



Fingerprinting Native and Non-Native Biodiversity in the U.S.: Phase I

Mohammed A. Kalkhan, Ph.D.

Natural Resource Ecology Laboratory

Colorado State University

Fort Collins, Colorado 80523-1499, USA

Phone: 970-491-5262, Fax: 970-491-1965

mohammed@nrel.colostate.edu

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Knowledge to Go Places

Investigators

Mohammed A. Kalkhan¹, Thomas J. Stohlgren²,
John L. Schnase³, Jeffrey T. Morisette³, and Jeffrey A. Pedelty³

¹Natural Resource Ecology Laboratory, Colorado State University

²USGS National Institute of Invasive Species Science Fort Collins
Science Center

³NASA Goddard Space Flight Center

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Research Team

Paul Evangelista¹, Catherine Jarnivich², Tracy Davern^{1,2}, Jim Graham¹,
Greg Newman¹, Alycia Crall¹, Sunil Kumar¹, Sara Simonson¹,
Rick Shory¹, Dave Barnett¹, Geneva Chong^{1,2}

Partners and Collaborators

K. Beck, C. Brown, R. Reich, W. Cai, J. Ericson, C. Flather, J. Fridley, P. Fuller, J.
Freeman, J. Gentle, M. Hunter, J. Kartesz, E. Martinson, L. Master, L. Meyerson, S.
Naeem, J. Norman *III*, P. Omi, B. Peterjohn, D. Sax, E. Seabloom, M. Smith, J.
Sutton, E. Stafford, J. Stachowicz, P. Whirly, A. Ullah³, J. Smith³, Ed Sheffner³,
Woody Turner³

¹Natural Resource Ecology Laboratory, Colorado State University

²USGS National Institute of Invasive Species Science Fort Collins Science Center

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Challenges with Fingerprinting Biodiversity

- **Quantifying patterns of biodiversity has been hampered by poor taxonomic knowledge of small and uncommon organisms, woefully incomplete surveys over large areas (in the US and elsewhere), inadequate coupled models of field data and high-resolution remote sensing data, and little systematic monitoring to detect the status and trends of all but the most common or charismatic species.**

Challenges with Fingerprinting Biodiversity

- **Fingerprinting biodiversity in the US is facilitated by more complete taxonomic information for many taxa and long-term systematic monitoring of some taxa (e.g., birds, fishes, native and non-native vascular plants, mammals, amphibians) that jointly may provide some insights on the patterns of other biological groups. Adequate data are at least available to test this basic assumption.**

Background Justification for the Project

- **Because there currently exists no coherent scientific or technological framework for biodiversity assessments (especially at continental scales), we embarked on a multidisciplinary research study to advance the science and technology of mapping and modeling patterns of biodiversity (i.e., biological fingerprinting).**
- **We also sought to document the patterns of the invasion of harmful non-native plants, fishes, and birds in the U.S.**

Research Objectives: Based on Interdisciplinary Research Incorporating

- Data from several remote sensing satellites;
- Synthesis of biodiversity field data sets from Department of Interior (USGS, BLM, NPS, BOR), Department of Agriculture (USFS, APHIS, ARS), non-government organizations (The Nature Conservancy, NatureServe), and universities;
- New Multi-scale Geospatial Modeling-Mapping Algorithms (Web Internet Tools); and
- High-Performance Computing Capabilities (HPCC-NASA-USGS) to document, map, and forecast the distributions and abundances of selected native and non-native plants and animals in the United States.

Research Objectives: Based on Interdisciplinary Research Incorporating

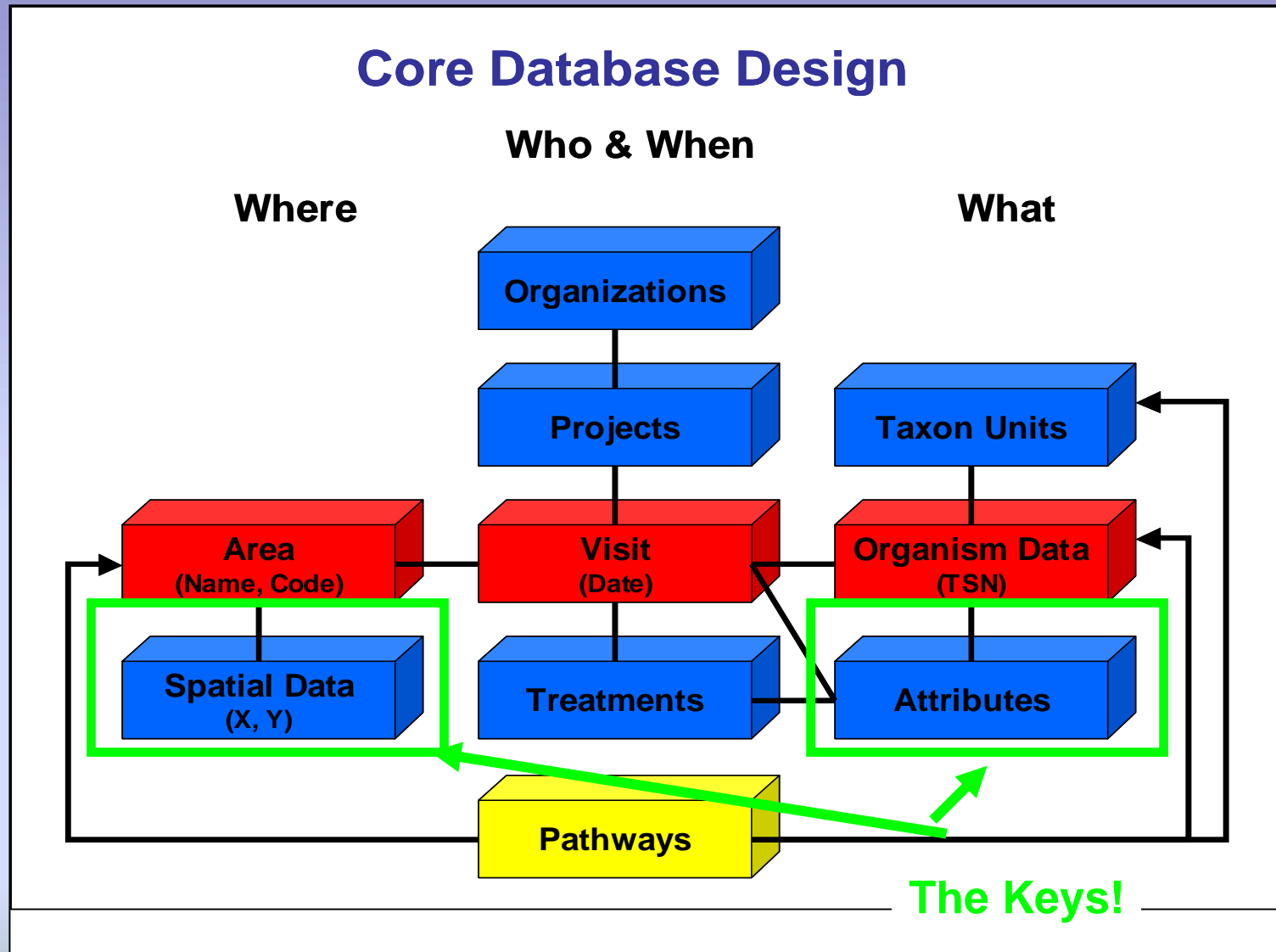
- Our state of the art research approach is proving successful at local and landscape scales.
- We focused on *Tamarix* spp. (tamarisk, salt cedar) and *Bromus tectorum* (cheatgrass) as test species for high-resolution mapping and modeling of harmful invasive species; however, our study has expanded well beyond these two species examining other invasive plant species, wildlife and pathogens.
- In addition, we tested a new field pixel nested plot (PNP- Kalkhan et. al., 2007a,b) sampling design with link to geospatial information data for using geostatistical modeling and thematic mapping applications into forecasting biodiversity, environmental, and ecological parameters.

**Geospatial Modeling- Thematic Mapping
Web Internet Tools
Through Multiple- Collaborative Teams:**

NREL-CSU, USGS-FORT, & NASA-GFSC

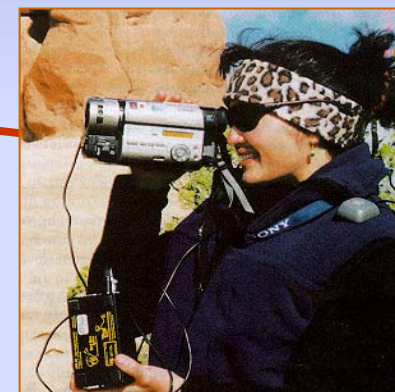
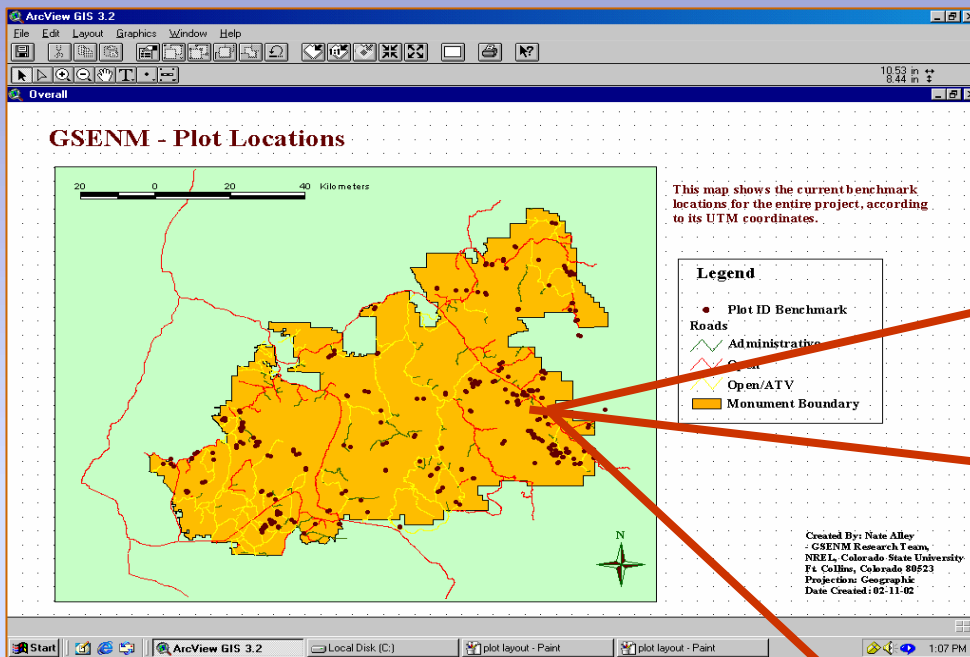
A Global Organism Detection and Monitoring (GODM) System for Plants, Animals, and Pathogens

Cultural Change
IT Infrastructure
Expertise



Graham, J., G. Newman, C. Jarnevich, R. Shory, T. Stohlgren. 2007.
A Global Organism Detection and Monitoring system for
Non-native species. *Ecological Informatics* 2:177-183.

Various Data Types & GIS: Helping Resource Management Activities



| PlotName | Date | UTM-E | UTM-N | Elev (m) | Veg Community | tot no. sp | no. native | no. exotic | tot veg cov | BRTE cov | Sand | Silt | Clay |
|----------|---------|--------|---------|----------|-----------------|------------|------------|------------|-------------|----------|----------|----------|----------|
| 205 | 5/22/01 | 422424 | 4159674 | 2215 | Ponde Pine | 49 | 42 | 1 | 14.4 | 0.05 | 64.25122 | 12.82617 | 22.92261 |
| 207 | 5/23/01 | 423256 | 4161403 | 2258 | Piny-Junp | 22 | 19 | | 42.4 | | 60.03738 | 10.24955 | 29.71307 |
| 206 | 5/23/01 | 423484 | 4160289 | 2215 | Pinyon Pine | 25 | 19 | | 33.85 | | 41.51793 | 18.89199 | 39.59007 |
| 208 | 5/28/01 | 415217 | 4122711 | 2168 | Sagebrush | 27 | 19 | 6 | 14.45 | 0.3 | 85.8724 | 4.084044 | 10.04356 |
| 209 | 5/28/01 | 415286 | 4123073 | 1447 | Peren. Riparian | 9 | 5 | 4 | 38.8 | | 84.19852 | 8.482759 | 7.318718 |
| 210 | 5/29/01 | 427169 | 4146438 | 1447 | Piny-Junp | 37 | 33 | 2 | 16.3 | | 23.99201 | 41.83134 | 34.17665 |
| 212 | 5/30/01 | 404538 | 4114473 | 1932 | Juniper | 34 | 32 | 1 | 7.2 | 0.1 | 58.27137 | 17.90272 | 23.82591 |
| 211 | 5/29/01 | 426994 | 4146803 | 1932 | Sagebrush | 37 | 32 | 3 | 18.3 | | 42.65982 | 21.33309 | 36.00709 |

Gather Data

[Field Methods](#)
[Field Tools](#)

Browse Data

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[By Location](#)
[By Species](#)
[By Project](#)
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Invasive Species Science

Analysis Settings

Select analysis settings

| | |
|---------------------------|-------------------------------|
| Analysis Type: | Multiple Logistic Regression |
| Response Variable: | Present |
| # of Predictors: | 6 |
| Predictor # 1: | Average annual precipitation, |
| Predictor # 2: | Average annual temperature, |
| Predictor # 3: | Elevation, |
| Predictor # 4: | Distance to Water, |
| Predictor # 5: | MODIS EVI three year mean, |
| Predictor # 6: | MODIS EVI three year range, |

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Analysis Results

Results of Multiple Logistic Regression:

Response Variable: Present

| Variable | Coefficient | P-Value |
|---|--------------|---------|
| Model Intercept: | 17.28823 | 0 |
| Average annual precipitation, | 0.07562426 | 0 |
| Average annual temperature, | -0.1597557 | 0.0901 |
| MODIS three year composite of EVI , Range | -0.001052232 | 0 |
| MODIS three year composite of EVI , Mean | 0.001473194 | 0 |
| Elevation, | -0.01004329 | 0 |
| Distance to Water, | 0.0001222648 | 0 |

Null Deviance: 2787.353

Residual Deviance: 1012.422

Deviance explained: 0.637

AIC (Akaike's Information Criterion): 1026.422

AICc (AIC corrected for small sample size): 1026.473

[Graphs of residuals versus fitted](#)

Predicted Surface

[Back to spreadsheets](#)

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- GeoRasters

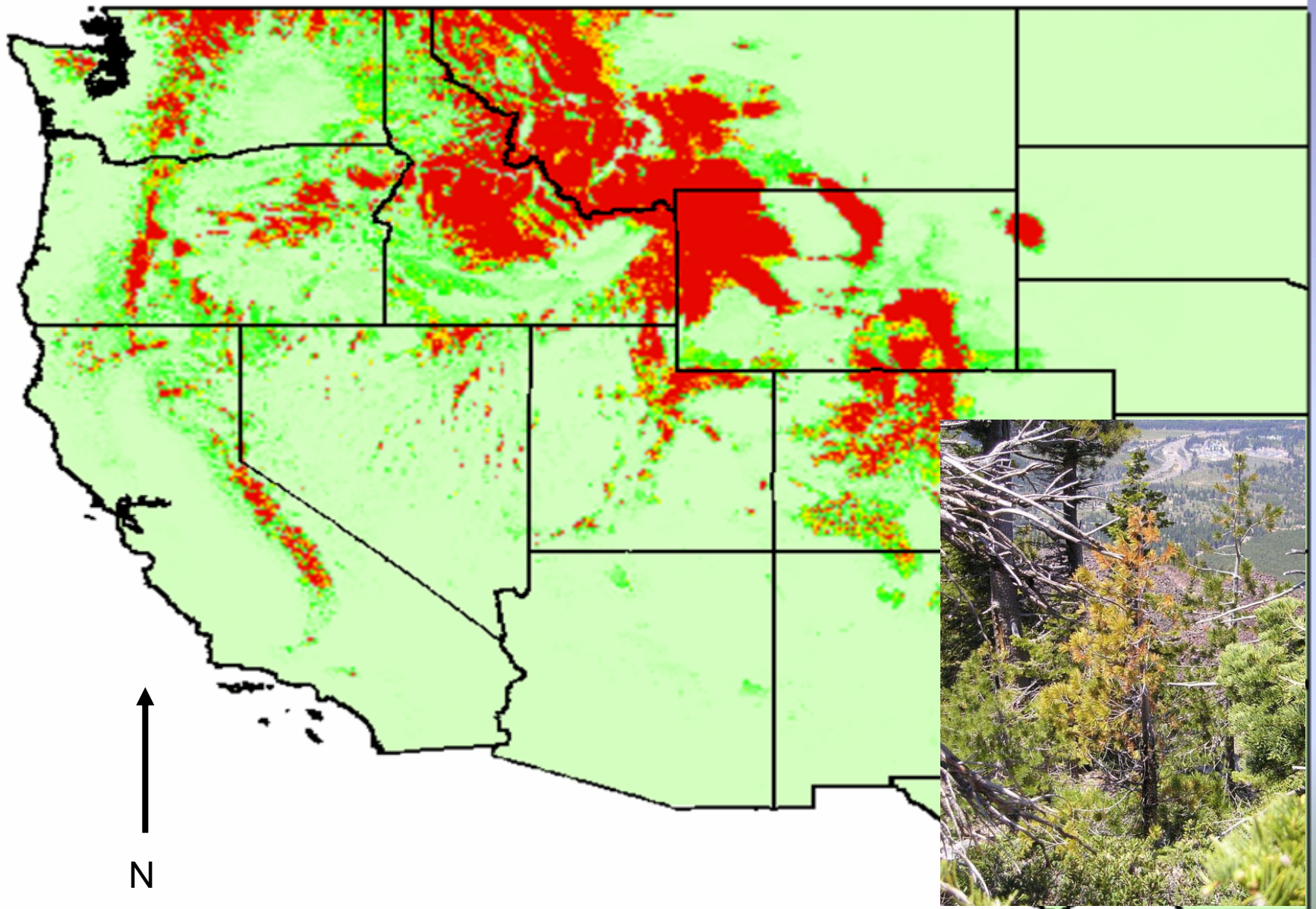
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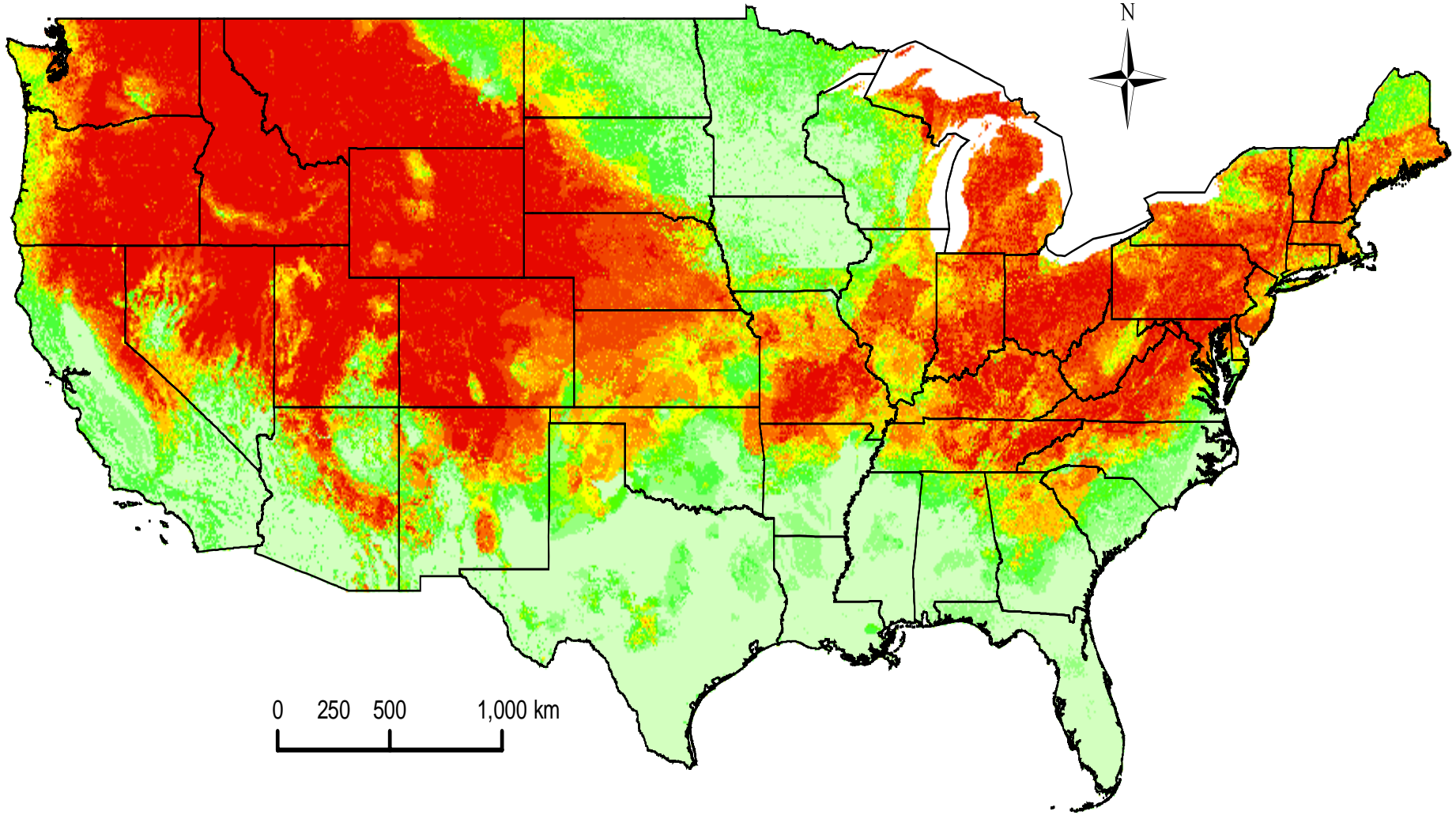
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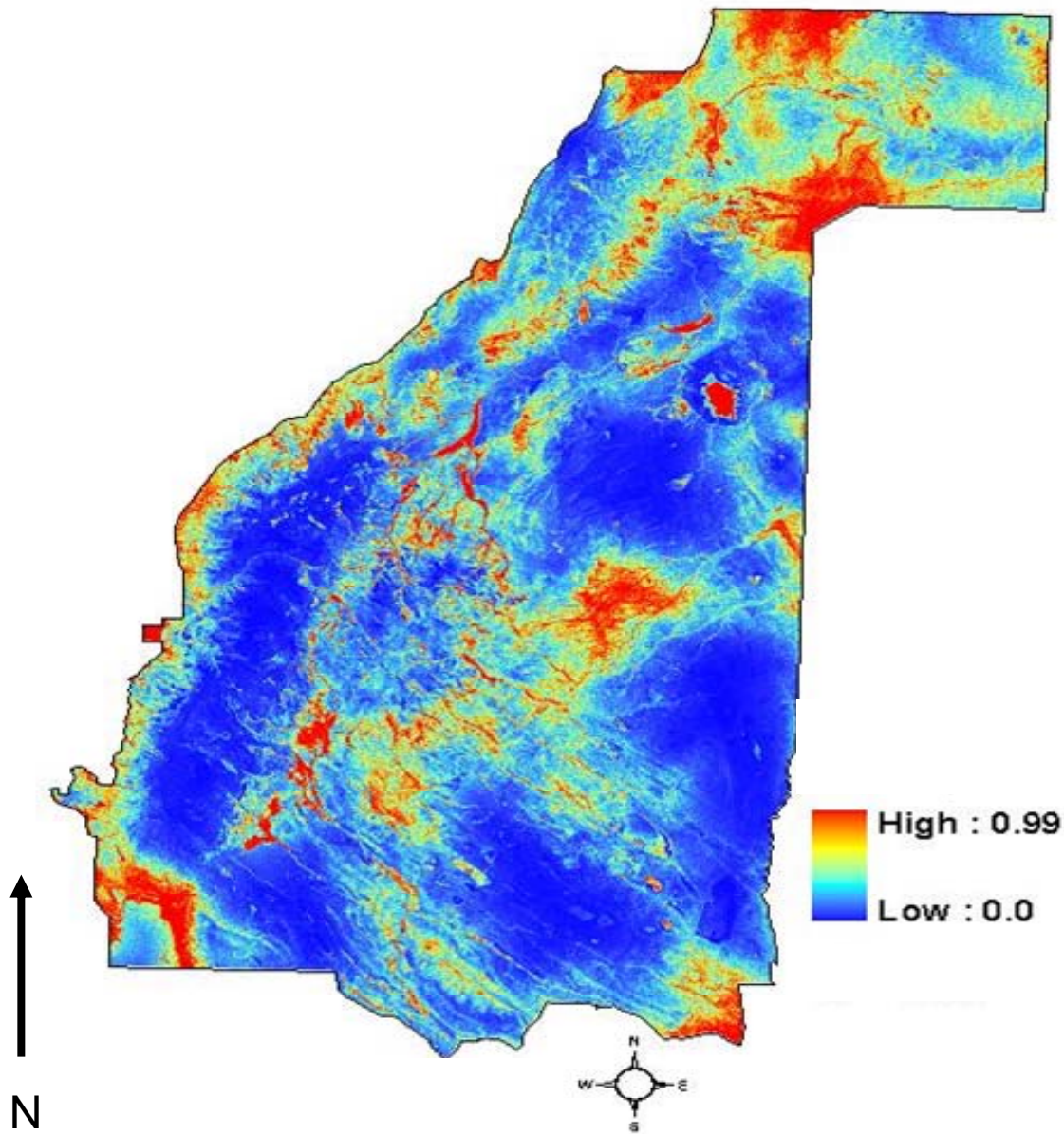
The Maxent Model was Tested on the Predicting White Pine Blister Rust Across Western USA Forests, Kumar *et al.* In Progress)



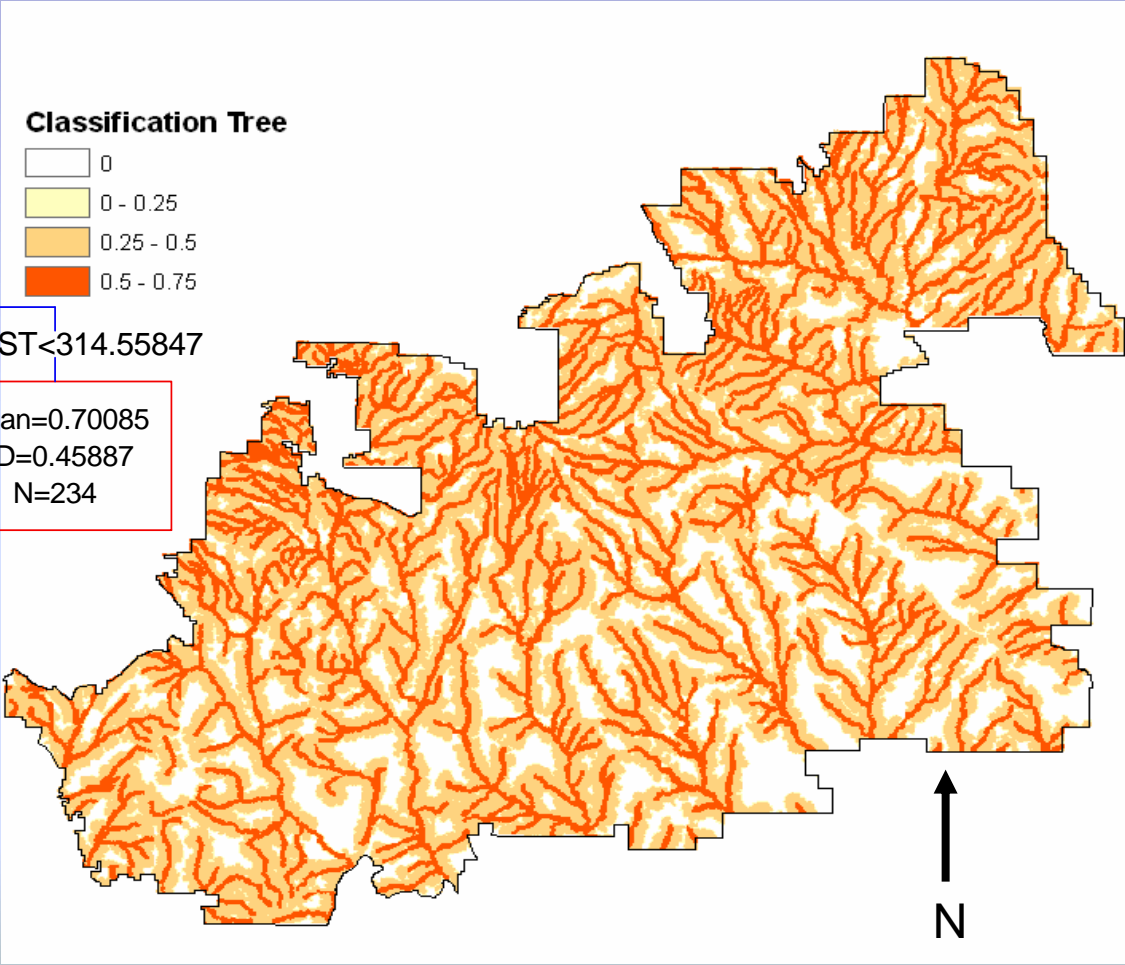
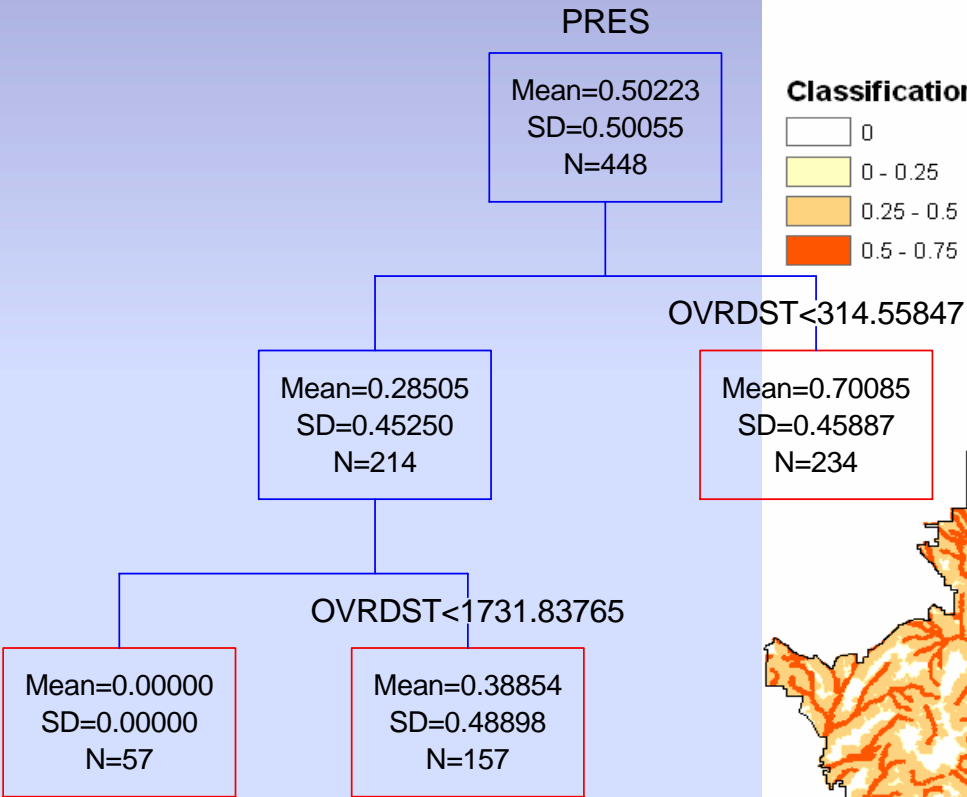
Diddymo, an invasive diatom infesting streams throughout the U.S., was modeled using GARP Model (Kumar *et al.* In Review).



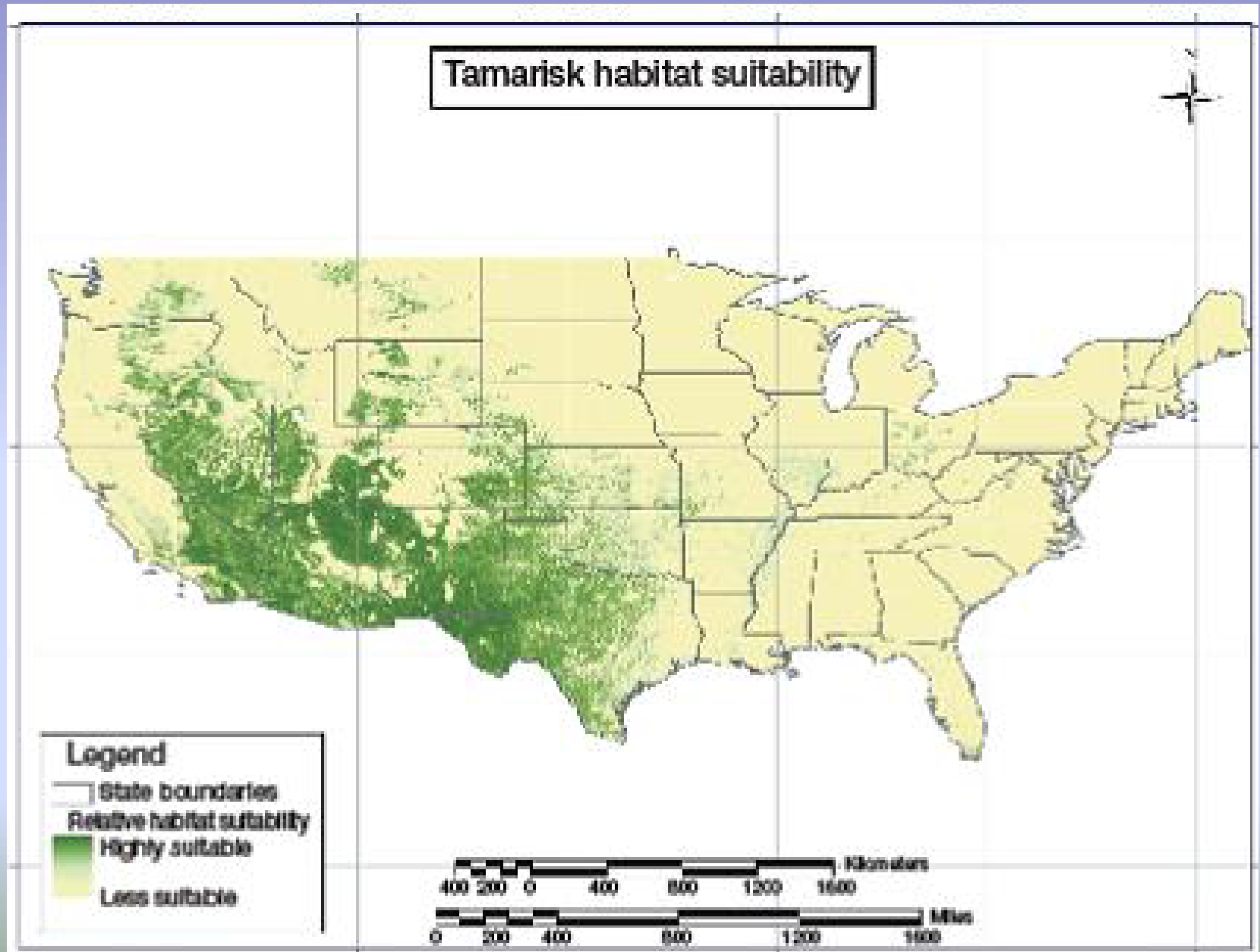
At Hart Mountain Wildlife Refuge Oregon, we tested logistic regression analyses to model areas at risk for white top infestation (Barnett *et al.* Work in Progress).



CART models statistically partition the dependent data into two homogenous groups, repeating the procedure for each group in a continuing process that forms a hierarchal tree based on the predictive strength of each environmental variable (Evangelista *et al.* In Press).

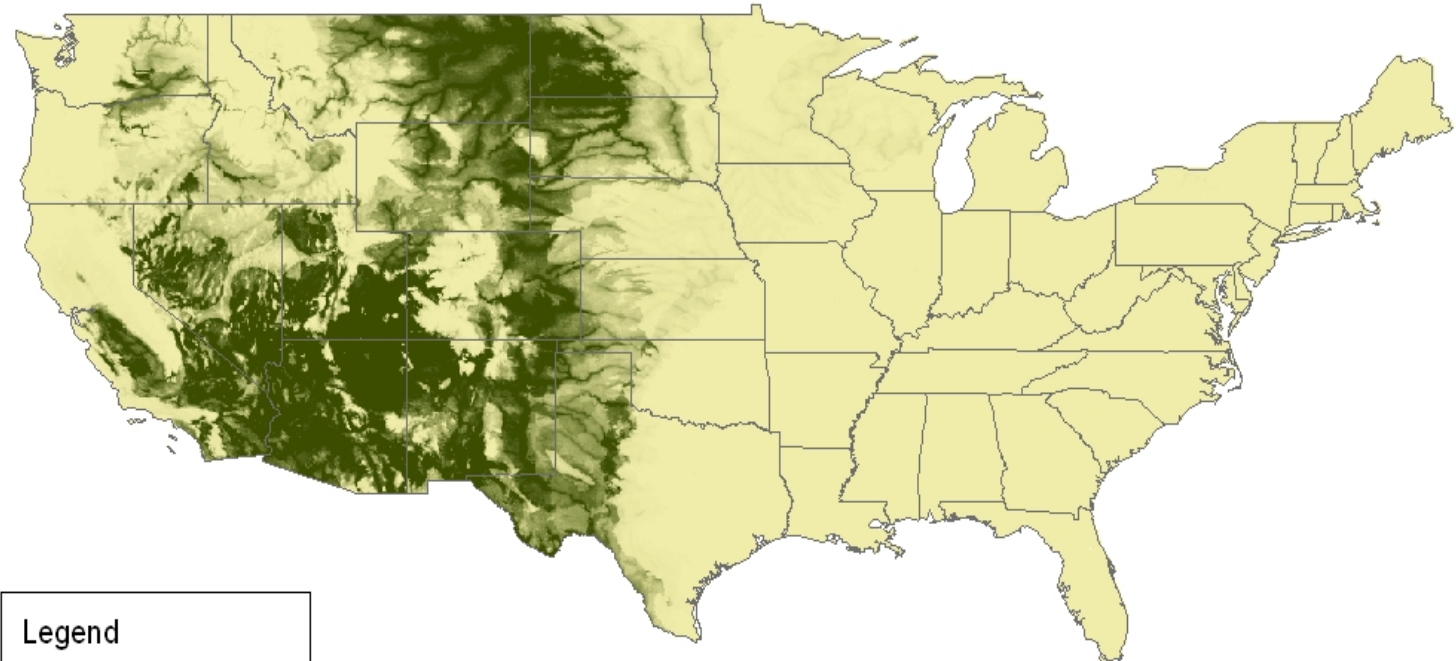


Tamarisk habitat suitability for the continental U.S. by Morisette *et al.* 2006.



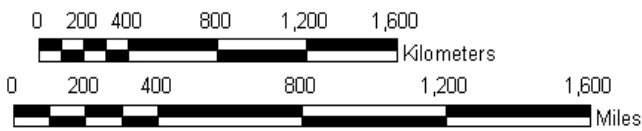
Tamarisk Habitat Suitability for the Continental U.S. by Evangelista *et al.* Work in Progress.

Tamarisk habitat suitability



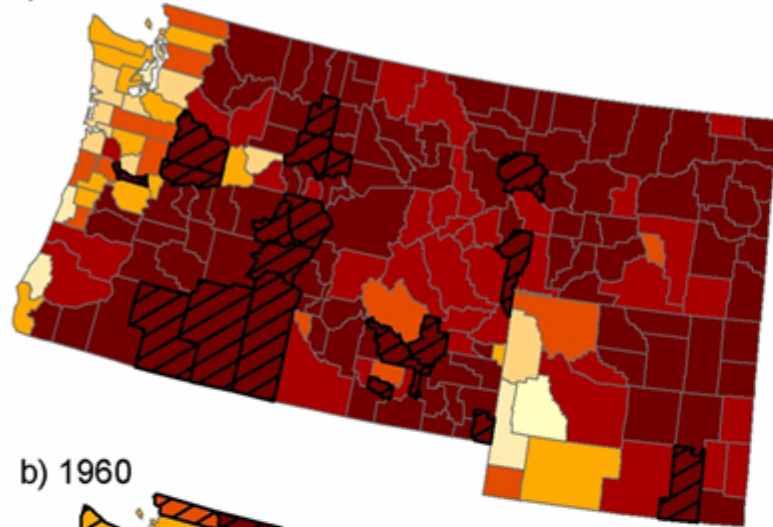
Legend

- state boundaries
- Relative habitat suitability
- Maxent Model
- Highly suitable
- Less suitable

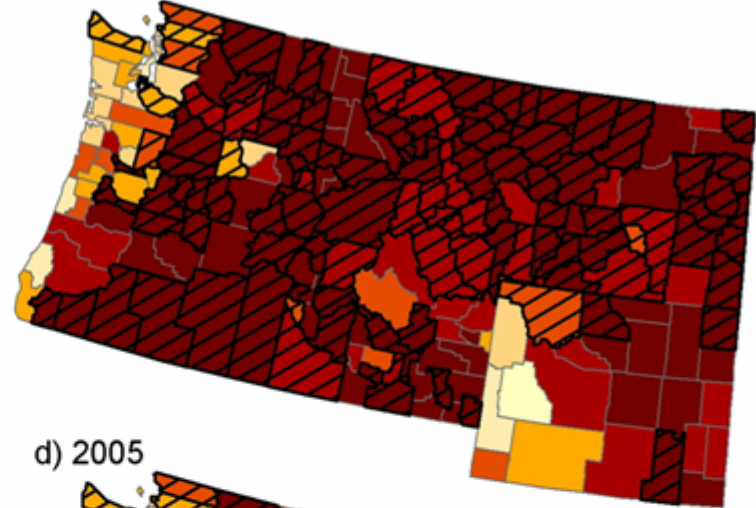


Using the Envelope model, the number of non-native species was tracked over time in selected counties in Washington (Jarniviche *et al.* In Review).

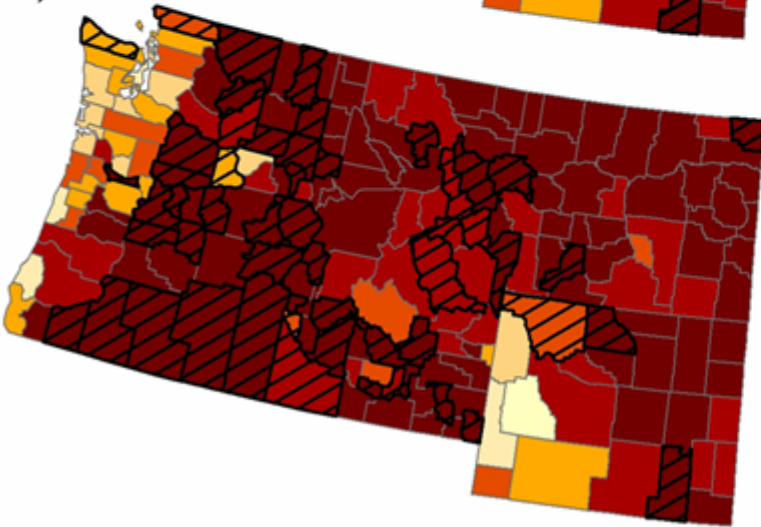
a) 1930



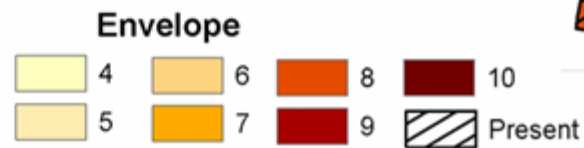
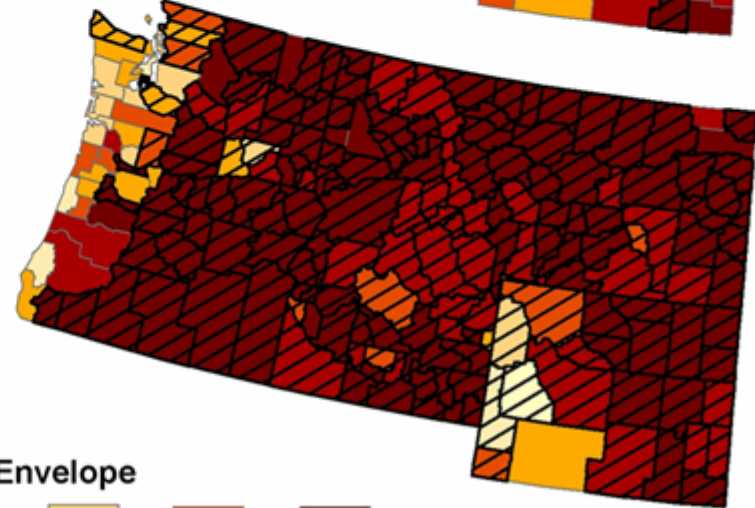
c) 1990



b) 1960



d) 2005



The Geographic Setting

- Understanding the geography and topography of the continental U.S. helped set the stage for evaluating patterns of species diversity.
- Data from the 3,004 county centroids showed that as latitude increased from Mexico to Canada, mean annual temperature sharply declined ($r = -0.91$), and mean annual precipitation declined ($r = -0.42$) with exceptions no doubt in mountainous areas.
- Due to the shape and topography of the US, increasing latitudes coincided with increasing distance to coastlines ($r = 0.54$) and increasing mean elevation ($r = 0.48$)

Conclusions and Future Directions

- **We are not yet satisfied that we achieved our objectives. Each of our data sets could be improved, as could the ancillary data layers used in geospatial modeling and the models themselves.**

Conclusions and Future Directions

- **This is the first attempt to evaluate patterns of native and non-indigenous vascular plants, birds, and fishes at multiple spatial scales relative to environmental factors, human population, and cross-correlations among the biological groups. Additional data on plant species richness are needed for many counties in the US (i.e., those with less than a few hundred native plant species seem suspiciously low).**

Conclusions and Future Directions

- **Non-indigenous fish data have not all been refined to the 8-HUC (Hydrologic Unit Code) drainage scale. Additional data at higher resolutions will be helpful in refining spatially predictive models of species richness and density.**

Conclusions and Future Directions

- **Need to more closely link richness and density to abundance, cover, and dominance, and to link species-level data to habitat quantity, quality, and connectedness by roads and waterways (i.e., corridors of invasion) and barriers to invasion.**

Conclusions and Future Directions

- **Caveats aside, we are gaining a much more robust general geospatial model –thematic maps of successful invasions by multiple biological groups. The general patterns observed here provide insights into changes needed for prevention, early detection and rapid response, research, control, and monitoring.**

An aerial photograph of a rural landscape. The foreground shows a large, golden-brown field, possibly a harvested crop field, with a line of green trees running along its edge. To the right, there's a field with distinct rows of crops, likely corn, in a greenish-brown stage. The background consists of a vast, flat expanse of green fields stretching to the horizon under a clear blue sky with some light clouds.

**Questions,
Comments,
!!!!!!!!!!!!!!**

Thank you