

A map of the Mojave Ecoregion, outlined in brown, showing various colored patches representing fire history and future projections. The patches are in shades of red, yellow, green, and blue. The background is a grayscale topographic map of the region.

Fire In The Mojave Ecoregion: Past, Present, And A Little Bit Into The Future

Randy McKinley, Josh Picotte

US Geological Survey

Earth Resources Observation Systems Center

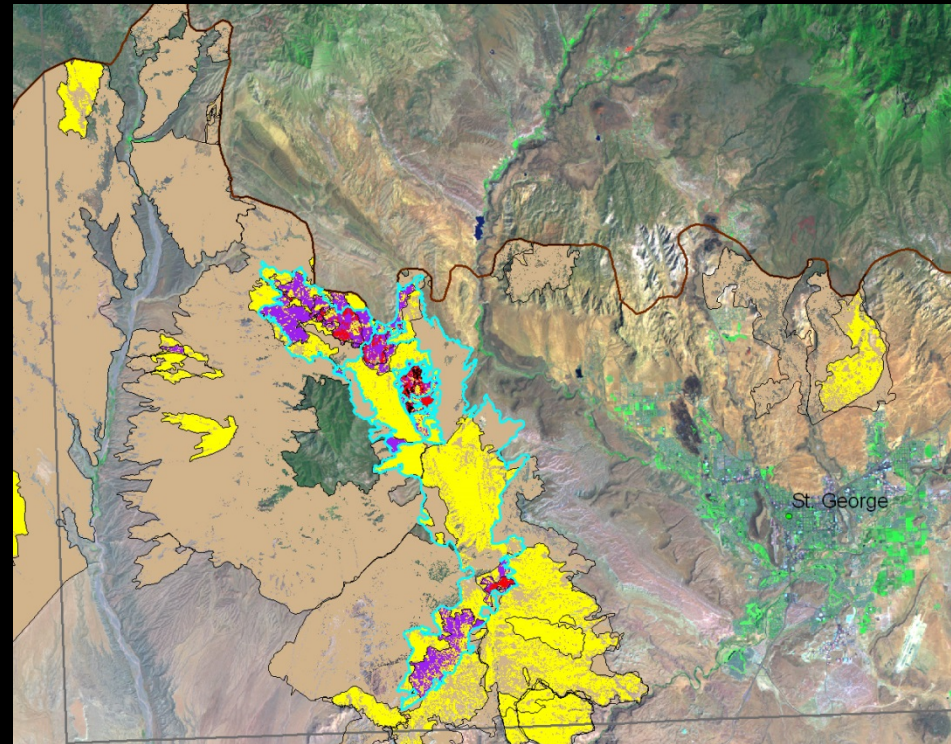
Rob Klinger, Matt Brooks

**US Geological Survey, Western Ecological Research Center,
Yosemite Field Station**



Approach

- Present overview of two large-scale integrated projects
- Explain the derivation of the foundational data for the project
 - Fire severity
- Spatial analysis
 - Brief (Jerry Tagestad's more detailed analysis)
- Temporal pattern
 - Correlations with precipitation and lightning
 - Rarity of 2005 & 2006
- Short-term forecasts
- Transition to Jerry's talk



Overview of Project

Analysis Component

- Overarching goal was to understand ecoregional-scale relationships between climate, fire, vegetation dynamics, and non-native annual species
- Mapping and characterizing fires > 405 ha (1000 acres) provided the foundational data of the analyses

- Severity
- Postfire vegetation dynamics



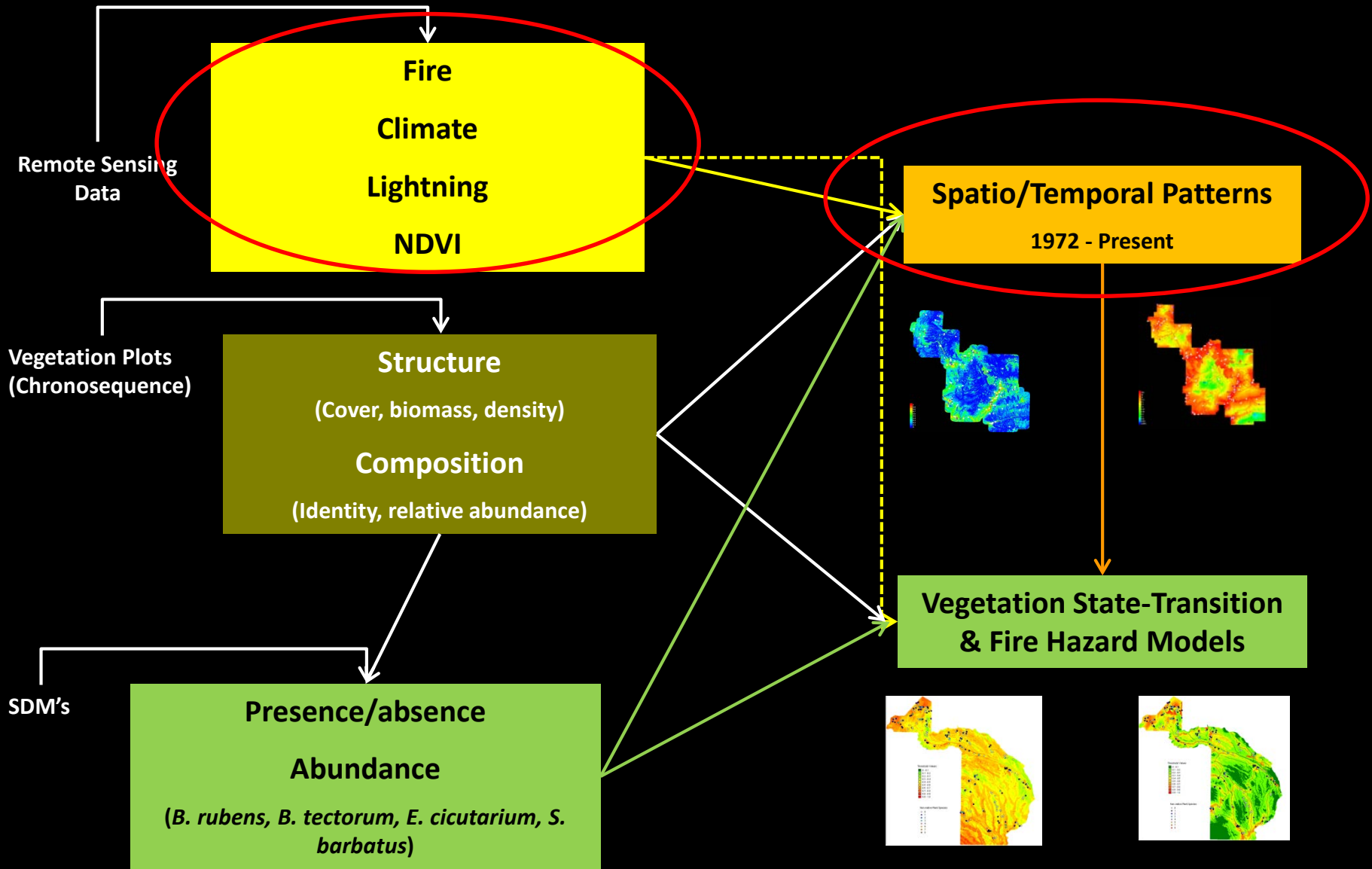
Overview of Project

Modeling Component

- Overarching goal was to use data and information from the analyses to model:
 - **Habitat suitability for four non-native annual species**
 - **Non-native annual species biomass**
 - **Postfire vegetation states and transitions**
 - **Likelihood of ignition across the ecoregion**
 - **Fire severity across the ecoregion**
- Develop tools for managers from these models



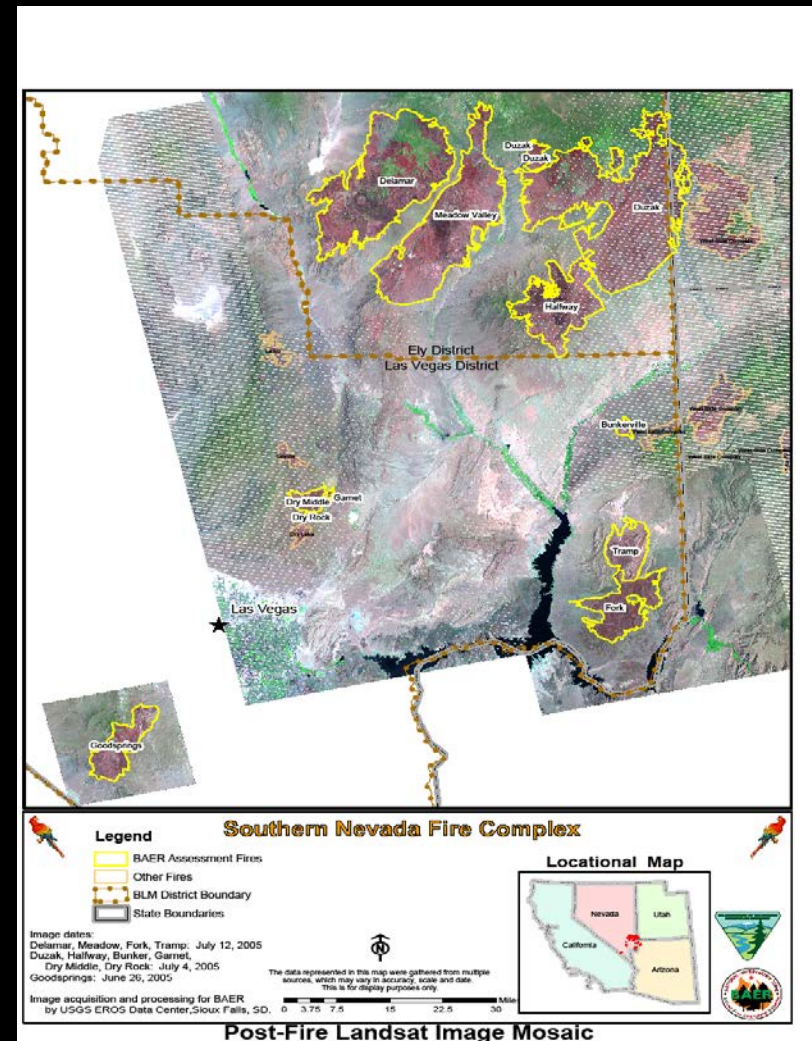
Integrated Multi-Scale Project



Motivation For Project

2005 Mojave Fire Season

- ≈ 51 fires in June & July
- ≈ 385,000 ha in Mojave bioregion
 - 132% of total area burnt in previous 25 years
- ≈ 289,000 ha in Clark and Lincoln counties
- Two consecutive wet winters
- Very wet winter of 2004/2005
- Huge series of lightning storms
- Followed in July 2006 by ≈ 37 fires (≈ 276,000)



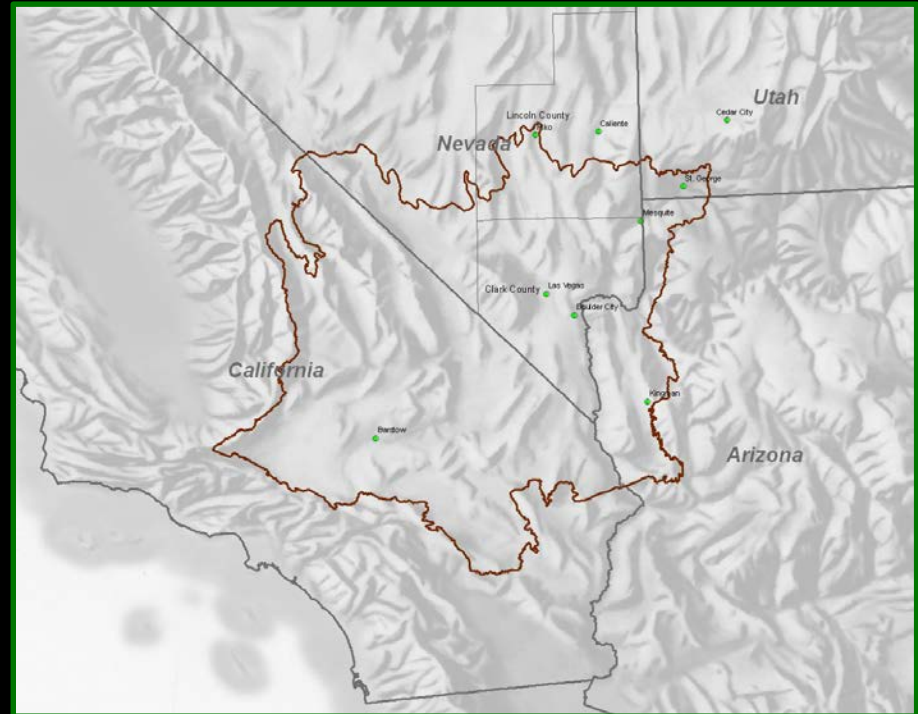
Raised Many Questions

- Was fire in the Mojave increasing?
 - Number of fires
 - Area burned
 - Severity
- Were vegetation communities being altered?
 - Non-native annual species



Fire Mapping As The Cornerstone of the Project

- **An evolving set of objectives**
 - Identify large fires (>1,000 acres) in Lincoln and Clark counties of Nevada for the period 1972 to 2007 using Landsat satellite imagery
 - Expand fire mapping to the full Mojave bioregion
 - Map all “identifiable” fires for the 1972 to 1983 period for the full Mojave including assessments of burn severity
 - Use USGS MTBS project data to characterize fires for the 1984 to 2010 time period
 - **Burned area extent, frequency, and severity over time**
 - Link remotely sensed fire severity and frequency data with vegetation structure and composition



Fire Mapping As The Cornerstone of the Project

- **An evolving set of analyses and models**
 - What constitutes a “good” remotely sensed measure of fire severity
 - Temporal and spatial variation in fire occurrence
 - Short-term forecasts of fire occurrence
 - Model likelihood of ignition
 - Model fire severity
 - Produce dynamic fire hazard prediction surfaces



What Do We Mean By Fire Severity?

- The effect of a fire on ecosystem properties, usually defined by *biomass loss*, the *mortality* of vegetation, or degree of *soil heating*
- Not just fire intensity (heat released per unit area)
- Fire Intensity + Residence Time + Vegetation Characteristics + Soil Structure



How Do We Measure Fire Severity?

Ground-based Measures

- Vegetation characters
- Soil structure
- Composite Burn Index (CBI)
 - Vegetation loss and soil combined
- Some problems with these:
 - Subjective
 - Limited in spatial extent and scope



How Do We Measure Fire Severity?

Remote Sensing Measures



Pre-burn ← Compare Reflectance → Post-burn



Remote Sensing Measures Of Fire Severity

- **Continuous measures**
 - NDVI (Normalized Difference Vegetation Index)
 - dNDVI (Differenced Normalized Difference Vegetation Index)
 - NBR (Normalized Burn Ratio)
 - dNBR (Differenced Normalized Burn Ratio)
 - RdNBR (Relativized Differenced Normalized Burn Ratio)
- **All work on idea of measuring photosynthetically active vegetation (“greenness”) while adjusting for bare soil**



Remote Sensing Measures Of Fire Severity

- Categories (“Severity Classes”)
 - Derived from dNBR/RdNBR
 - Unburned, Low, Moderate, High, Very High



Vegetation Indices (NDVI and dNDVI)

- **The Normalized Difference Vegetation Index (NDVI)** is widely used to identify vegetated areas and to estimate their condition. NDVI is computed using Landsat ETM+/TM near infrared (NIR) and visible red (RED) spectral bands (4 and 3) respectively. Can be derived from other sensors (i.e Landsat MSS) with VNIR bands. NDVI is calculated as follows:

$$NDVI = (NIR - RED) / (NIR + RED)$$

- For burn severity mapping or change detection purposes, the **differenced NDVI (dNDVI)** is calculated using two images acquired at different time intervals (i.e. pre-fire and post-fire) as shown in this example for mapping burn severity:

$$dNDVI = NDVI_{prefire} - NDVI_{postfire}$$

Burn Severity Indices (NBR, dNBR and RdNBR)

- The **Normalized Burn Ratio (NBR)** is computed using Landsat ETM+/TM near infrared (NIR) and short wave infrared (SWIR) spectral bands (4 and 7). The NBR proposed by Key and Benson (1999) is calculated as follows:

$$NBR = (NIR - SWIR) / (NIR + SWIR)$$

- For burn severity mapping purposes the NBR is generally calculated for both a pre-fire and post-fire image and then used to derive a differenced NBR (dNBR) as follows:

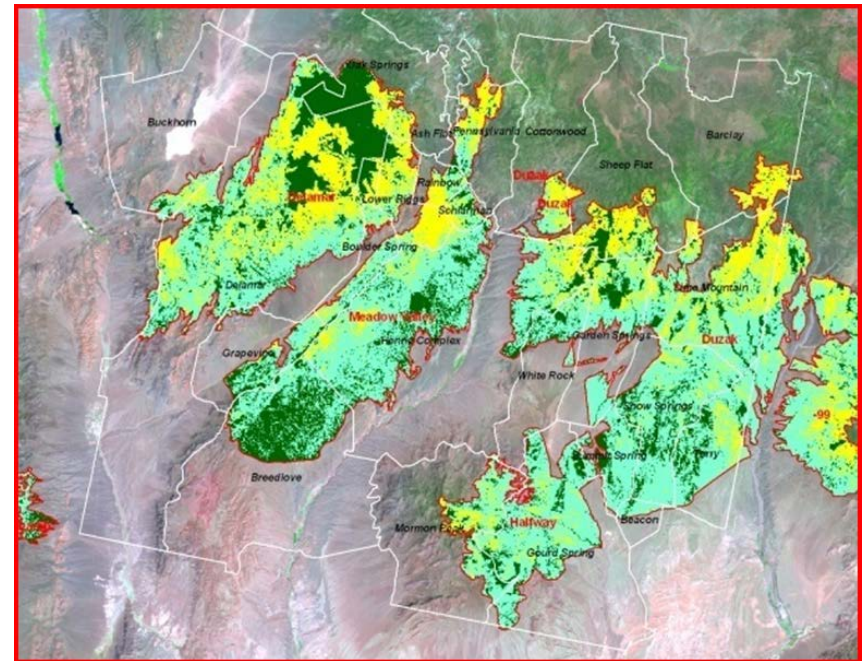
$$dNBR = NBR_{prefire} - NBR_{postfire}$$

- Miller and Thode (2007) proposed the relative differenced NBR (RdNBR) to remove the biasing of the pre-fire vegetation by dividing dNBR by the square-root of the pre-fire NBR as follows:

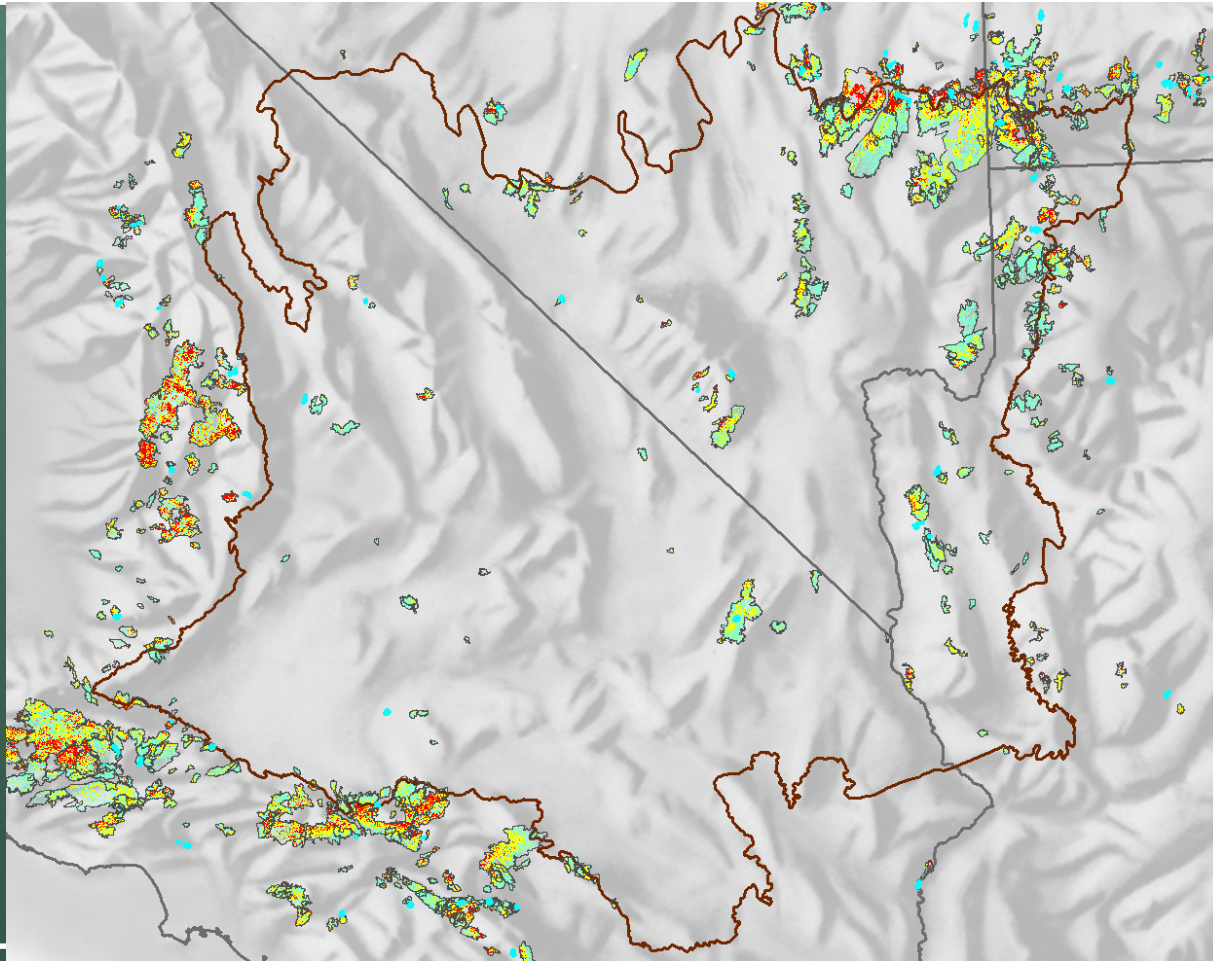
$$RdNBR = (NBR_{prefire} - NBR_{postfire}) / \sqrt{(|NBR_{prefire}| / 1000)}$$

The Mapping Process

- Randy McKinley's 8-year labor of:
 - Love
 - Hate
 - Infatuation
 - Despair
 - Triumph (finally)
- Mapped all fires > 405 ha (1,000 acres) in and adjacent to ecoregion 1984-2010)
- Mapped **ALL** fires in and adjacent to ecoregion 1972-1983)



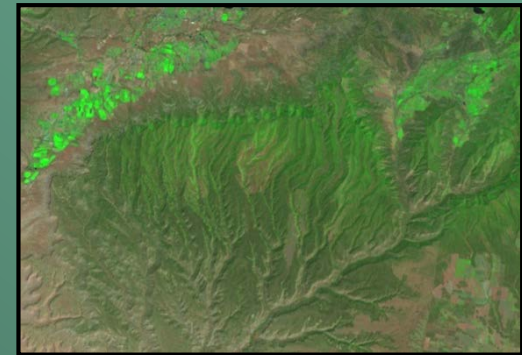
Involved Identifying > 1,000 Fire Perimeters



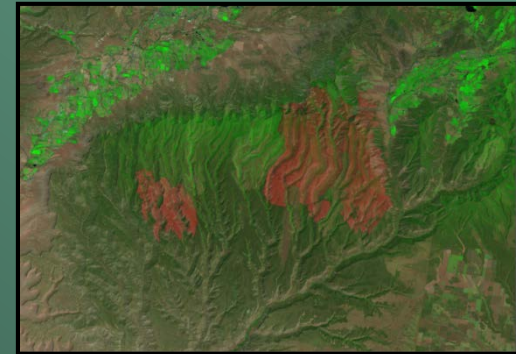
MTBS Process: Landsat Scene Selection

- Dates of pre- and postfire scenes are extremely important:
- dNBR: change detection specifically targeting burned area
- Ideally, results show only change caused by fire
- Pre and Post fire datasets should be chosen to match moisture content and phenology as closely as possible
- Images are terrain corrected and radiometrically processed to at-satellite reflectance

Bircher and Pony Fires of 2000 Mesa Verde National Park



Prefire Landsat: May 23, 2000



Postfire Landsat: June 11, 2001

The Challenge - generating new spatial information for 1972-1983 fires for continuous severity measures

- Landsat satellite imagery spans 1972 to the present
- 1984 to Present – Thematic Mapper sensor at 30 meter resolution and Visible, Near Infrared and Short Wave Infrared (VINIR/SWIR) spectral bands, with SWIR providing increased sensitivity for burn mapping
- 1972 to 1983 - Multispectral Scanner (MSS) sensor at ~57 meter resolution and Visible/Near Infrared (VINIR) spectral bands (no SWIR band)

The Challenge - generating new spatial information for 1972-1983 fires (con't.)

- The Landsat MSS period compared to TM/ETM/ETM+
 - Increased scene registration issues
 - Additional calibration concerns
 - Reduced scene availability for some years
 - Reduced spatial resolution (80m versus 30m)
 - Fewer & less precise spectral bands, no SWIR
 - Increased incidence of bad lines, missing lines
 - Increased noise
 - Reduced radiometric resolution
- Result>> Used MSS and dNDVI to map 1972-2010 fires and SWIR to map 1984-2010

Final Products

- **Burn frequency and reburn trends (1972 – 2010)**
- **Continuous burn severity and other variables for statistical analyses (1984 through 2010)**
 - But vegetation plots spanned 1972 – 2010 burns
- **Categorical burn severity layer**
 - Provide estimate of burn severity (low, mod, high)
 - Commonly used in maps of individual fires
 - ***Could*** provide a consistent measure of severity from 1972 - 2010

Three Issues Of Great Importance To Vegetation Analyses (stay tuned for this afternoon)...

- How well did dNBR compare with on the ground measures of fire severity?
- How appropriate was it to use fire severity classes in analyses of:
 - Large-scale patterns and trends in severity?
 - Vegetation dynamics?
- Was there something we could do about the disconnect between dNDVI and dNBR in different time periods

...and an issue with dNBR

- Lets take a look at the equation again:

$$dNBR = NBR_{prefire} - NBR_{postfire}$$

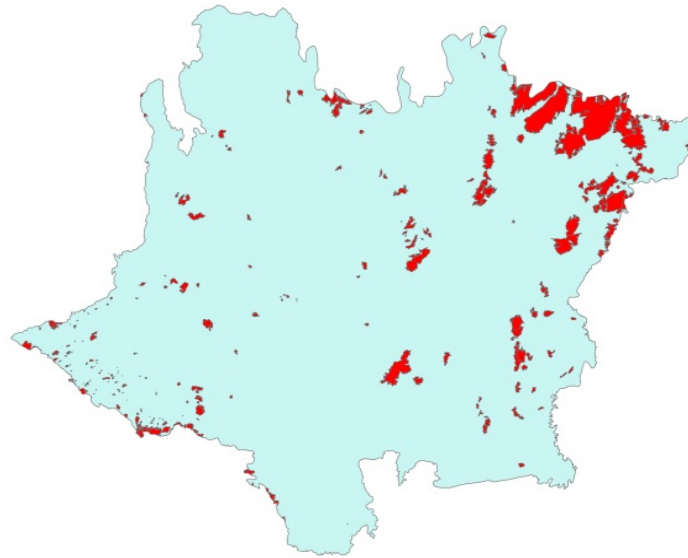
- The NBR values are problematic because they vary from fire to fire
 - Likely confounds comparisons across burns
 - RdNBR is a partial correction but relativizing dNBR introduces other problems
 - Elegant solution
 - Develop an **offset** based on mean dNBR values just outside (≈ 100 m) of burn perimeter
 - Calibrates dNBR among fires to a more comparable scale
-

Now We Can Start Addressing Some Questions

- What are general patterns of area burned and fire frequency in the Mojave ecoregion since 1972?
- Where in the Mojave ecoregion have the fires occurred since 1972?
- Has there been an increase in the number of fires in the Mojave ecoregion since 1972?
- Has there been an increase in the area burned in the Mojave ecoregion since 1972?
- What environmental variables are correlated with variability in number of fires and area burned?
- Can we forecast how many fires or the area burned we are potentially looking at in a given year?

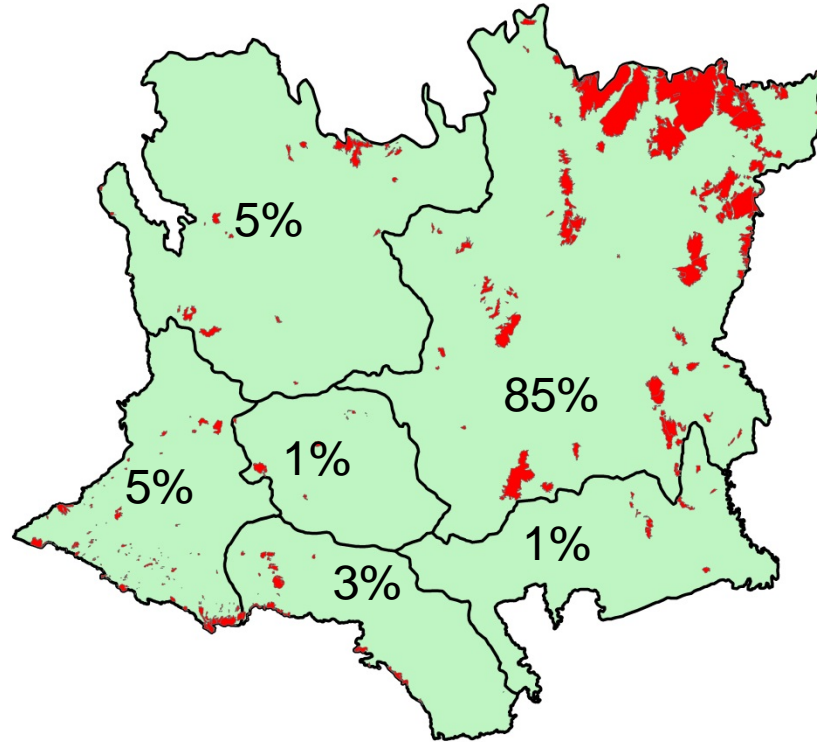
What Are General Patterns Of Area Burned?

- Basic statistics (fires > 405 ha)
 - Number of fires 1972-2010
 - 254
 - Area burned 1972-2010
 - 7,517 km²
 - 5% of ecoregion
 - 76% of area burned has burned one time (3.6%)
 - 20% of area burned has burned two times (0.6% of ecoregion)
 - 4% of area burned has burned > 2 times (0.8% of ecoregion; maximum = 5)



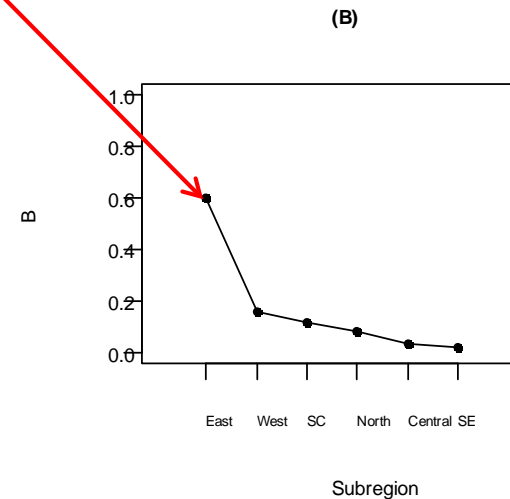
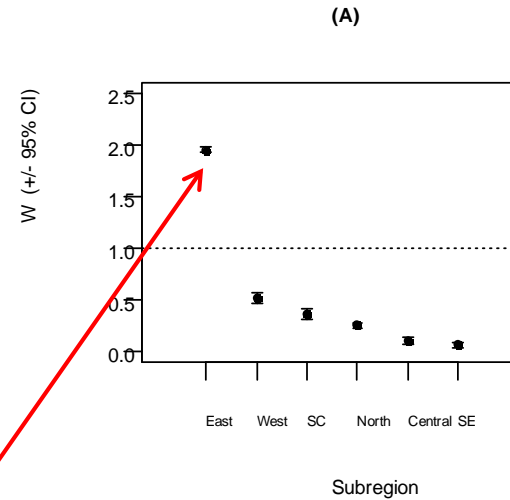
Where In The Ecoregion Is Fire Most Extensive?

- Proportion of total area burned across ecoregion
- Northern
- Western
- Southcentral
- Central
- Southeast
- Eastern
 - The east appears to be a “hot zone”



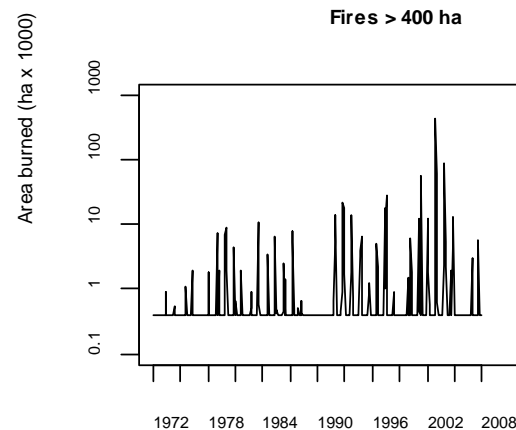
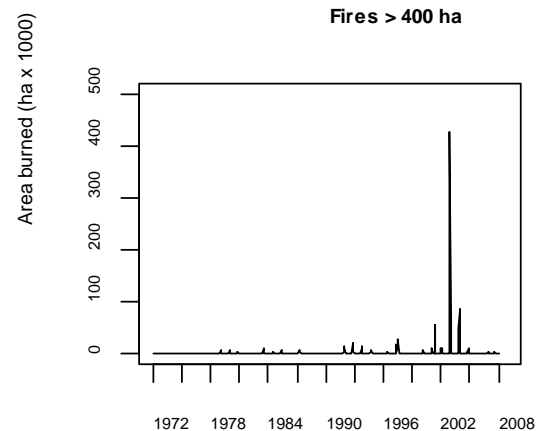
Where In The Ecoregion Is Fire Most Extensive?

- Analysis of fire occurrence relative to area of the region
 - Absolute occurrence
 - Relative to other regions
- The area burned in the Eastern region is 2x greater than expected relative to its area
- The area burned in the Eastern region is 3x - 12x more than the other regions
 - Why? Stay tuned for Jerry Tagestad's presentation



Temporal Patterns

- Main Questions – Set 1
 - Is there evidence of a trend in:
 - Area burned
 - Number of fires
 - Variability in area burned and number of fires
 - 1972 through 2010
 - Ecoregional scale
- But patterns and trends are almost certainly related to other factors
 - Fuels
 - Precipitation!
 - Ignition
 - Lightning!



Temporal Patterns

- Time series analysis (1972-2010)

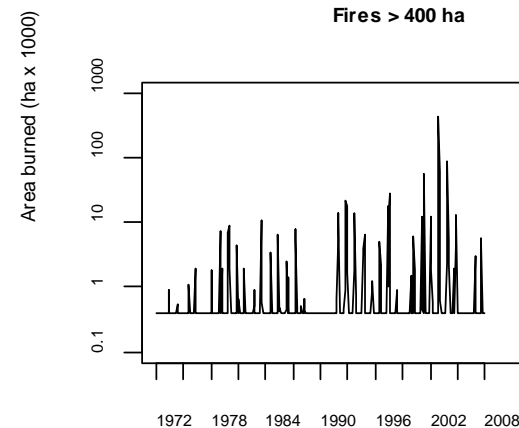
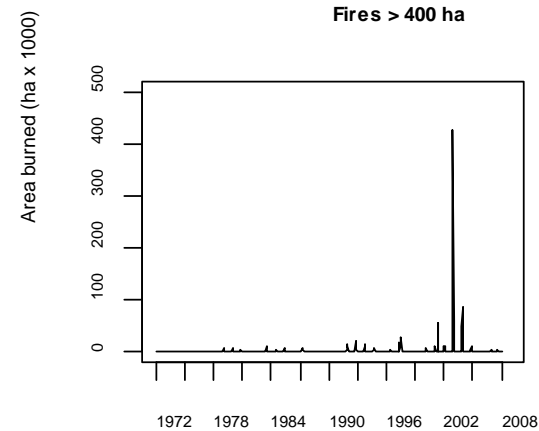
- Monthly number of fires and area burned

- Fine temporal scale trend analysis

- Annual number of fires and area burned

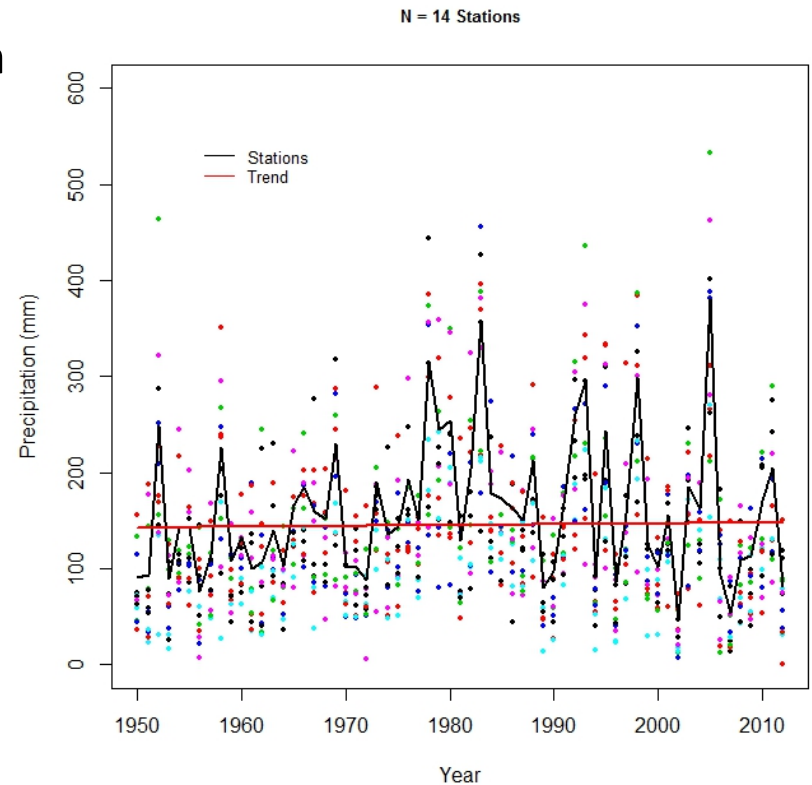
- General patterns for forecasting

- But first we needed to understand patterns in precipitation and lightning



Temporal Variation in Precipitation Regime

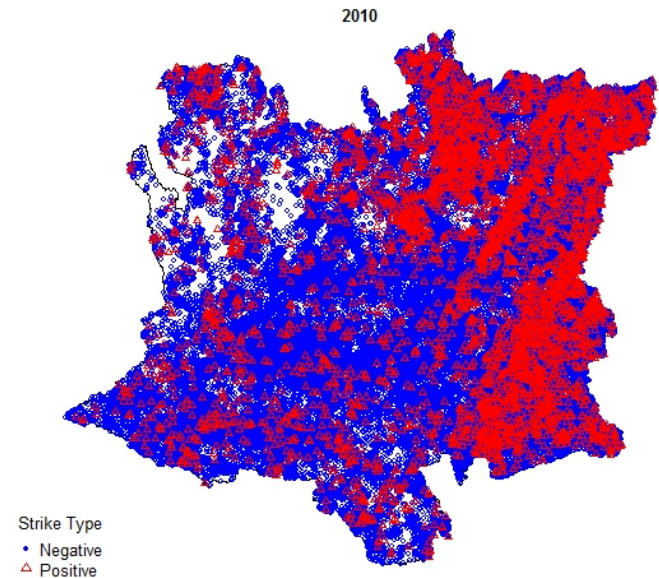
- Main Question
 - What is the ecoregional pattern of variability in precipitation?
 - Spatial variability within ecoregion
- Hereford (2006)
 - Monthly time series 1893 – 2001
 - N = 52 stations
 - Many outside ecoregion
 - Very patchy records
 - Dry periods (1893-1904, 1942-1975) sandwiched between wet periods (1905-1941, 1976-2001)
- Our analysis
 - Monthly time series 1950 – 2012
 - N = 29 stations parsed to 14 with near complete annual records
 - All within ecoregional boundary



High variability but **NO** trend
One main pattern characterizes ecoregion
(Multivariate Autoregressive State-Space Model: MARSS)

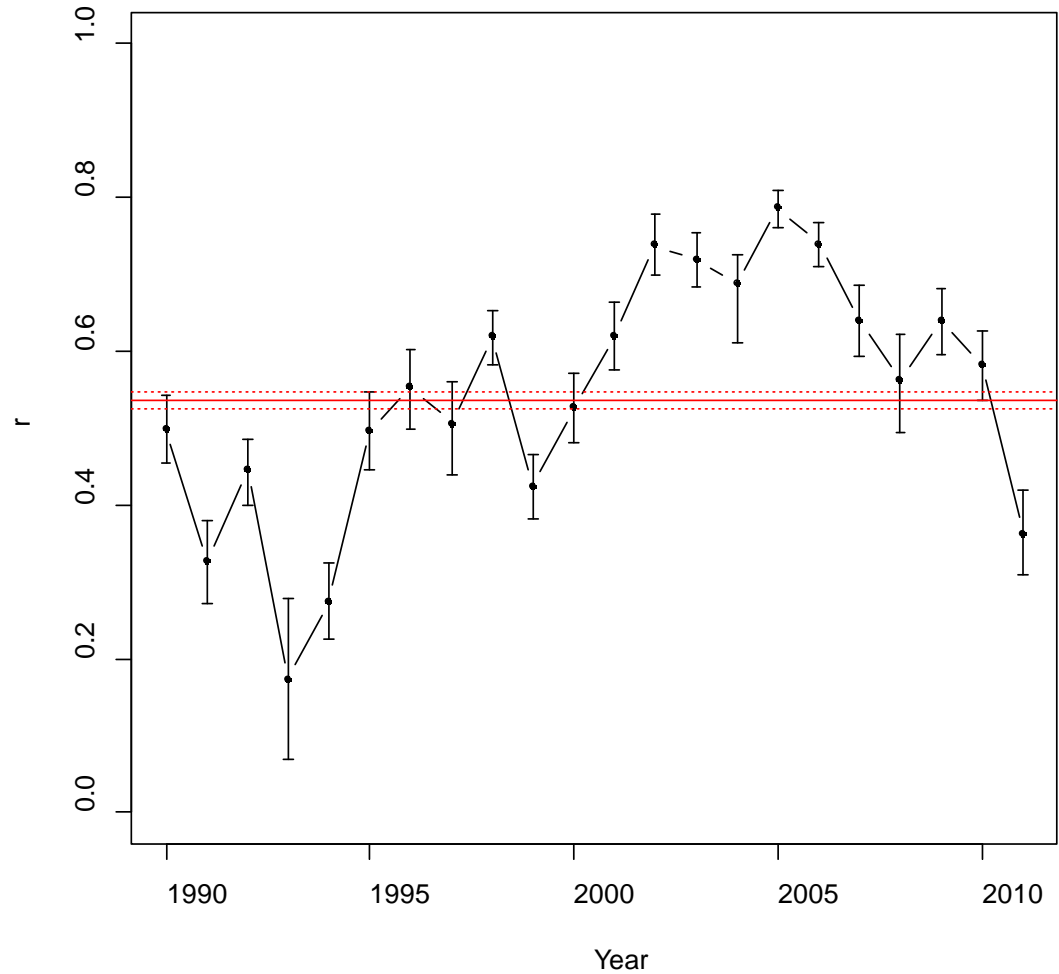
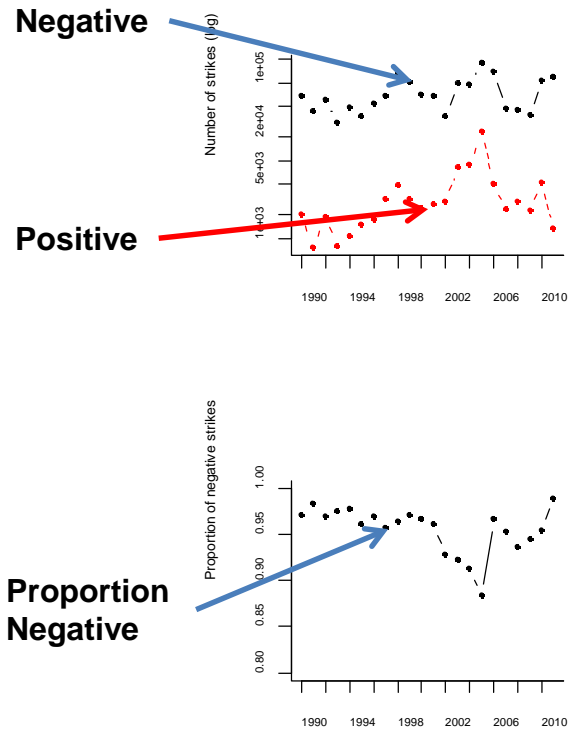
Spatio-temporal Variation In Ignition Patterns

- Lightning strike data (1990-2012)
 - $N \approx 1.8$ million records
 - Negative strikes
 - Most strikes (90 – 95%)
 - “Short” duration (1 microsecond)
 - “Low” energy (30kA, 500 megajoules)
 - Positive strike
 - Low proportion ($\approx 5\%$)
 - “Long” duration (20 microseconds)
 - High energy (300kA, 5000 megajoules)



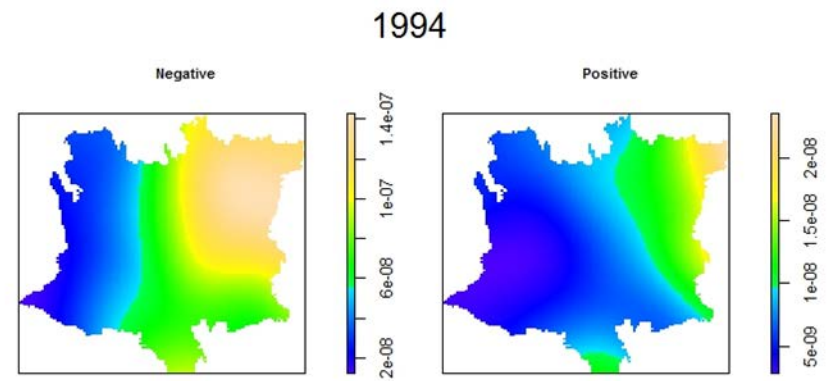
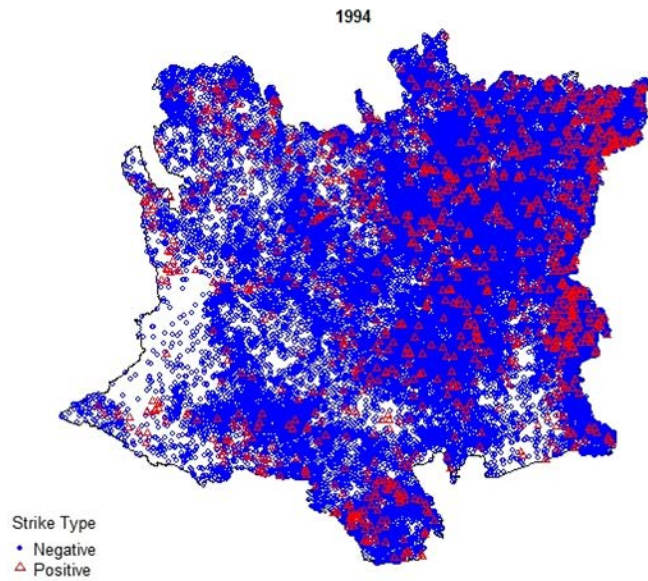
Spatio-temporal Variation In Ignition Patterns

Scale = 100 km²



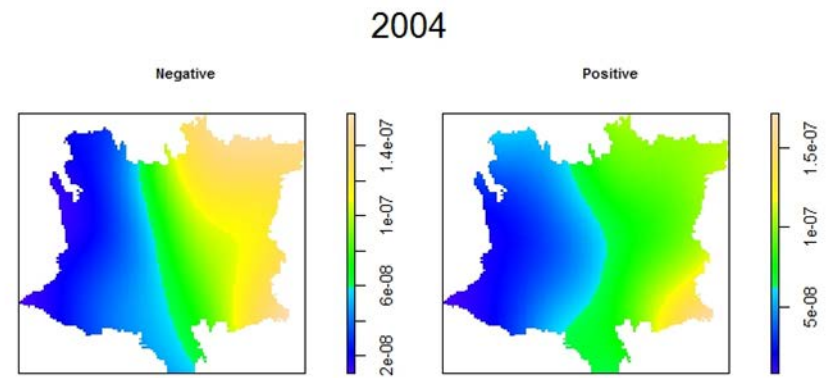
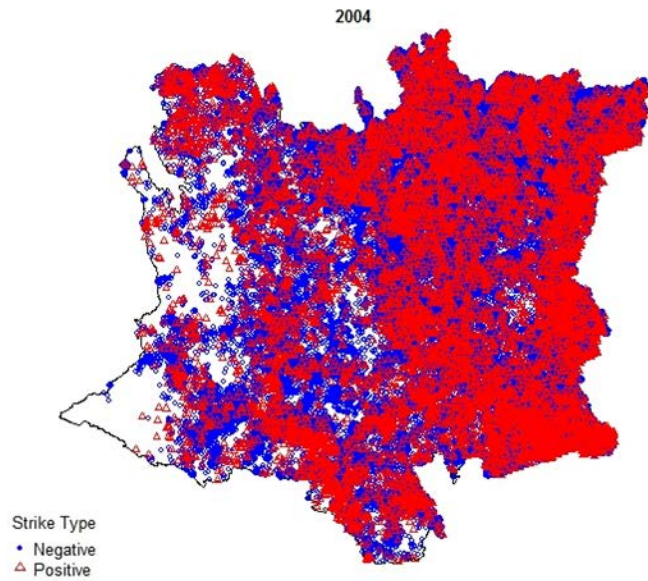
Cross-Correlation Coefficient; No CSR

Spatio-temporal Variation In Ignition Patterns



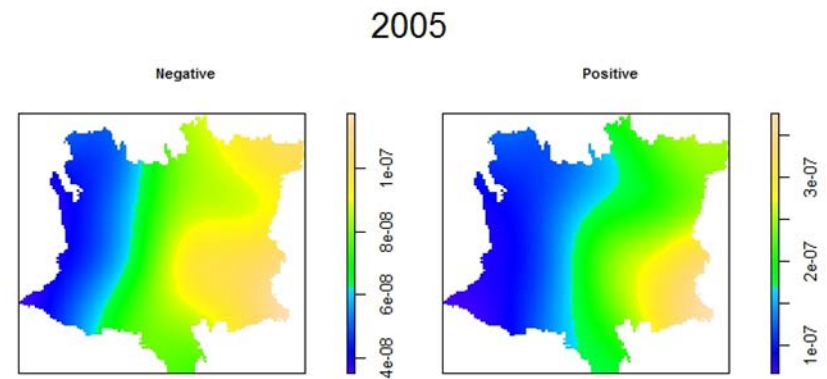
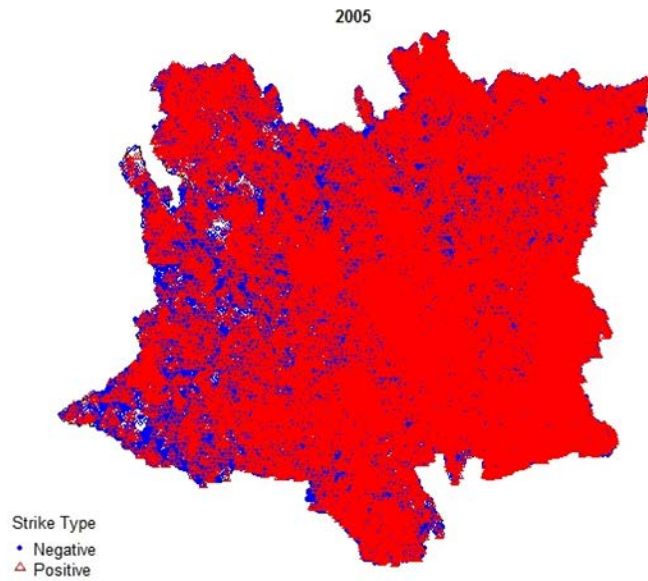
Dynamic Linear Model

Spatio-temporal Variation In Ignition Patterns



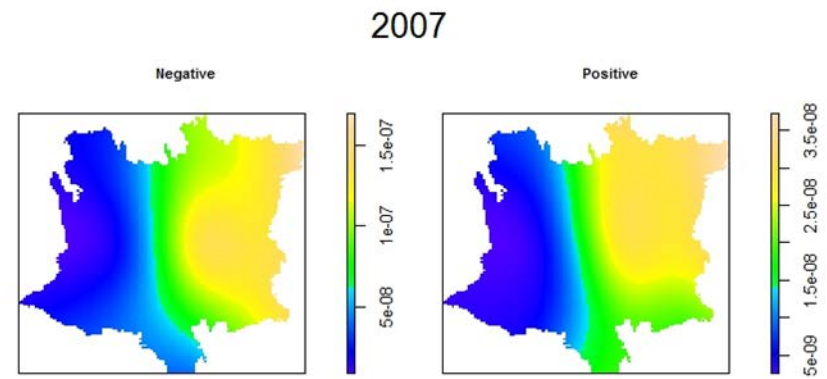
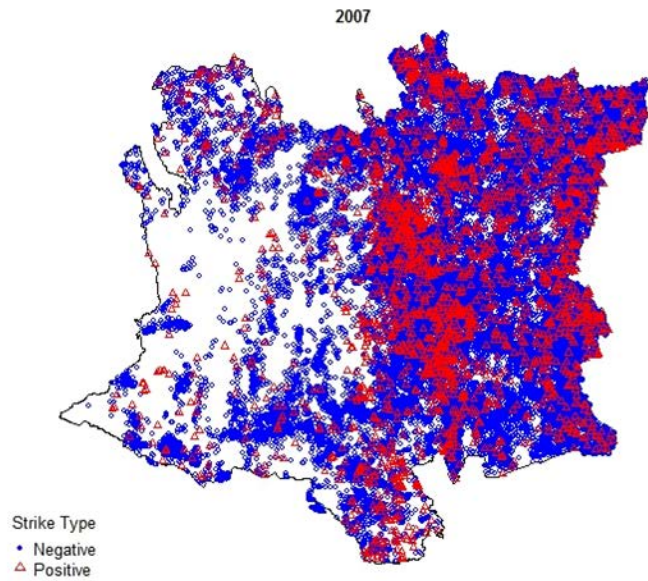
Dynamic Linear Model

Spatio-temporal Variation In Ignition Patterns



Dynamic Linear Model

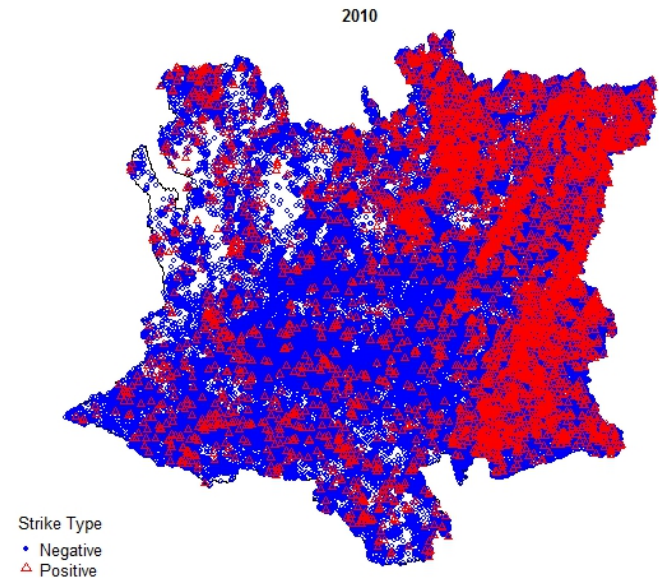
Spatio-temporal Variation In Ignition Patterns



Dynamic Linear Model

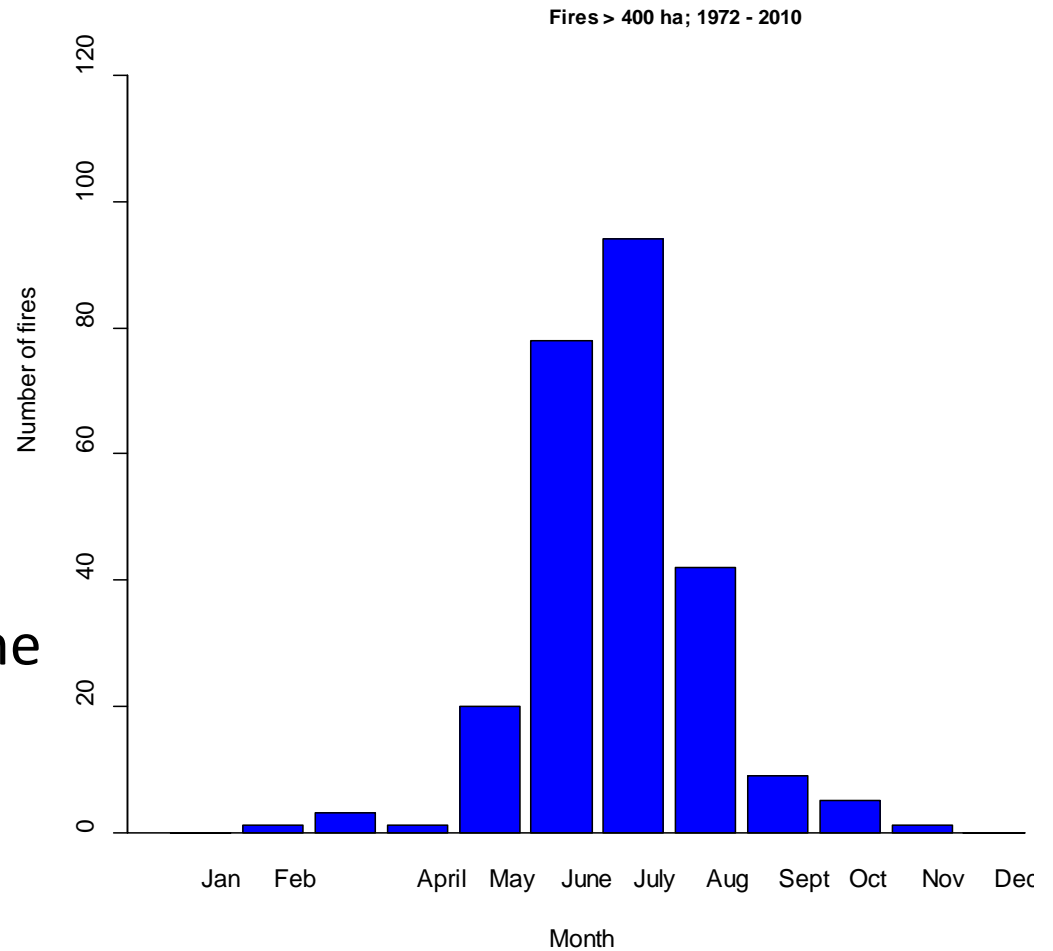
Spatio-temporal Variation In Ignition Patterns

- Summary of patterns
 - No temporal trend in number of negative strikes
 - Increase in number and proportion of positive strikes 1993-2005
 - Increase in spatial correlation of negative and positive strikes 1993-2005, followed by decrease 2006-2012
 - ***Strike intensity “jumps” around spatially in different years***
 - ***Central and west Mojave have much lower strike intensity than east Mojave***



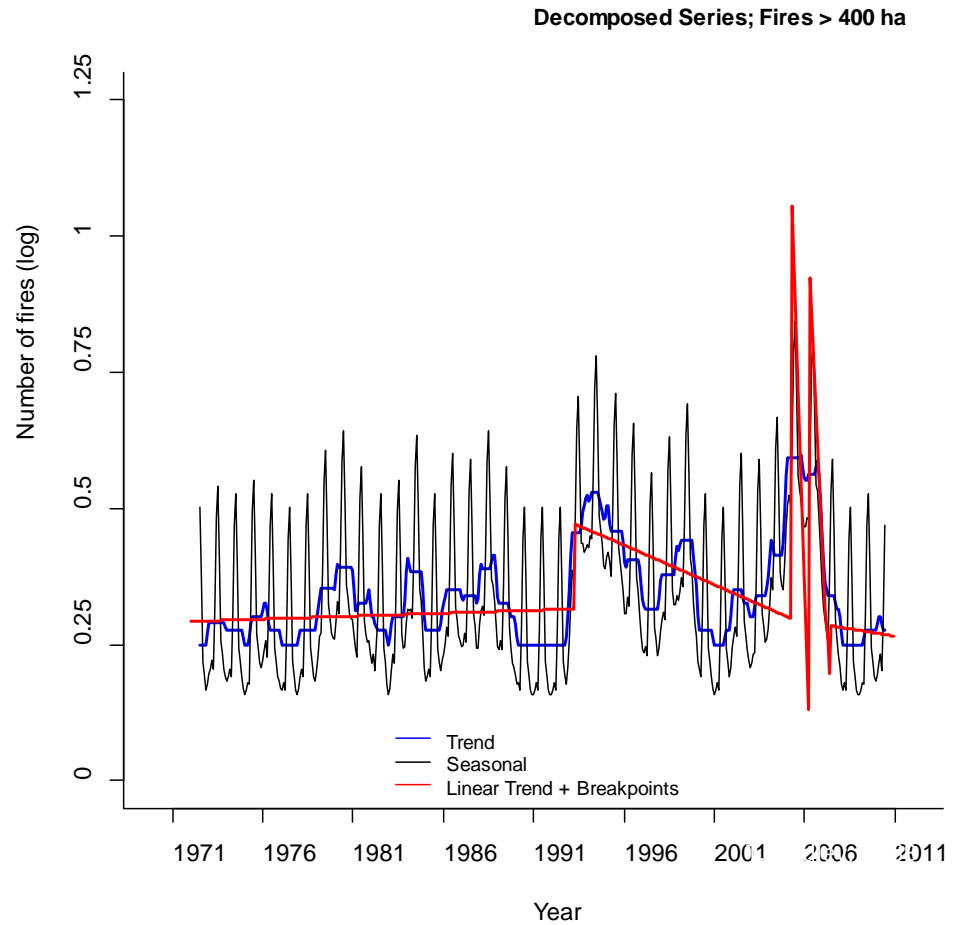
Temporal Patterns In Fire Occurrence

- When does fire occur in the Mojave?



Temporal Patterns In Fire Occurrence

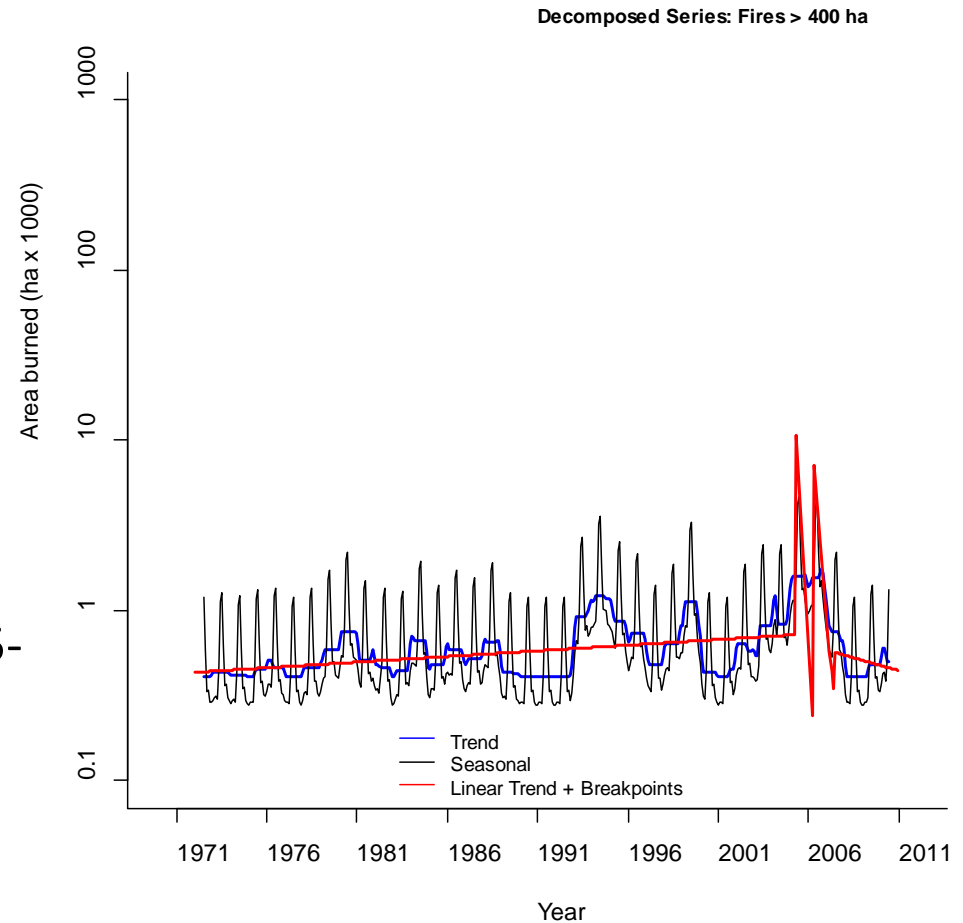
- Has there been a trend in number of fires?
 - Yes, but...
 - Not linear
 - Punctuated by “leaps” in two sets of years



Dynamic Linear Breakpoint Model

Temporal Patterns In Fire Occurrence

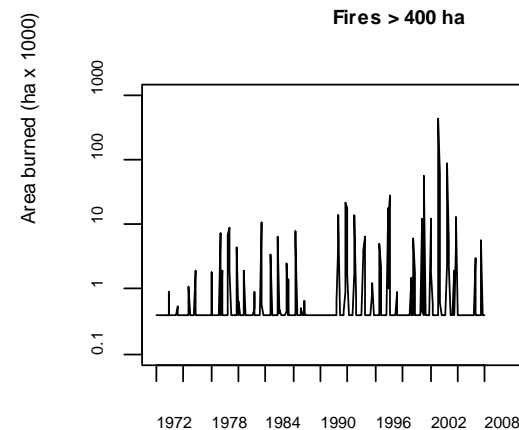
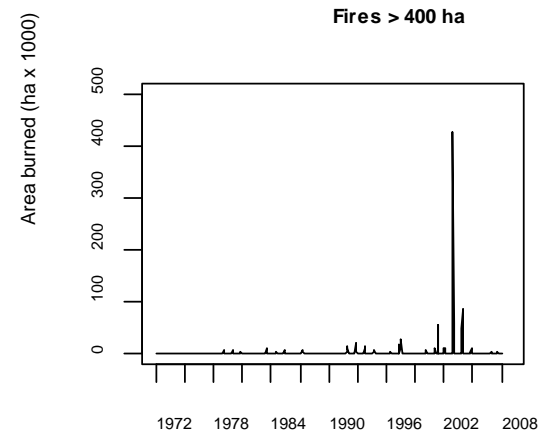
- Has there been a trend in area burned?
 - Yes, but...
 - Not linear
 - Punctuated by “leap” in 2005-2006



Dynamic Linear Breakpoint Model

Temporal Patterns

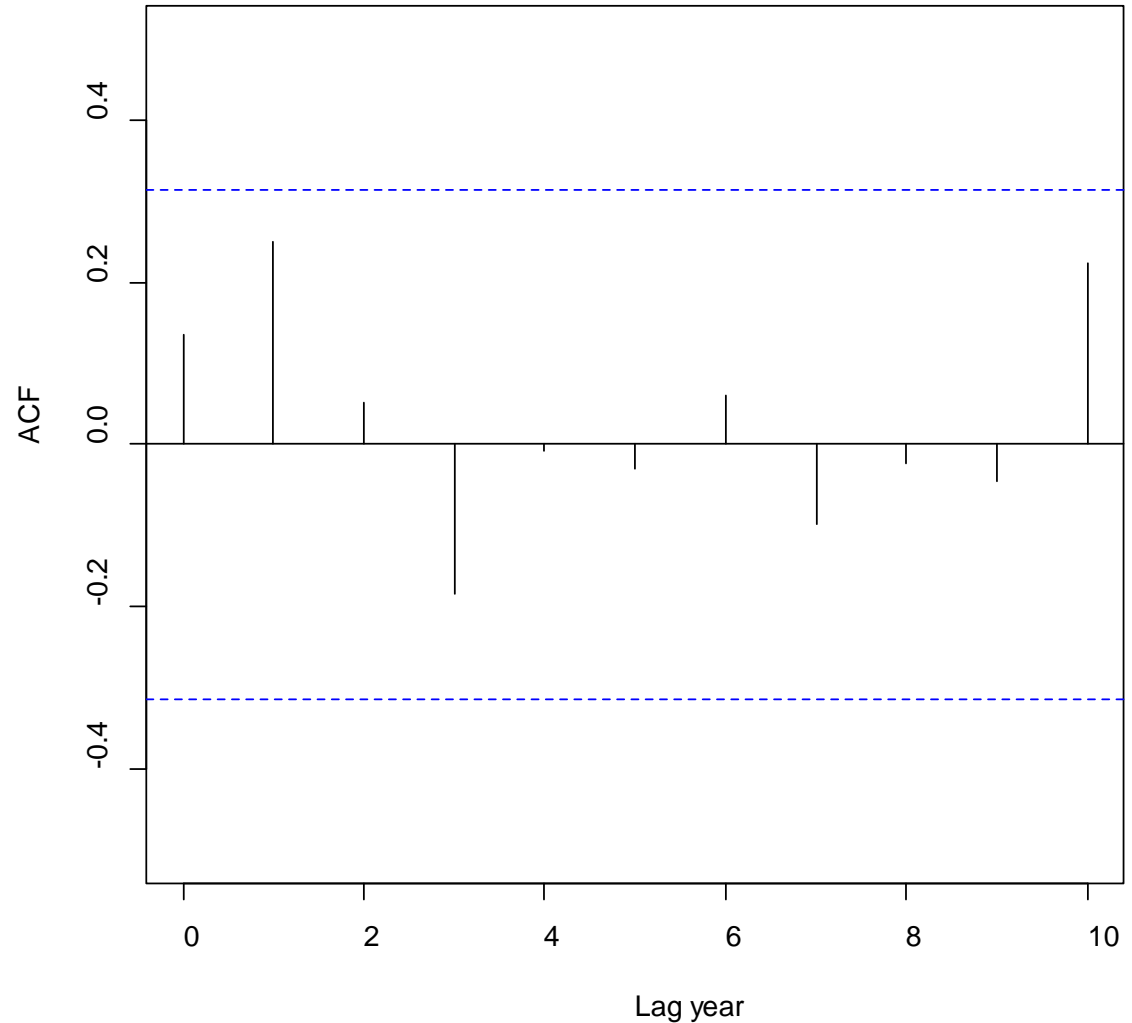
- Main Questions – Set 2
 - Could we use the data to generate short-term forecasts of:
 - Area burned
 - Number of fires
 - 1 - 2 years ahead
 - Ecoregional scale



Temporal Patterns In Fire Occurrence

Cross-Correlation Area Burned & Precipitation In C

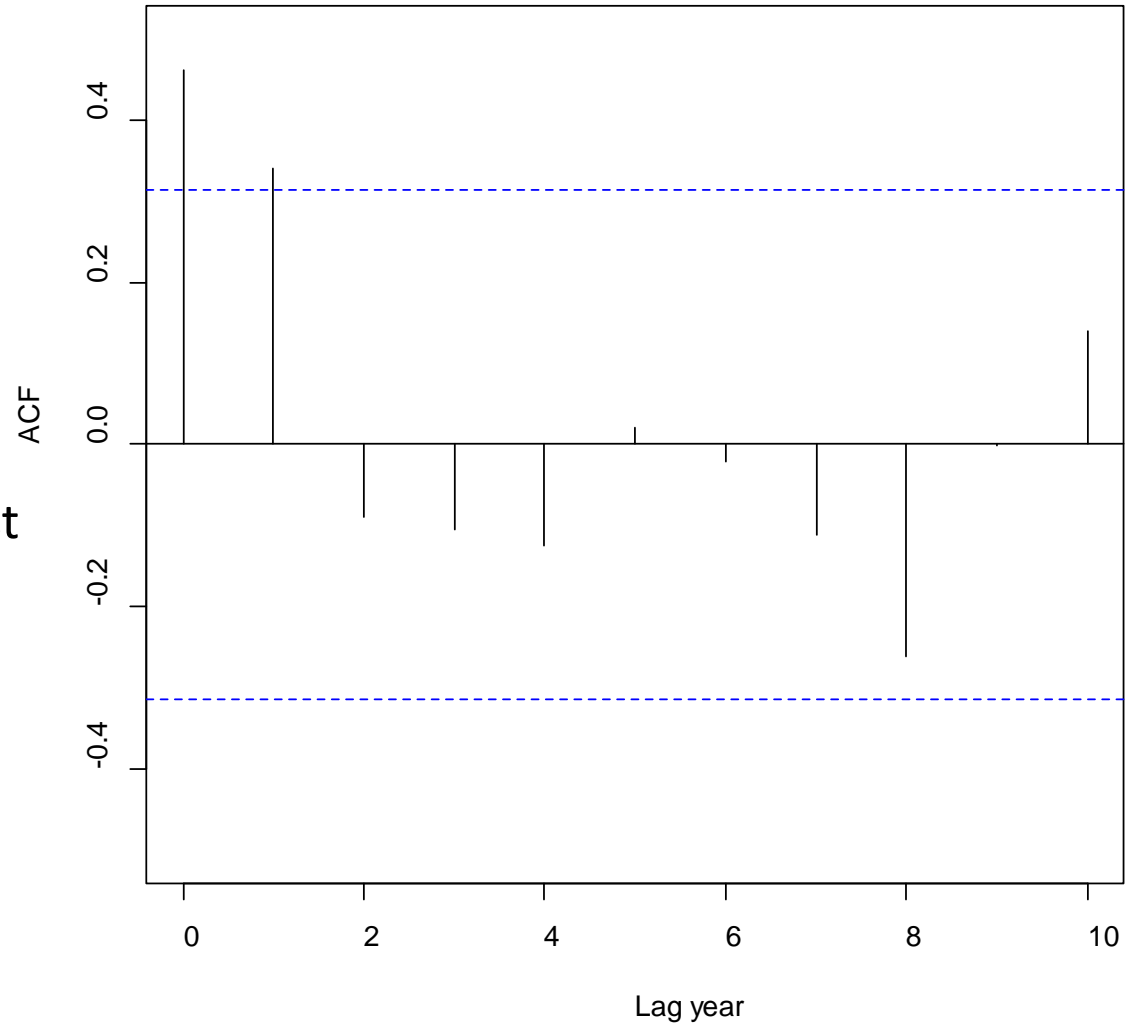
- What is useful for predicting how much area and how many burns will occur?
 - NOT precipitation in the current year
 - NOT lightning



Temporal Patterns In Fire Occurrence

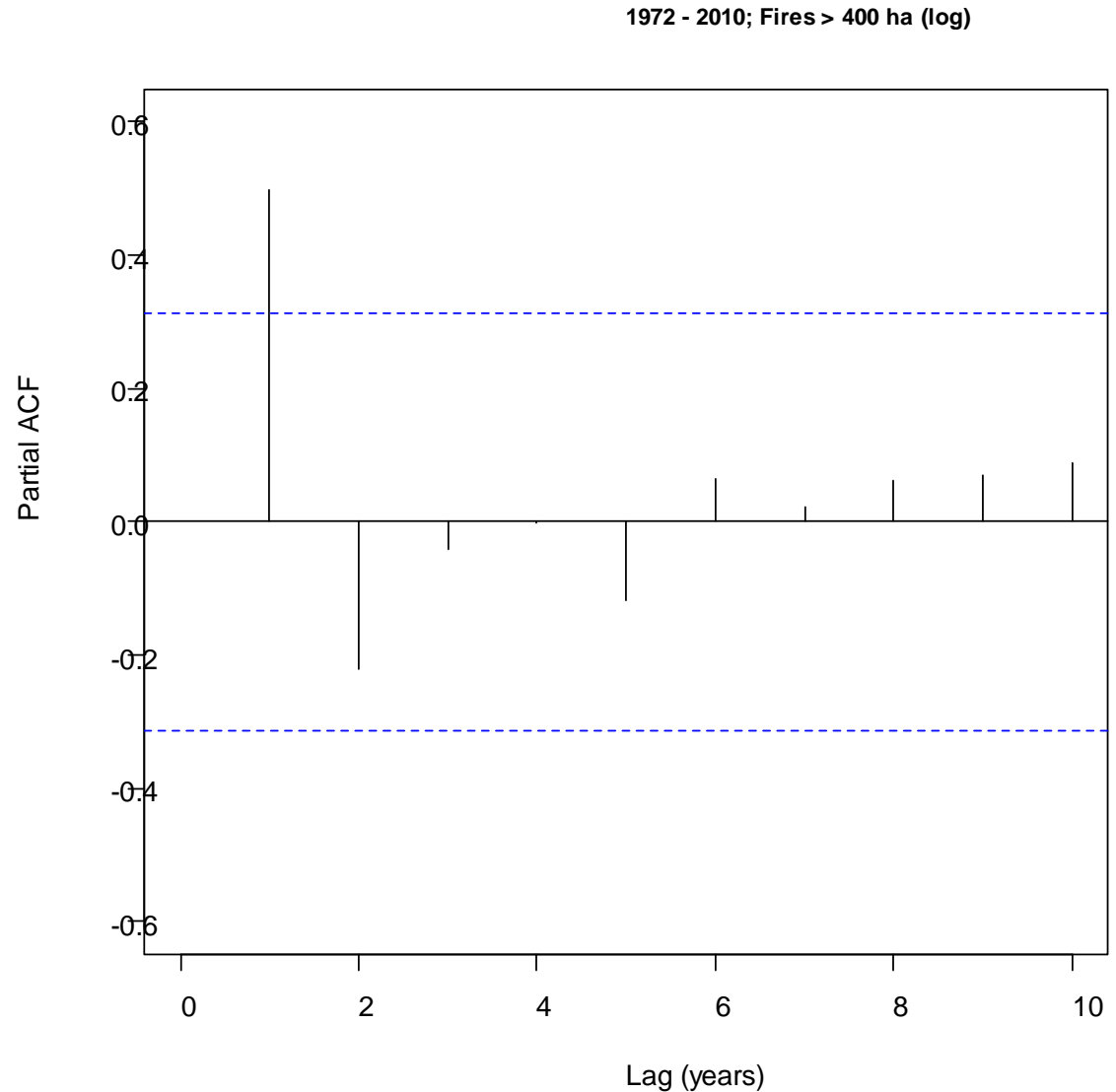
Cross-Correlation Area Burned & Precipitation In F

- What is useful for predicting how much area and how many burns will occur?
 - Precipitation in the last 6 or 18 months

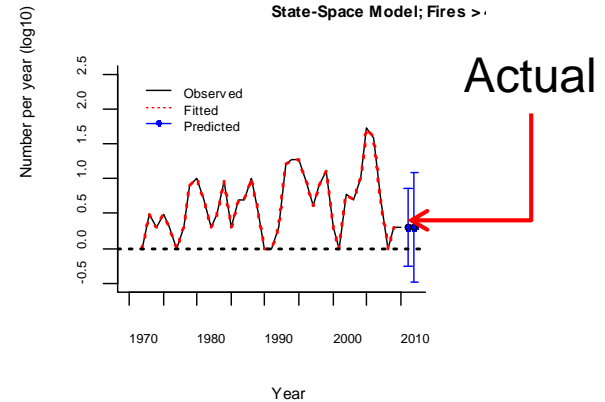
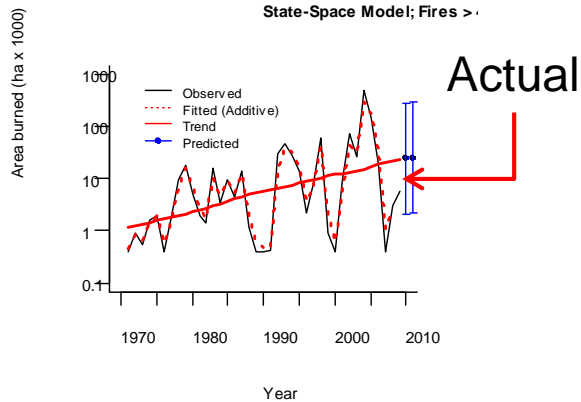
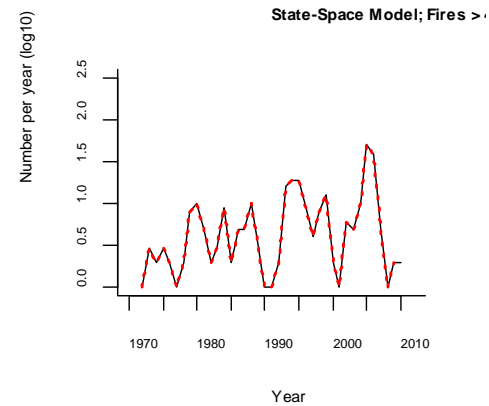
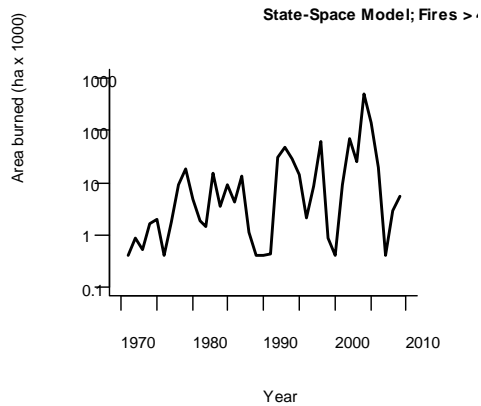


Temporal Patterns In Fire Occurrence

- What is useful for predicting how much area and how many burns will occur?
 - Their own short term history!
 - 1-year lag



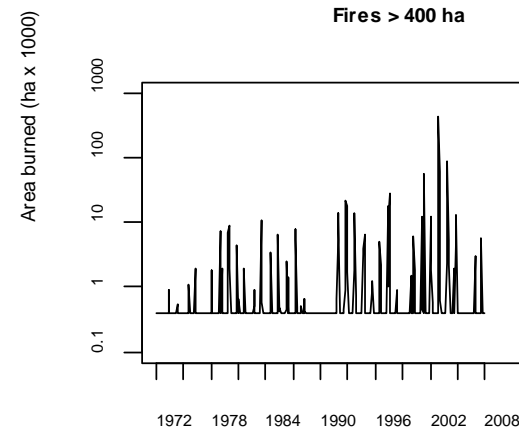
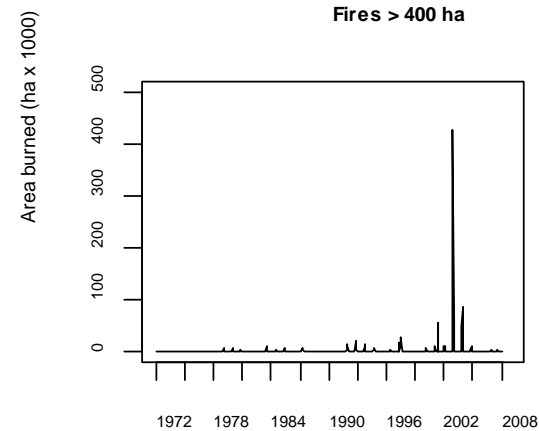
Looking A Little Bit Ahead



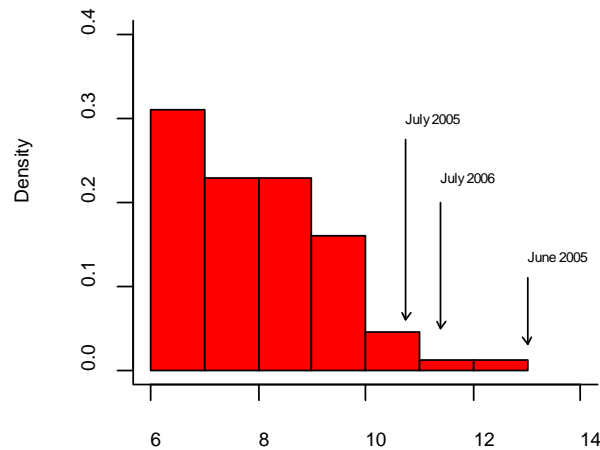
Successful 1-year forecasts of number of fires and area burned based on previous year burning and precipitation in previous year

Temporal Patterns

- Main Questions – Set 3
 - How rare were 2005 and 2006 fire seasons?
 - Could we estimate how frequently these types of years might happen?
 - Ecoregional scale

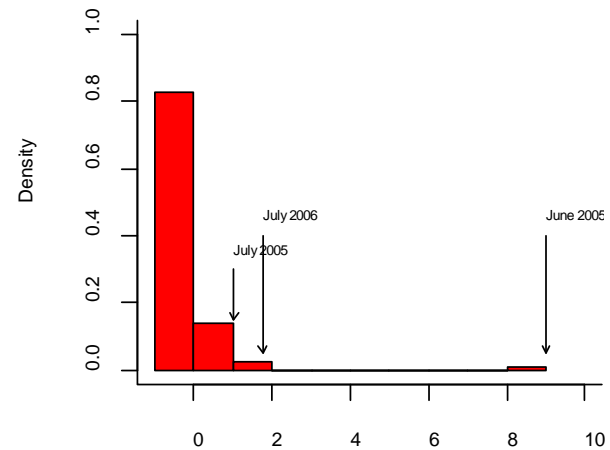


How Rare Of Events Were The 2005 & 2006 Fire Seasons?



Gamma Probability Distributions

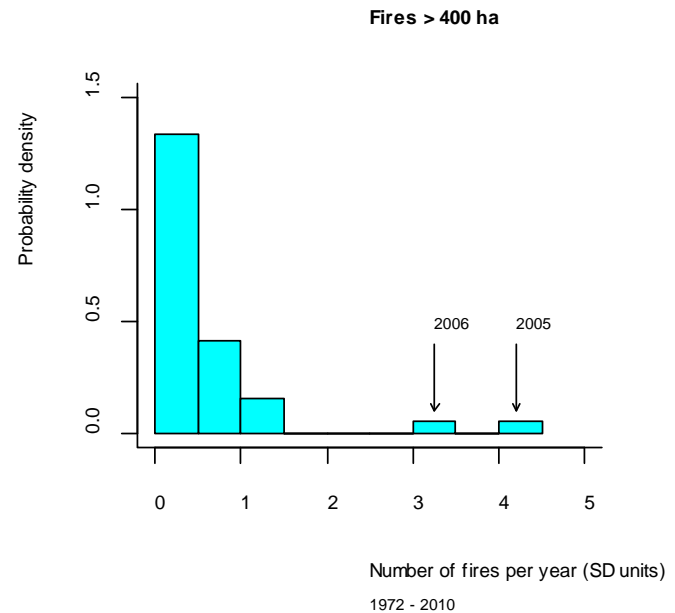
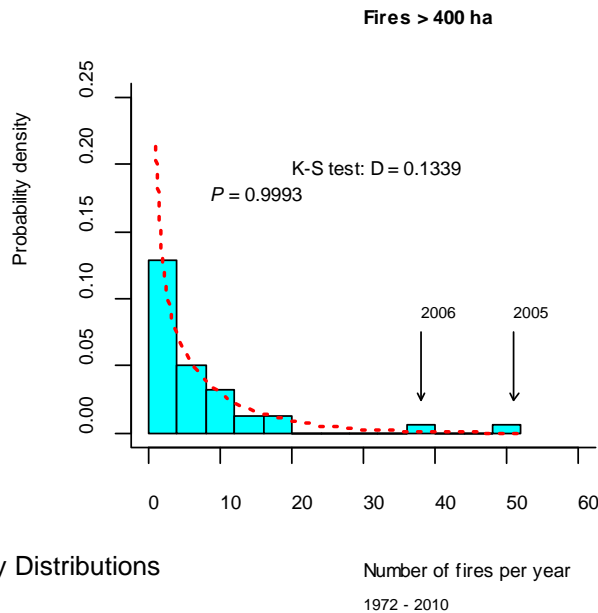
Area burned per month (log ha)
1972 - 2010



Area burned (ha) per month (SD uni)
1972 - 2010

- **VERY!**
 - Statistically, June 2005 should not have happened

How Rare Of Events Were The 2005 & 2006 Fire Seasons?

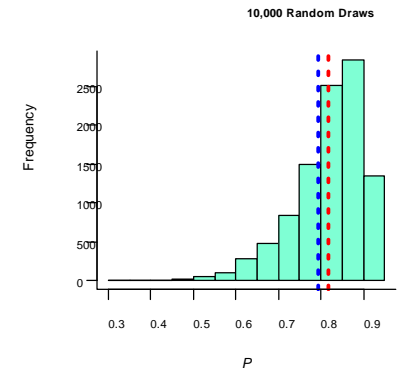
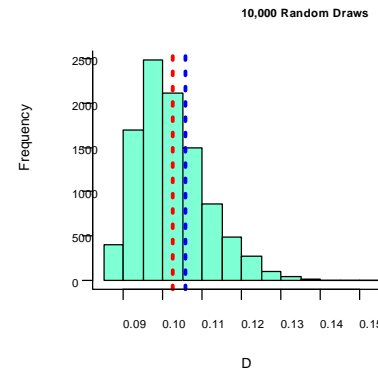
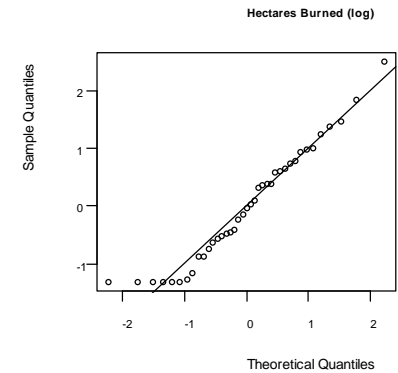
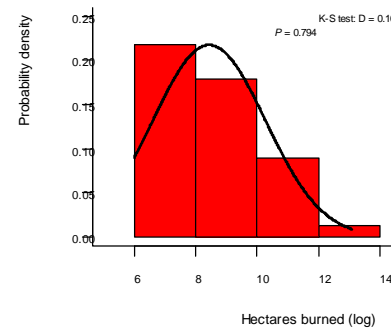


Negative Binomial Probability Distributions

- **VERY!**
 - Statistically, June 2005 and July 2006 occurring back-to-back should not have happened

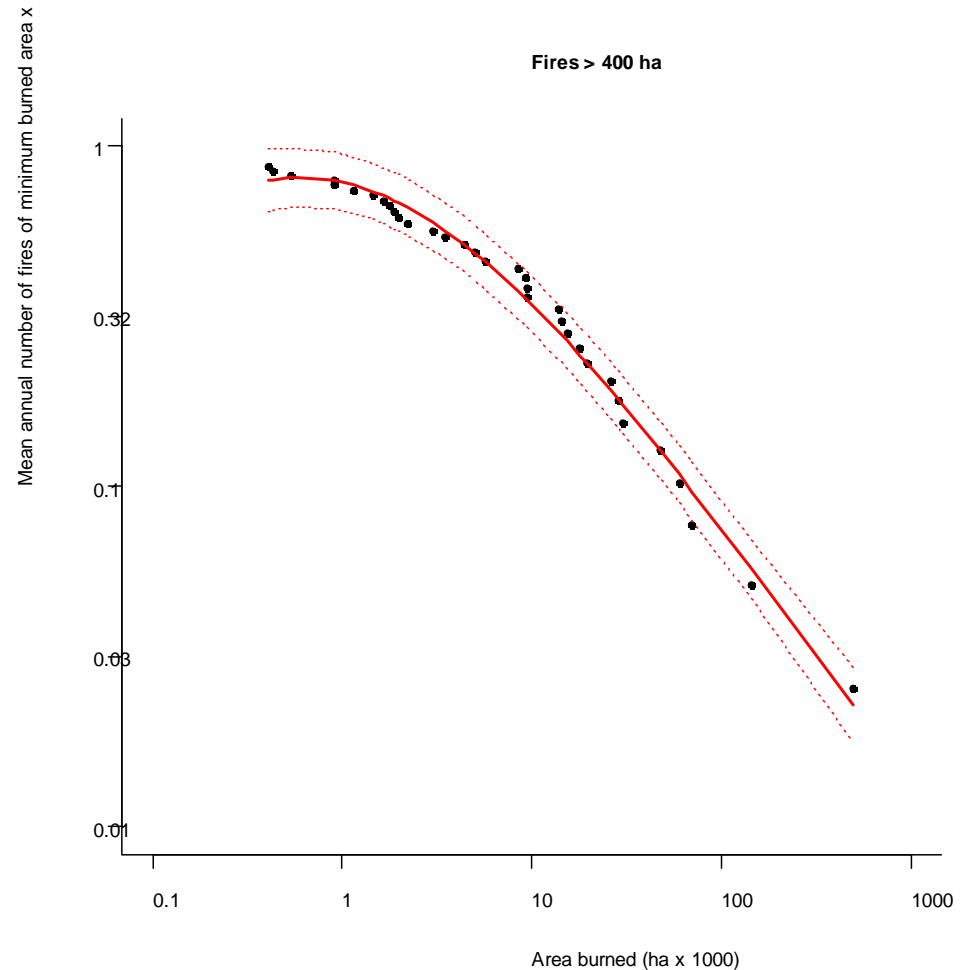
How Often Might These Rare Events Occur?

- Well...it depends
 - Theoretical probability distributions suggest every 500 – 1000 years (or more)
 - Assumes distribution of events remains relatively constant over time



How Often Might These Rare Events Occur?

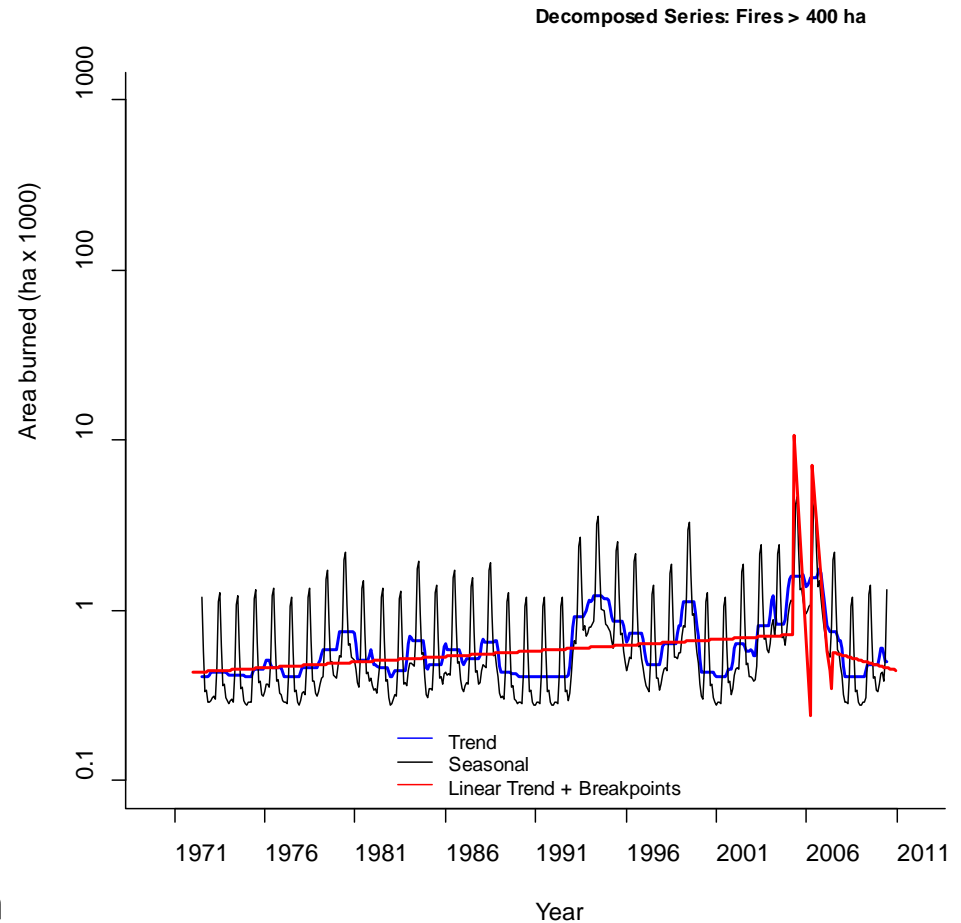
- Well...it depends
 - But empirically derived probabilities suggest every several decades or century (at the outside)
 - Assumes recent events are not anomalous and will be representative of future conditions
 - If this assumption has merit it implies years such as 2005 and 2006 will not be such rare events



Temporal Patterns In Fire Occurrence

- Summary

- Number of fires and area burned have increased in the Mojave 1972-2010
- Not a smooth increase
- Irruptive pattern
 - Indication of state change?
- Driven by precipitation but not ignition
- Frequency of “rare events” could become more common



Bridging The Temporal And The Spatial

- When and where are the fires occurring?
 - Lightning was not a good predictor of temporal patterns of burning
 - Areas of concentration jump around so much
 - But averaging across time, there are clearly areas of lightning concentration
 - Guess where the burns are
 - But lightning also lines up with precipitation patterns
 - Ignition and precipitation!

