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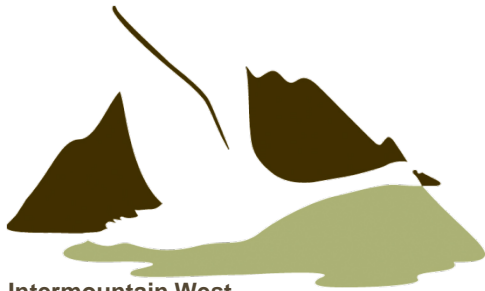
# ***Image segmentation for wetlands inventory: data considerations and concepts***



***Presented by :***

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Missoula, MT***





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## Wetland inventory needs:

- **Small spatial scales**
- **High precision**
- **High accuracy**
- **Dynamic ecological setting**





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## Traditional photo interpretation strategies:

### Modeling (Human)

- Field Observation
- Direct Recognition
- Interpretation by Inference
- Probabilistic Interpretation
- Stereo interpretation



Data inputs

Stereo CIR areal imagery





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## Image object strategies require:

### Modeling (computer)

- Segmentation modeling
- Machine learning



### Data inputs

- Multi spectral imagery
- High spatial resolution data
- Multi temporal scale
- Physiographic / structural characterization







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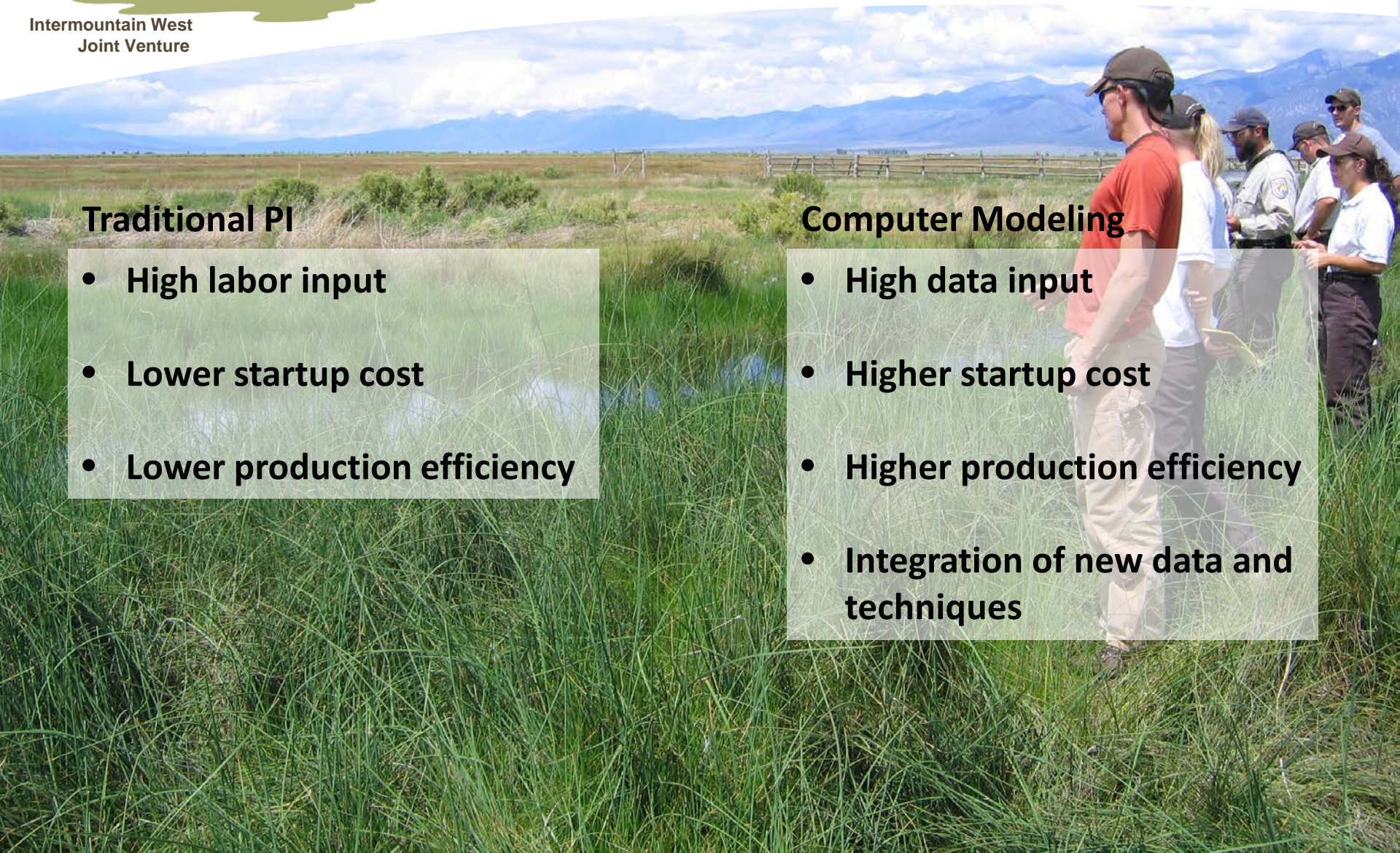
## Potential tradeoffs:

### Traditional PI

- High labor input
- Lower startup cost
- Lower production efficiency

### Computer Modeling

- High data input
- Higher startup cost
- Higher production efficiency
- Integration of new data and techniques







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## Investment considerations:

- **Workforce skills**
- **Labor capacity and cost**
- **Available capital**
- **Conservation needs**







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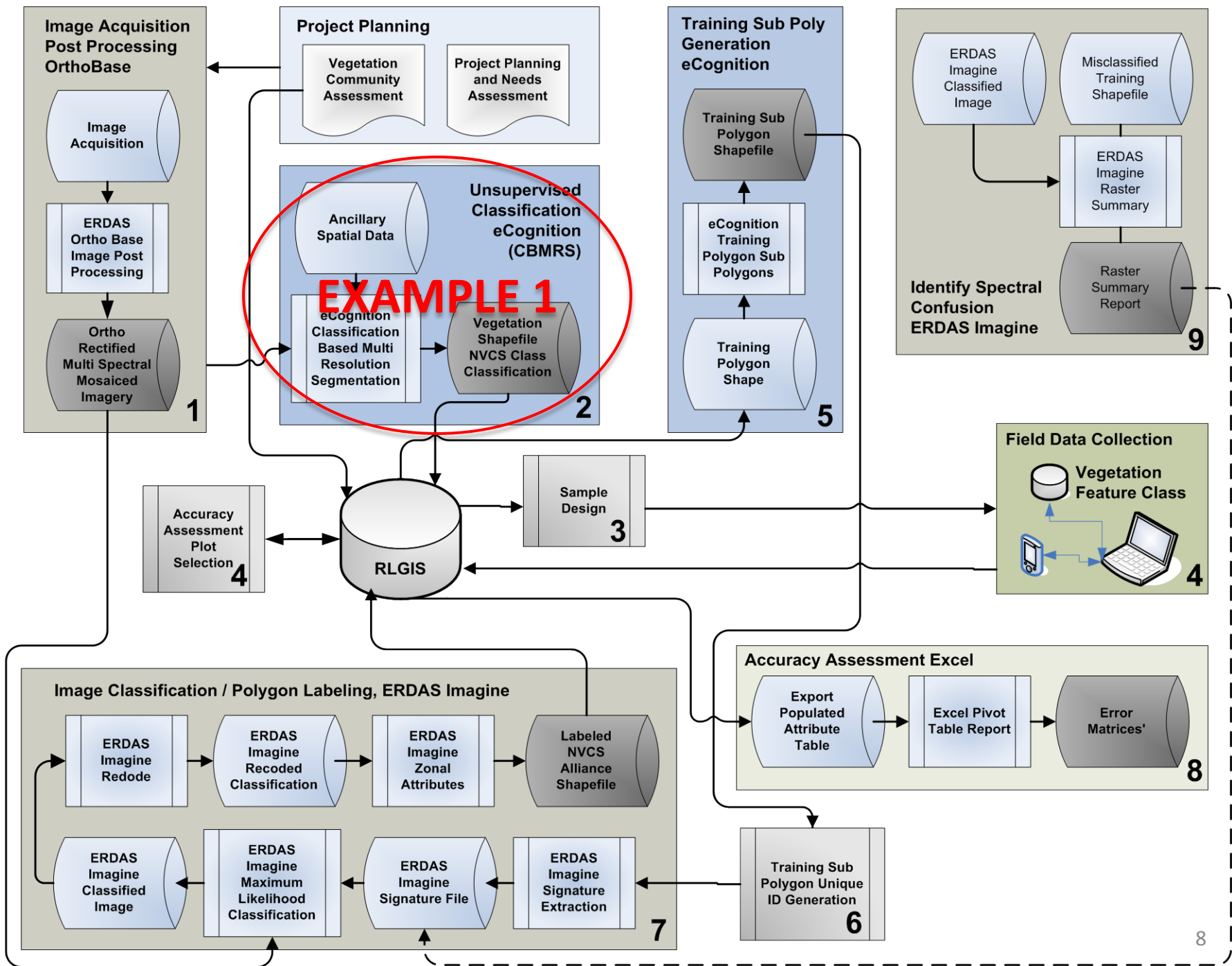
## Evaluate needs:

### Example 1.

Need to develop models that delineate wetland boundaries **to be interpreted and labeled using traditional photo interpretation**

### Example 2

Need to develop models that delineate wetland boundaries **and model (automate) wetland class labeling**















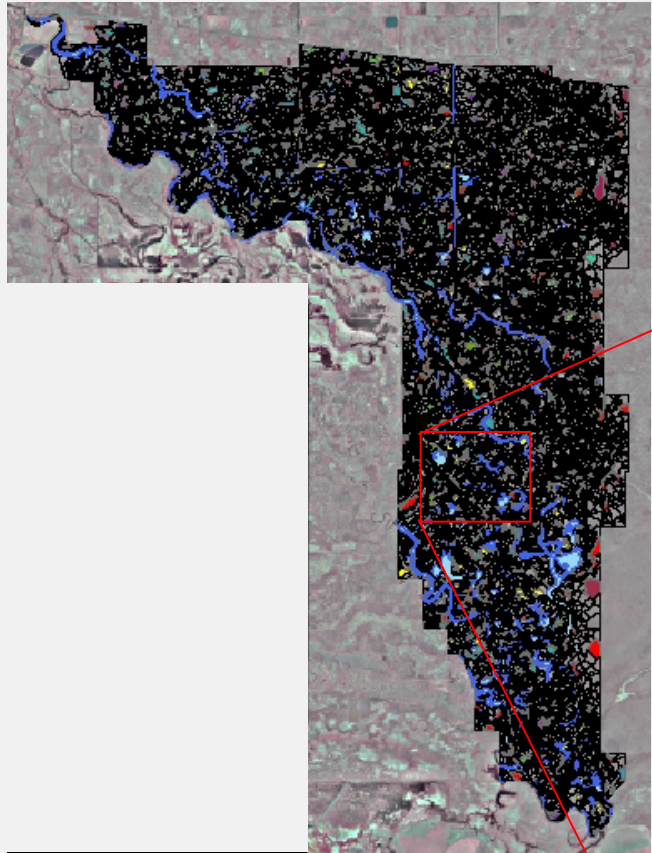
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## Object based (Segmentation) concept:

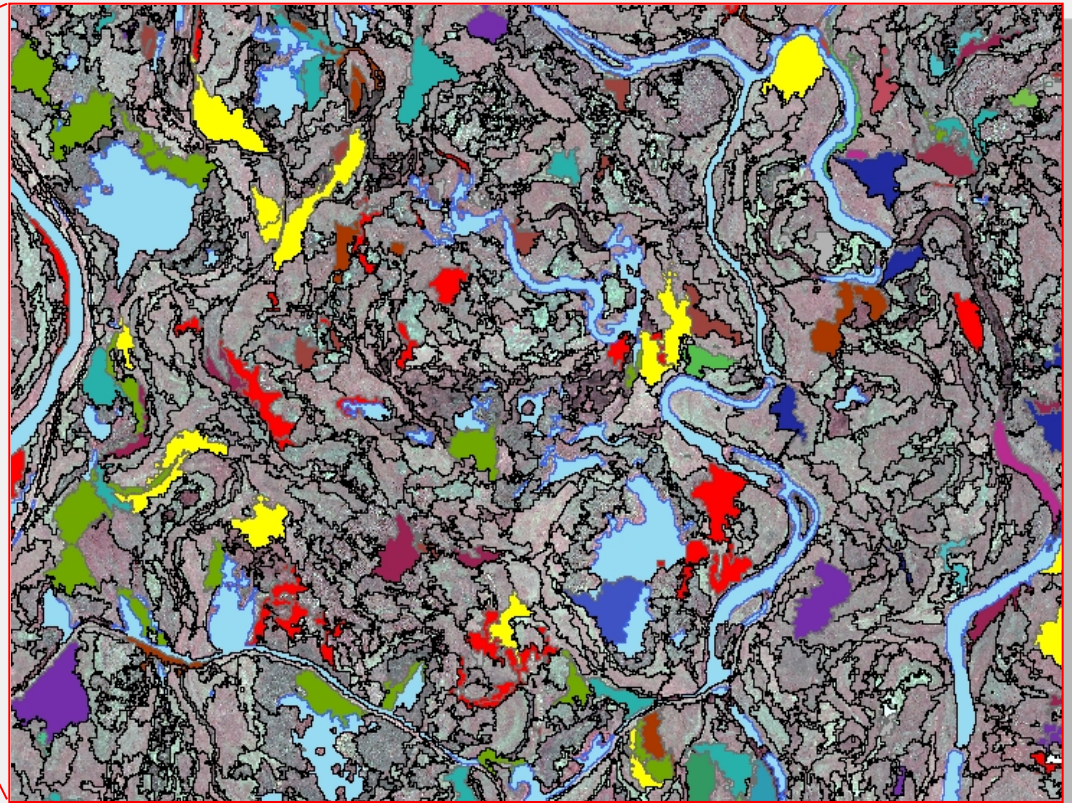
**Need to simplify and model high resolution digital data in logical units that can consider:**

- **Spectral resolution**
- **Radiometric resolution**
- **Spatial resolution**
- **Temporal resolution**





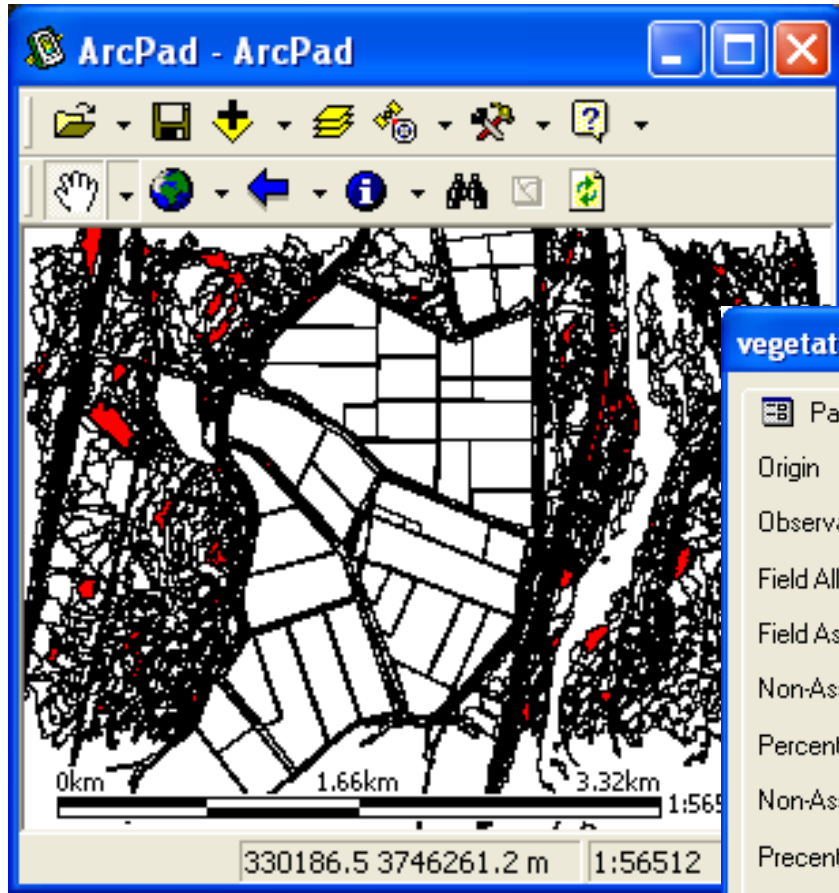
**Acquisition or collection of associated plot data is required to interpolate (model) wetland habitat classes continuously across project area.**



**Alamosa NWR, CO - NVCS floristic level plant community inventory plot data collected within object based grid**



# Integration of field data collection tools



vegetation

Page 1 Page 2

Origin donnelly

Observation Date 2/ 1/200

Field Alliance Artemisia filifol

Field Assoiation

Non-Associated 1 Sporobolus ail

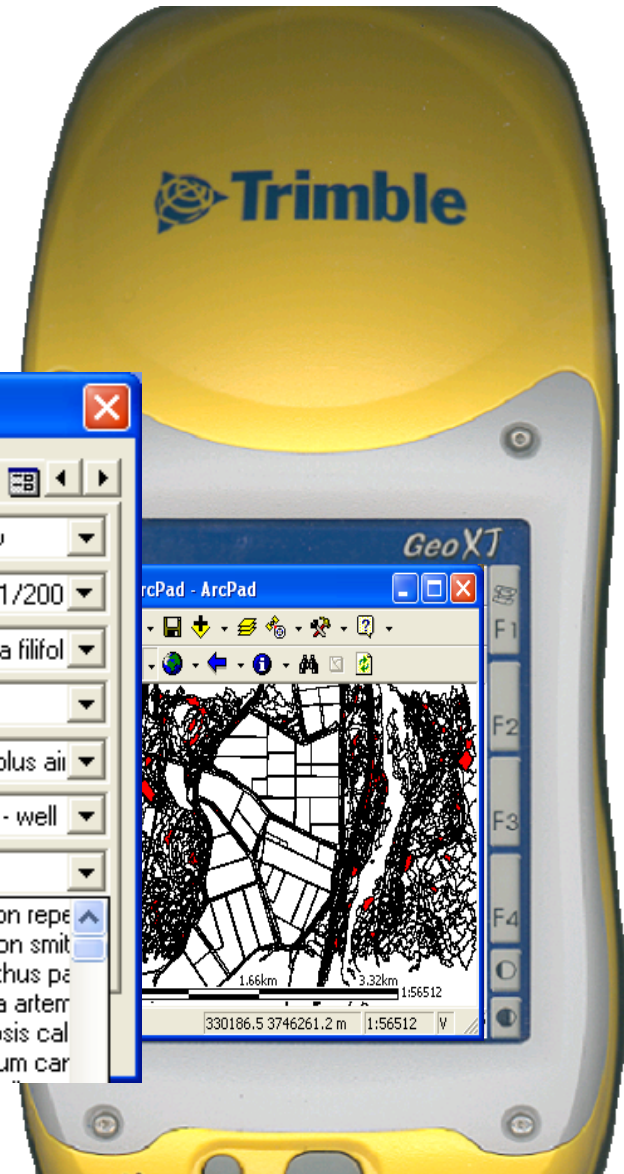
Percent Cover 1 10-25% - well

Non-Associated 2

Precent Cover 2 Acroptilon repe  
Agropyron smit  
Amaranthus pa  
Ambrosa arterr  
Anemopsis cal  
Apocynum car

OK

The "vegetation" dialog box is overlaid on the ArcPad interface. It contains a list of fields with dropdown menus for data entry. The fields include Origin, Observation Date, Field Alliance, Field Assoiation, Non-Associated 1, Percent Cover 1, Non-Associated 2, and Precent Cover 2. The Precent Cover 2 field has a scrollable list of plant species names. An "OK" button is located at the bottom left of the dialog box.





## Integration of field data collection tools

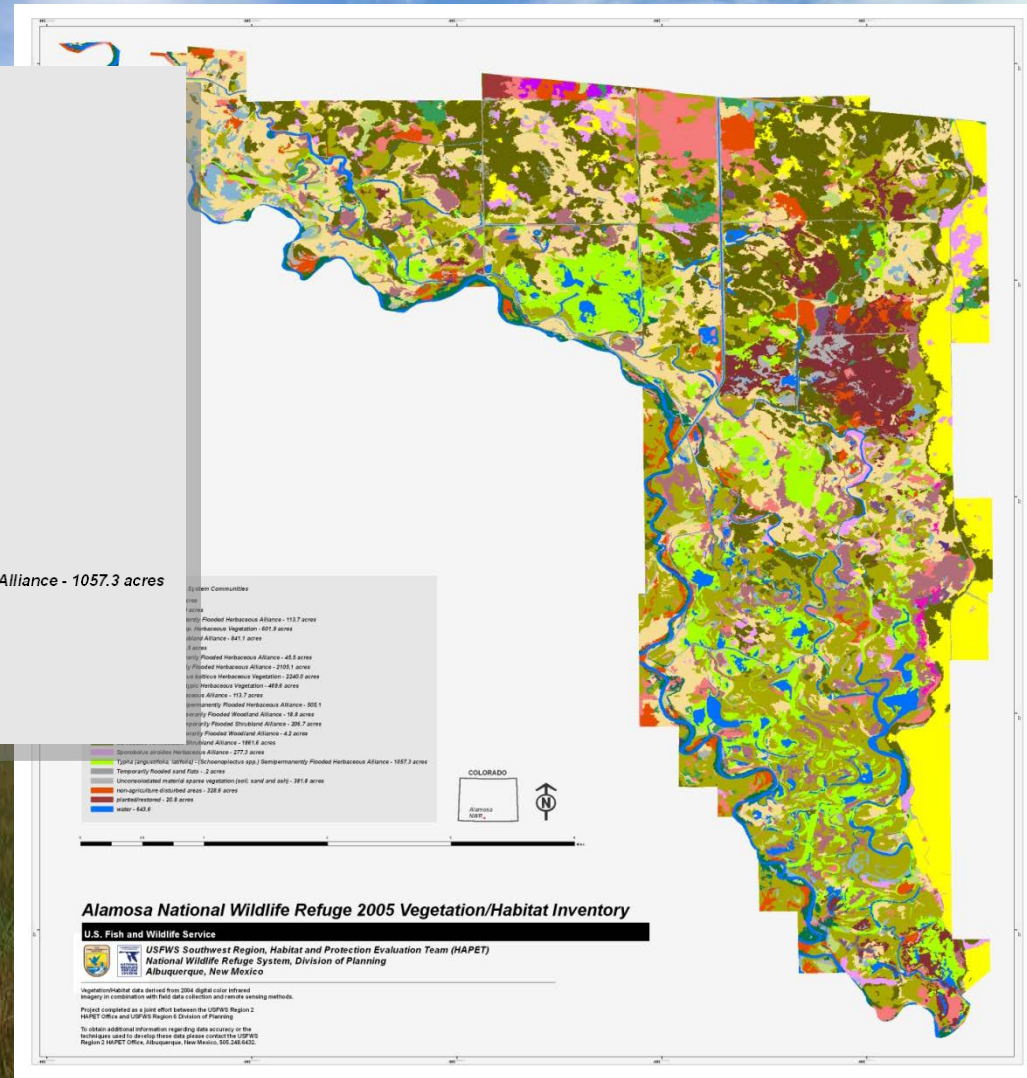




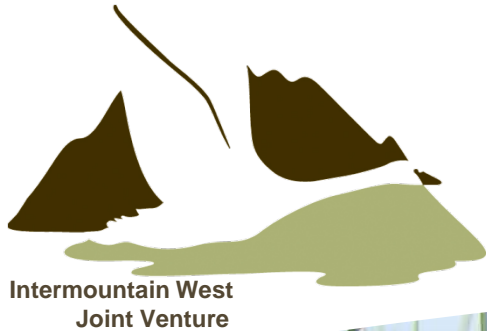
**National Vegetation Classification System Communities**

- Acroptilon repens* - 20.8 acres
- Chenopodium* spp. - 198.9 acres
- Distichlis spicata* Intermittently Flooded Herbaceous Alliance - 113.7 acres
- Eleocharis* spp. - *Carex* spp. Herbaceous Vegetation - 601.9 acres
- Ericameria nauseosa* Shrubland Alliance - 841.1 acres
- Helianthus tuberosus* - 16.5 acres
- Hordeum jubatum* Temporarily Flooded Herbaceous Alliance - 45.5 acres
- Juncus balticus* Seasonally Flooded Herbaceous Alliance - 2105.1 acres
- Lepidium latifolium* - *Juncus balticus* Herbaceous Vegetation - 2240.0 acres
- Lepidium latifolium* monotypic Herbaceous Vegetation - 469.6 acres
- Pascopyrum smithii* Herbaceous Alliance - 113.7 acres
- Phragmites australis* Semipermanently Flooded Herbaceous Alliance - 505.1
- Populus angustifolia* Temporarily Flooded Woodland Alliance - 18.8 acres
- Salix (exigua, interior)* Temporarily Flooded Shrubland Alliance - 206.7 acres
- Salix amygdaloides* Temporarily Flooded Woodland Alliance - 4.2 acres
- Sarcobatus vermiculatus* Shrubland Alliance - 1861.6 acres
- Sporobolus airoides* Herbaceous Alliance - 277.3 acres
- Typha (angustifolia, latifolia)* - (*Schoenoplectus* spp.) Semipermanently Flooded Herbaceous Alliance - 1057.3 acres
- Temporarily flooded sand flats - .2 acres
- Unconsolidated material sparse vegetation (soil, sand and ash) - 381.8 acres
- non-agriculture disturbed areas - 328.6 acres
- platted/restored - 20.8 acres
- water - 643.6

**Modeling outputs create tremendous efficiencies that are capable of addressing ecological complexity if the necessary data inputs are available**





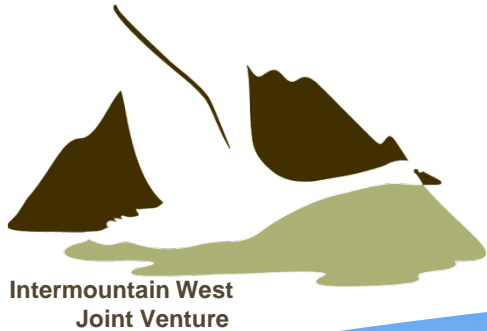


## Object based classification model concept:

### Incorporation of multi scale informational inputs:

- Plot data collection and input
- Terrain derivatives (slope, aspect, elevation)
- Structural derivatives (canopy height, understory density)
- Spectral derivatives/indices (NDVI, tassel cap, Soil-Adjusted Vegetation Index)
- Ancillary data (Hydric soils, FSA, NWI)





## **Object based classification model – measuring historic ecological settings:**

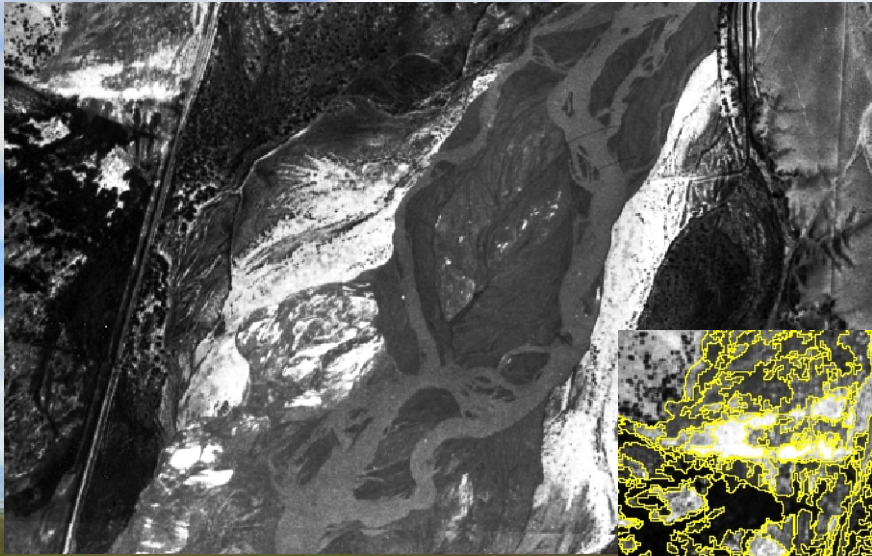
**Understanding of historic biotic and abiotic process prior to large scale impacts to ecological processes (agriculture, damming, ditching, road construction, etc...) (Laubhan et al., 2005).**

**Provides insight to the distribution of different wetland types and processes...**

**Features can be overlooked during restoration efforts because many of the identifiable wetland feature characteristics are no longer recognizable.**

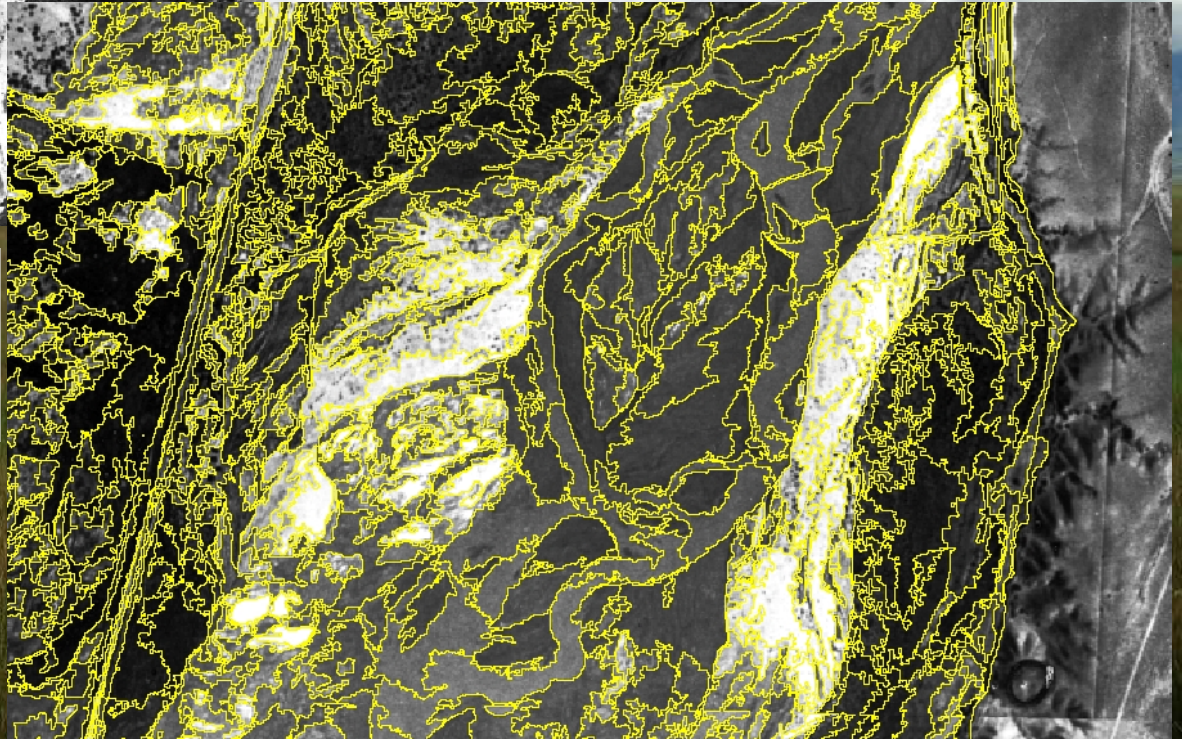
**Unidentifiable wetland feature can lead to improper site selection when developing restoration and management planning efforts (King and Fredrickson 1998).**





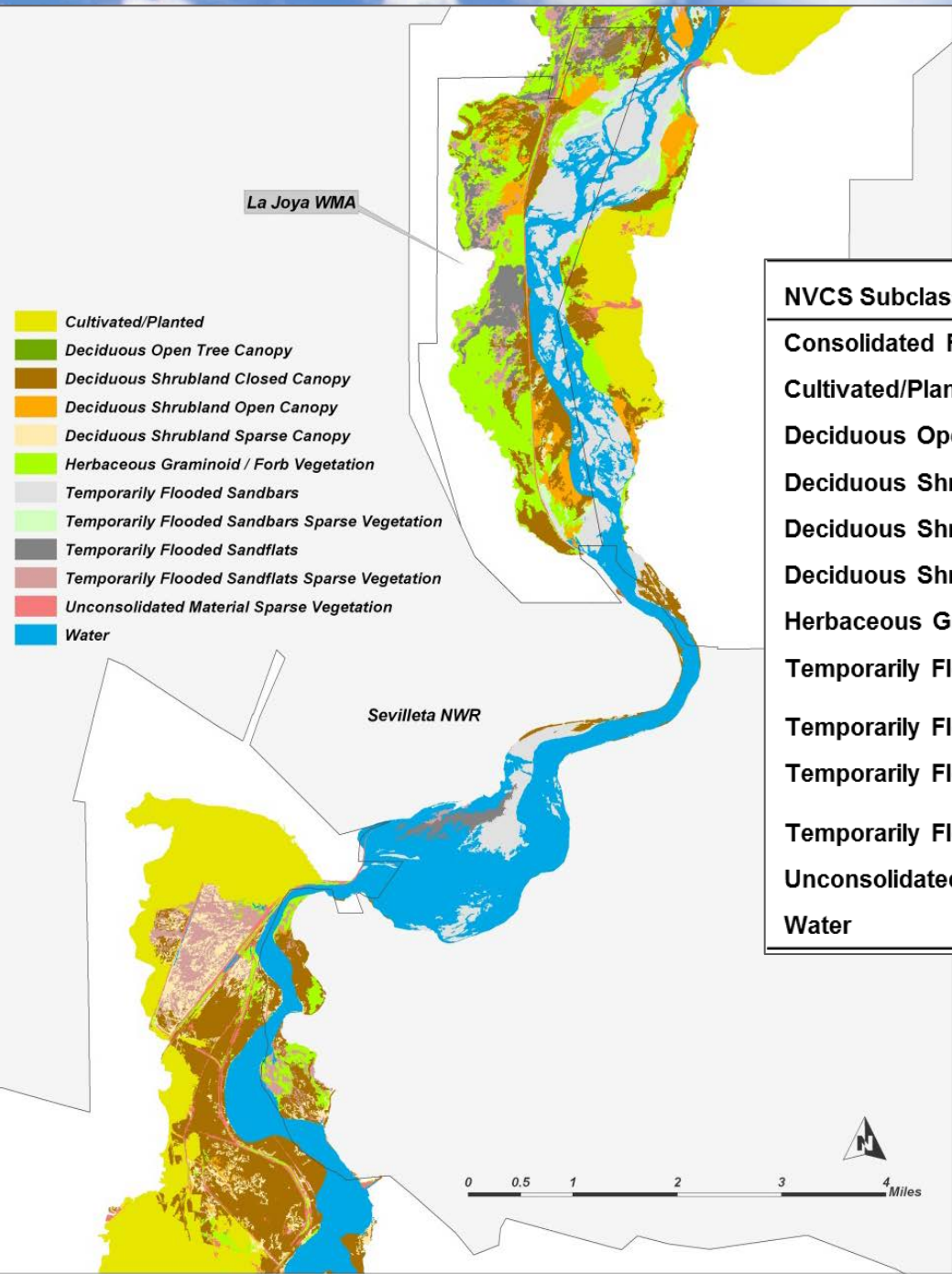
**Rio Grande 1935  
panchromatic orthorectified  
imagery**

**Rio Grande 1935 segmented**





# Rio Grande 1935 (La Joya Reach) Landcover Inventory

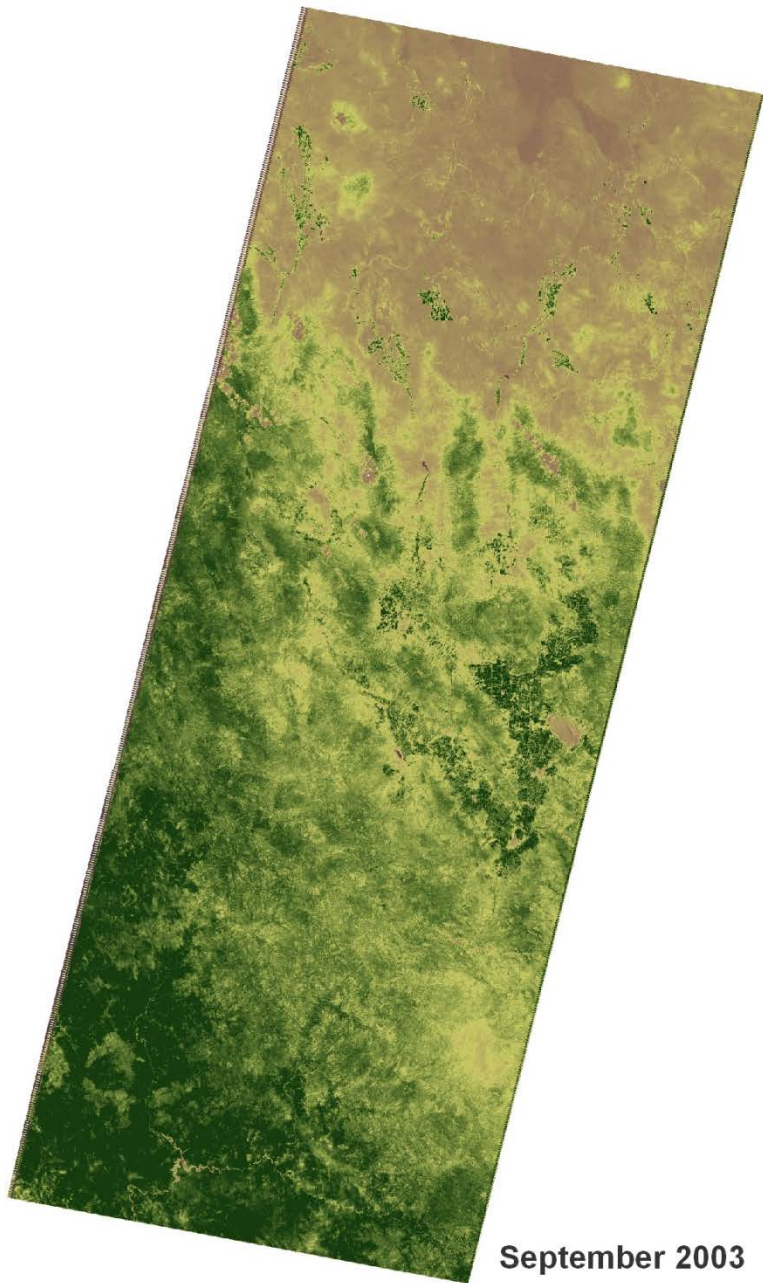


NVCS Subclass	Acres	% of reach
Consolidated Rock Sparse Vegetation	64.8	0.6%
Cultivated/Planted	2334.6	21.1%
Deciduous Open Tree Canopy	2.7	0.0%
Deciduous Shrubland Closed Canopy	1738.7	15.7%
Deciduous Shrubland Open Canopy	319.1	2.9%
Deciduous Shrubland Sparse Canopy	336.4	3.0%
Herbaceous Graminoid / Forb Vegetation	1345.5	12.2%
Temporarily Flooded Sandbars	1068.3	9.7%
Temporarily Flooded Sandbars Sparse Vegetation	92.4	0.8%
Temporarily Flooded Sandflats	365.3	3.3%
Temporarily Flooded Sandflats Sparse Vegetation	506.3	4.6%
Unconsolidated Material Sparse Vegetation	211.5	1.9%
Water	2662.3	24.1%

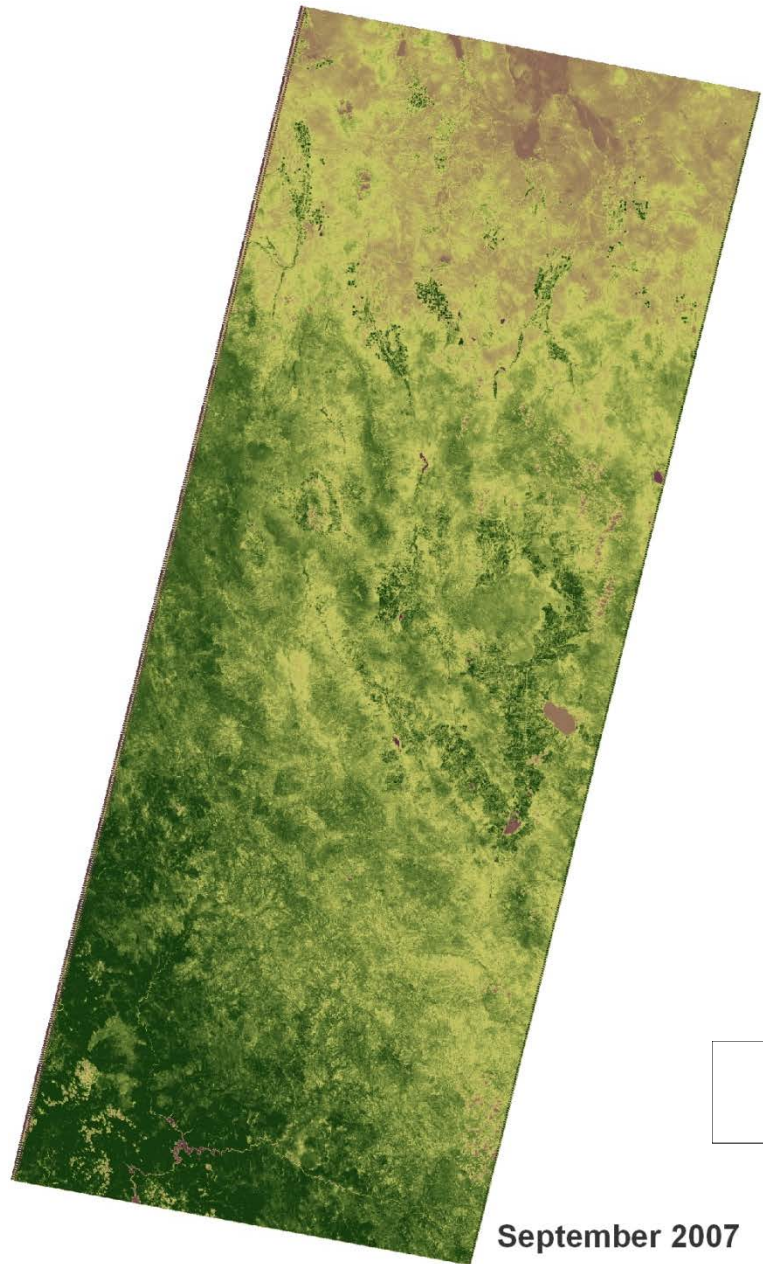








September 2003



September 2007



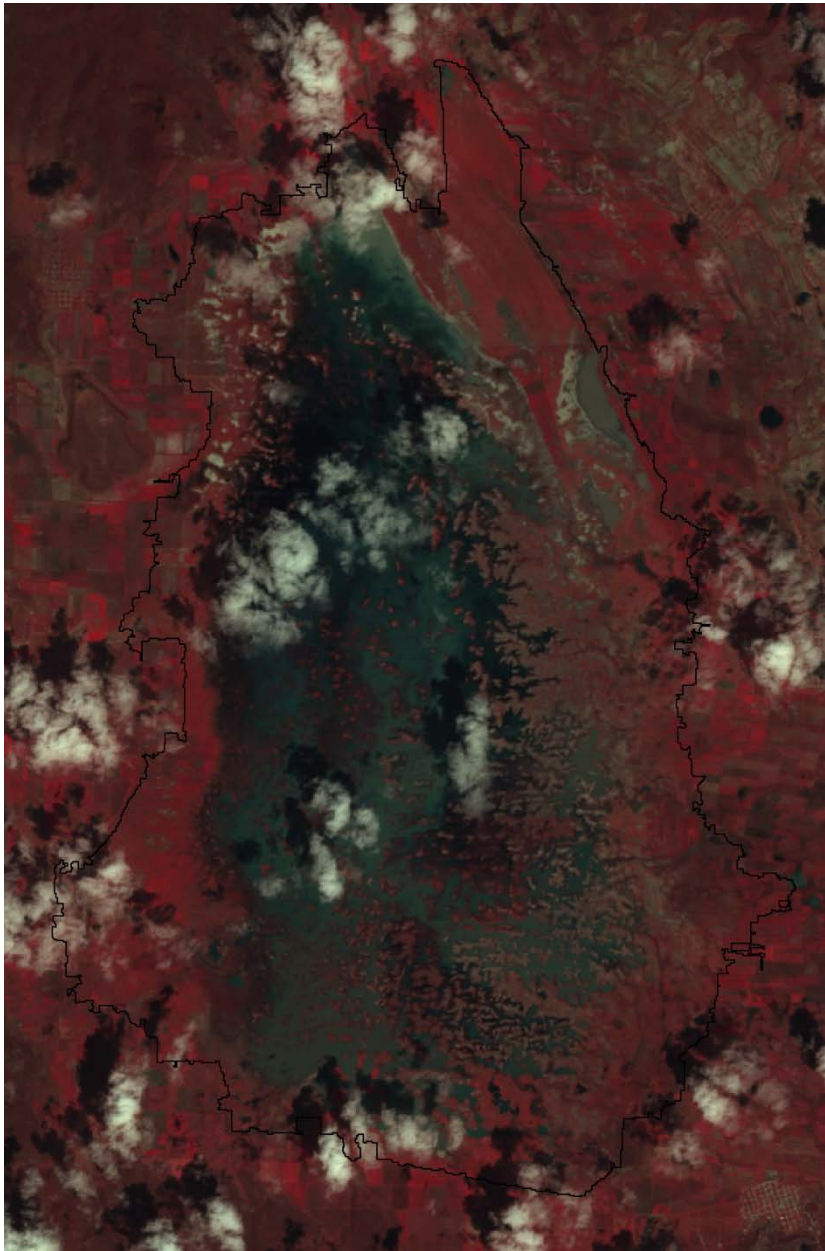




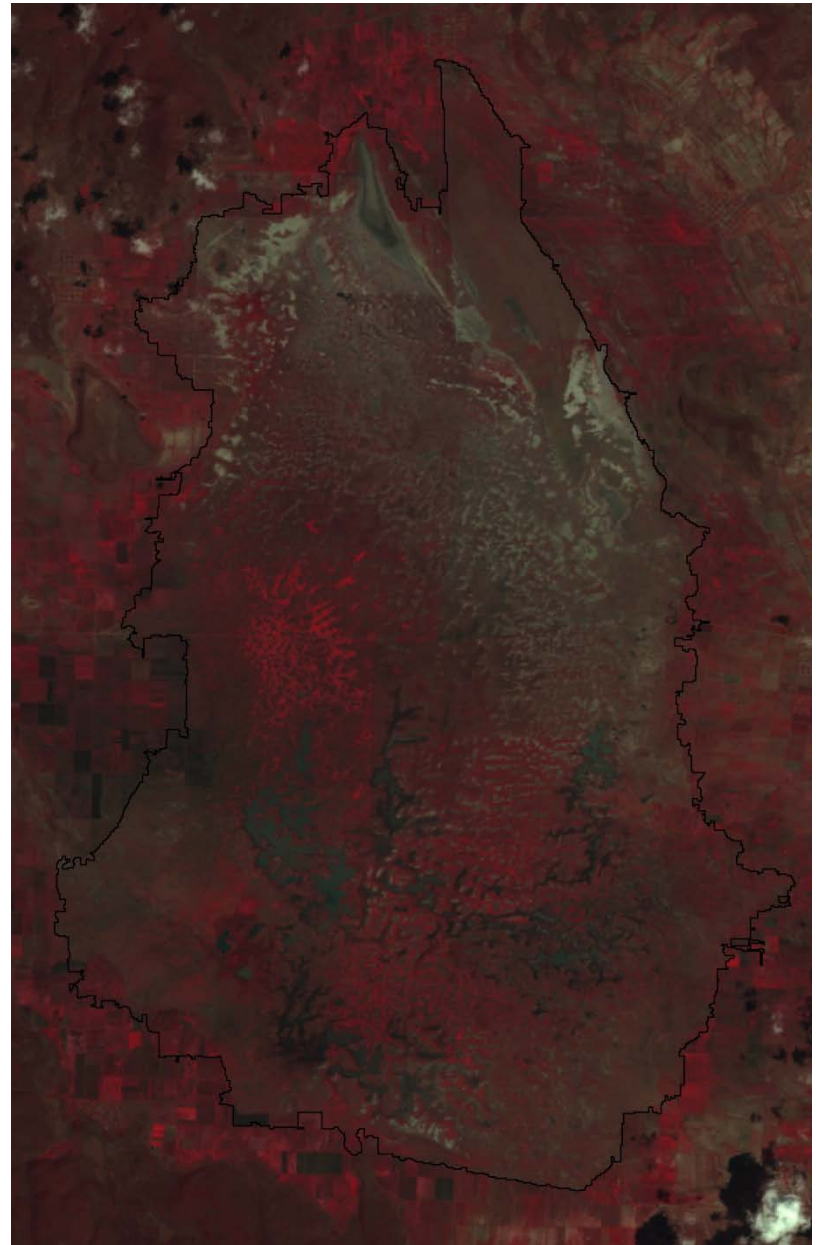
## *Overview*

- 1. 23,775 hectare closed basin*
- 2. Convective summer precipitation drives productivity*
- 3. >5,000 hectares of adjacent cultivated lands*



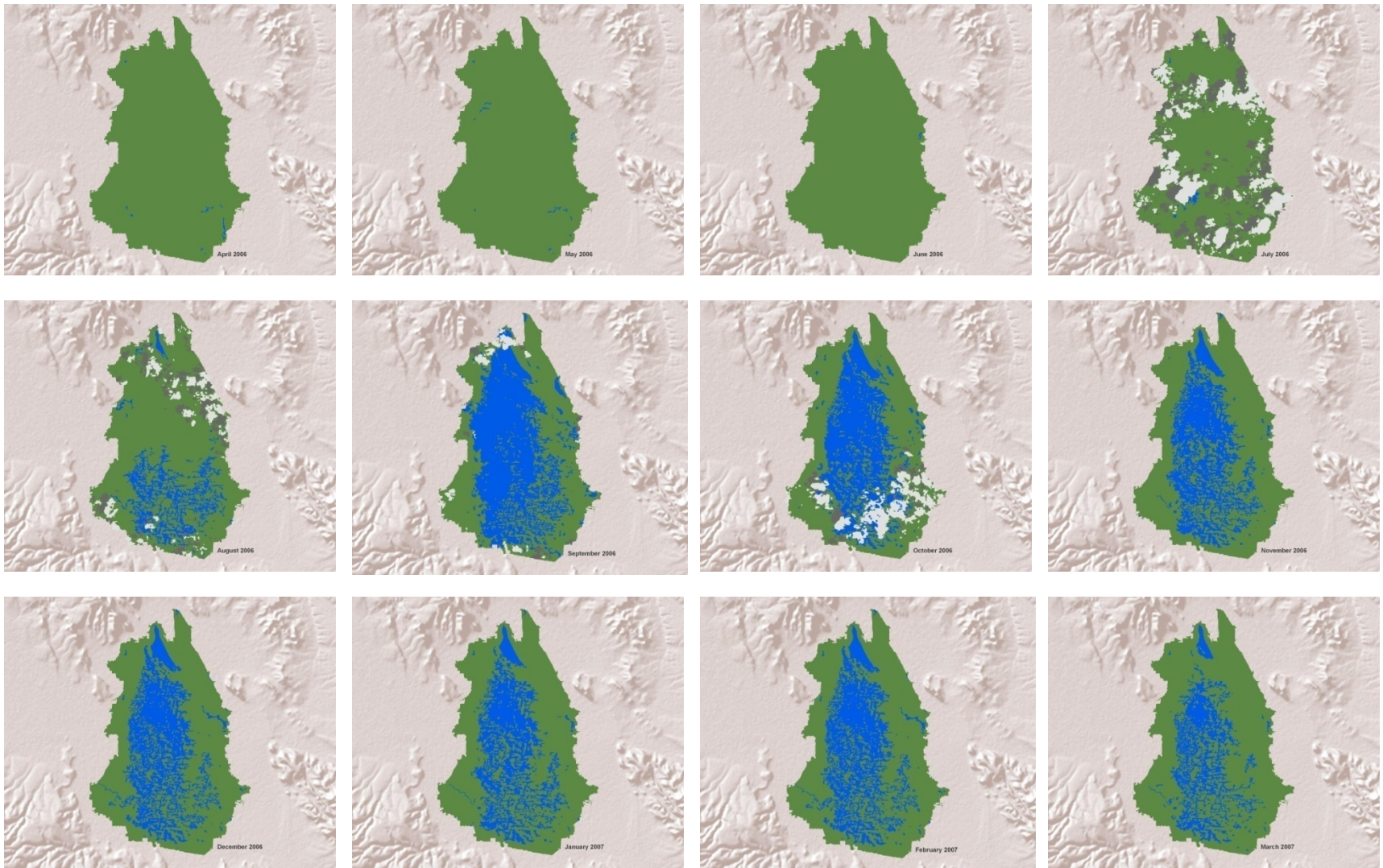


***Sept. 2006***



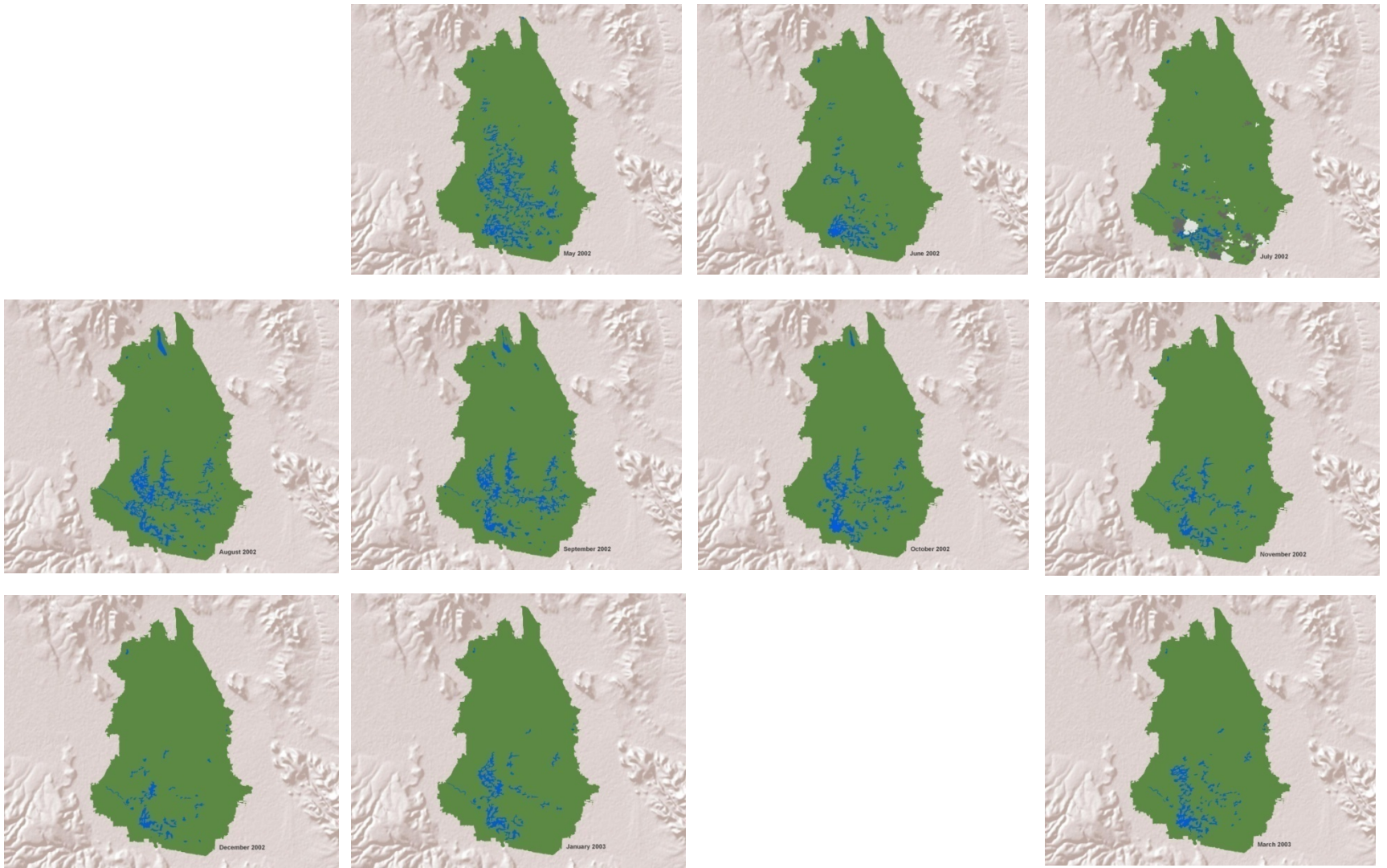
***Sept. 2002***





***Babicora Basin, Mexico April 2006 – March 2007 (green-ms, blue-surface water)***

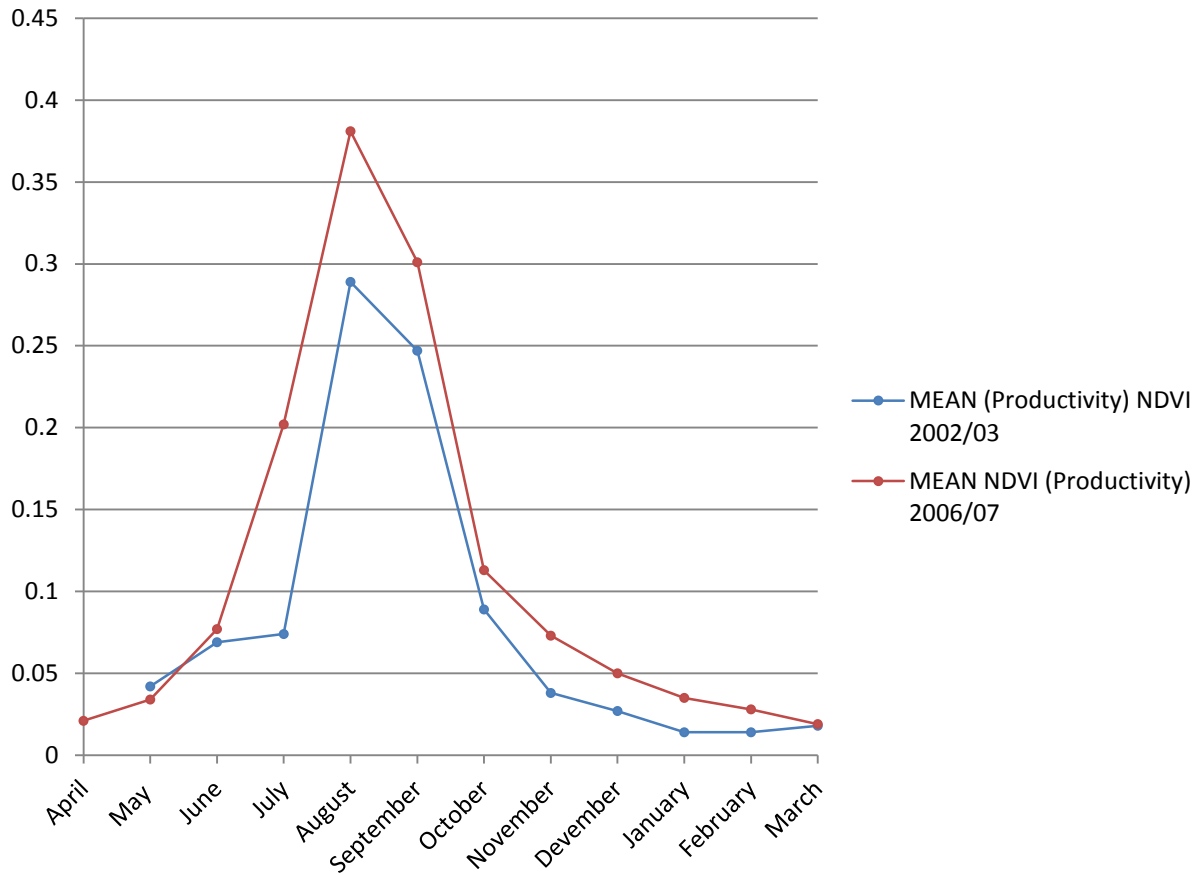




***Babicora Basin, Mexico April 2002 – March 2003 (green-ms, blue-surface water)***



# Monitoring and Analysis: 2002/03 – 2006/07 wetland productivity curve



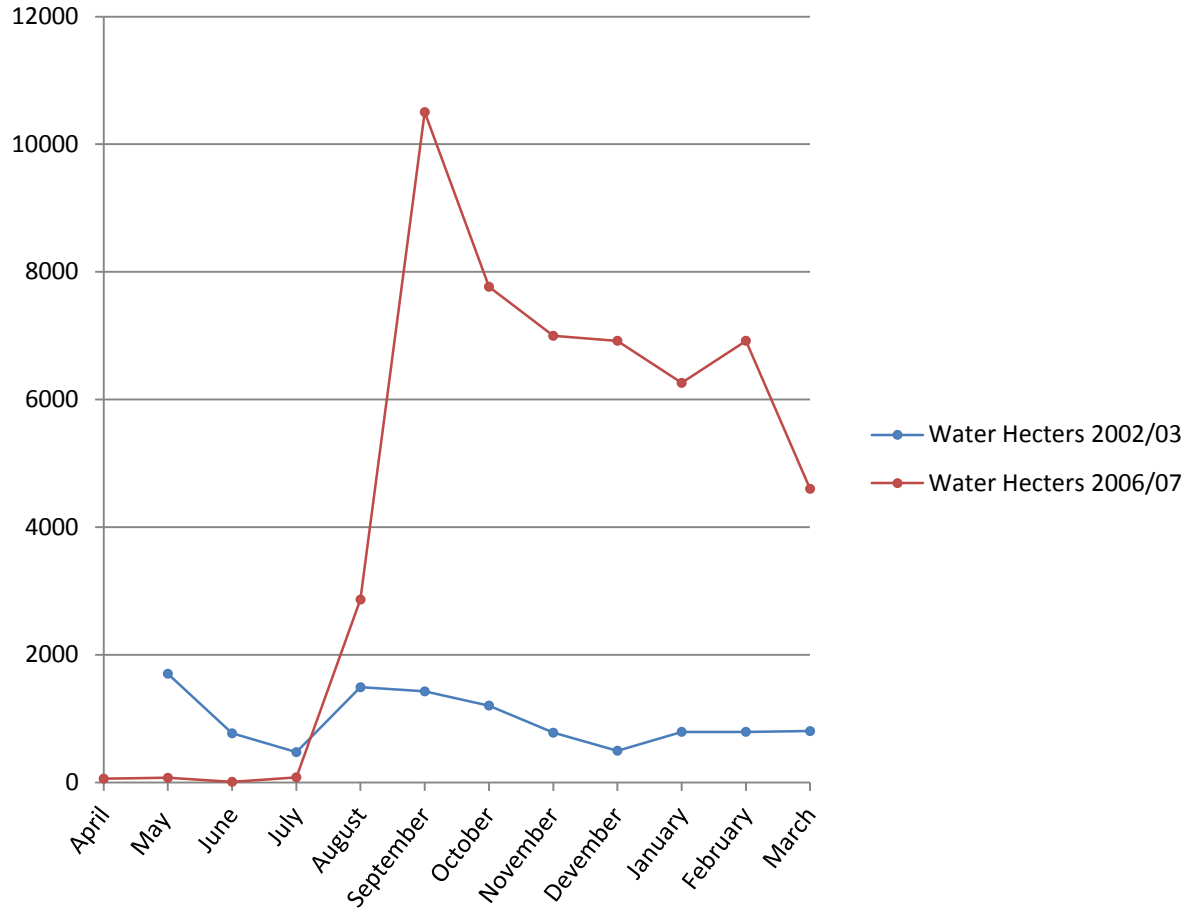
P(T<=t) two-tail 0.020635

t-Test: Paired Two Sample for Means

	Variable 1	Variable 2
Mean	0.0907	0.1285
Variance	0.009431	0.015635
Observations	10	10
Pearson Correlation	0.957189	
Hypothesized Mean Difference	0	
df	9	
t Stat	-2.8023	
P(T<=t) one-tail	0.010317	
t Critical one-tail	1.833113	
P(T<=t) two-tail	0.020635	



# Monitoring and Analysis: 2002/03 – 2006/07 surface water abundance







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## Segmentation and related software:

### Segmentation

eCognition

SPRING

Berkeley Segmentation

Monteverdi

ERDAS

ENVI

### Data Mining/Machine Learning

R

R – Rattle

R – Random Forest

R- SVM (Support Vector Machines)





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## Additional resources:

**USFWS - Remote Sensing application Center (RSAC)**

<http://www.fs.fed.us/eng/rsac/>

**Intermountain West Joint Venture (IWJV)**

[patrick\\_donnelly@fws.gov](mailto:patrick_donnelly@fws.gov)

**eCognition Developer 8 Quickstart**

<http://www.ecognition.com/products/trial-software>

**Rattle: A data Mining GUI for R**

[http://journal.r-project.org/archive/2009-2/RJournal\\_2009-2\\_Williams.pdf](http://journal.r-project.org/archive/2009-2/RJournal_2009-2_Williams.pdf)





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# QUESTIONS?

Needmore