## IT'S NOT EASY BEING GREEN

## CAN GREEN SPACE PREDICT CRIME RATES IN NEW YORK CITY?

### BACKGROUND

Green space can positively impact psychological health on an individual and community level through promoting sense of place, community identity, and social capital. The World Health Organization (WHO) defines human health as "a state of complete physical, mental and social well-being and not merely the absence of disease or infirmity." Green space can cultivate social cohesion and individual personal well-being, and provide ecosystem services such as reducing crime and improving individual happiness.

Urban green space can play an important role in offering a safe space for communities to both reconnect to nature and connect with their neighbors. This analysis examines the relationship between green space, socioeconomic factors (SES), and crime incidents in the five boroughs of New York City. The aim of the project is to use a regression model to see how well the presence of green space and socioeconomic status (SES) factors predict crime rates for 2014 data.

ALL 7 MAJOR FELONIES

-0.5 - 0.5 Std. Dev



#### METHODS

For this study, an Ordinary Least Squares regression model was run. SES factors and percent green space were chosen as explanatory variables to determine how well they predict the dependent variable, crime rates. Five SES indicators were chosen as predictors for the regression model based on literature: Population density (population), median age (age), unemployment rate (unemployment), percent below poverty level (poverty), and the percent of individuals age 25 and up with a high school or above degree (education). These data sets are projections for 2014 and was obtained from the United States Census Bureau. Percent green space was calculated by merging land use data for each borough, acquired from the New York City government's Planning data. The land use category "open space and recreation" was selected for and created as a new layer (Parks map). The Union tool was used to join census tracts and open space, and lot area was calculated in the resulting layer.

Crime data, downloaded from nyc.gov, represents the incidents of seven major felonies committed all five boroughs of New York City in 2014. This includes assault, burglary, larceny, larceny of a vehicle, murder, rape, and robbery. This XY data was added to the map and kernel density was run for each of the seven major felonies, as well as all felonies together. Results are demonstrated in the following tables and maps.

#### REGRESSION MODEL PREDICTING MURDER INCIDENTS

may attract criminal activity.

**Explanatory Variables** 

Population, age, unemploymer

Population

opulation, age

overty, education

overty, green space

| <b>Explanatory Variables</b>                        | AIC  | Adjusted R <sup>2</sup> |
|---|------|-------------------------|
| Population  | 2777 | 0.012                   |
| Population, age                                     | 2758 | 0.021                   |
| Population, age, unemployment                       | 2656 | 0.066                   |
| Population, age, unemployment, poverty              | 2606 | 0.088                   |
| Population, age, unemployment, poverty, education   | 2600 | 0.091                   |
| Population, age, unemployment, poverty, green space | 2600 | 0.090                   |

**EGRESSION MODEL PREDICTING ALL CRIME INCIDENTS** 

Population, age, unemployment, 22286 0.083

opulation, age, unemployment, 22170 0.13

Population, age, unemployment, 22162 0.13

AIC Adjusted R<sup>2</sup>

22342 0.057

22336 0.060

22321 0.067

#### REGRESSION MODEL PREDICTING ASSAULT INCIDENTS

RESULTS AND CONCLUSIONS

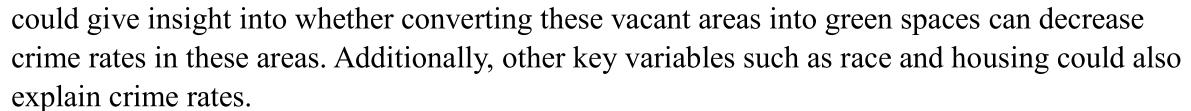
| <b>Explanatory Variables</b>                        | AIC   | Adjusted R <sup>2</sup> |
|---|-------|-------------------------|
| Population  | 17001 | 0.045                   |
| Population, age                                     | 16959 | 0.064                   |
| Population, age, unemployment                       | 16782 | 0.14                    |
| Population, age, unemployment, poverty              | 16678 | 0.18                    |
| Population, age, unemployment, poverty, education   | 16658 | 0.19                    |
| Population, age, unemployment, poverty, green space | 16652 | 0.19                    |

#### REGRESSION MODEL PREDICTING ROBBERY INCIDENTS

| <b>Explanatory Variables</b>                        | AIC   | Adjusted R <sup>2</sup> |
|---|-------|-------------------------|
| Population  | 14777 | 0.089                   |
| Population, age                                     | 14708 | 0.12                    |
| Population, age, unemployment                       | 14509 | 0.20                    |
| Population, age, unemployment, poverty              | 14347 | 0.25                    |
| Population, age, unemployment, poverty, education   | 14341 | 0.26                    |
| Population, age, unemployment, poverty, green space | 14337 | 0.26                    |

#### A properly specified model would have an adjusted R<sup>2</sup> value of 0.80 (80%) or higher. This value indicates that the model explains 80% or more of crime incidents. Based on the regression analysis, green space and socioeconomic status factors are not efficient predictors of crime rates, with an adjusted R<sup>2</sup> value of 0.26 or below. This lack of predicting power indicates that another variable is influencing crime. As shown in the kernel density map for all 7 major felonies, there is a concentration of crime in lower Manhattan, which is an area with a high volume of tourism. This

Future directions would be to look at non-green areas, such as vacant land, as predictor of crime. If this is a good predictor, this



#### Cartographer: Katie Grassle

Data Sources: United States Census Bureau 2015, Global Administrative Area (GADM) 2005, NYC Department of Planning 2000, NYC Department of Planning 2015, NYC OpenData 2014

> Projection: NAD\_1983\_StatePlane\_New\_York\_Long\_Island\_FIPS\_3104\_Feet 5/10/2016



#### Cummings School of Veterinary Medicine

#### **References:**

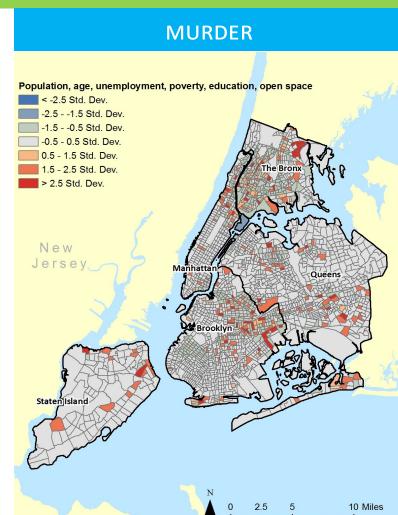
Jennings, V., and Gaither, C.J. (2015). Approaching Environmental Health Disparities and Green Spaces: An Ecosystem Services Perspective. In ternational Journal Eviron. Res. Public Health 12:1952-1968. doi:10.3390/ijerph120201952.

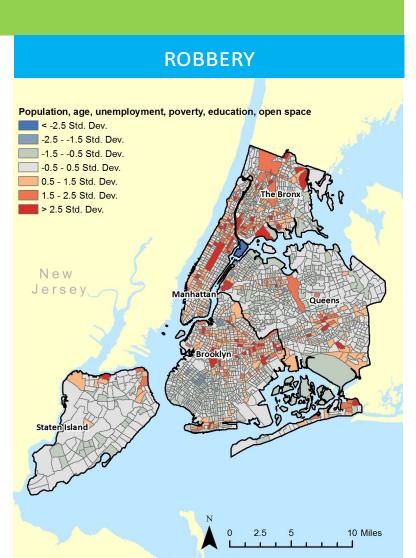
Preamble to the Constitution of the World Health Organization as adopted by the International Health Conference, New York, 19-22 June, 1946; s igned on 22 July 1946 by the representatives of 61 States (Official Records of the World Health Organization, no. 2, p. 100) and entered into force on 7 April 1948. http://www.who.int/about/definitionn/en/print.html.

Weinstein, N., Balmford, A., DeHaan, C.R., Gladwell, V., Bradbury, R.B., and Amano, T. Seeing Community for the Trees: The Links among Con tact with Natural Environments, Community Cohesion, and Crime (2015). BioScience 65: 1141-1153.

#### ORDINARY LEAST REGRESSION RESULTS

|     | ASSAULT   |
|-----|---|
| T D | Population, age, unemployment, poverty, education, open space  < -2.5 Std. Dev.  -2.51.5 Std. Dev.  -1.5 - 0.5 Std. Dev.  0.5 - 0.5 Std. Dev.  1.5 - 2.5 Std. Dev.  > 2.5 Std. Dev.  New  Jersey  Manhattan  Oueens |
| les | N 0 2.5 5 10 Miles  |









# DEPENDENT VARIABLES: 2014 CRIME KERNEL DENSITIES **ALL 7 MAJOR FELONIES**

