



Spatial Analysis of Emerald Ash Borer (EAB) Spread in New Jersey

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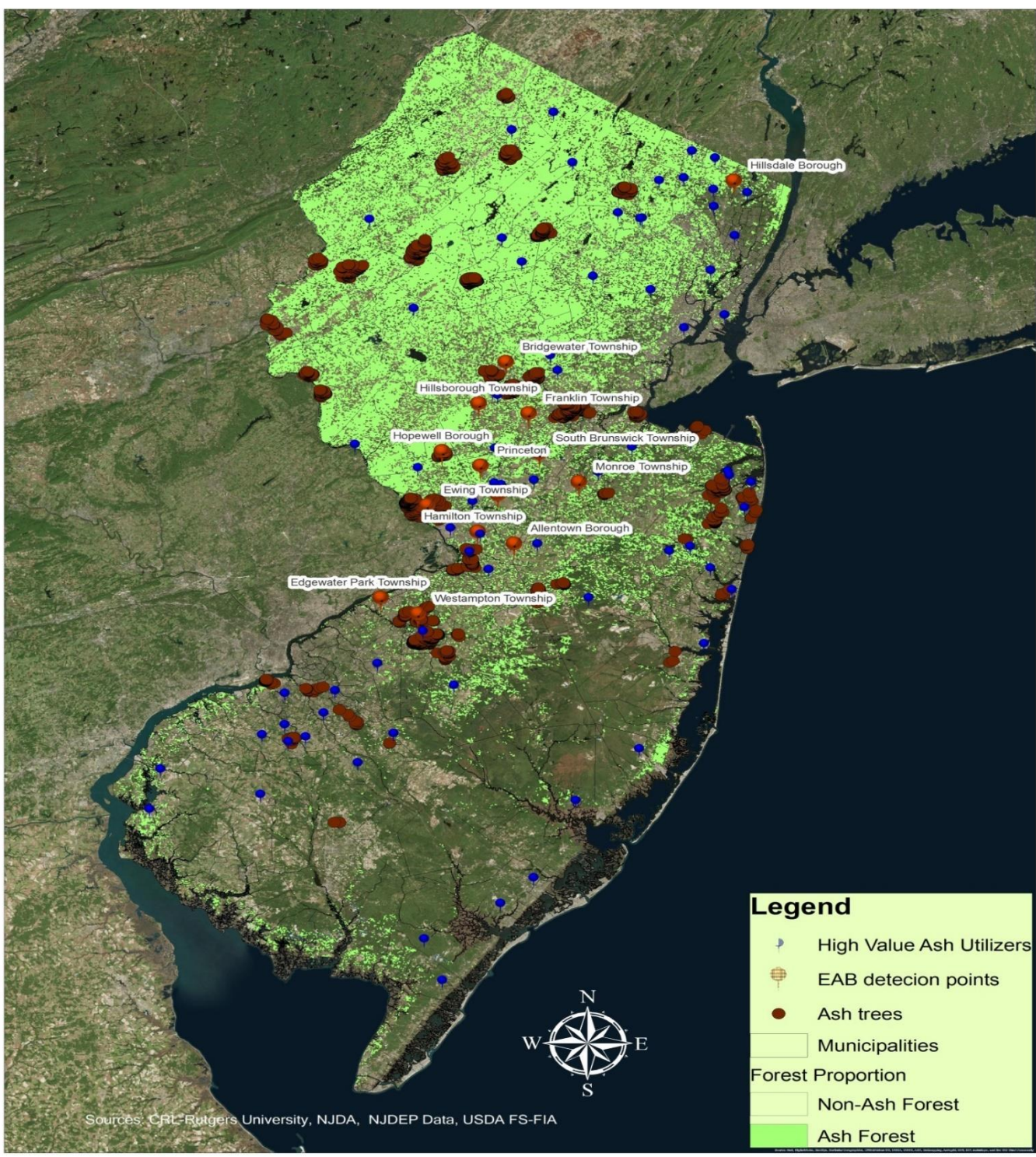


Background

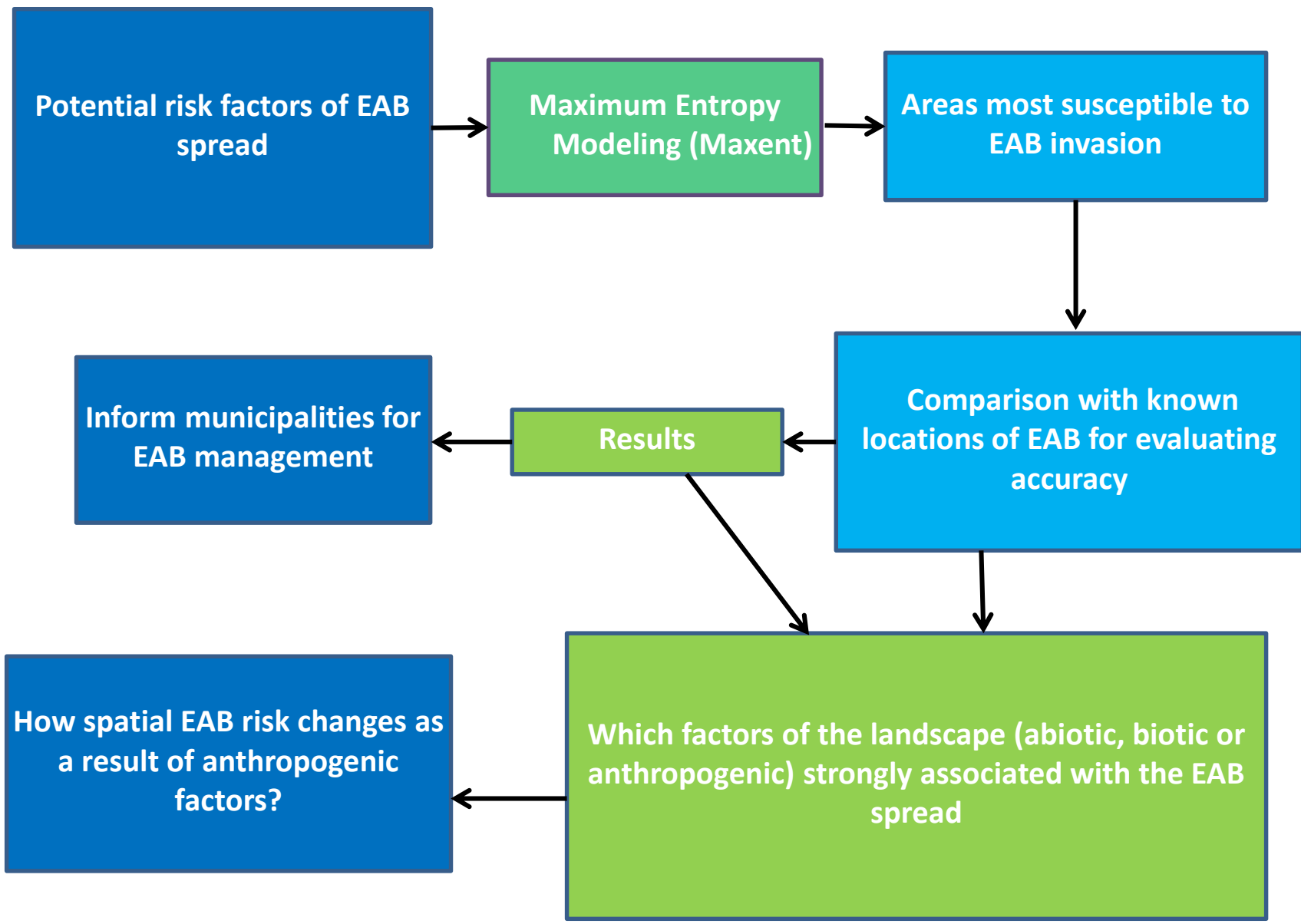
- Emerald Ash Borer (*Agilus planipennis* Fairmaireis), is an exotic invasive beetle that affects all species of true ash trees (*Fraxinus* species) in New Jersey.
- EAB was first detected in New Jersey during summer 2014.
- Nationwide, EAB is incurring billions of dollars cost in tree removals, replacement, and insecticide treatments.
- EAB is not yet fully established in New Jersey.
- Projected future distribution of EAB informs management response.



EAB in New Jersey



Conceptual Framework



Maximum Entropy Modeling (Maxent)

- Maxent uses identified EAB locations and environmental/anthropogenic factors as prior information.
- Identification of EAB data in New Jersey is incomplete. Maxent provides general approach for making predictions/inferences from presence only (incomplete information) modeling.
- Maxent is suitable for predicting EAB distribution in New Jersey.

Exponential (exp) Maxent distribution (Dudík et al., 2004) for EAB risk is defined as:

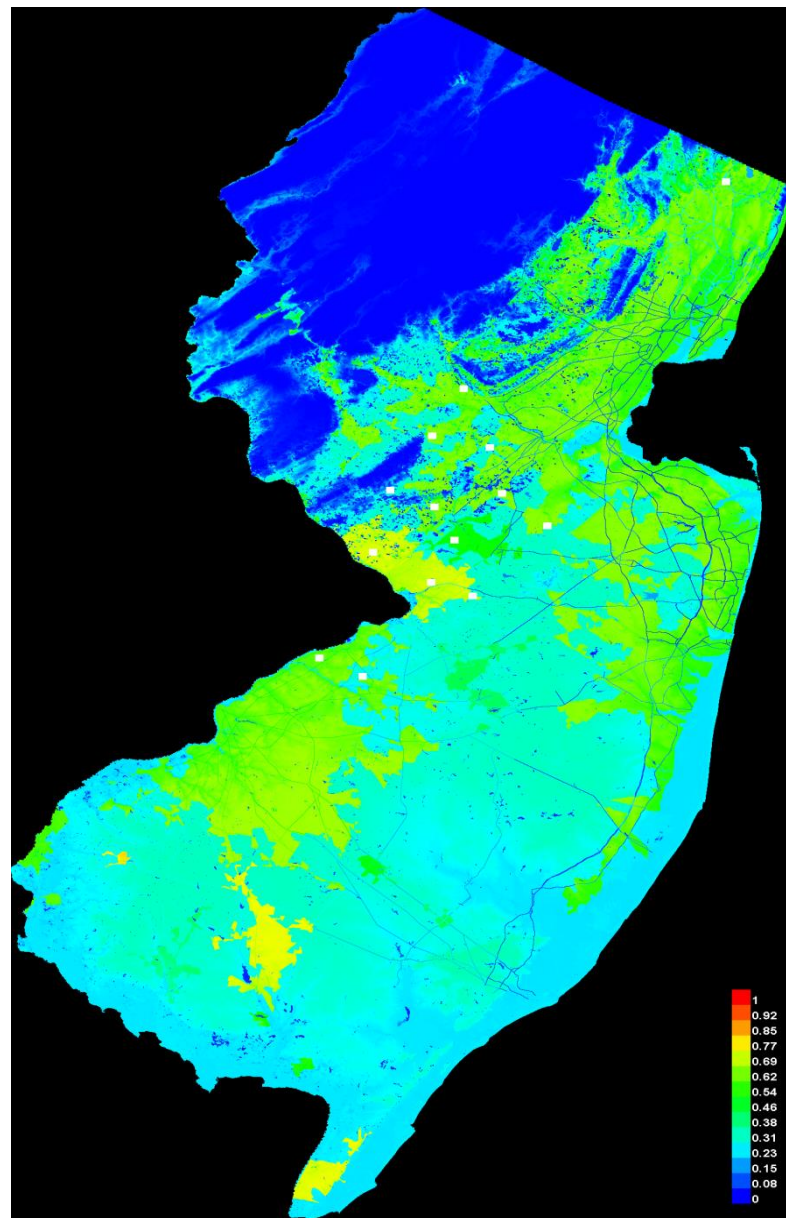
$$q_i(x) = \exp(\lambda_1 f_1(x) + \lambda_2 f_2(x) + \lambda_3 f_3(x) + \lambda_4 f_4(x) + \lambda_5 f_5(x)) / Z$$

Where

λ_1 , λ_2 , λ_3 , λ_4 , and λ_5 are coefficients for urban areas, elevation, ash basal area, major highways and waterbodies respectively. Coefficients are calculated by the program for each feature (f_1 , f_2 , f_3 , f_4 , and f_5). Z is a scaling factor so distribution sums to 1.

Maxent probability is defined on a pixelated map of the study area. The sample points consist pixels with EAB detection points and the features are environmental/anthropogenic factors.

Preliminary Results



Probability of EAB presence

Estimates of relative contributions of the environmental variables

Variable	Percent contribution	Permutation importance
Urban areas	56.5	20
Elevation	34.5	61.1
Ash basal area	4.4	18.5
Major highways	3.4	14.8
Water bodies	1.1	4.1

In the map, warmer colors show higher predicted probability of suitable conditions and cooler colors show lower predicted probability of suitable conditions for EAB spread.

Preliminary results show higher EAB risk mostly in urban areas, which are closer to major highways compare to non-urban areas.

Future Steps/Work in Progress

Inclusion of campgrounds, wood industries, nurseries, precipitation and temperature data.

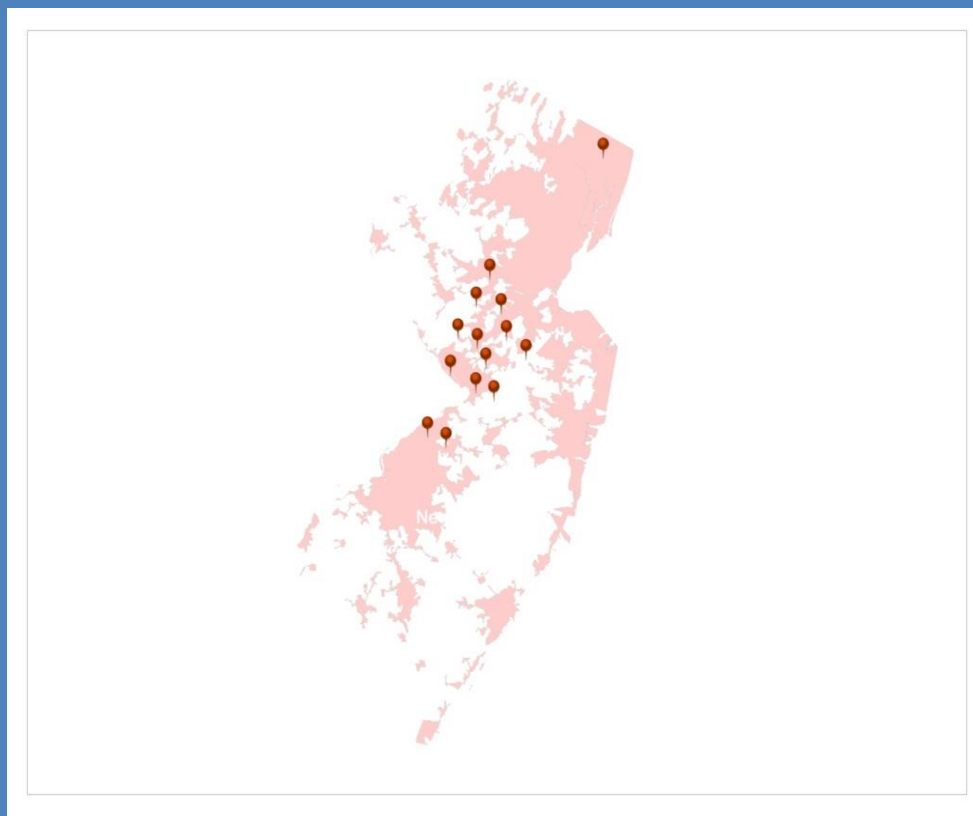
Following Elith et al., 2006 study, three statistics will be used with improved data to assess the agreement between the presence-absence records and the EAB risk predictions. These statistics are: (1) Area under the Receiver Operating Characteristic curve (AUC), (2) Correlation (COR), and (3) Kappa statistics.

References

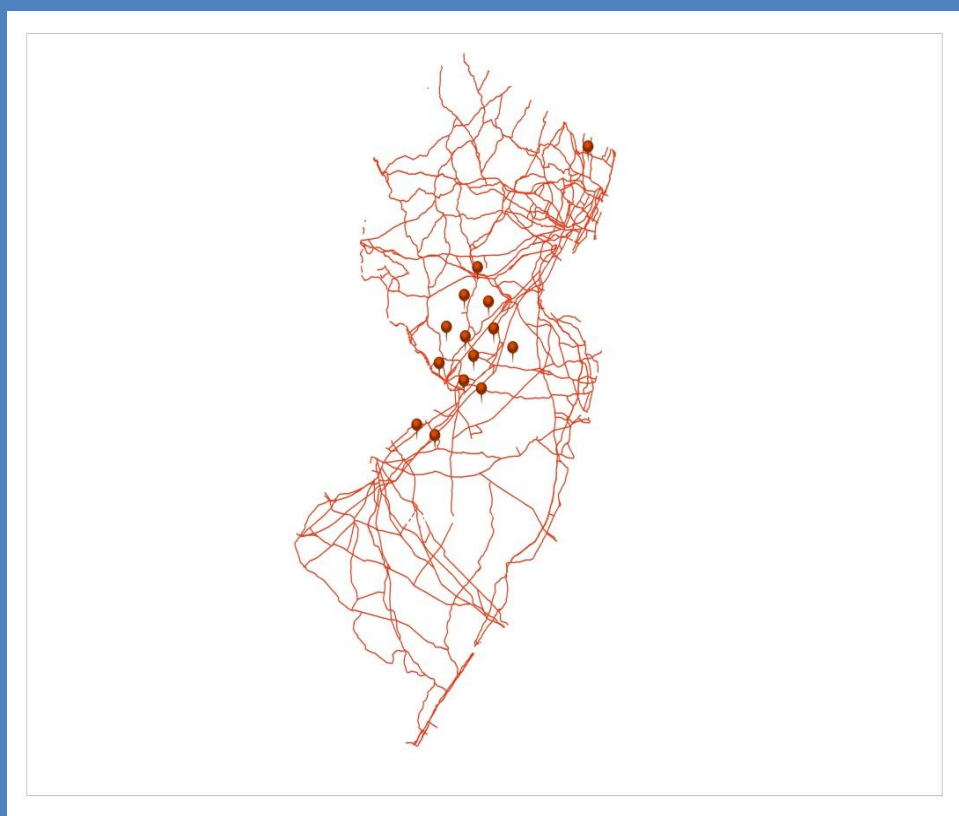
- Dudík, M., Phillips, S. J., & Schapire, R. E. (2004). Performance guarantees for regularized maximum entropy density estimation. Proceedings of the Seventeenth Annual Conference on Learning Theory (pp. 472--486). Springer-Verlag.
- Elith, J. et al. 2006. Novel methods improve prediction of species' distributions from occurrence data. *Ecography* 29: 129-151.

Mapping Risk Factors

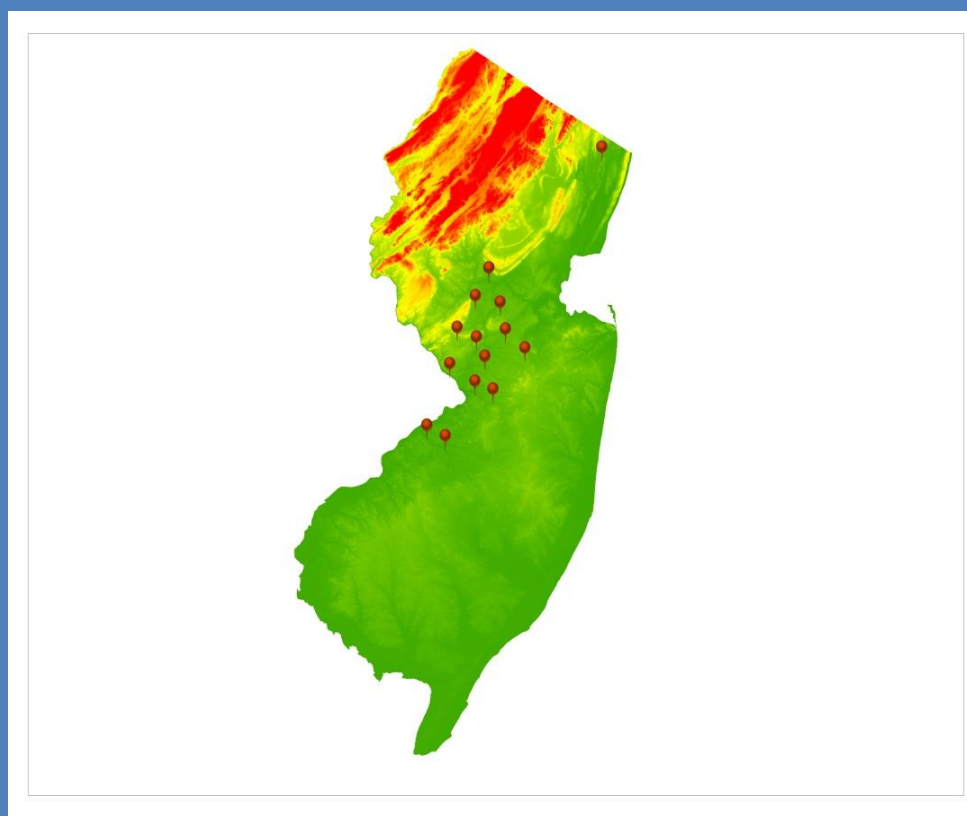
Anthropogenic Factors



Urban areas

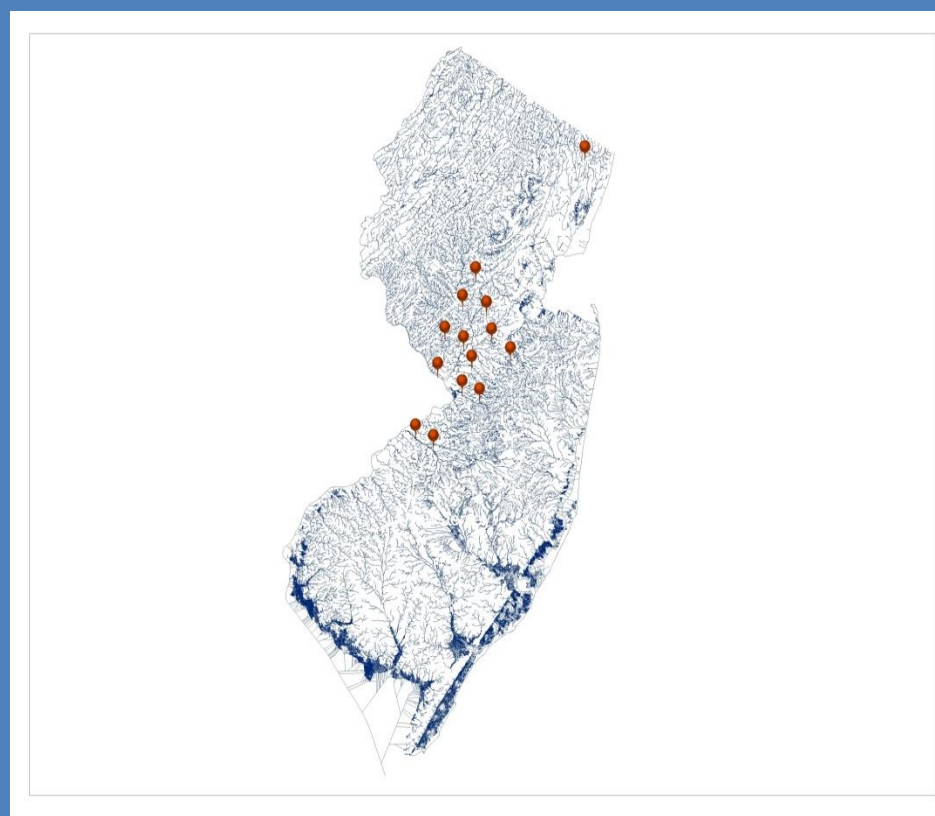


Major highways

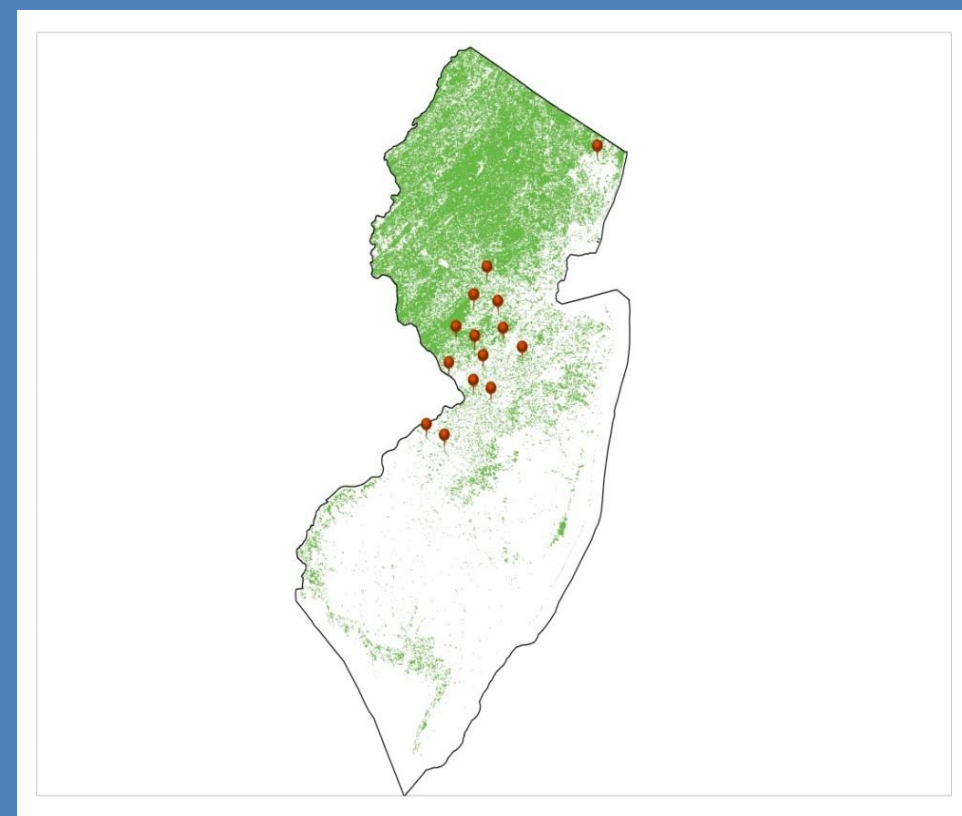


Elevation

Environmental Factors



Water bodies



Ash basal area