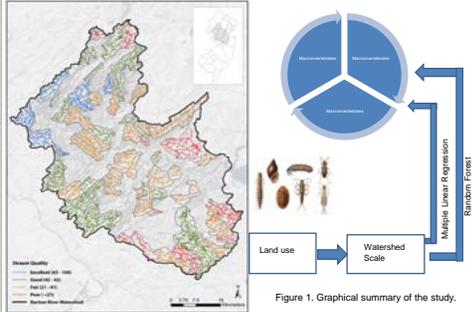


Graphical Abstract

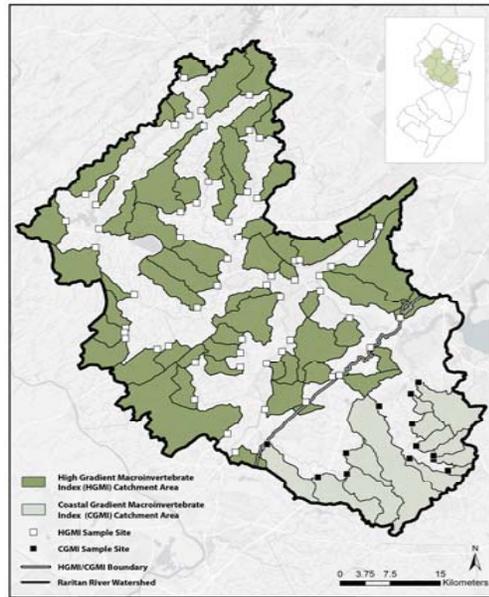
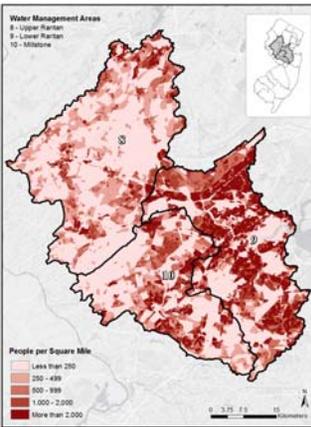


Introduction

The population in the Raritan River Watershed (RRW) has an increasing trend. During 1990 to 2010, an increase in 25.6 percent of population was observed.

Similar to population trend, an increasing housing density was found in the RRW. As a result, upland forest, agricultural lands, and wetlands are converted into low, medium, and high density residential, as well as new urban centers.

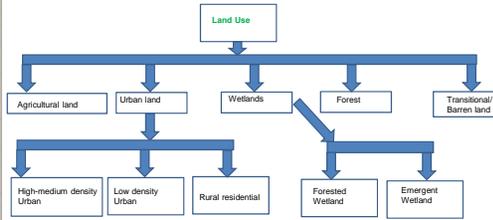
Resulting increases in impervious surface (road, parking lots, and residential areas) are expected to have negative consequences on water quality and watershed health.



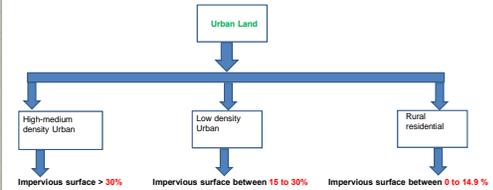
A total of 139 sub-basins were delineated using Streamstats based on macroinvertebrates data from New Jersey Department of Environmental Protection (NJDEP). Out of which, half of the watersheds were eliminated using following two criteria, i) no nestedness and spatial autocorrelation among watersheds, ii) threshold watershed area (>1,000 acre).

Land Use Matrix

2012- land use/cover data obtained from NJDEP was used in this study. Level III NJDEP plus Hasse-Lathrop reclassification systems were used to get the final land use matrix presented below:



Urban Land Classification



- Analysis I (land use matrix): Agricultural land, forest, barren land, high medium density urban, low density urban, rural residential, **wetlands**
- Analysis II (land use matrix): Agricultural land, forest, barren land, high medium density urban, low density urban, rural residential, **forested wetlands, emergent wetlands**.

Stream Health



Stream health can be evaluated through biological monitoring of fresh water. The Ambient Biomonitoring Network (AMNET) of the NJDEP conducts monitoring of macroinvertebrate communities at each station in the stream to evaluate the ecological condition.

Taxonomic analysis of macroinvertebrates is conducted to calculate a multimetric index of stream health known as the New Jersey Impairment Score (NJIS).

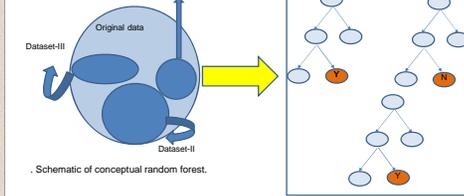
Statistical Analysis

i) Multiple Linear Regression:

A multiple linear regression was used in R platform between NJIS score of each watershed and its land use matrix.

$Y_i = X_i\beta + \epsilon_j$; where Y_i = NJIS of watershed, X_i = land use matrix, β = fixed effect of land uses on NJIS, ϵ_j = residuals.

ii) Random Forest:



Random forest is a non parametric method applied in variety of environmental research and it uses multiple learning algorithms to obtain better predictive performance.

Decision trees are developed based on random selection of data and variables.

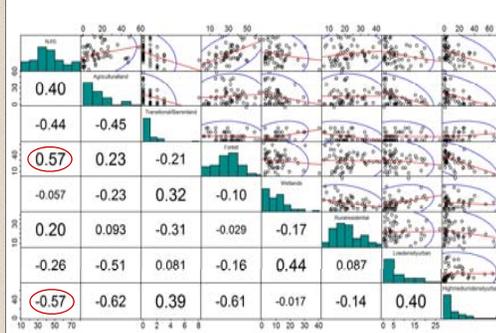
Results and Discussion

1) Stream Health of High Gradient Watersheds (Analysis I):

Response variable: NJIS

Predictors: Agricultural land, forest, barren land, high medium density urban, low density urban, rural residential, **wetlands**

i) Data Visualization:



ii) Land Use and Stream Health (Multiple Linear Regression):

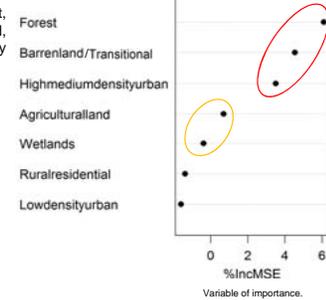
Multiple linear regression modeling results of different predictors at watershed level.

Predictors	β -value	P-value
Intercept	31.74	0.06
Agricultural land	0.05	0.84
Barren land / Transitional	-3.83	0.009**
Forest	0.58	0.02*
Wetlands	0.12	0.69
Low density urban	-0.43	0.29
High medium density urban	-0.11	0.63

* Indicates 5% level of significance and ** indicates 1% level of significance.

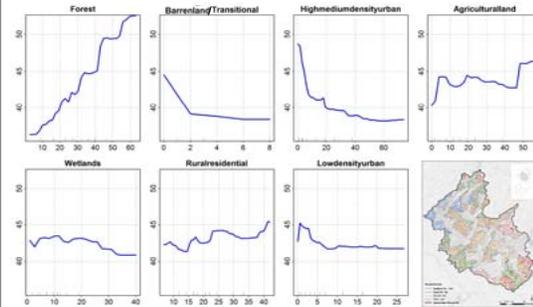
iii) Land Use and Stream Health (Random Forest):

Highly important: Forest, transitional/barren land, and high medium density urban land.



Least important: Rural residential and low density urban land.

Partial Dependence Plot:



Model Evaluation:

Comparison of model with and without least influential predictors.

Parameter	5-fold cross validation	Final model
	Using all predictors	
NSE	0.34	0.26
RMSE	13.32	14.44
PBIAS	1.48	0.75
Removing least influential predictors		
NSE	0.36	0.28
RMSE	13.11	14.22
PBIAS	-0.75	-2.15

Land use is able to explain nearly 30 percent of NJIS and Model predicting power increases with removal of least influential predictors.

Future Work

- Incorporate Coastal Plain Watersheds.
- Collaborate with various watershed associations to incorporate their macroinvertebrate/stream health data collected as part of their citizen science monitoring programs to more fully elucidate patterns across the Raritan Basin.

Contact Detail

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