



THE LIKABILITY OF A CITY IN RELATION TO MUNICIPALITY BONDS

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WHAT MAKES A CITY ATTRACTIVE TO LIVE IN?

ABSTRACT

To answer the question above, we use a revealed approach using machine learning. We hypothesized that an attractive city ought to attract better human capital translating to lower risk in municipalities in generating revenues. If this is the case, these muni bonds will be perceived as low risk and will inturn deliver low yields. To this end, we build a panel dataset of rouble 60 measure of city attractiveness. We will link these measures to muni bond yields and use machine learning techniques to find which dimension of city attractiveness are key in lowering muni bond yields.

INTRODUCTION

In recent years, It has been hypothesized that a city with attractive qualities ought to attract better human capital. Though it was been theorized, a tangible correlation has not been presented. The purpose of this research was to use a revealed preference approach using machine learning and muni bond yields to find which dimensions of city attractiveness are key in lowering the yields of the bond.

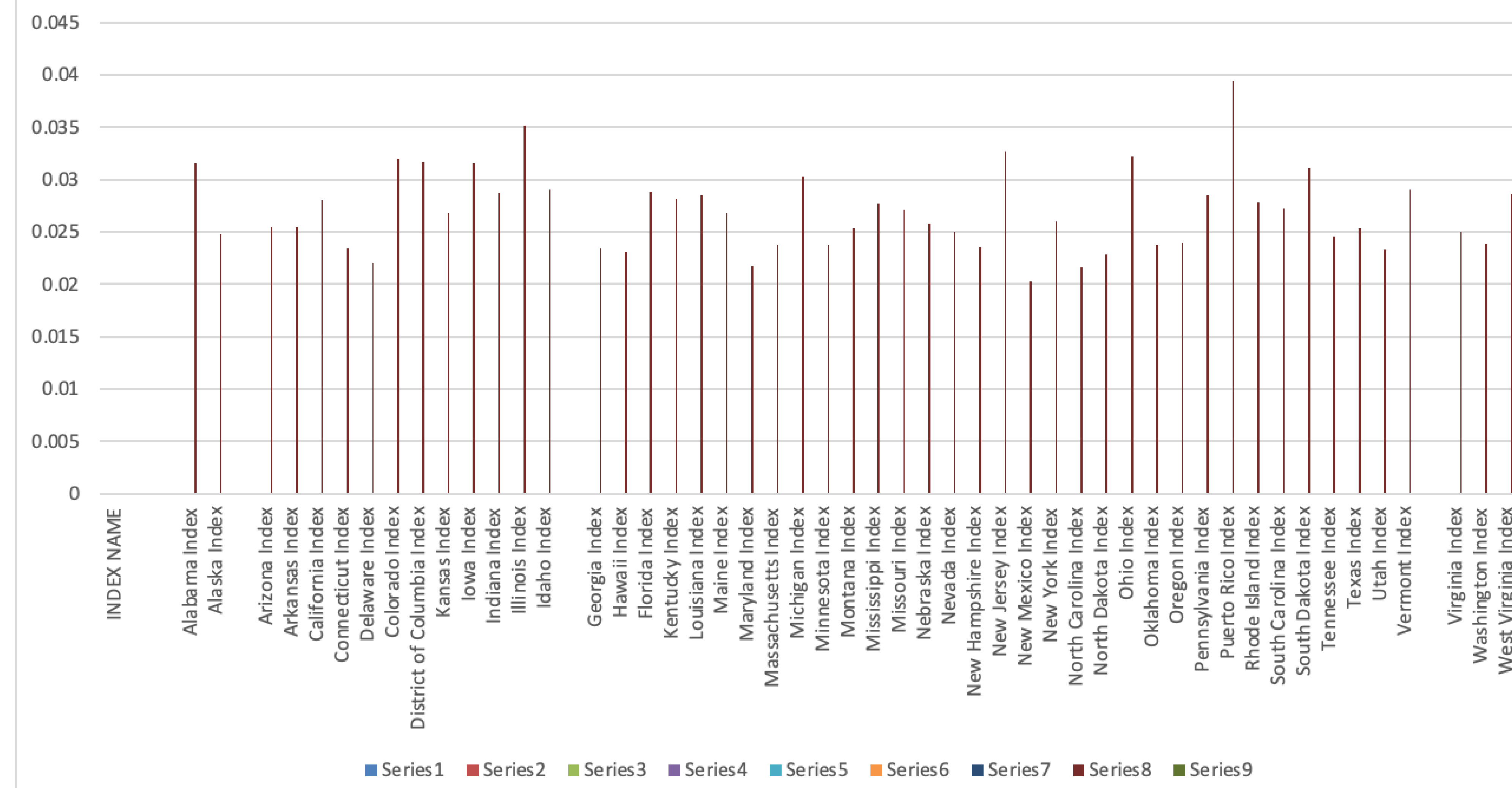


Figure 2. Sample municipality bond data

4 Favorable Weather	Heat Index	https://www.ncdc.noaa.gov
5 Social Connectedness Index	Average sale price of homes in the area.	https://www.census.gov/construction/hous/index.html or https://www.census.gov/programs-surveys/acs
6 Median House Value	Median dollar value of owner occupied housing units	https://www.census.gov/programs-surveys/acs
7 ParkServe	Inventory of parks for every urban area in the U.S., including Puerto Rico	https://www.tpl.org/parkserve
8 Hospitals	Number of hospitals and clinics per capita.	https://www.aha.org/statistics/fact-facts-us-hospitals
9 Air Quality	Levels of common pollutants (PM2.5, PM10, NO2, Ozone)	https://www.epa.gov/air-quality
10 Water Quality	Levels of contaminants in the water (lead, chlorine, E. coli), or Water quality reports from local utilities or health departments.	https://www.epa.gov/water
11 Noise Pollution	Average decibel levels in residential and commercial areas.	https://www.epa.gov/noise
12 Light Pollution	Nighttime light intensity measurements from satellite imagery	https://www.nasa.gov/earthdata.nasa.gov
13 Cost of Living	Consumer Price Index (CPI) or Average rent and utility costs	https://www.bls.gov/spi/
14 Unemployment Rate	Percentage of the labor force that is unemployed	https://www.bls.gov/charts/
15 Cultural Facilities: Number of museums, theaters, galleries. Source: City cultural affairs departments	Number of cultural facilities (museums, theaters, galleries) per capita.	https://culturaldata.org
16 Diversity Index	Ethnic and racial composition of the population	https://www.census.gov
17 Crime Rate	Number of reported crimes per 100,000 residents.	https://ucr.fbi.gov
18 Educational Institutions	Number of schools and colleges	https://nces.ed.gov
19 Public Transportation	Ridership numbers and trends.	https://www.transit.dot.gov/nd
20 Road Quality:	Percentage of roads in good or poor condition, or Road maintenance and repair budgets.	https://infrastructurereportcard.org
21 Internet Speed	Average broadband and mobile internet speeds.	https://www.speedtest.net/global-index
22 Utilities Reliability	Frequency and duration of utility outages (electricity, water, gas).	https://www.eia.gov
23 Political Stability	Frequency and severity of political protests or unrest or Changes in government or leadership (frequency and nature).	https://datacenter.csis.org
24 Policy Effectiveness:	Public satisfaction with government policies (survey data)	https://www.pewresearch.org
25 Nightlife Options	Number of nightlife venues (clubs, bars, etc.) per capita	https://www.statista.com
26 Restaurant and Cafe Density:	Number of restaurants and cafes per capita or per square mile.	https://www.911.gov
27 Emergency Response Time	Average time taken for emergency services (police, fire, medical) to respond.	https://www.census.gov
28 Poverty Rate	Percentage of the population living below the poverty line	https://www.census.gov
29 Child Care Services	Availability of childcare facilities per capita.	https://www.uspto.gov
30 Innovation Index:	Number of patents filed per capita	https://www.uspto.gov
31 Renewable Energy Usage	Percentage of energy derived from renewable sources.	https://www.eia.gov
32 Carbon Footprint	Total greenhouse gas emissions per capita.	https://www.ourworldindata.org
33 Waste Management Efficiency	Recycling rates and waste diversion from landfills.	https://www.epa.gov
34 Obesity Rates	Percentage of the population classified as obese	https://www.cdc.gov
35 Library Resources	Number of libraries per capita and their geographic distribution.	https://www.bls.gov
36 Bicycle-Friendly Infrastructure:	Length and quality of bicycle lanes and paths or Bicycle sharing programs and their usage rates	https://www.bts.gov
37 Traffic Congestion Levels	Average commute times and delays due to traffic.	https://www.bts.gov
38 Airborne Allergen Levels	Concentration of common airborne allergens (pollen, mold, etc.).	https://www.cdc.gov
39 Pet-Friendly Amenities	Number of pet-friendly public spaces (parks, restaurants, etc.).	https://www.imarissat.com
40 Language Diversity Services	Availability of public services in multiple language or Language education programs and resources.	https://digital.gov
41 Tax	Tax rates (property, sales, income) and their comparison to regional averages.	https://taxfoundation.org
42 HOA	Prevalence and coverage of HOAs within the city.	https://www.census.gov/programs-surveys/ahs.html
43 Elderly Care Services	Availability and quality of elderly care facilities and services.	https://www.cms.gov
44 Fire Department Efficiency	Response times of fire services	https://www.cms.gov

Figure 1. Sample Example Variables

RESULTS

During this research, this is an ongoing process which is still undergoing thorough research. As of today, we have accumulated 60 variables that present substantial evidence of depicting the likability of a city through a regression line. We hypothesize that there will be a pattern in the price of the municipality bond and the expression of each variable.

CONCLUSION

This currently an ongoing process which is still undergoing thorough research. As of today, we have accumulated 60 variables that present substantial evidence of depicting the likability of a city through a regression line. We hypothesize that there will be a pattern in the price of the municipality bond and the expression of each variable.

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