write the ZonalMajority values from Step 2 to the new grid, filling only Zero areas.

## Results

The end product for Phase I of the 2015 Kansas Land Cover mapping project is an updated digital Level III land cover map of Kansas (Figure 2). A summary of the land cover types, their area mapped in square meters, and the percent of the total area in Kansas represented by each type is presented in Table 5.

Table 5. Modified Anderson Level I land cover classes, their area mapped (acres and sq. km.), and the percent of the State's total area represented by each land cover class.

	LULC		Percent	Area ( sqmet)
LULC Class	Code	Pixel Count	Mapped	Mapped
Commercial/Industrial	110	682,595	0.29	151,805
Residential	120	1,928,812	0.81	428,957
Urban Openland	130	1,456,502	0.62	323,918
Urban Woodland	140	287,123	0.12	63,855
Urban Water	150	68,852	0.03	15,312
Corn	211	19,758,626	8.34	4,394,210
Soybean	212	14,369,788	6.07	3,195,762
Sorghum	213	12,977,941	5.48	2,886,223
Winter Wheat	221	44,488,130	18.79	9,893,915
Alfalfa	231	1,664,229	0.70	370,115
Fallow	240	13,170,046	5.56	2,928,946
Double-Crop	250	4,321,326	1.83	961,039
Warm-Season Grass	320	91,976,326	38.85	20,455,029
Cool-Season Grass	330	14,881,474	6.29	3,309,558
Woodland	400	12,253,521	5.18	2,725,116
Water	500	2,425,008	1.02	539,308
Other	600	64,845	0.03	14,421
Total		236,775,144	100.00	52,657,490

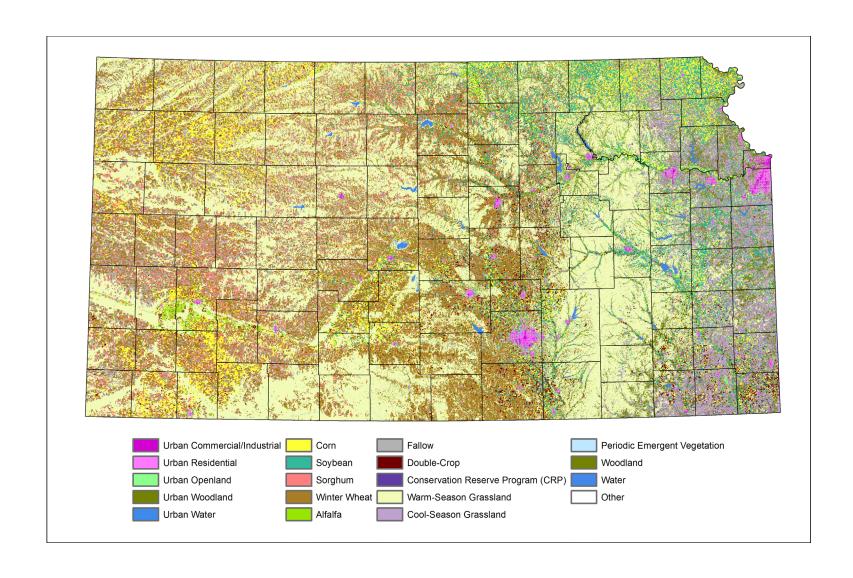


Figure 2. The 2015 Kansas Land Cover Patterns-Level III map developed using the Cropland Data Layer, Random Forest classifier of Landsat and MODIS data and ancillary data sources.

## Accuracy Assessment

Field campaigns for accuracy assessments can be costly and time-consuming endeavors. Rather than conducting an independent field campaign for the accuracy assessment, two existing databases were used to assess the accuracy of the 2015 land cover map. The 2015 Common Land Unit (CLU) dataset was used to assess the accuracy of mapped grassland and cropland and the Kansas GAP vegetation database was used to assess the accuracy of mapped woodlands. The Kansas GAP vegetation database is a digital database of sample sites used for training and validation of the Kansas Vegetation Map (Egbert *et al.*, 2001). Urban and water databases were unavailable, and therefore, manual photo interpretation of high-resolution digital aerial photography was used to assess the accuracy of these land cover classes.

### **Accuracy Assessment Results**

The overall accuracy level for the Level III map was 81% and KAPPA was equal to .80. User's and Producer's Accuracies for each Level of mapping are presented in the Table 6.

Table 6. User's and Producer's Accuracy levels by Level III land use/land cover class.

		Producer's	User's
Level III LULC Class Name	LULC Code	Accuracy	Accuracy
Corn	211	75.9%	80.8%
Soybean	212	79.6%	80.9%
Sorghum	213	71.7%	63.6%
Winter Wheat	221	77.5%	87.3%
Alfalfa	231	70.6%	36.9%
Fallow	241	79.8%	62.4%
Double-Crop	251	80.7%	61.2%
Warm-Season Grassland	320	92.4%	88.9%
Cool-Season Grassland	330	84.2%	89.3%

## Grassland Mapping:

Grassland accuracy levels are reported by the processing unit, Landsat WRS2 path/row (e.g. 2732 or 2733) and combined. Accuracy levels by path/row was to determine priority rankings for the mosaic process.

2732	32	33	Total	User's
32	10	7	17	58.8%
33	31	221	252	87.7%
Total	41	228	269	Overall
Producer's	24.4%	96.9%		85.9%

2733	32	33	Total	User's
32	3054	328	3382	90.3%
33	629	3442	4071	84.5%
Total	3683	3770	7453	Overall
Producer's	82.9%	91.3%		87.2%

2734	32	33	Total	User's
32	4067	520	4587	88.7%
33	770	3609	4379	82.4%
Total	4837	4129	8966	Overall
Producer's	84.1%	87.4%		85.6%

2832	32	33	Total	User's
32	954	83	1037	92.0%
33	44	361	405	89.1%
Total	998	444	1442	Overall
Producer's	95.6%	81.3%		91.2%

2833	32	33	Total	User's
32	2504	145	2649	94.5%
33	85	344	429	80.2%
Total	2589	489	3078	Overall
Producer's	96.7%	70.3%		92.5%

2834	32	33	Total	User's	
32	3618	221	3839	94.2%	
33	17	186	203	91.6%	
Total	3635	407	4042	Overall	
Producer's	99.5%	45.7%		94.1%	

2634	32	33	Total	User's
32	115	36	151	76.2%
33	213	1468	1681	87.3%
Total	328	1504	1832	Overall
Producer's	35.1%	97.6%		86.4%

Total	32	33	Total	User's	
32	14322	1340	15662	91.4%	
33	1789	9631	11420	84.3%	
Total	16111	10971	27082	Overall	
Producer's	88.9%	87.8%		88.4%	

Table 8. Error matrix for the Level III 2015 Kansas Land Cover Patterns map. The error matrix is a cross-tabulation between the map and ground reference data and is used to calculate accuracy levels.

		nc		

LULC Name	LULC Cod	Corn	Soybean	Sorghum	Winter Wheat	Alfalfa	Fallow	Double	Warm-Season	Cool-Season	Row Total
		211	212	213	221	231	240	250	320	330	
Corn	211	7,494	1,035	193	458	27	65		4	2	9,278
Soybean	212	1,302	9,784	362	572	30	37		6	4	12,097
Sorghum	213	287	428	2,818	701	10	103	78	6		4,431
Sm Grains	221	333	407	260	12,070	67	233	443	9	2	13,824
Alfalfa	231	110	67	40	343	369	17	48	5		999
Fallow	241	131	42	104	806	4	1,833	10	6		2,936
Double	251	213	521	155	616	16	10	2,428	1	7	3,967
Warm-Season	320								12,966	1,625	14,591
Cool-Season	330	5	2		1			2	1,033	8,727	9,770
Column Total		9,875	12,286	3,932	15,567	523	2,298	3,009	14,036	10,367	71,893

# References

- Anderson, J., E. Hardy, J. Roach, and R. Witmer. 1976. A Land Use and Land Cover Classification System for Use with Remote Sensor Data, *Geological Survey Professional Paper # 964*, USGS, Washington, D.C.
- Cohen, J. 1960. A coefficient of agreement for nominal scales. *Educational and Psychological Measurement*, Vol. 20(1): 37-40.
- Congalton, R. G. and K. Green. 1999. Assessing the Accuracy of Remotely Sensed Data: Principles and Practices. Lewis Publishers: Boca Raton, Florida.
- Egbert, S.L., D.L. Peterson. A.M. Stewart, C.L. Lauver, C.F. Blodgett, K.P. Price, and E.A. Martinko. 2001. The Kansas GAP land cover map final report. *Kansas Biological Survey Report #99*, University of Kansas, Lawrence, Kansas.
- Jensen, J.R. 1996. *Introductory Digital Image Processing*. Prentice-Hall, Upper Saddle River, NJ.
- KARS (Kansas Applied Remote Sensing). 1973. *Kansas Land Use Patterns*. Lawrence, Kansas: Kansas Biological Survey, University of Kansas.
- KARS. 1997. *Kansas Land Cover Patterns*. Lawrence, Kansas: Kansas Biological Survey, University of Kansas.
- KARS. 2002. *Kansas Vegetation Map*. Lawrence, Kansas: Kansas Biological Survey, University of Kansas.
- Whistler, J., M.E. Jakubauskas, S.L. Egbert, E.A. Martinko, D.W. Baumgartner, and R. Lee. 1995. Kansas Land Cover Mapping Project: Regional Scale Land Use/Land Cover Mapping Using Landsat Thematic Mapper Data. *ACSM/ASPRS Annual Convention and Exposition Technical Papers*, Vol. 3, pp773-785.

# List of Acronyms and Abbreviations

CDL Cropland Data Layer CLU Common Land Unit

DASC Data Access and Support Center

DTC Decision Tree Classifier

FID Feature ID

FSA Farm Service Agency

KARS Kansas Applied Remote Sensing Program

KBS Kansas Biological Survey KGS Kansas Geological Survey

KDOT Kansas Department of Transportation

KDWPT Kansas Department of Wildlife, Parks and Tourism

LULC Land Use / Land Cover MMU Minimum Mapping Unit

MODIS Moderate Resolution Imaging Spectroradiometer

NAIP National Agriculture Imagery Program
NDVI Normalized Difference Vegetation Index
NRCS Natural Resources Conservation Service

PLSS Public Land Survey System

USDA US Department of Agriculture