

# THE EFFECT OF UNEMPLOYMENT ON VEHICLE MILES DRIVEN

GOOGLE SEARCH QUERIES AS  
PROXY FOR UNEMPLOYMENT

# Overview

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- Motivation: Technology
  - Determine If Google Searches For Jobs Is A Good Predictor Of Vehicle Miles Driven (VMD)
  - Surprisingly, Yes.
- Methodology
  - Linear Regression Model
  - Time Series Data
- Results
  - Job Search Queries Negatively Correlated With Vehicle Miles Driven

# Methodology

□

$$VMD = \alpha_i + \beta_1 Population_i + \beta_2 FuelPrices_i + \beta_3 JobSearches_i + \beta_4 Weather_i + \varepsilon_i$$

- Many Combinations Of RHS, Transformation, Change Of Scale

# Data

- Dependent Variable
  - Vehicle Miles Driven (VMT)
- Independent Variables
  - Population
  - Price Of Fuel
    - Conventional Gas, Reformulated Gas, #2 Diesel
  - Google Job Search Queries
    - Total Of Multiple Search Line Inputs
  - Weather
    - Wet/Dry Anomalies As Percentage
    - Cold/Warm Anomalies As Percentage

# Data

- Time Series
- N = 164
- Monthly Obs.
  - 2004-2017
- Transformation Square Root RHS

| Descriptive Statistics |     |             |           |           |           |
|------------------------|-----|-------------|-----------|-----------|-----------|
| Statistic              | N   | Mean        | St. Dev.  | Min       | Max       |
| Month                  | 164 | 5.5         | 3.4       | 0         | 11        |
| Year                   | 164 | 2,010.3     | 4.0       | 2,004     | 2,017     |
| jobs                   | 164 | 58.9        | 8.6       | 38        | 100       |
| Monster.com            | 164 | 50.9        | 28.1      | 9         | 100       |
| monster.com            | 164 | 46.9        | 34.3      | 3         | 100       |
| Indeed.com             | 164 | 38.3        | 25.9      | 0         | 100       |
| indeed.com             | 164 | 38.3        | 25.9      | 0         | 100       |
| unemployment           | 164 | 39.7        | 19.5      | 18        | 100       |
| job.listings           | 164 | 45.5        | 22.0      | 12        | 100       |
| job_monthly_total      | 164 | 318.4       | 78.9      | 164       | 492       |
| mi_month               | 164 | 251,451.2   | 16,380.0  | 210,635   | 283,498   |
| mi_month_s             | 164 | 251,377.1   | 6,337.8   | 241,735   | 268,158   |
| mi_yr_to_date          | 164 | 1,590,395.0 | 882,572.4 | 220,839   | 3,169,954 |
| mi_12mo_avg            | 164 | 3,006,886.0 | 66,349.0  | 2,894,137 | 3,196,843 |
| population             | 164 | 309,854.1   | 9,854.5   | 292,046   | 325,892   |
| conv_gas               | 164 | 2.8         | 0.6       | 1.6       | 4.1       |
| reform_gas             | 164 | 3.0         | 0.6       | 1.7       | 4.2       |
| num2_diesel            | 164 | 3.0         | 0.7       | 1.6       | 4.7       |
| very_warm              | 164 | 0.2         | 0.2       | 0.0       | 0.9       |
| very_cold              | 164 | 0.04        | 0.1       | 0.0       | 0.5       |
| very_wet               | 164 | 0.1         | 0.1       | 0.0       | 0.4       |
| very_dry               | 164 | 0.1         | 0.1       | 0.0       | 0.3       |
| miles                  | 164 | 251.5       | 16.4      | 210.6     | 283.5     |
| miles_s                | 164 | 251.4       | 6.3       | 241.7     | 268.2     |
| pop                    | 164 | 309.9       | 9.9       | 292.0     | 325.9     |
| y_hat_reg_ssw          | 164 | 251.4       | 5.9       | 242.3     | 265.7     |

# Results

|                          | Dependent variable:                       |   |   |                               |                             |                              |                              |
|--------------------------|---|---|---|-------------------------------|-----------------------------|------------------------------|------------------------------|
|                          | Miles Driven<br>(1)                       | (2)                                       | (3)                                       | (4)                           | (5)                         | (6)                          | (7)                          |
| Population               | 0.166 (-0.157, 0.489)                     | 0.330*** (0.269, 0.392)                   | 0.320*** (0.260, 0.381)                   |                               |                             |                              |                              |
| Conventional Gas         |   |   |   | 0.320*** (0.260, 0.381)       |                             |                              |                              |
| Reformed Gas             | 1,524.904 (-40,927.360, 43,977.170)       | 12,999.650*** (4,927.409, 21,071.900)     | 12,571.310*** (4,761.872, 20,380.740)     | 12.571*** (4.762, 20.381)     |                             |                              |                              |
| #2 Diesel                | 41,783.830** (3,321.541, 80,246.120)      | -8,417.071** (-15,730.630, -1,103.517)    | -8,518.900** (-15,640.010, -1,397.784)    | -8.519** (-15.640, -1.398)    |                             |                              |                              |
| Job Searches             | -36,338.470*** (-47,454.190, -25,222.760) | -6,903.972*** (-9,017.611, -4,790.333)    | -6,393.537*** (-8,492.691, -4,294.383)    | -6.394*** (-8.493, -4.294)    |                             |                              |                              |
| Very Wet                 | -55.835*** (-89.693, -21.978)             | -46.980*** (-53.418, -40.542)             | -44.769*** (-51.100, -38.438)             | -0.045*** (-0.051, -0.038)    |                             |                              |                              |
| Very Dry                 |   |   | 182.346 (-4,793.922, 5,158.614)           | 0.182 (-4.794, 5.159)         |                             |                              |                              |
| Very Cold                |   |   | -2,519.597 (-8,831.634, 3,792.439)        | -2.520 (-8.832, 3.792)        |                             |                              |                              |
| Very Warm                |   |   | -6,433.222*** (-11,109.250, -1,757.189)   | -6.433*** (-11.109, -1.757)   |                             |                              |                              |
| very_warm                |   |   | 2,571.946** (356.155, 4,787.736)          | 2.572** (0.356, 4.788)        |                             |                              |                              |
| I(T * pop)               |   |   |   |                               | 0.885*** (0.830, 0.940)     | 0.992*** (0.975, 1.009)      | 0.994*** (0.978, 1.011)      |
| I(T * conv_gas)          |   |   |   |                               | 4.724** (0.526, 8.922)      | 4.758*** (3.434, 6.081)      | 4.995*** (3.667, 6.323)      |
| I(T * reform_gas)        |   |   |   |                               | -0.230 (-4.156, 3.696)      | -4.084*** (-5.321, -2.846)   | -4.264*** (-5.497, -3.031)   |
| I(T * num2_diesel)       |   |   |   |                               | -4.126*** (-5.361, -2.890)  | -1.259*** (-1.648, -0.869)   | -1.303*** (-1.687, -0.919)   |
| I(T * job_monthly_total) |   |   |   |                               | -0.024 (-0.062, 0.014)      | -0.023*** (-0.035, -0.011)   | -0.023*** (-0.035, -0.011)   |
| I(T * very_wet)          |   |   |   |                               | 0.686** (0.070, 1.301)      | 0.117 (-0.078, 0.311)        |                              |
| I(T * very_dry)          |   |   |   |                               | 0.126 (-0.564, 0.816)       | 0.203* (-0.015, 0.420)       |                              |
| I(T * very_cold)         |   |   |   |                               | 0.059 (-0.395, 0.512)       | -0.160** (-0.302, -0.017)    |                              |
| I(T * very_warm)         |   |   |   |                               | 0.236 (-0.117, 0.588)       | -0.050 (-0.161, 0.061)       |                              |
| Constant                 | 199,959.700*** (102,051.400, 297,868.000) | 173,544.600*** (154,927.400, 192,161.700) | 175,703.800*** (157,328.800, 194,078.800) | 175.704*** (157.329, 194.079) |                             |                              |                              |
| Observations             | 164                                       | 164                                       | 164                                       | 164                           | 164                         | 164                          | 164                          |
| R <sup>2</sup>           | 0.329                                     | 0.838                                     | 0.853                                     | 0.853                         | 0.999                       | 1.000                        | 1.000                        |
| Adjusted R <sup>2</sup>  | 0.308                                     | 0.833                                     | 0.844                                     | 0.844                         | 0.999                       | 1.000                        | 1.000                        |
| Residual Std. Error      | 13,630.830 (df = 158)                     | 2,591.885 (df = 158)                      | 2,500.762 (df = 154)                      | 2.501 (df = 154)              | 0.452 (df = 155)            | 0.142 (df = 155)             | 0.144 (df = 159)             |
| F Statistic              | 15.476*** (df = 5; 158)                   | 163.325*** (df = 5; 158)                  | 99.216*** (df = 9; 154)                   | 99.216*** (df = 9; 154)       | 22,442.590*** (df = 9; 155) | 225,915.700*** (df = 9; 155) | 395,200.000*** (df = 5; 159) |

Note:

\*p<0.1; \*\*p<0.05; \*\*\*p<0.01

# Key Findings

Google Job Search Slopes

| job_monthly_total | job_monthly_total.1 | job_monthly_total.2 | job_monthly_total.3 | I(T * very_wet) | I(T * job_monthly_total) | I(T * job_monthly_total).1 |
|-------------------|---------------------|---------------------|---------------------|-----------------|--------------------------|----------------------------|
| -55.84            | -46.98              | -44.77              | -0.04               | 0.69            | -0.02                    | -0.02                      |

- Job Searches Negatively Correlated With VMD
  - Fewer Commuters
  - Reduced Consumption
    - Retail Sales
    - Commercial (#2 Diesel)

# Key Findings

- Seasonal VMT Includes Variation Due To Weather
  - Reduced Significance Of Weather RHS Variables
- Conventional Gas Positively Correlated
  - Population Growth => More Drivers ?
  - Lower MPG Vehicles => Freed \$ To Drive/Spend ?
- **Searches Do Not Cause Fewer Miles To Be Driven**
  - But, They Do Measure Unemployment
    - Unemployment Causes Fewer Miles To Be Driven



# Discussion/Thinking Forward

- Growth of Social Interactions In Digital Environments Increases Breadth & Scope Of 'Clinical' Setting
  - Observe Behaviors In Private Homes
  - New Behaviors: Gaming, VR, CryptoKitties
  
- Digital Tech Growth Increases Sensing Abilities
  - GPS, Accelerometers, Microphones, Computing Capabilities, Virtual Personalities