# The Development of a Sagebrush Natural Resource Inventory and Map Data Set

#### a Resource Planning and Monitoring Tool

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Why am I here?

in August 2014, I was in Sac for the ESA conference sitting in on the NVCS mapping session hosted by Todd Keeler-Wolf of Cal Fish & Wildlife and Julie Evens of CNPS.

This session was covering the state of NVCS mapping in California. I found it quite interesting.

At the close Dr. Janet Franklin of ASU was talking about the future of Mapping and displayed a diagram relating current mapping abilities to image resolution.

She speculated that modeling individual species cover was 15-20 years in the future.

That really got my attention because we were already mapping, not modeling, individual species cover during our past and present NPS projects.

I had never really talked much about these species-specific mapping efforts in California and the Park Service staff certainly haven't and likely won't as they have their own Mapping & Inventory Program.

And so I started to reach out to people with similar interests to see if they were interested in finding out more about what we had accomplished.

And so here I am.
love what I do.
will try to keep this non-technical, but some technical terms are unavoidable.

### **Background**

#### Education

- Forestry Education at UC Berkeley B.S. '73 & M.F'75

#### Work Experience

- Forest Industry (1975-1989)
  - · Inventory & Planning Forester
- Mapping/GIS/Information Development Services (1989-2015)
  - · Director, Resource Management and Remote Sensing Applications
    - Redwood National Park Mapping Project ('08-'13)
    - Lassen Volcanic National Park Comparative Mapping Project (\*06-\*14)
    - CALFIRE Klamath Province Mapping Project ('92-'94 18 million acres)
    - CALFIRE Timberlands Mapping Project ('90-92 6 million acres)
    - Wrangell-St. Elias National Park & Preserve ( '04-'07 18 million acres)
    - Katmai National Park & Preserve ( '00-'04 4 million acres)





I received my education at Cal with a very <u>well rounded education</u> in Forestry. At this point in my career looking back, I couldn't be more pleased about my experiences at Cal and the education I received. I had some very noteworthy professors both in and outside of the School of Forestry and Conservation.

I then was <u>quite fortunate to land a job with one of the major forest industries in the redwood region</u>, a company noted for its progressive approach to managing their timberlands. My position was a new one and it encompassed some very interesting responsibilities.

I worked in the field and in the office, performed covertyping using stereo photography, wax pencils, and a zoom transfer scope, and ran the inventory field crews.

I was responsible for training, which primarily involved developing consistency of the data collection efforts by seasonal staff and the elimination of errors.

Participated in the **Early Development of GIS capabilities** - justified by integration of data, the value of "good" information, and the prospects of decreasing, if not eliminating, the odds of making poor or bad decisions!

Cost = \$280K was based on the value of GOOD INFORMATION!

I am a Cofounder of Geographic Resource Solutions

Started performing Image Classification Services back in the early 1990's when we landed the Cal Timberlands Mapping (6MM) and Cal Klamath Province (18MM) Projects. Both were based on the CDFG WHR Classification system, but we quickly found out the generalized methods taught in school didn't work well over large areas

And so I developed a means to map cover and tree size as continuous variables

#### **Background**

- Field Data Collection
- Modeling
  - Growth and Yield
  - Long-term Yield and Harvest Scheduling
- Planning
- Remote Sensing
- GIS
- Mapping
- Accuracy Assessment
- Software Development

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I have been fortunate to have developed experience in a wide range of natural resource oriented fields

I have also been able to experience first hand some of the problems that currently exist when trying

to use the mapping data sets that have been developed to represent the natural resources we are charged with managing.

I have never liked the "seat-of-the-pants" model or the "quick-and-dirty" approach.

I have always wanted data that were meaningful and useful.

In summary, I am a planner, mapper, modeler, developer, and (importantly) a USER of the various types of resource information for which I was responsible.

I quickly learned to appreciate the value of resource information, the effort necessary to develop and maintain it,

and **how it could be used** in resource management and planning efforts.

#### **National Mapping Efforts**

- Large area (small scale) standard is a color-coded type map
  - Inventory & Monitoring
  - National Land Cover Mapping
  - Gap Analysis
  - LANDFIRE
- Lower 48 efforts are based on National Vegetation Classification System (NVCS)
  - Standardized conventions for naming
  - Art versus Science
    - · Lacks standards for development of "types"
    - · No standards for information content

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I have performed considerable work for DOI since 1997 mapping nearly 25-million acres

I am sufficiently experienced with the DOI standards to know that the minimum requirement is to produce a type map that may have as many as three cover density classes.

All of these mapping projects in are based on the National Vegetation Classification System (NVCS)

This is simply a naming system developed to **standardize** the naming of different vegetation types.

I have worked on Vegetation Classification efforts, actually analyzing the field sample data to develop Associations and write vegetation descriptions for both the LAVO and RNSP projects.

Vegetation Classification is not an absolute science and unfortunately, in my opinion, the NVCS does not enforce standards of how types are classified, but only how they are named.

There are no standards regarding information content.

Vegetation descriptions may contain averages and ranges of species specific information, but I find maps based on these type names are generalized type maps and are quite limited in their ability to support planning applications.

Beach Sea Rocket Alliance = 1 plant with < 0.5% cover on beach sand was a TYPE!!!!!!

No definitions for Barren or Water Types ... any plant life tends to qualify the area as a plant type, no matter how little plant cover.

#### **Database Limitations**

- Generalized type information can be misleading
  - Type names may not represent all of the components of the type
  - Tree types may not represent shrub or herbaceous cover that is present
  - Shrub types may not represent tree or herbaceous cover that is present
  - Herbaceous types may not represent tree or shrub cover that is present



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I found that Type level information may be incomplete and misleading ...

We may see this as we look at some of our recent Sagebrush mapping results in just a few moments ...

# **Sagebrush Mapping Efforts**

- Working with USGS Fort Collins Science Center
- Efforts based on:
  - BLM Montrose District Field Data
    - · Line intercept
    - · Line-point transect
  - Landsat 8 Imagery

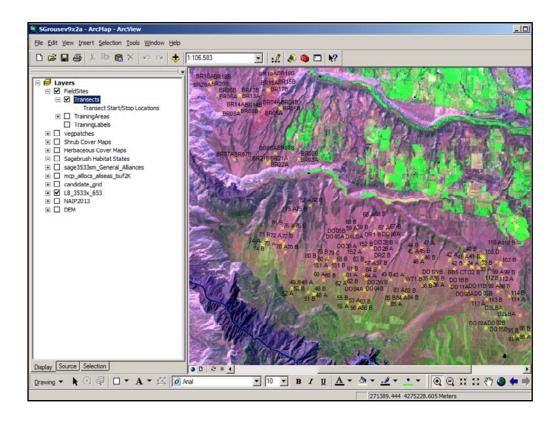
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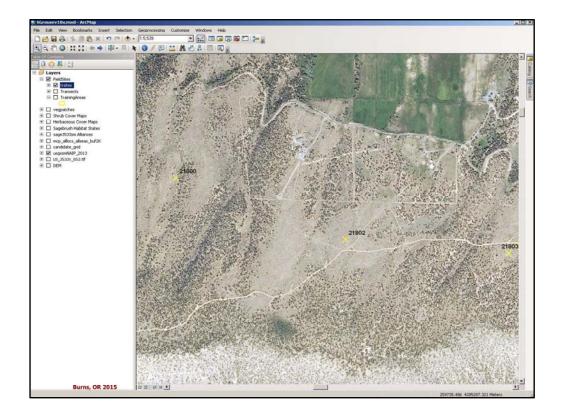
Current efforts are based on BLM field site data (2013-2015) ...



The Area of Interest for our current sagebrush mapping effort is located in western Colorado



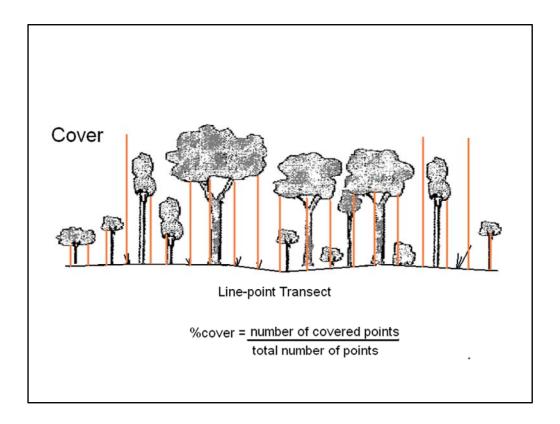
Landsat 8 imagery (bands 6,5, and 3) and Field Site locations



Recent BLM field sampling efforts were based on a stratification based on management practices.

This is a view of 3 field site locations and 2013 NAIP imagery.

Sites were sampled using line-intercept and line-point transects.

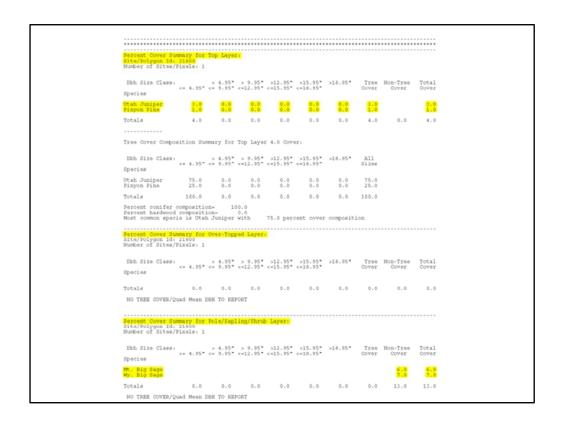


The line-point transect methodology is easy to learn/train. In addition, cover computations are easy.

In 2012 we used a BLM Grant to train and hire Native American HS Students during our Galena Biomass Inventory Project

and after 2 days of training they worked right along side our botanists.

No hard decisions with this methodology - the results are accurate, repeatable, and standardized.



Let's look at some of the data available from the BLM field sites.

Species Cover Totals and Composition represent the first level of field site detail/information

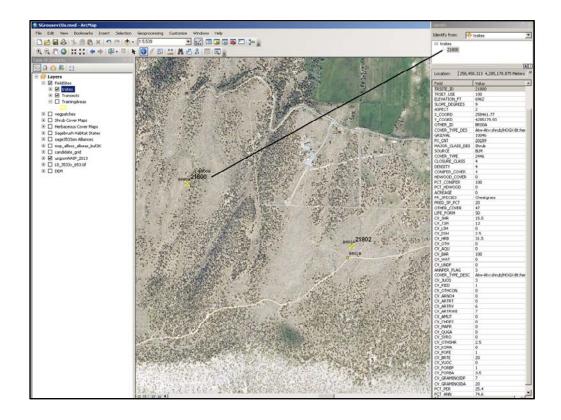
Values by canopy layer represent a second level of information ...

**Ground layer and Ground conditions** 

Bird's-eye view cover values as seen from above – overtopped characteristics are not included.

```
Percent Cover Summary for All Layers:
Site/Polygon Id: 21800
Number of Sites/Pixels: 1
Species
                 3.0 0.0 0.0 0.0 0.0 0.0 3.0
1.0 0.0 0.0 0.0 0.0 1.0
Cheatgrass
Arrowlf Blsmrt
Madwort
Unknown mustar
NonVascular/Mo
                4.0 0.0 0.0 0.0 0.0 0.0
Totals
                                                                      147.0
                                                                             151.0
Tree Cover Composition Summary for All Layers 4.0 Cover:
Species
Utah Juniper
Pinyon Pine
             100.0 0.0 0.0
Totals
                                                       0.0 100.0
                                        0.0
                                               0.0
Percent conifer composition= 100.0
Percent hardwood composition= 0.0
Most common specie is Utah Juniper with 75.0 percent cover composition
```

Total (all layers) characteristics ...

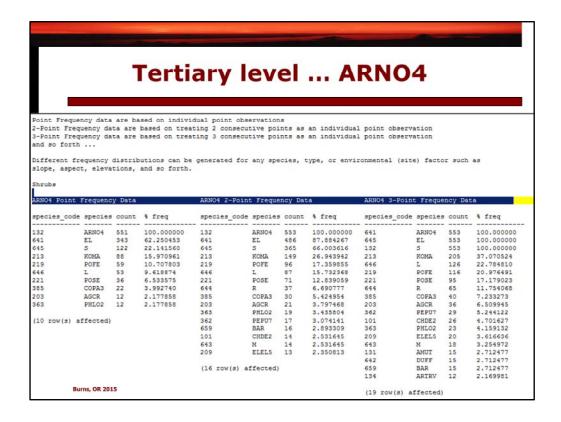


We can process the field data ... To develop different types of info about a field site,

such as type names and conditions .... All of this info can be loaded into a GIS map layer and is accessible for processing

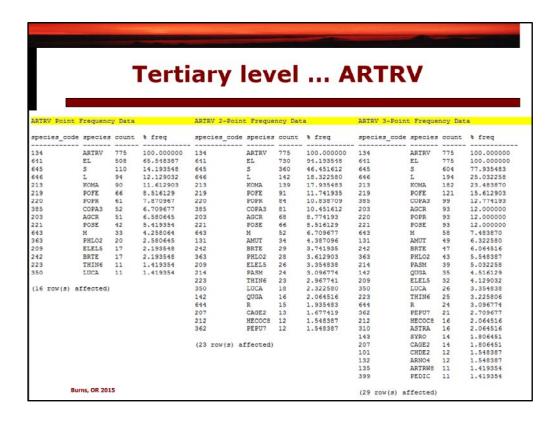
Detailed Alliance Species	Bird's-Eye Frequency (%)	Bird's-Eye Average Cover	Bird's-Eye Minimum Cover	Bird's-Eye Maximum Cover	Total Frequency (%)	Total Average Cover	Total Minimum Cover	Total Maximum Cover
Pinus Jeffreyi	25	0.3	1	1	50	0.1	0.5	0.5
Abies concolor	25	1.2	5	5	25	0.4	1.7	1.7
Cercocarpus ledifolius	25	0.3	1	1	25	0.1	0.5	0.5
Pinus contorta var. murrayana	T	T	T	T	25	T	T	T
Abies magnifica	т	т	Т	т	25	т	т	т
Total tree		1.8				0.6		
Arctostaphylos patula	100	91	85	98	100	92.7	88.3	98
Ceanothus velutinus	25	0.8	3	3	50	1.2	1.5	3.3
Chrysolepis sempervirens	25	1.3	5	5	25	0.4	1.7	1.7
Total shrub		93.1				94.3		
Kelloggia galioides	25	0.3	1	1	25	0.3	1	1
Total herbaceous		0.3				0.3		
Total nonvascular		0				0		
Barren - litter	75	3	2	6	100	50	4	100
Barren - fine gravelly soil	25	1.3	5	5	25	1.3	5	5
Barren - rock	25	0.3	1	1	25	0.3	1	1
Barren - bare soil	25	0.3	1	1	25	0.3	1	1
Total other		4.9				51.9		

It is this type of information that supports analyses like vegetation classification

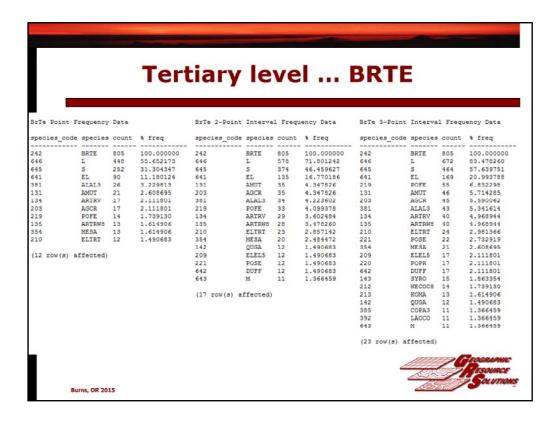


Recently I discovered a third level of information ... similar in concept to veg classification but at the point observation levels.

Point observations ... for Black Sage

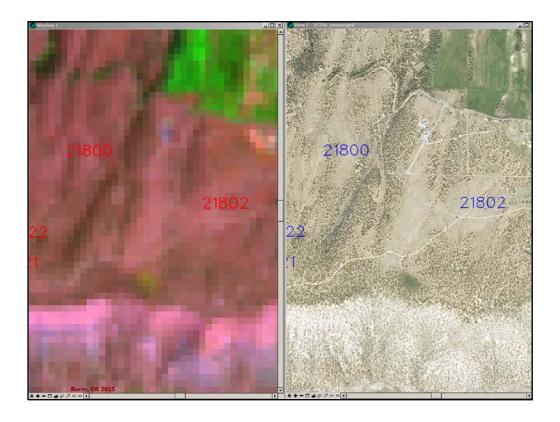


Point observations ... for Mountain Big Sage



Point observations ... for Cheatgrass

Many frequency distributions can be generated at many levels of spacing ... based on many different site characteristics and/or species.



We use all of these detailed field data with the Landsat imagery to develop our resource information that we will eventually store in our

Resource inventory map data set.

Is there Skepticism about our use of Landsat imagery?



Why skepticism?

You cannot see these features in the imagery!

That's right, but we don't see them in the imagery.

We do not using methods taught at our colleges ... But rather a different approach

# **A Different Approach**

- We do not try to see the features we are mapping in the imagery
- We see them on the ground in the field data that represents the sites that have been visited and described

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Our approach is different!

We see these features on the ground in the field data set(s)

## A Different Approach ...

- Independent of a Classification System
- Represents Individual Species/Landscape Features
  - Cover magnitude and extent
  - Species composition
  - Tree Characteristics dbh, height, stems/acre, and crown area
  - Shrub characteristics height
  - Herbaceous and Non-vascular plant characteristics
  - Abiotic Features
    - · Ground Surface Characteristics
    - · Coarse and Fine Woody Debris

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We relate these field data to distinct spectral signatures we can discriminate in the imagery.

We use a comprehensive approach designed to collect detailed accurate field data that will provide

a solid foundation for our inventory and mapping efforts. We integrate all of the field data into our resulting map data set.

Our approach is ...

Classification independent

Species/Landscape-feature specific

•••

# A Different Approach ...

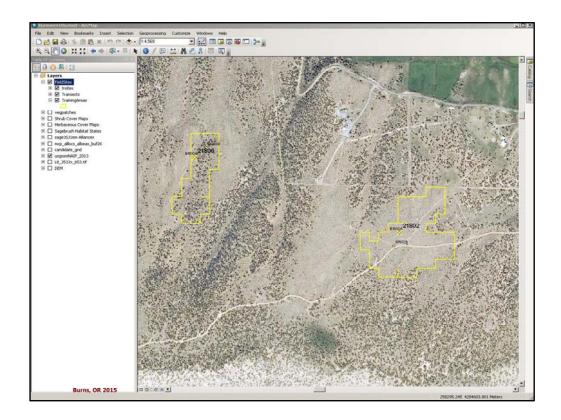
- Characteristics by Canopy Layer
  - Top, overtopped, pole/sapling near the ground, on the ground, and ground surface
- Characteristics by Status
  - Dead, dying, or alive
  - · Healthy or infected/affected
  - Wildlife feature(s)
- Compared to our traditional mapping/inventory techniques
  - Easier to implement
  - Detailed, Accurate, and Repeatable
  - Less expensive

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Our field data collection approach is easy to implement **consistently and accurately** by staff of different levels of expertise –

It enables seasonal staff to collect data comparable to that collected by experienced staff.



Our image classification approach is relatively easy to implement ...

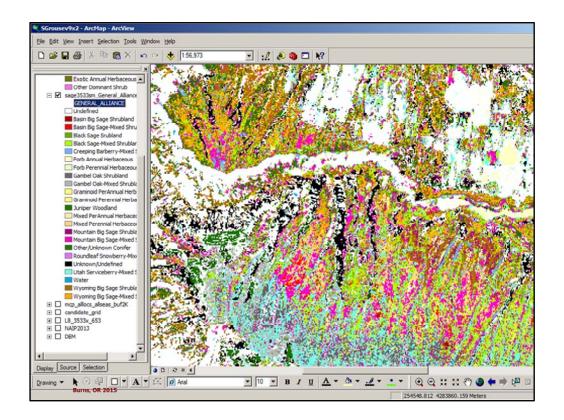
In a nutshell ... we relate each field site to an individual statistically valid spectral signature and map many, many shades of gray

that represent the different plant communities found in our project area.

After performing all of our quality control processes ... and correcting any spectral confusion we can develop our output classification maps.

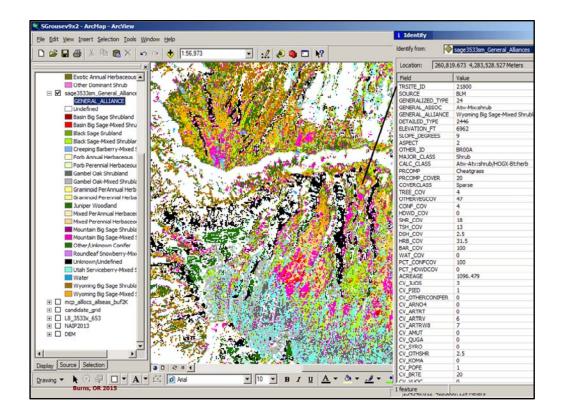
The end result is a map data set that supports the development of many maps and applications

This next map ...



represents a color-coded map of the General Alliances found in this area.

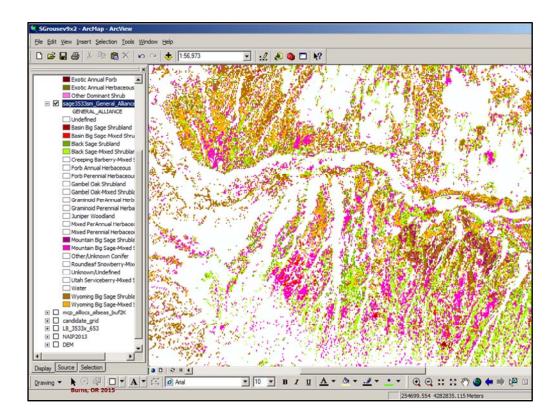
These Alliances have been based on the dominant/most abundant plant species and the presence/absence of a significant amount (25%) of other species.



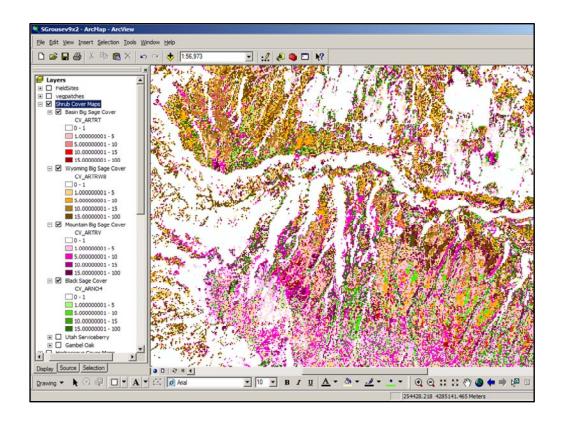
However, rather than this being simply a color-coded lookup table-based type map, every pixel is represented by a detailed set of attributes

that describe the plant community characteristics estimated for that specific location.

All of this information enables mapping of different types of plant community characteristics:



We can display the sagebrush types, by modifying our legend and blanking out the display of all the other types.



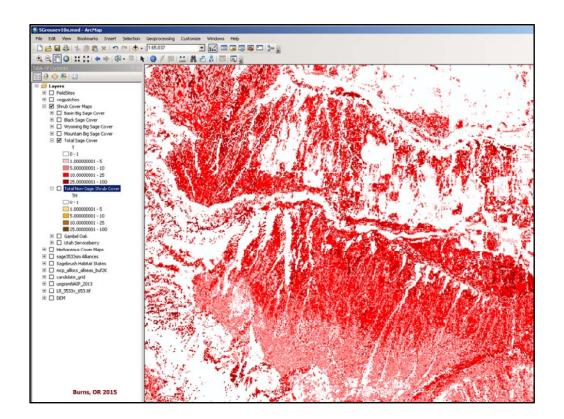
However, we can generate a different map for sagebrush species if we map Sagebrush Cover as a species cover component rather than by type. This map represents a different representation of sagebrush cover and extent than the sagebrush type map. It is not nearly as fragmented or spatially lacking in its distribution because we are mapping sagebrush cover for areas that may be other types than a sagebrush type, but they still contain sagebrush cover as a component of the other non-sagebrush type.

This representation of Sagebrush cover might lead us to develop different plans and policies than the previous apparently sparsely populated and fragmented shrub cover map.

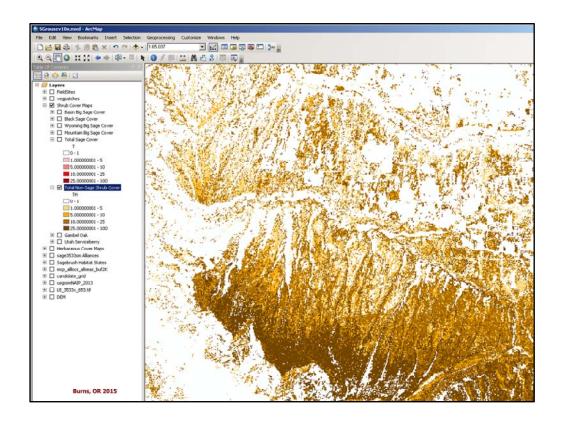
I would like to suggest that there is a better approach if you are interested in the presence of sagebrush cover rather than types, as the different sagebrush species may be a component of other "named" plant communities.

This map actually represents the combination of all 4 sagebrush species.

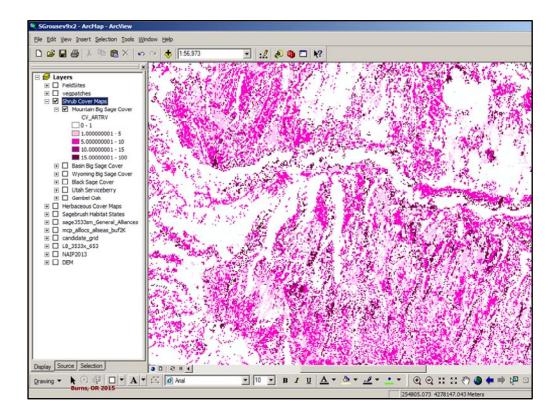
We can also map the total cover of sagebrush species cover individually ...



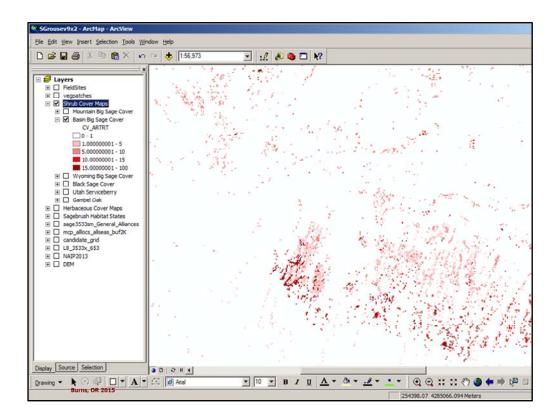
... the total cover of sagebrush species ...



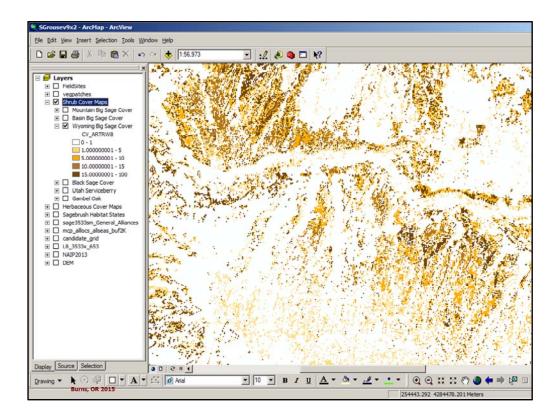
... the total cover of non-sagebrush species and individual sage species cover ...



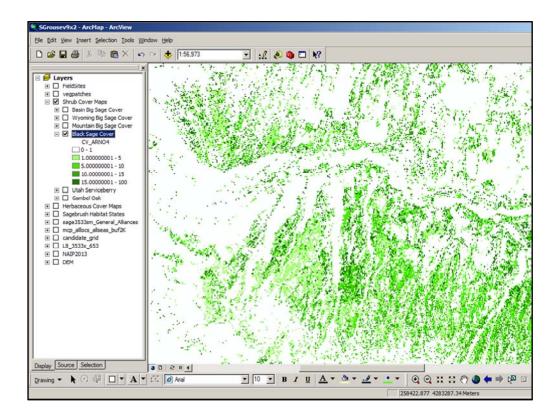
... Mtn. Big Sage



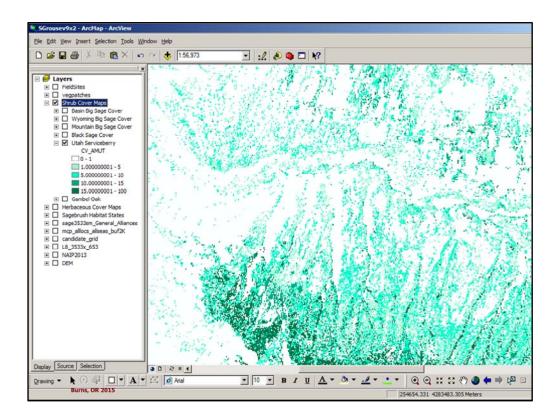
... Basin Big Sage



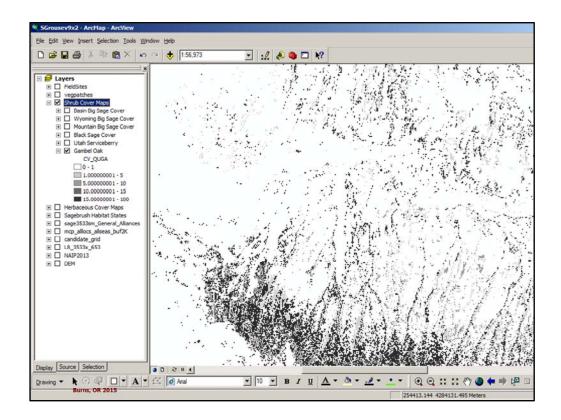
... Wyoming Big Sage



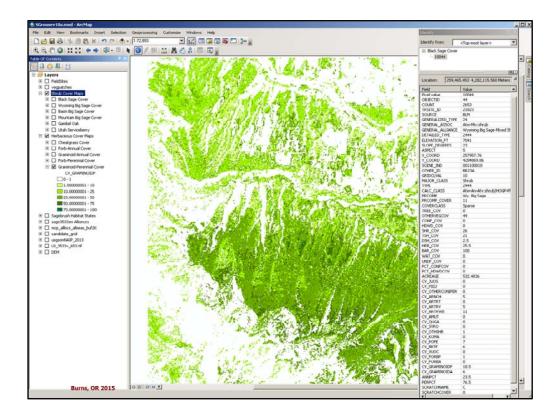
And Black Sage



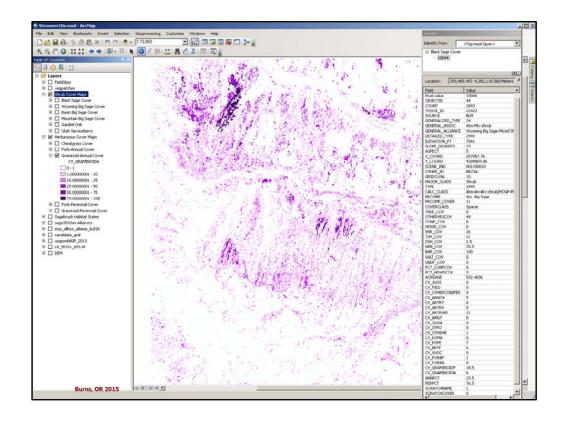
We can also map other species and features ... like Utah Serviceberry or



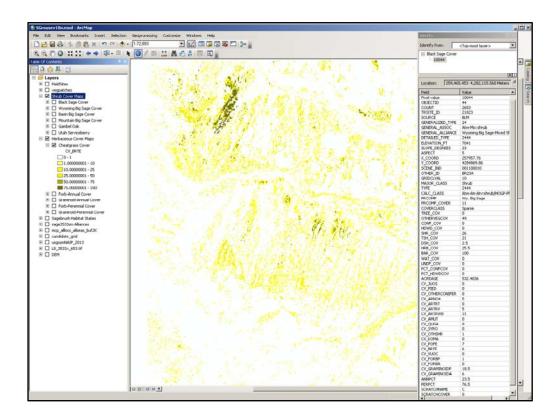
Gambel Oak, both of which tend to occur at predominantly higher elevations than do the sagebrush species.



Here is a map of Perennial Graminoid cover and

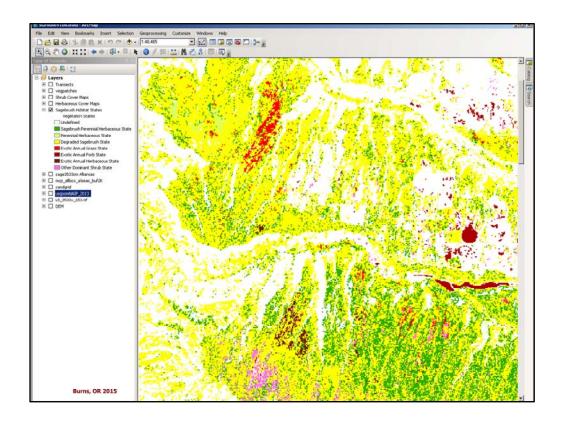


Here is a map of Annual Graminoid cover ... and

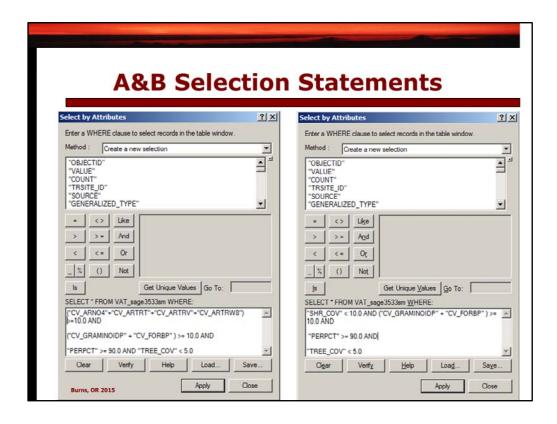


Here is a map of Bromus tectorum cover ...

We can use these maps to develop other information  $\dots$ 

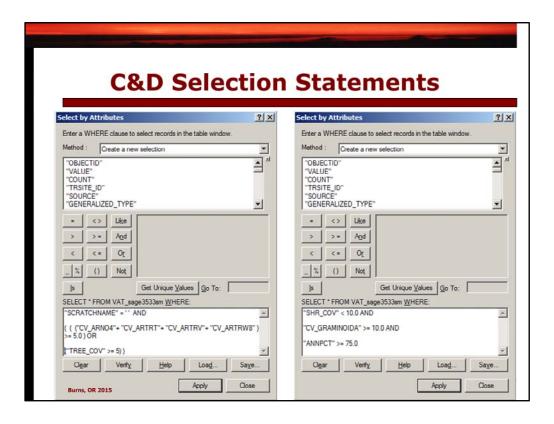


Use this data to map Sagebrush Vegetation States ...

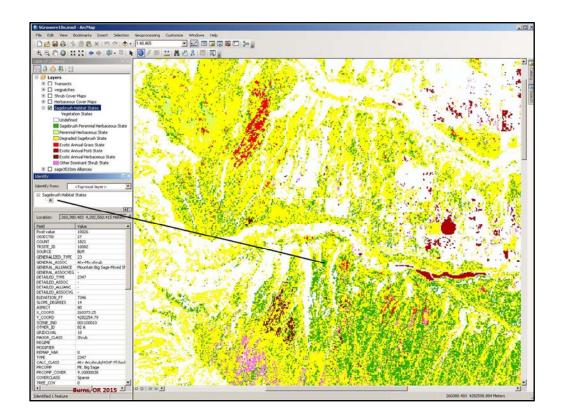


We can select records based on cover rules and threshold and update a "State" field to represent the Vegetative State of a location.

Here are selection criteria for States A & B.

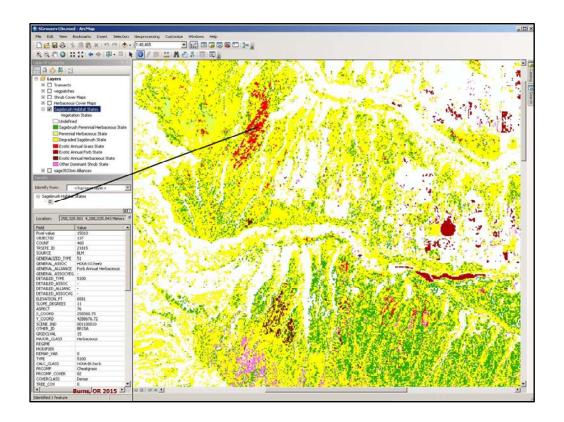


Here are selection criteria for States C & D.



Here is an example of the Vegetation States layer we can develop based on these rules as applied to the database attributes that have been mapped ...

This is an example State A -  $\,$  rules indicate assign State A when Sagebrush > 10% and annual herb < 10% and tree cover < 5%



We can change rules and thresholds  $\,\dots\,$ 

State D = < 10% sage and Bromus Tectorum >= 75%

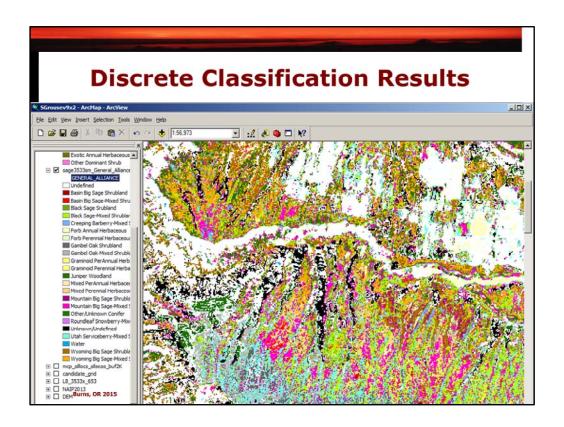
### The Approach is Highly Adaptable

- Change Rules?
  - New or modified number of classes or class thresholds
    - Change Legend Properties
  - Type/Key or State Changes
    - Modify the Key/SQL programming
    - Reprocess the data using the new rules and develop new type/state names
    - Reload the new data into the database tables
    - Remap ...

Giognamic Missource Sournous

BLM, Arcata CA 2015

A key benefit of this approach is that different results are easily generated as it is easy to modify/generate new categorical class (State) values based on different rules.



The end result of the Vegetation/Image Classification process is the DCMM data set ...

### **Stand/Polygon Development**

- <u>Same table attribute structure</u> as field sites and pixel classification map
- Raster pixels are aggregated into stands
- Attribute values are derived by computing weighted average of pixel attribute values within a stand
- Type assignments are based upon stand level cover attribute values processed by the Key
- Minimum Mapping Unit Size Limits (MMU) are implemented with respect to different vegetation/landscape characteristics



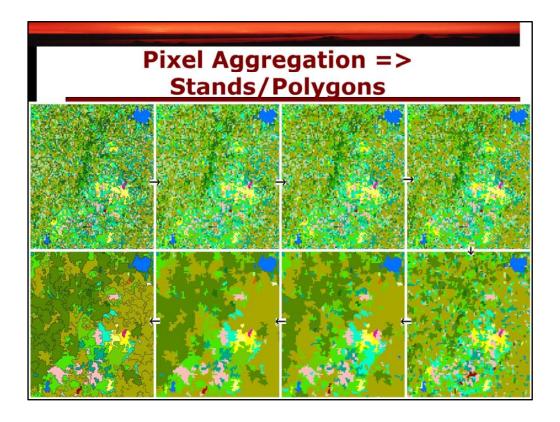
This data set has the same table structure as the field sites

We can use it to perform Pixel Aggregation

The resulting stands have attributes based on the weighted averages of all pixels merged together into a particular polygon/stand.

We can process the stand attributes to assign Type names

We can implement different MMU values, based on the relative significance of the different species

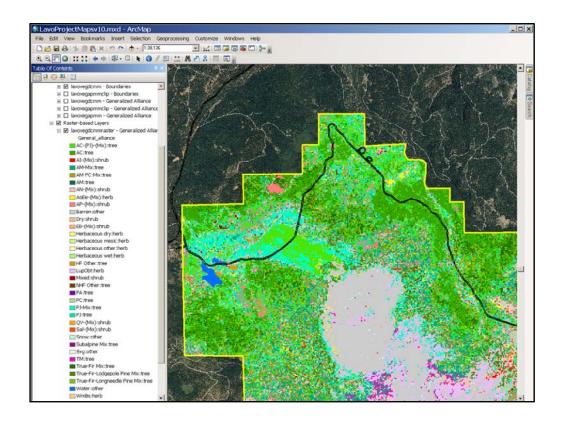


Here is an example of the pixel aggregation process using a display from our recent LAVO Project.

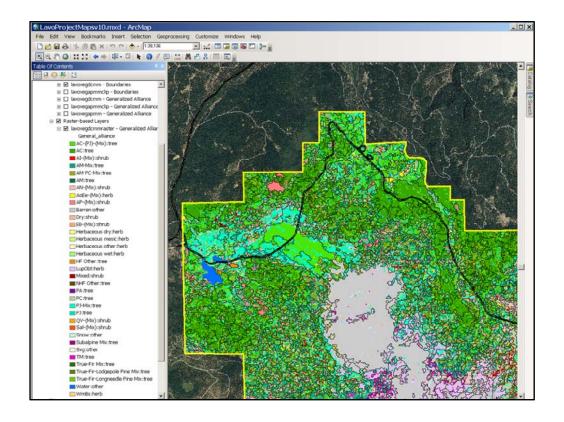
We use the detailed species-specific cover data to form groups of "similar" and dissimilar pixels that will eventually form stands, which all meet the minimum mapping size limit.

This figure shows the aggregation results at different levels as we process all the data and aggregate the pixels into polygons.

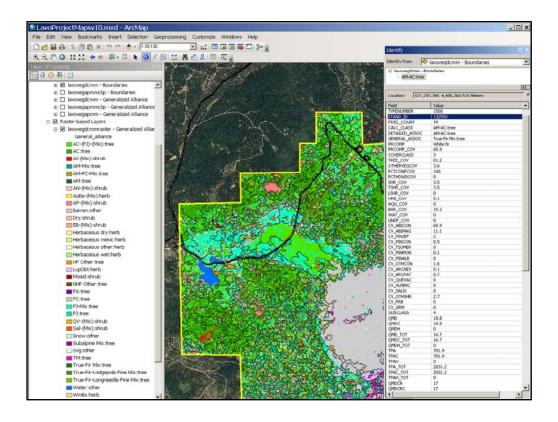
(This step can be replaced by using the boundaries created using an object oriented classification approach, but I think this approach is better as it is based on plant community characteristics rather than spectral data). It can also be replaced using hand drawn photoInterpreted boundary linework.



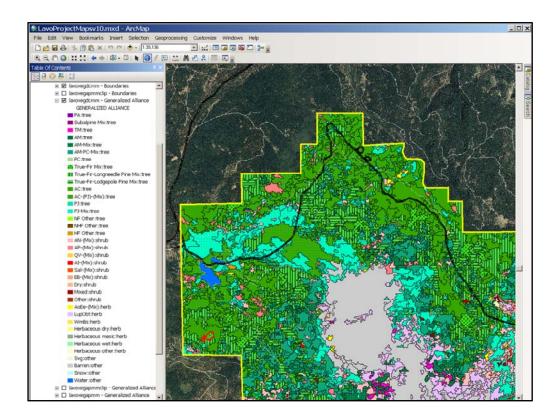
Again, using our recent LAVO project – this Raster classmap represents the starting point of the aggregation process...



Here are the resulting stand boundaries displayed over raster map ...



This slide shows some of the attribute info at the stand level ...



This slide shows the Stand map symbolized by Alliance/Landscape feature

For LAVO, 870 classes were generalized to 37 Generalized Alliances

#### Raster and Polygon Map Data Set Uses

- Map National Vegetation Classification System Type
  - Detailed Alliance & Association
  - Generalized Alliance
- Map Extent and cover by species and landscape feature
  - Can group species by lifeform
  - Can group species by major or minor groups
  - Can group landscape features by major or minor groups
- Map Other Vegetation States and Characteristics
- Map woody debris values dry tons/acre
- Map tree size, trees/unit area, structure, mortality, ...
- Perform Accuracy Assessment based upon statistical tests

The resulting Stand Level Map Data Sets have numerous uses ...

They meet the NVCS Type name requirements, but in addition can be used to map:

The extent and amount of cover of different species and landscape features,

A Vegetation State,

Size characteristics,

And other characteristics, such as estimates of woody debris and biomass by size class ...

Lastly, accuracy assessments may be undertaken using statistical tests rather than "fuzzy logic".

Let's look at some examples ...

#### So How Did We Do This?

- Our mapping/information development methodology has evolved over the last 25 years
  - Information Content
  - Field Sampling Methods
  - Data Processing Tools

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Over the past 25 years our mapping methodology has evolved from it's original form as it seems like we encountered new challenges and processing obstacles.

Initially it was lack of Memory and disk space

Had to be creative ... Like stuffing 5 different data items into the different bits of one 32 bit integer so I didn't exceed the computer's memory ... (simvals)

A mB of memory was \$1K

It took 10 days to perform classification of one image, something that takes 15 minutes on this laptop;

A 2 gB external drive cost\$4K.

Our approach evolved with respect to the information content, field sampling techniques, and data processing tools to take advantages of the changes in technology that have occurred.

### **Key Elements of the Process**

- Resource Inventory Data Model
- Field Data Collection and Sample Design
- Discrete Classification Mapping Methodology
  - Verification/Confirmation of Ground:Image Relationships\*
- Pixel aggregation into polygons and calculation of weighted pixel value averages to represent stand values\*

\* Includes some GRS software customization



So now let's look at the key elements of our process (See slide) ...

### **Resource Inventory Data Model**

- Develop and store estimates of the cover of species and landscape features that comprise the plant communities and landscape features we are mapping
  - By size diameter and/or height
  - By canopy layer/position including the ground surface
  - By status alive, dead, stunted, ...
- Cover values represent the continuum of cover
- Cover values support the assignment of a "type" or a "class"

"If we don't collect and retain details we cannot map them!"



We use a different data model based on collecting and storing species or landscape feature specific cover estimates by size, canopy layer, and status.

Splitter and then a lumper!

### **Resource Inventory Data Model**

- Resource Inventory field data is linked to each individual field site on a 1:1 basis
- Discrete Classification links the Resource Inventory field data to individual Classification Map pixel classes
- Stand/Polygon Map Data Set is based upon weighted average of field data that are linked to the different pixels that comprise each individual aggregated stand
- The same basic data model is used for field sites, DCMM classes, and stands
- The same basic data model is used for Accuracy Assessment

Resource Inventory data are developed for/represent the individual field sites

The Discrete Classification Mapping Methodology links the Field Sites data to individual Pixel Classes

The Stand values are based on weighted average of Pixel Class values

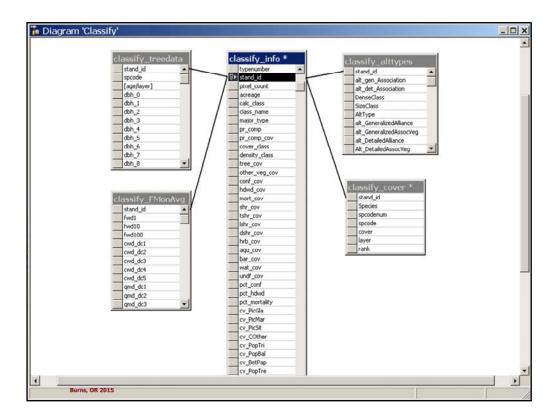
The same basic data model is used for field sites, DCMM classes, and stands

### Resource Data Accessible Through ...

- Main table xxxx (xxxx=field sites, DCMM Raster, or DCMM Stand)
  - xxxx\_cover table
  - xxxx\_fmonavg table
  - xxxx\_alttypes table
  - xxxx\_treedata table
- Joins/Relates of these additional tables are based upon
  - site\_id (field site tables)
  - gridval (dcmm raster tables)
  - stand\_id (dcmm stand map tables)



The data structure is somewhat similar to the DOI PLOTSv3.2 but extends to the raster and stand map data sets too, instead of just the field data.



At the stand level the database table relationships look like this

#### **Field Data Collection**

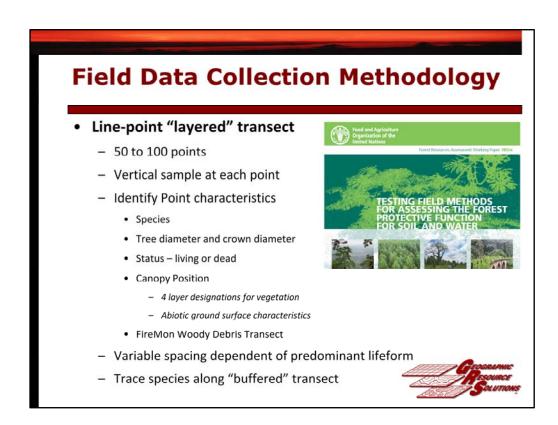
- How do we populate the Resource Inventory attributes?
- · We need field site data that are:
  - Quantitative
  - Species/feature-specific
  - Layered
  - Comprehensive
  - ACCURATE
    - Estimates
    - Location

Burns, OR 2015

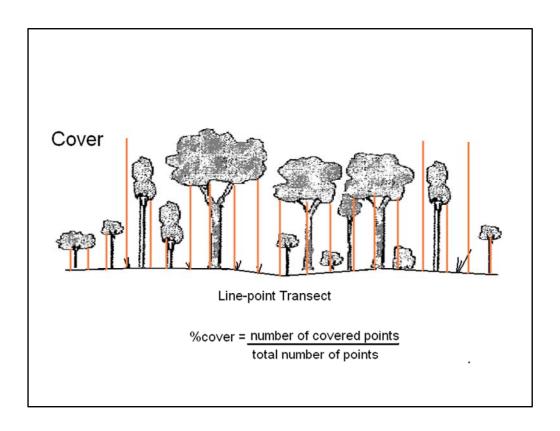


Past projects have used DU, NPS FirePro, ANHF, ABR, RA/Relevé, Aerial, Ocular, transect

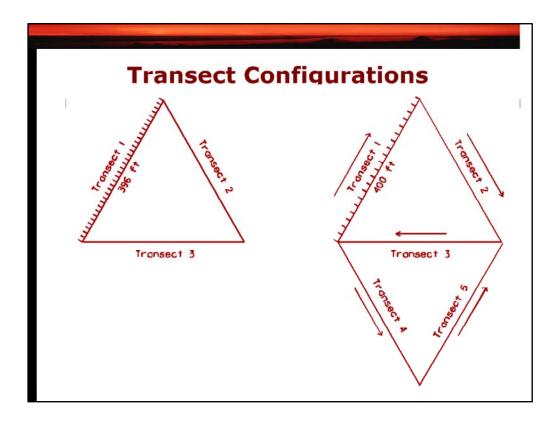
We often use multiple types in the same project – for example for the Tonsina projects we used NPS FirePro, WRST aerial, GRS Transect and ocular, and BLM Transect data.



My preferred method is the Line-point Transect ... it was recently recommended by the Food and Agricultural Organization of the UN as the "most scientifically accurate, easiest-to-use, and most cost effective" data collection method of the four they evaluated.



Example diagram ...



Typical configurations – designed to fit sample area.

We will use a linear transect for narrow riparian areas.

We will also use a square or rectangle.

Like the closed loop as it samples all aspects of the contour of the field site going both across and with the contours if there is slope.

### **Field Data Collection Methodology**

- Alternate Approach Ocular/Rapid Area Assessment
  - Cover by species/feature and canopy layer
    - By size ?
    - By status ?
  - Total Cover
  - Type
  - Average diameter/size and range
  - Ground surface characteristics
  - Trace species



Alternate methodologies – ocular or rapid area assessment – these are the main techniques we have used in most of our AK projects.

However, when you use these techniques there is no way that someone will be able to accurately describe the different species-specific cover components by layer, so my preferred method is the line-point transect.

## **Field Data Collection Methodology**

- Alternate Approach Aerial Survey or Photo Interpretation
  - Cover by species/feature
    - By size ?
    - By status ?
  - Total Cover
  - Type
  - Average diameter/size and range

May be all that the project can afford!



We will use this technique if it is the only means available.

I have never participated in a project yet where the ecologists didn't always want to collect more data and there was always too little funding available for them to do so!

### **Improve Sampling Efficiencies**

- Field data collection is major project cost (> 50%)
- Transportation time to/from site is a major component of field data collection effort and cost (> 50%)

Let's preprocess the project area and allocate samples so that we only collect data at "valid" necessary field sites.

- · Perform a comprehensive sampling effort
- Eliminate collection of redundant data
- Eliminate collection of <u>erroneous</u> or <u>unusable</u> data



Another key Field Data Collection element concerns the field sample design and improvement of field data collection efficiencies.

If funds are limited (which they nearly always are) then we must be able to collect as much of the "best" data as possible with the limited resources we have.

See slide ...

Emphasize:

Eliminate collection of redundant data

Eliminate collection of <u>erroneous</u> or <u>unusable</u> data

# **Field Site/Area Characteristics**

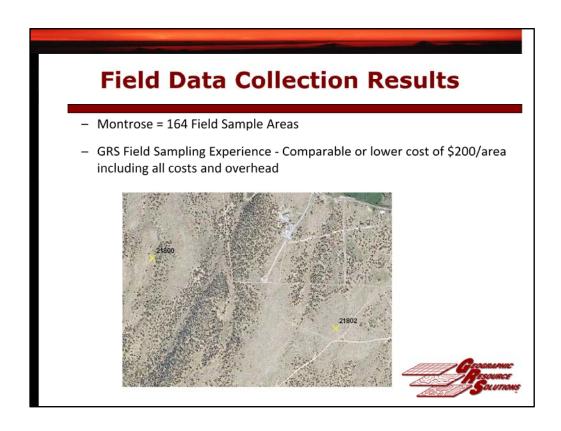
- Homogeneous distribution of their characteristics
  - Single type
- Accessible
- Large enough
  - for an adequate sample
  - to locate in the field
  - to distinguish from neighboring types
- Normally Distributed Image Data



We look for areas that meet these requirements...

One of our RNSP botanists ... "why did you make us hike two miles to sample an area when that type was also by the parking lot?"

Because the close site was not large enough to provide a suitable spectral sample. <u>Areas are picked to serve multiple purposes</u>, not just for the vegetation classification.



For each of these projects we collected data at over 400 "ground truth" sites at an average total (fully loaded) cost of about \$200/site.

# **Field Site Allocation Methodology**

- Build a Candidate Field Site Map Data Set
  - Stratify the Project Area
  - Develop a Candidate Site Database
  - Refine the Candidate Site Database
- Field Sample Plan Development and Administration
  - Rare classes
  - Small classes
  - Common classes



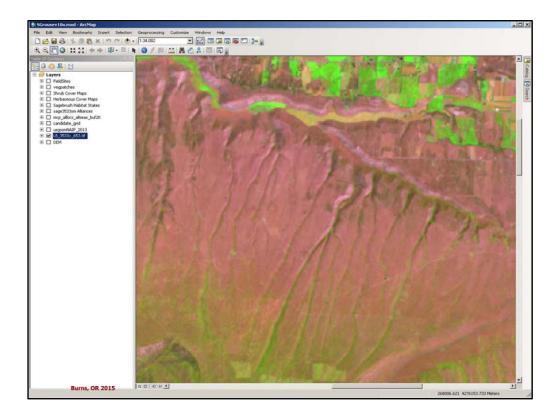
Based on ...

# **Perform Image Stratification**

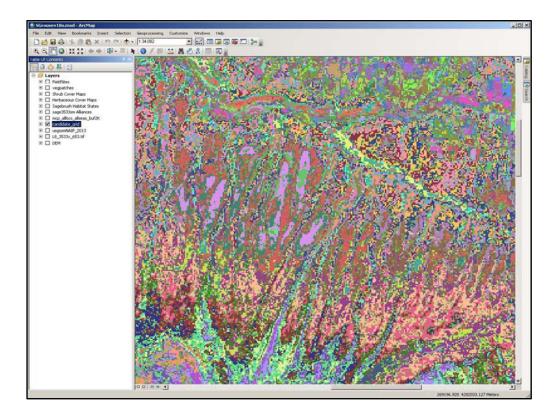
- Use NDVI to separate veg from non-veg image data
- Develop veg isodata classification map
  - ML and MD
- Develop non-veg isodata map
  - ML and MD
- Overlay to merge isoclass data and build final isodata stratification map
- Develop map with 150-250 classes/strata per image



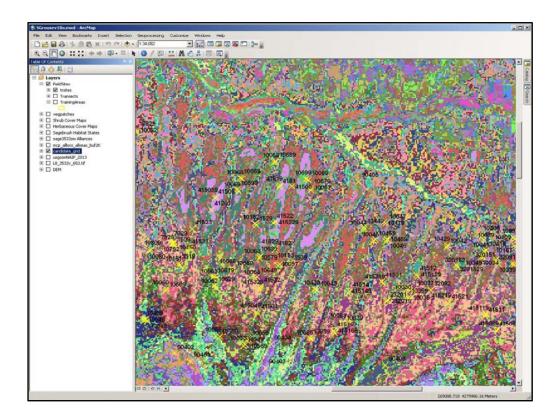
Highlight processes on slide ...



Landsat imagery for the project is classified to develop a stratified data set ...



Note the homogeneous areas ideal for field sampling.



Field Sites already selected ....

These field sites were not selected using our image stratification and therefore, a high percentage ( $^{\sim}45\%$ ) of them were located on areas that lie

In a mixed area or along an ecotone.

Histogram	d:\mqepr	ojects\	usqssm\q	rd\3533stra	ita.grd						
Value F	requency	8	Cum. %	# Pure Samples	# Mixed Samples	Value	Frequency	g.	Cum. %	# Pure Samples	# Mix
VOID	303679	63.14	63.14	Dungs ou	Dungatos	41	946	0.20	92.43	Samples	Sampl
1	1158	0.24	63.38			42	2680	0.56	92.98		
2	5081	1.06	64.44	4	2	43		0.23			
3	4296	0.89	65.33			44	902	0.19	93.40		
4	3595	0.75	66.08			45	1197	0.25	93.65		
5	5786	1.20	67.28	10	6	46		0.35			
6	4442 2304	0.92	68.21 68.69	_	3	47	1186	0.25	94.24		
8	2414	0.48		5	1	48 49		0.11		_	1
9	6301	1.31	70.50	6	1 3	50	547	0.49		-	1
10	6031	1.25	71.75	-	1	51	1601	0.33	95.29	1	1
11	1412	0.29	72.05		-	52	111	0.02		-	-
12	4144	0.86	72.91	4	2	53	2550	0.53		-	1
13	2673	0.56	73.46			54	631	0.13	95.98		
14	221	0.05	73.51			55	1763	0.37	96.34	2	2
15	2397		74.01	5	4	56	494	0.10			
16	1242	0.26	74.27	_		57	1313	0.27	96.72		
17	5337	1.11	75.38	9	6	58	600	0.12	96.84	-	1
18 19	7202 3066	0.64	76.87 77.51	2	1	59 60	1395 671	0.29	97.13 97.27		
20	6676	1.39	78.90	7	2	61	581	0.14	97.39		
21	6132		80.17	_	2 2	62	1221	0.12	97.65		
22	5797	1.21	81.38	_	2	63	1328	0.28	97.92		
23	2961	0.62	82.00		-	64	267	0.06	97.98	1	-
24	5773	1.20	83.20	1	5	65	207	0.04	98.02		
25	2939	0.61	83.81	1	3	66	615	0.13			
26	6116	1.27	85.08	1	2	67	263	0.05	98.21		
27	1396	0.29	85.37			68	323	0.07	98.27		
28	5723	1.19		4		69		0.20	98.47		
29	1257	0.26	86.82	-	1	70		0.19	98.66		
30 31	3410 5410	0.71	87.53 88.65	1 3	4	71	620	0.13	98.79 98.86		
32	5862	1.12	89.87	2	4	72 73	351 642	0.07	98.86		
33	728	0.15	90.02		-	74	59	0.13	99.00		
34	3043	0.63		-	1	75	40	0.01	99.00		
35	933	0.19	90.85		-	76	150	0.03	99.04		
36	1957	0.41	91.26			77	103	0.02	99.07		
37	1291	0.27	91.53			78	277	0.06	99.12		
38 39	1130	0.23	91.76			79	187	0.04	99.16		
	1211	0.25	92.01			80	127	0.03	99.19		

Pure samples are ideal for relating the field data to the imagery.

74/134 were in pure areas while the other 60 were on mixed areas.

Not all vegetation classes were sampled and some (most frequent by area) were sampled more than they likely needed to be (redundantly sampled class)

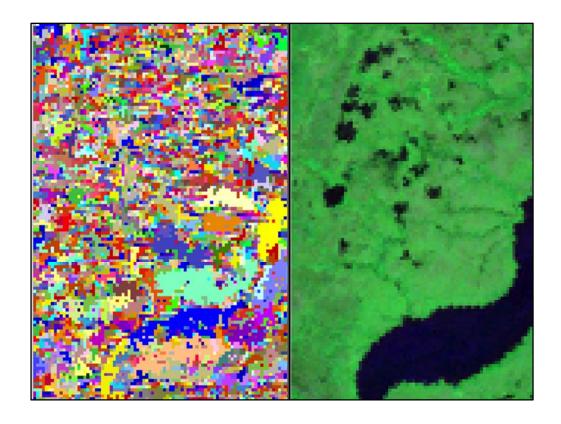
While other classes were likely undersampled.

### **Build Map Data Set**

- Build "Unique Area" grid based on the class number
- Histogram provides number of pixels by class
  - Identify most common classes
  - Identify rare classes
- Estimate Average Size by Class



Highlight processes on slide



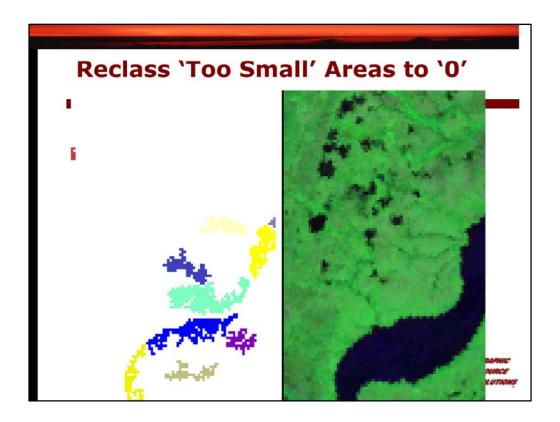
From Katmai NP Project - heterogeneous mix of classes for the basis of the stratification while imagery looks somewhat uniformly GREEN and BLUE

### **Candidate Sample Site Selection**

- Identify largest contiguous areas of each class by setting a minimum size threshold for sample areas
- Determine missing or rare classes
  - Those having less than 5 sample areas
- Add additional candidate areas to supplement scarce or missing classes by lowering the minimum size limit until a sufficient number of the largest size areas of each class have been identified



This enables me to ...

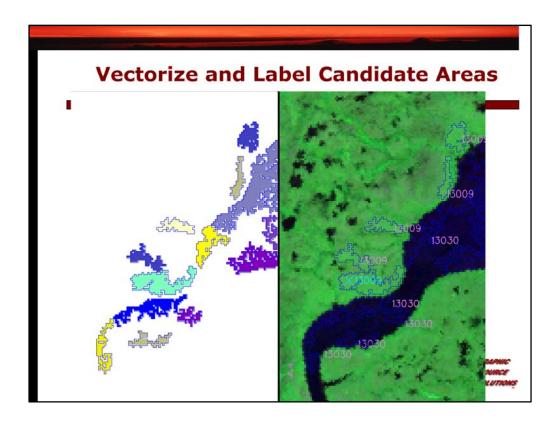


Filter out areas too small to sample leaving only the larger homogeneous areas

#### **Characterize Candidate Sites -**Frequency(Count) by Class iso class freq pixels ave size

We can develop a summary of pixels/area by class which indicates numbers (freq) and average size.

Use this to identify rare classes or classes of small average size.



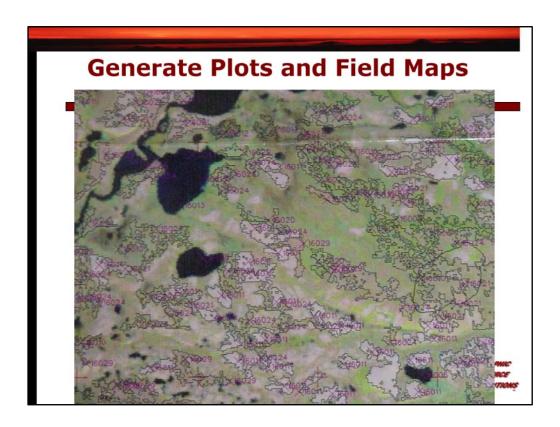
We then Vectorize the grid and Label the filtered candidate areas with their Class #

# The Candidate Training Site Database Contains ...

- Land cover class value
- X,Y coordinates
- Area number of pixels
- Slope, aspect, and elevation
- Scarcity flag
- Small size flag



We populate specific area attributes for each candidate area.



We can then create and plot field maps ... useful for planning purposes and for selecting other alternate nearby areas, if sampling plans cannot be followed.

#### **Candidate Site Selection Criteria**

- Minimum number of samples per class
- Access
- Distance traveled
- · Scarcity of class
- Proximity of candidate training sites to each other
- Sampling efforts dispersed across the entire project area



I consider these attributes when selecting candidate areas and ...

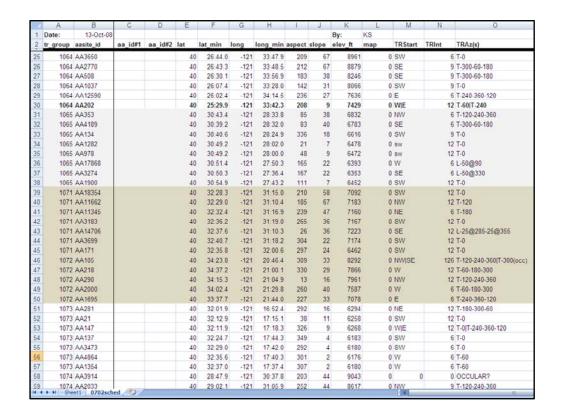
# Sampling Plan Development and Administration

- Daily plan development
  - Identify needs for scarce classes first
  - fulfill daily plan using nearby areas of common classes
  - fulfill overall plan requirements with other needed classes
- · Annotate field maps
- Monitor progress
- Update plans and schedule



... building daily and weekly sampling plans.

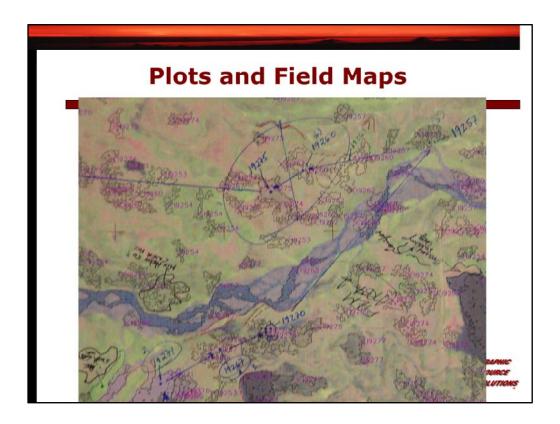
We can then use all of these plans to monitor our progress, track our results, and modify our schedule, if necessary



We can then print the plans and schedules for the field crews and assign groups of sites to specific field crews.

Plans now include all necessary info describing the layout of the transect – starting point, configuration, azimuths, and spacing.

We load the coordinate data and target id values in this schedule right into GPS units



Field maps are annotated by field crews to show sampling plan.

Field crew can add their own notes as they visit sites and implement the plan.

#### **Maintain Field Site Database**

- Update as we go so we always know
  - What we have sampled
  - What we still need to sample

Guommic Hasource Souvrous

Burns, OR 2015

...

Now on to the next key element of our methodology – Discrete Classification

### **Different Mapping Approach**

- From the Ground UP rather than Sensor DOWN
  - Determine where different plant communities & landscape features exist on the ground
  - Sample them
  - Evaluate the imagery to determine if we can relate those plant community/landscape features to distinctly different spectral patterns present in the imagery
  - Map the different features based on those relationships

"We don't try to "see" the vegetation in the imagery.

We see it on the ground in our field data."



See slide ... emphasize "Ground up" rather than "Sensor down"

This is a critical concept/difference between how we develop the map data sets and how others do this. We don't try to "See" the features in the imagery.

#### "Discrete" Classification

- Develop a 1:1 correspondence of a ground truth field sample area to a spectral training class
- Map shades-of-gray rather than distinctly different classes
- Use confusion and "mapping fidelity" to verify the shades-of gray represent the continuums of related plant communities and/or landscape features
  - Can be performed using any image processing package, as it is a variation of supervised classification techniques.
  - Needed to find a vendor who would increase the number of classes that could be identified. All were limited to 255 – the maximum value of 8-bit data.



We then developed a classification method we call "Discrete Classification."

It involves a 1:1 correspondence between our training areas and our spectral classes.

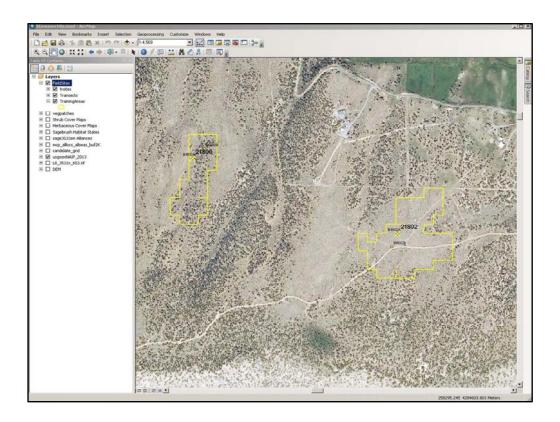
This approach maps many shades-of-gray that represent the multi-dimensional continuum of landscape and plant community features found within each project area.

### Training Approach ...

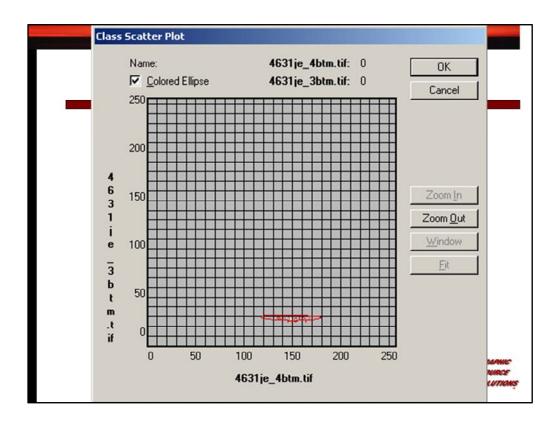
#### • Each Training Site is a Spectral Training Class

- Limit statistical range of spectral statistics
- Build training sets with many, many classes that have small statistical variances
- Process training sites as individual classes rather than by clustering them by some categorical value
- Can limit application of training class data using area masks to represent different ecoregions
- All training class data are available in each class map until excluded through operator intervention

Review slide ...



Example from USGSSM project of two field sites and their spectral training area polygons.



We review the spectral data collected for every field site – and verify that we have generated spectral signatures with small variances

How do we know we have created good relationships between the field sites and the imagery?

# Training Site Evaluation - Are These Good Relationships?

- Spectral/Confusion Report
  - Good versus bad confusion
- Fidelity Report
  - Training areas classify correctly



We have two ways to verify we are mapping shades-of-gray and eliminating confused training classes

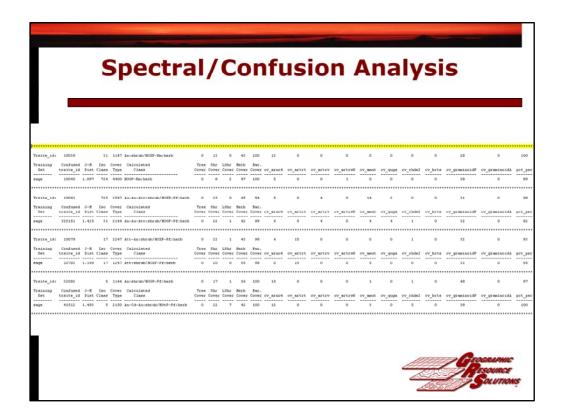
## **Spectral/Confusion Report**

- · Identify potentially confused sites
  - Statistically close signatures
- Review site characteristics
  - "Good confusion" verifies the validity of the confused sites
  - "Bad confusion" indicates a potential classification problem that needs resolution



First, we generate a Confusion Report – in which we can identify "GOOD" and "BAD" confusion.

We will need to resolve the sites that indicate "Bad confusion."



Confusion examples – we review similarity of vegetation characteristics of confused sites.

We use these related sites to verify we are recognizing shades-of-gray of slightly different different types –

or verify "We have a PROBLEM, as indicated by BAD confusion" between completely non-related different types.

#### **Fidelity Evaluation**

- · Perform self-classification of field training areas
- . Do we get the same attribute values?
  - Compare vegetation/land cover characteristics to determine suitability of "match" between field data and classification estimates



We also review the classification results to determine how well a training areas is classified. We review the degree of "self-classification" of an area and the training area's calculated (weighted average) attributes for the area compared with the actual field data values collected there. Are they the same or is it different? Significant differences indicate data migration away from field estimates due to infiltration of the training area by dissimilar classes. This infiltration of different classes is due to BAD confusion.

١.		Fidelity Report													
A	8	c	D	E	F	G	н	8J	BK	BL	8M	BN	BO	BP.	
			Type	Self		pixel									
Trset		typeNuml	Match	Match	%Self	count	calc_class	cv_ARNO4 c	v_ARTRT	cv_ARTRV	cv_ARTRW cv	TUMA	cv_CHDE	cv_MAFR cv	
	10029														
/ersion1_ml	10030		м	м	90%		Atv-Sr-Au:shrub/HOXX-Km:herb	0.8	0		0.1	3.3			
age_ml	10030		M	m	74%		Atv-Sr-Au:shrub/HOXX-Km:herb	0.8	0		0.1	3.3			
iage_md	10030	1000000	m	N	24%		Atv-An-Au:shrub/HOXX-Km:herb	5.3	0.3		1.4	3.4			
TrainingCalc'd	10030					1	Atv-Sr-Au:shrub/HOXX-Km:herb	0	0	21	0	3	0	0	
****	10030														
/ersion1_ml	10030		м	M	94%	20	An-Au-Atw:shrub/HOXP-Km:herb	6	0	0	3	3	0	0	
sage ml	10031		M	M	94%		An-Au-Atw:shrub/HOXP-Km:herb		0			3	-	-	
sage_md	10031		M	M	84%		An-Au-Atw:shrub/HOXP-Km:herb		0		2.5	3.1			
TrainingCalc'd	10031				0476		An-Au-Atw:shrub/HOXP-Km:herb		0			3		2.0	
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/ersion1 ml	10032		M	M	100%	9	Atv-Qg-Au:shrub/HOXX-Pp:herb	0	0	21	0	.5	0	0	
age_ml	10032	2349	M	M	100%		Atv-Qg-Au:shrub/HOXX-Pp:herb	0	0	21	0	5	0	0	
age_md	10032	2349	м	m	67%		Atv-Qg-Au:shrub/HOXX-Pp:herb	0	0	14	0	3.3	0	0	
TrainingCalc'd	10032	2349				1	Atv-Qg-Au:shrub/HOXX-Pp:herb	0	0	21	0	5	0	0	
*****	10032														
	10032														
/ersion1_ml	10033		M	M	100%		An-Au-Atv:shrub/HOGP-Pf:herb	10.4	0.6		0	8.4			
age_ml	10033		м	м	75%		An-Au-Atv:shrub/HOGP-Pf:herb	9.9	0.6			8.4			
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	10033	2144				1	An-Au-Atv:shrub/HOGP-Pf:herb	11	0	2	0	10	0		

On a site by site basis we review and identify significant differences of characteristics where the weighted average values are deviating from the field estimated values. When data are migrating away from the ground truth values it is due to spectral confusion with sites that have different characteristics.

#### **If There Are Confusion Issues?**

- Identify problem situations
  - Significant deviation of site attribute(s)
- Training site data are acceptable after problems have been resolved, otherwise ...
  - Correct bad data
  - Reposition
  - Retrain
  - Reprocess
  - Review



We resolve these issues as best we can ...

See slide ...

Sometimes we find problems in the field data collection efforts.

WRST example – consider site 71606 which was originally called a White Spruce site ...

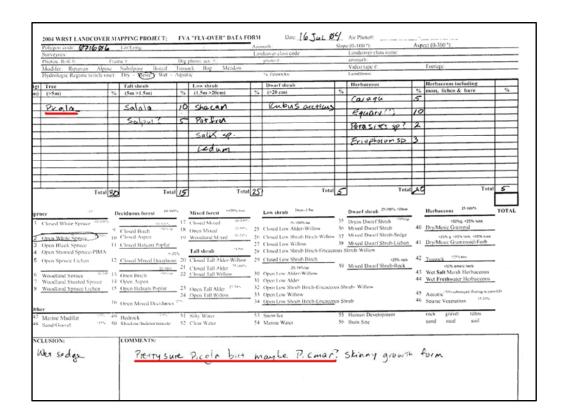


This Woodland White Spruce type was confused with several Black Spruce types

In the Fidelity Report cover values migrated from PicGla to PicMar cover

What the heck? We tried all sorts of retraining approaches but none resolved this confusion.

Finally went back and looked at data sheet!



#### Low and behold!

The botanist had indicated she might have miscalled the species and that it might be Black Spruce !!!!!!

While the botanist was uncertain, our QC processes identified the problem and indicated a need to correct the species to resolve it!

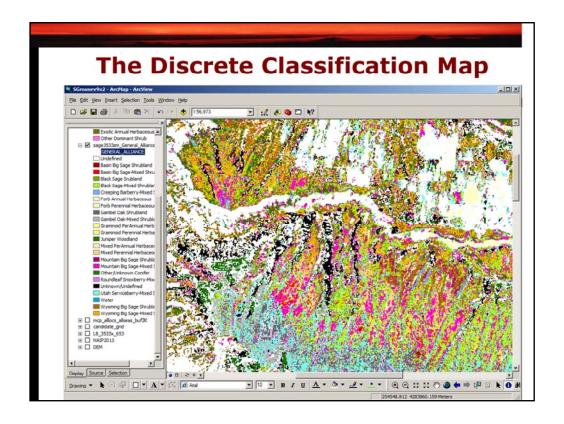
#### **Discrete Classification Results**

- Discrete classes identified and mapped
  - 170 classes



The DCMM map was comprised of 170 pixel classes.

We need to transform these classes into stands that all meet the Minimum Mapping Unit size limit(s).



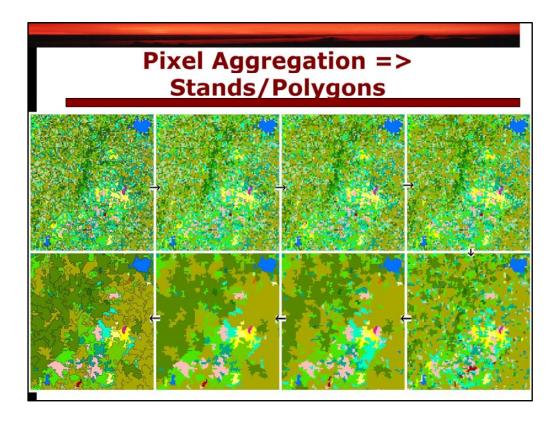
Here is the resulting pixel classmap symbolized by alliance

So how do we build the stand map.

#### THIS CAN BE A BIG BIG PROBLEM!!!!!!!!!!!

Key reason people use eCognition and gave up on this type of approach.

However, recognize that Segmentation has been around since 1980's – nothing new.



We use the detailed species-specific cover data to form groups of "similar" and dissimilar pixels that will eventually form stands, which all meet the minimum mapping size limit.

(This step can be replaced by using the boundaries created using an object oriented classification approach,

but I think this approach is better as it is based on plant community characteristics rather than spectral data).

It can also be replaced using hand drawn photointerpreted boundary linework.

#### **Ecological Rule-based Pixel Aggregation**

- The classified pixel is a stratum in a stratification
- Each stratum represents a distinct set of cover, size, and species descriptions that are based on field site data collection efforts or other data descriptions
- Polygons are formed by grouping areas that have the most similar or related vegetation/landscape characteristics
- Iteratively process data until all polygons meet minimum mapping unit size limits (MMU)



Each Pixel Class = stratum

Each Pixel Class has attribute values

We group pixels based on the similarity of their values

We continue grouping pixels into groups of pixels (stands) until all groups meet the MMUs

#### Rules Similar to Vegetation Classification Processes

- Generate distance vectors to represent stand differences
  - Species presence/absence as indicated by the number of coincident species relative to total number of species
  - Magnitude of species cover value differences as indicated by the root mean squared cover deviation for all species

#### Can also use:

- Tree size
- Cover by lifeform
- Other characteristics



Similarity is based on a distance vector, just like Ordination

The smaller the vector, the more similar the stands being compared.

### **Minimum Size Mapping Unit**

- Can have different MMUs for different characteristics
- Can vary based on degree of similarity the concept of similar vs dissimilar characteristics
  - Desirable limits higher MMU
  - Critical limits lower MMU



See slide ...

We do not want to merge dissimilar areas, if we can help it.

#### **Generation of Stand Values**

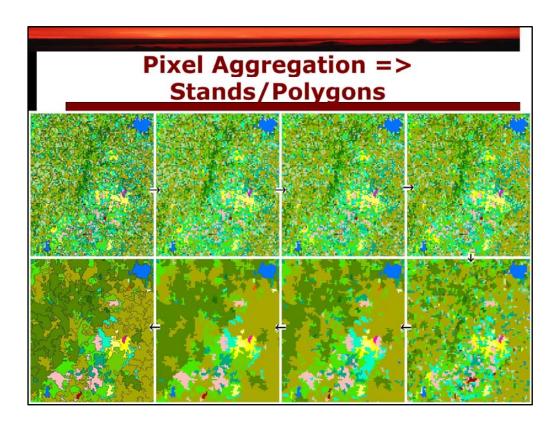
- Maintain a count of pixel classes by individual stand
- Generate the stand values by calculating the weighted average of the pixel class values
- Generate stand categorical estimates by processing discrete estimates using software (Key program) and sql statements



We can generate a frequency distribution of the different pixel class values that comprise each stand.

We develop stand cover estimates by simply calculating the weighted average of the different pixel class values

that comprise each individual stand.



The process is iterative and looks like this if we interrupt it and map the intermediate results as we process the data.

The end map (left bottom) is the one map in which all stands meet the MMU limits for the characteristics of that stand.

#### Our Methodology ...

- ... is not a remote sensing methodology or land cover mapping methodology but rather a <u>means of developing a</u> <u>detailed, quantitative, and comprehensive Natural Resource</u> <u>Inventory</u>
- ... is an <u>integrated approach</u> that has the potential to fulfill the needs of many different users that include ecologists, foresters, botanists, wildlife biologists, fire scientists, resource planners, and any others in need of this type of resource information
- ... can reduce budgetary problems and constraints by addressing and satisfying multiple project needs with an integrated approach

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{read slide}

Not a remote sensing approach

Integrated ...

Can reduce pressure of budgetary constraints ...

#### The Resulting Discrete Classification Map Data Sets Provide

- · A solid foundation of resource information for
  - Inventory
  - Monitoring major and minor changes
  - Analyses
  - Planning applications
  - Modeling applications
- A color-coded NVCS type map and summary info
  - Make these data products <u>by-products</u> of the process rather than the main, sometimes only, products!

In summary, this Discrete Classification map data set has many benefits relative to the traditional generalized approach.

Let the generalized color-coded type map be a by-product of this mapping process rather than the main product.

These detailed map data sets will likely form the basis for monitoring the gradual changes in some species that may be occur associated with future climatic changes.

#### The Question is?

- How long is it going to take before we start using processes that improve the information content of our natural resource map data sets?
- Hopefully not 15-20 years!
- The Remote Sensing\GIS vendors don't know enough about ecology and resource inventory to develop such capabilities on their own.
  - Ecognition, ESRI, and Hexagon = "Can't do this"
- You (Users) need to ask for/demand these type of data be developed instead of just "type" data.
- The Future can be Now!



My opinion is the vendors are now mostly massaging interfaces and providing new ways to access their software ... as the analytical GIS tools we have been using haven't changed in a long time ...

GIS/Remote Sensing staff and Vendors won't magically provide these new types or levels of information to you (users) until you (users) start to ask/demand these type of resource information.

However, based on our efforts, we don't need to wait any longer to have species/landscape-specific estimates.

