Investigate_a_Dataset

May 4, 2020

1 Project: Investigating NICS background checks with FBI Gun Data

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2.1 Table of Contents

Introduction

Data Wrangling

Data Cleaning

Exploratory Data Analysis

Research Question 1: What census data is most associated with high gun per capita?

Research Questinon 2: Which states have had the highest growth in gun registrations?

Research Question 3: What is the overall trend of gun purchases?

Conclusions

Introduction

The data that is used in this project is retrieved from the FBI's National Instant Criminal Background Check System. The goal of this project is investigating NICS background checks to identify data trends of US gun purchases and creating visualisations using Python,NumPy, Pandas and Matplotlib.

The NICS bankground check is used by to determine whether a prospective buyer is eligible to buy firms or explosives. Gun shops call into this system to ensure that each customer does not have a criminal record or isn't otherwise ineligible to make a purchase. The data has been supplemented with state level data from census.gov.

```
In [1]: # Use this cell to set up import statements for all of the packages that you
    import pandas as pd
    import numpy as np
    import datetime
    from statistics import mode
    import seaborn as sns
    % matplotlib inline
    import matplotlib.pyplot as plt
    get_ipython().run_line_magic('matplotlib', 'inline')
## Data Wrangling
```

Tip: In this section of the report, you will load in the data, check for cleanliness, and then trim and clean your dataset for analysis. Make sure that you document your steps carefully and justify your cleaning decisions.

2.1.1 General Properties

```
In [2]: #read from CSV file
        census = pd.read_csv('U.S. Census Data.csv')
        #read from excel data format file
        gun = pd.read_excel('gun_data.xlsx')
In [3]: gun.head()
Out[3]:
             month
                                           permit_recheck handgun long_gun
                          state
                                  permit
                                                                                 other \
        0 2017-09
                        Alabama
                                 16717.0
                                                      0.0
                                                             5734.0
                                                                       6320.0
                                                                                 221.0
        1
          2017-09
                         Alaska
                                   209.0
                                                       2.0
                                                             2320.0
                                                                       2930.0
                                                                                 219.0
        2 2017-09
                                  5069.0
                        Arizona
                                                    382.0 11063.0
                                                                       7946.0
                                                                                 920.0
        3
           2017-09
                       Arkansas
                                  2935.0
                                                    632.0
                                                             4347.0
                                                                       6063.0
                                                                                 165.0
           2017-09 California 57839.0
                                                      0.0 37165.0
                                                                      24581.0 2984.0
           multiple
                      admin prepawn_handgun
                                                       returned_other rentals_handgun
                                         15.0
        0
                317
                        0.0
                                                                   0.0
                                                                                     0.0
        1
                 160
                        0.0
                                          5.0
                                                                   0.0
                                                                                     0.0
        2
                631
                        0.0
                                         13.0
                                                                   0.0
                                                                                     0.0
        3
                366
                       51.0
                                         12.0
                                                                   0.0
                                                                                     0.0
        4
                  0
                        0.0
                                          0.0
                                                                   0.0
                                                                                     0.0
                                                     private_sale_long_gun \
           rentals_long_gun private_sale_handgun
                         0.0
        0
                                                9.0
                                                                       16.0
                                               17.0
                                                                       24.0
        1
                         0.0
        2
                         0.0
                                               38.0
                                                                       12.0
        3
                                               13.0
                                                                       23.0
                         0.0
        4
                         0.0
                                                0.0
                                                                        0.0
           private_sale_other
                                return_to_seller_handgun
                                                           return_to_seller_long_gun
        0
                                                       0.0
                                                                                   0.0
                           3.0
        1
                           1.0
                                                       0.0
                                                                                   0.0
        2
                           2.0
                                                       0.0
                                                                                   0.0
        3
                                                       0.0
                                                                                   2.0
                           0.0
        4
                           0.0
                                                       0.0
                                                                                   0.0
           \verb"return_to_seller_other" totals"
        0
                               3.0
                                     32019
        1
                               0.0
                                      6303
        2
                               0.0
                                      28394
        3
                               1.0
                                     17747
        4
                               0.0 123506
```

In [4]: gun.describe()

Out[4]:		permit	permit_r	echeck	han	dgun long	_gun \	
040[1].	count	12461.000000	_	000000	12465.00	-	-	
	mean	6413.629404		956364	5940.88			
	std	23752.338269		200609	8618.58			
	min	0.000000		000000	0.00		0000	
	25%	0.000000		000000	865.00			
	50%	518.000000		000000	3059.00			
	75%	4272.000000		000000	7280.00			
	max	522188.000000	116681.		107224.00			
	lliax .	322100.000000	110001.	000000	101224.00	108038.00	0000	
		other	multi	ple	admin	prepawn_handg	un \	
	count	5500.000000	12485.000	_	462.000000	10542.0000		
	mean	360.471636	268.603		58.898090	4.8280		
	std	1349.478273	783.185		604.814818	10.9077		
	min	0.000000	0.000		0.000000	0.0000		
	25%	17.000000	15.000		0.000000	0.0000		
	50%	121.000000	125.000		0.000000	0.0000		
	75%	354.000000	301.000		0.000000	5.0000		
	max	77929.000000	38907.000		0.000000	164.0000		
	max	77323.000000	00001.000	000 20	000.000000	101.000	00	
		prepawn_long_g	gun prepa	wn_othe	r	returne	d_other \	
	count	10540.0000		5.00000		1815	.000000	
	mean	7.8343	156	0.16559	1	1	.027548	
	std	16.4680)28	1.05710	5	4	.386296	
	min	0.0000	000	0.00000	0	0	.000000	
	25%	0.0000	000	0.00000	0	0	.000000	
	50%	1.0000		0.00000			.000000	
	75%	8.0000		0.00000			.000000	
	max	269.0000	000 4	9.00000	0	64	.000000	
		rentals_handgu		s_long_		te_sale_handgun		
	count	990.00000		825.000		2750.000000		
	mean	0.07676	58	0.087	273	14.936000		
	std	0.63450	03	0.671	649	71.216021		
	min	0.00000	00	0.000	000	0.000000		
	25%	0.00000	00	0.000	000	0.000000		
	50%	0.00000	00	0.000	000	0.000000		
	75%	0.00000	00	0.000	000	2.000000		
	max	12.00000	00	12.000	000	1017.000000		
								i
		private_sale_	0 0	-	_sale_othe		_	
	count		0.000000		2750.00000		2475.0000	
	mean		1.602909		1.03018		0.4020	
	std		1.253090		4.46784		1.4465	
	min		0.000000		0.00000		0.0000	
	25%	(0.000000		0.00000	D .	0.0000	100

50% 75% max	0.000000 4.000000 777.000000	0.000000 0.000000 71.000000	0.000000 0.000000 28.000000
	return_to_seller_long_gun	return_to_seller_other	totals
count	2750.000000	2255.000000	12485.000000
mean	0.441818	0.105987	21595.725911
std	1.528223	0.427363	32591.418387
min	0.000000	0.000000	0.00000
25%	0.000000	0.000000	4638.000000
50%	0.000000	0.000000	12399.000000
75%	0.000000	0.000000	25453.000000
max	17.000000	4.000000	541978.000000

[8 rows x 25 columns]

Out[5]:					Fact Fac	t Note	Alabama \	
0	Pop	oulation esti	mates, Jul	y 1, 2016,	(V2016)	NaN 4,	863,300	
1	Populati	Population estimates base, April 1, 2010, (V2			NaN 4,	780,131		
2	Populati	on, percent	change - A	pril 1, 2010	(es	NaN	1.70%	
3	;	Popu	lation, Cer	nsus, April 3	1, 2010	NaN 4,	779,736	
4	Persons	under 5 year	s, percent	, July 1, 201	16,	NaN	6.00%	
	Alaska			California				\
0	· ·	6,931,071		39,250,017			952,065	
1		6,392,301						
2	4.50%	8.40%	2.50%	5.40%	10.20%	0.10	6.00%	
3	710,231	6,392,017	2,915,918	37,253,956	5,029,196	3,574,09	7 897,934	
4	7.30%	6.30%	6.40%	6.30%	6.10%	5.20	5.80%	
			_	_				,
		South Dakota					0	\
0		865454		27,862,596				
1		814195	6346298	25,146,100	2,763,888	625,741	8,001,041	
1 2		814195 0.063	6346298 0.048	25,146,100 10.80%	2,763,888 10.40%	625,741 60.20%	8,001,041 5.10%	
1		814195 0.063	6346298 0.048	25,146,100	2,763,888 10.40%	625,741 60.20%	8,001,041 5.10%	
1 2		814195 0.063	6346298 0.048 6346105	25,146,100 10.80% 25,145,561	2,763,888 10.40% 2,763,885	625,741 60.20%	8,001,041 5.10% 8,001,024	
1 2 3		814195 0.063 814180 0.071	6346298 0.048 6346105 0.061	25,146,100 10.80% 25,145,561 7.20%	2,763,888 10.40% 2,763,885 8.30%	625,741 -0.20% 625,741	8,001,041 5.10% 8,001,024	
1 2 3 4	Washingto	814195 0.063 814180 0.071 on West Virgi	6346298 0.048 6346105 0.061 nia Wisco	25,146,100 10.80% 25,145,561 7.20% nsin Wyoming	2,763,888 10.40% 2,763,888 8.30%	625,741 -0.20% 625,741	8,001,041 5.10% 8,001,024	
1 2 3 4	Washingto 7,288,00	814195 0.063 814180 0.071 on West Virgi 00 1,831,	6346298 0.048 6346105 0.061 nia Wiscon	25,146,100 10.80% 25,145,561 7.20% nsin Wyoming	2,763,888 10.40% 2,763,885 8.30%	625,741 -0.20% 625,741	8,001,041 5.10% 8,001,024	
1 2 3 4 0 1	Washingto 7,288,00	814195 0.063 814180 0.071 on West Virgi 00 1,831, 1,853,	6346298 0.048 6346105 0.061 nia Wiscon 102 5,778 011 5,687	25,146,100 10.80% 25,145,561 7.20% nsin Wyoming ,708 585,503	2,763,888 10.40% 2,763,885 8.30%	625,741 -0.20% 625,741	8,001,041 5.10% 8,001,024	
1 2 3 4 0 1 2	Washingto 7,288,00	814195 0.063 814180 0.071 on West Virgi 00 1,831, 1,853, 0% -1.	6346298 0.048 6346105 0.061 nia Wiscon 102 5,778 011 5,687 20% 1	25,146,100 10.80% 25,145,561 7.20% nsin Wyoming ,708 585,503 ,289 563,767	2,763,888 10.40% 2,763,885 8.30%	625,741 -0.20% 625,741	8,001,041 5.10% 8,001,024	
1 2 3 4 0 1	Washingto 7,288,00	814195 0.063 814180 0.071 on West Virgi 00 1,831, 15 1,853, 0% -1.	6346298 0.048 6346105 0.061 nia Wiscon 102 5,778 011 5,687 20% 1	25,146,100 10.80% 25,145,561 7.20% nsin Wyoming ,708 585,503	2,763,888 10.40% 2,763,885 8.30%	625,741 -0.20% 625,741	8,001,041 5.10% 8,001,024	

[5 rows x 52 columns]

```
Out[6]:
                                            Fact Fact Note
                                                                Alabama Alaska Arizona
                                              80
                                                                     65
                                                                             65
                                                                                      65
        count
        unique
                                              80
                                                          15
                                                                     65
                                                                             64
                                                                                      64
                                                         (c)
                                                                         7.30%
        top
                 Nonminority-owned firms, 2012
                                                              50,645.33
                                                                                  50.30%
        freq
                                                           6
                Arkansas California Colorado Connecticut Delaware
                                                                               South Dakota
        count
                      65
                                   65
                                                                                          65
                      64
                                   63
                                            64
                                                          63
                                                                                          65
        unique
                                                                   64
                                                                         . . .
        top
                  50.90%
                               6.80%
                                         3.30%
                                                      0.10%
                                                               51.60%
                                                                                       75811
                        2
                                    2
                                             2
                                                           2
                                                                    2
        freq
                                                                                           1
                Tennessee
                             Texas
                                      Utah Vermont Virginia Washington West Virginia \
                       65
                                65
                                        65
                                                 65
                                                           65
                                                                       65
        count
                                        64
                                                 63
                                                           65
                                                                       65
                                                                                      64
        unique
                        64
                                64
                    0.048
                                     2.50%
        top
                            50.40%
                                             1.90%
                                                       9.10%
                                                               7,288,000
                                                                                   1.50%
        freq
                         2
                                 2
                                         2
                                                  2
                                                            1
                                                                        1
                                                                                       2
                Wisconsin Wyoming
                       65
                                65
        count
                        65
        unique
                                64
                   40,507
                             7.10%
        top
        freq
                         1
         [4 rows x 52 columns]
   ## Data Cleaning Gun datasets:
In [7]: gun.head()
Out[7]:
              month
                           state
                                    permit permit_recheck handgun
                                                                                    other
                                                                       long_gun
        0
           2017-09
                         Alabama
                                  16717.0
                                                        0.0
                                                               5734.0
                                                                          6320.0
                                                                                    221.0
        1
          2017-09
                          Alaska
                                     209.0
                                                         2.0
                                                               2320.0
                                                                          2930.0
                                                                                    219.0
           2017-09
                                    5069.0
                         Arizona
                                                      382.0
                                                             11063.0
                                                                          7946.0
                                                                                    920.0
                                                      632.0
           2017-09
                        Arkansas
                                    2935.0
                                                               4347.0
                                                                          6063.0
                                                                                    165.0
           2017-09
                     California 57839.0
                                                        0.0
                                                             37165.0
                                                                         24581.0
                                                                                   2984.0
                                                          returned_other rentals_handgun
           multiple
                      admin prepawn_handgun
                                                  . . .
        0
                 317
                         0.0
                                          15.0
                                                                     0.0
                                                                                        0.0
        1
                 160
                         0.0
                                           5.0
                                                                     0.0
                                                                                        0.0
        2
                 631
                         0.0
                                          13.0
                                                                     0.0
                                                                                        0.0
        3
                 366
                        51.0
                                          12.0
                                                                     0.0
                                                                                        0.0
        4
                   0
                         0.0
                                           0.0
                                                                     0.0
                                                  . . .
                                                                                        0.0
           rentals_long_gun private_sale_handgun private_sale_long_gun \
        0
                          0.0
                                                  9.0
                                                                          16.0
        1
                          0.0
                                                 17.0
                                                                          24.0
```

In [6]: census.describe()

```
0.0
2
                                      38.0
                                                             12.0
3
                0.0
                                      13.0
                                                             23.0
4
                0.0
                                      0.0
                                                              0.0
  private_sale_other return_to_seller_handgun return_to_seller_long_gun \
0
                  3.0
                                             0.0
                                                                        0.0
                  1.0
                                             0.0
                                                                        0.0
1
                  2.0
                                             0.0
                                                                        0.0
3
                  0.0
                                             0.0
                                                                        2.0
4
                  0.0
                                             0.0
                                                                        0.0
   return_to_seller_other totals
0
                      3.0
                            32019
                      0.0
1
                             6303
2
                      0.0
                            28394
3
                      1.0
                            17747
```

0.0 123506

[5 rows x 27 columns]

In [8]: gun.dtypes

Out[8]:	month	object
	state	object
	permit	float64
	permit_recheck	float64
	handgun	float64
	long_gun	float64
	other	float64
	multiple	int64
	admin	float64
	prepawn_handgun	float64
	prepawn_long_gun	float64
	prepawn_other	float64
	${\tt redemption_handgun}$	float64
	redemption_long_gun	float64
	redemption_other	float64
	returned_handgun	float64
	returned_long_gun	float64
	returned_other	float64
	rentals_handgun	float64
	rentals_long_gun	float64
	${\tt private_sale_handgun}$	float64
	private_sale_long_gun	float64
	private_sale_other	float64
	return_to_seller_handgun	float64
	return_to_seller_long_gun	float64
	return_to_seller_other	float64

dtype: object In [9]: gun.count() Out[9]: month 12485 state 12485 12461 permit permit_recheck 1100 handgun 12465 long_gun 12466 5500 other multiple 12485 admin 12462 prepawn_handgun 10542 prepawn_long_gun 10540 prepawn_other 5115 redemption_handgun 10545 redemption_long_gun 10544 redemption_other 5115 returned_handgun 2200 returned_long_gun 2145 returned_other 1815 rentals_handgun 990 rentals_long_gun 825 private_sale_handgun 2750 private_sale_long_gun 2750 private_sale_other 2750 return_to_seller_handgun 2475 return_to_seller_long_gun 2750 return_to_seller_other 2255 totals 12485 dtype: int64 In [10]: census.head() Out[10]: Fact Fact Note Alabama \ ${\tt NaN}$ 0 Population estimates, July 1, 2016, (V2016) 4,863,300 Population estimates base, April 1, 2010, (V2... 4,780,131 1 ${\tt NaN}$ Population, percent change - April 1, 2010 (es... 2 NaN 1.70% Population, Census, April 1, 2010 4,779,736 3 NaN4 Persons under 5 years, percent, July 1, 2016, ... ${\tt NaN}$ 6.00% Alaska Arizona Arkansas California Colorado Connecticut Delaware \ 0 741,894 2,988,248 6,931,071 39,250,017 5,540,545 3,576,452 952,065 1 710,249 6,392,301 2,916,025 37,254,522 5,029,324 3,574,114 897,936 2 4.50% 8.40% 2.50% 5.40% 10.20% 0.10% 6.00% 3 710,231 6,392,017 2,915,918 37,253,956 5,029,196 3,574,097 897,934 7.30% 6.30% 6.40% 5.20% 6.30% 6.10% 5.80%

int64

totals

```
27,862,596 3,051,217
         0
                           865454
                                    6651194
                                                                     624,594
                                                                               8,411,808
             . . .
         1
                           814195
                                    6346298
                                             25,146,100
                                                          2,763,888
                                                                     625,741
                                                                               8,001,041
             . . .
         2
                                                  10.80%
                                                             10.40%
                                                                      -0.20%
                                                                                   5.10%
             . . .
                            0.063
                                      0.048
         3
                                    6346105
                                             25,145,561
                                                          2,763,885
                                                                     625,741
                                                                               8,001,024
                           814180
             . . .
         4
                            0.071
                                      0.061
                                                   7.20%
                                                              8.30%
                                                                        4.90%
                                                                                   6.10%
             . . .
           Washington West Virginia Wisconsin
                                                  Wyoming
                           1,831,102
         0 7,288,000
                                      5,778,708
                                                  585,501
           6,724,545
                           1,853,011
                                      5,687,289
                                                  563,767
         1
         2
                8.40%
                              -1.20%
                                          1.60%
                                                    3.90%
         3 6,724,540
                           1,852,994
                                      5,686,986
                                                  563,626
         4
                6.20%
                                          5.80%
                                                    6.50%
                               5.50%
         [5 rows x 52 columns]
In [11]: #Replacing the NaN results as "No Records"
         gun.fillna('No record', inplace = True)
         gun.isnull().any()
Out[11]: month
                                       False
                                       False
         state
         permit
                                       False
         permit_recheck
                                       False
         handgun
                                       False
                                       False
         long_gun
                                       False
         other
         multiple
                                       False
                                       False
         admin
         prepawn_handgun
                                       False
                                       False
         prepawn_long_gun
         prepawn_other
                                       False
         redemption_handgun
                                       False
         redemption_long_gun
                                       False
         redemption_other
                                       False
         returned_handgun
                                       False
         returned_long_gun
                                       False
         returned_other
                                       False
                                       False
         rentals_handgun
         rentals_long_gun
                                       False
         private_sale_handgun
                                       False
         private_sale_long_gun
                                       False
         private_sale_other
                                       False
         return_to_seller_handgun
                                       False
         return_to_seller_long_gun
                                       False
         return_to_seller_other
                                       False
         totals
                                       False
         dtype: bool
```

Texas

Vermont

Utah

Virginia \

South Dakota Tennessee

In [12]: census.dtypes

Out[12]:	Fact	object
	Fact Note	object
	Alabama	object
	Alaska	object
	Arizona	object
	Arkansas	object
	California	object
	Colorado	object
	Connecticut	object
	Delaware	object
	Florida	object
	Georgia	object
	Hawaii	object
	Idaho	object
	Illinois	object
	Indiana	object
	Iowa	object
	Kansas	object
	Kentucky	object
	Louisiana	object
	Maine	object
	Maryland	object
	Massachusetts	object
	Michigan	object
	Minnesota	object
	Mississippi	object
	Missouri	object
	Montana	object
	Nebraska	object
	Nevada	object
	New Hampshire	object
	New Jersey	object
	New Mexico	object
	New York	object
	North Carolina	object
	North Dakota	object
	Ohio	ū
	Oklahoma	object
	_	object
	Oregon	object
	Pennsylvania	object
	Rhode Island	object
	South Carolina	object
	South Dakota	object
	Tennessee	object
	Texas	object
	Utah	object

```
Vermont
                           object
         Virginia
                           object
         Washington
                           object
         West Virginia
                           object
         Wisconsin
                           object
         Wyoming
                           object
         dtype: object
In [13]: index_census_state = census.iloc[0].index
         index_census_state
Out[13]: Index(['Fact', 'Fact Note', 'Alabama', 'Alaska', 'Arizona', 'Arkansas',
                'California', 'Colorado', 'Connecticut', 'Delaware', 'Florida',
                'Georgia', 'Hawaii', 'Idaho', 'Illinois', 'Indiana', 'Iowa', 'Kansas',
                'Kentucky', 'Louisiana', 'Maine', 'Maryland', 'Massachusetts',
                'Michigan', 'Minnesota', 'Mississippi', 'Missouri', 'Montana',
                'Nebraska', 'Nevada', 'New Hampshire', 'New Jersey', 'New Mexico',
                'New York', 'North Carolina', 'North Dakota', 'Ohio', 'Oklahoma',
                'Oregon', 'Pennsylvania', 'Rhode Island', 'South Carolina',
                'South Dakota', 'Tennessee', 'Texas', 'Utah', 'Vermont', 'Virginia',
                'Washington', 'West Virginia', 'Wisconsin', 'Wyoming'],
               dtype='object')
In [14]: #As per the previous- using index 2 to remove fact and fact note.
         index_census_state = index_census_state[2:]
         index_census_state
Out[14]: Index(['Alabama', 'Alaska', 'Arizona', 'Arkansas', 'California', 'Colorado',
                'Connecticut', 'Delaware', 'Florida', 'Georgia', 'Hawaii', 'Idaho',
                'Illinois', 'Indiana', 'Iowa', 'Kansas', 'Kentucky', 'Louisiana',
                'Maine', 'Maryland', 'Massachusetts', 'Michigan', 'Minnesota',
                'Mississippi', 'Missouri', 'Montana', 'Nebraska', 'Nevada',
                'New Hampshire', 'New Jersey', 'New Mexico', 'New York',
                'North Carolina', 'North Dakota', 'Ohio', 'Oklahoma', 'Oregon',
                'Pennsylvania', 'Rhode Island', 'South Carolina', 'South Dakota',
                'Tennessee', 'Texas', 'Utah', 'Vermont', 'Virginia', 'Washington',
                'West Virginia', 'Wisconsin', 'Wyoming'],
               dtype='object')
In [15]: #Number of states
         len(index_census_state)
Out[15]: 50
In [16]: #List the number of states
         index_gun_state = gun.groupby('state').sum().index
         index_gun_state
Out[16]: Index(['Alabama', 'Alaska', 'Arizona', 'Arkansas', 'California', 'Colorado',
                'Connecticut', 'Delaware', 'District of Columbia', 'Florida', 'Georgia',
```

```
'Guam', 'Hawaii', 'Idaho', 'Illinois', 'Indiana', 'Iowa', 'Kansas',
                'Kentucky', 'Louisiana', 'Maine', 'Mariana Islands', 'Maryland',
                'Massachusetts', 'Michigan', 'Minnesota', 'Mississippi', 'Missouri',
                'Montana', 'Nebraska', 'Nevada', 'New Hampshire', 'New Jersey',
                'New Mexico', 'New York', 'North Carolina', 'North Dakota', 'Ohio',
                'Oklahoma', 'Oregon', 'Pennsylvania', 'Puerto Rico', 'Rhode Island',
                'South Carolina', 'South Dakota', 'Tennessee', 'Texas', 'Utah',
                'Vermont', 'Virgin Islands', 'Virginia', 'Washington', 'West Virginia',
                'Wisconsin', 'Wyoming'],
               dtype='object', name='state')
In [17]: len(index_gun_state) #Number of states have changed from 50 to 55
Out[17]: 55
In [18]: #To identify why the number of states had changed from 50 to 55
        for state in index_gun_state:
             if state not in index_census_state:
                 print(state)
District of Columbia
Guam
Mariana Islands
Puerto Rico
Virgin Islands
In [19]: #Extracting the Year and months column which wil print off an array
        gun['year']=gun['month'].apply(lambda x: x.split("-")[0]).astype(int)
        gun['year'].unique()
Out[19]: array([2017, 2016, 2015, 2014, 2013, 2012, 2011, 2010, 2009, 2008, 2007,
                2006, 2005, 2004, 2003, 2002, 2001, 2000, 1999, 1998])
In [20]: #
         gun['months'] = gun['month'].apply(lambda x: x.split("-")[1]).astype(int)
        gun['months'].unique()
Out[20]: array([ 9, 8, 7, 6, 5, 4, 3, 2, 1, 12, 11, 10])
In [21]: #check the gun
        gun.head(9)
Out[21]:
             month
                                    state permit permit_recheck handgun long_gun other \
        0 2017-09
                                  Alabama 16717
                                                              0
                                                                   5734
                                                                            6320
                                                                                   221
         1 2017-09
                                   Alaska
                                             209
                                                              2
                                                                   2320
                                                                            2930
                                                                                   219
         2 2017-09
                                  Arizona
                                           5069
                                                            382 11063
                                                                            7946
                                                                                   920
```

```
2017-09
                           Arkansas
                                       2935
                                                          632
                                                                  4347
                                                                            6063
3
                                                                                    165
   2017-09
                         California 57839
                                                            0
                                                                37165
                                                                           24581
                                                                                   2984
5
  2017-09
                           Colorado
                                       4356
                                                            0
                                                                15751
                                                                           13448
                                                                                   1007
6
  2017-09
                       Connecticut
                                       4343
                                                          673
                                                                  4834
                                                                            1993
                                                                                    274
                           Delaware
                                        275
                                                            0
                                                                  1414
                                                                            1538
                                                                                     66
7
   2017-09
             District of Columbia
                                                            0
                                                                    56
  2017-09
                                         1
                                                                               4
                                                                                      0
                                              rentals_long_gun
   multiple admin prepawn_handgun
                                        . . .
0
         317
                  0
                                   15
                                       . . .
         160
                                                               0
1
                  0
                                    5
                                        . . .
2
         631
                  0
                                                               0
                                   13
3
         366
                 51
                                   12
                                                                0
4
                                                                0
           0
                  0
                                    0
5
        1062
                  0
                                                                0
                                       . . .
6
           0
                  0
                                                                0
                                        . . .
7
          68
                  0
                                    0
                                       . . .
8
           0
                  0
                                        . . .
                                                                0
  private_sale_handgun private_sale_long_gun private_sale_other
0
                       9
                                               16
                      17
                                               24
                                                                      1
1
                                                                      2
2
                      38
                                               12
                                                                      0
3
                      13
                                                23
4
                       0
                                                 0
                                                                      0
5
                       0
                                                 0
                                                                      0
6
                       0
                                                 0
                                                                      0
7
                      55
                                               34
                                                                      3
8
                       0
                                                 0
                                                                      0
  return_to_seller_handgun return_to_seller_long_gun return_to_seller_other
0
                            0
                                                          0
                                                                                    3
                            0
                                                          0
                                                                                    0
1
                            0
                                                          0
2
                                                                                    0
                            0
                                                          2
3
                                                                                    1
4
                            0
                                                          0
                                                                                    0
                            0
5
                                                          0
                                                                                    0
6
                            0
                                                          0
                                                                                    0
7
                            1
                                                          2
                                                                                    0
8
                            0
                                                          0
                                                                                    0
   totals year months
    32019
            2017
                       9
0
1
     6303
            2017
                       9
                       9
2
    28394
            2017
3
    17747
            2017
                       9
   123506
            2017
                       9
5
                       9
    35873
            2017
    12117
            2017
                       9
```

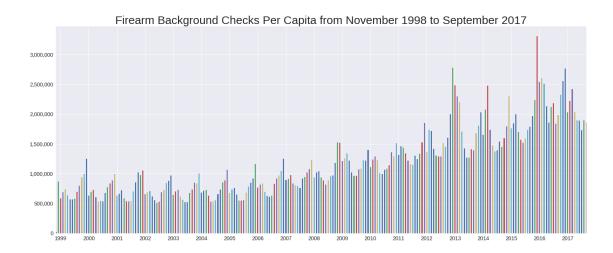
```
7
                               3502 2017
                   8
                                   61
                                           2017
                    [9 rows x 29 columns]
In [22]: #Assig n column names to the list
                   cols = ['permit', 'permit_recheck', 'handgun','long_gun','other','admin','prepawn_handg
                    'prepawn_other','redemption_handgun', 'redemption_long_gun','redemption_other','returne
                    'returned_other', 'rentals_handgun', 'rentals_long_gun', 'private_sale_handgun', 'private_sale_handgun
                    'private_sale_other', 'return_to_seller_handgun', 'return_to_seller_long_gun', 'return_
In [23]: gun.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 12485 entries, 0 to 12484
Data columns (total 29 columns):
month
                                                                12485 non-null object
                                                                12485 non-null object
state
permit
                                                                12485 non-null object
permit_recheck
                                                                12485 non-null object
                                                                12485 non-null object
handgun
long_gun
                                                                12485 non-null object
                                                                12485 non-null object
other
                                                                12485 non-null int64
multiple
admin
                                                                12485 non-null object
                                                                12485 non-null object
prepawn_handgun
prepawn_long_gun
                                                                12485 non-null object
                                                                12485 non-null object
prepawn_other
redemption_handgun
                                                                12485 non-null object
redemption_long_gun
                                                                12485 non-null object
redemption_other
                                                                12485 non-null object
returned_handgun
                                                                12485 non-null object
returned_long_gun
                                                                12485 non-null object
returned_other
                                                                12485 non-null object
rentals_handgun
                                                                12485 non-null object
rentals_long_gun
                                                                12485 non-null object
private_sale_handgun
                                                                12485 non-null object
private_sale_long_gun
                                                                12485 non-null object
private_sale_other
                                                                12485 non-null object
return_to_seller_handgun
                                                                12485 non-null object
return_to_seller_long_gun
                                                                12485 non-null object
return_to_seller_other
                                                                12485 non-null object
totals
                                                                12485 non-null int64
                                                                12485 non-null int64
year
                                                                12485 non-null int64
months
dtypes: int64(4), object(25)
memory usage: 2.8+ MB
```

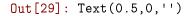
Exploartory Data Analysis

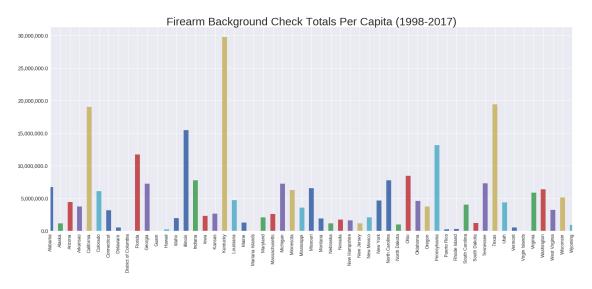
Out[28]: Text(0.5,0,'')

Research Question 1: What census data is most associated with high gun per capita? Research Questinon 2: Which states have had the highest growth in gun registrations? Research Question 3: What is the overall trend of gun purchases? ## Research Question 1: What census data is most associated with high gun per capita?

```
In [24]: #group by state and gun
         gun_state = gun.groupby('state')
In [25]: #sum the total guns in state
         gun_state_sum = gun_state.sum()
In [26]: #qun state total
        gun_state_total = gun_state_sum['totals']
In [27]: #qun total by state
         gun_state_total.head()
Out[27]: state
         Alabama
                        6706079
         Alaska
                        1137643
         Arizona
                        4425714
         Arkansas
                        3752633
         California 19014063
         Name: totals, dtype: int64
In [28]: # sum total increasing by month from Nov 1998 to Sept 2017
         totals = gun.groupby("month")["totals"].sum()
         tick_placement = pd.np.arange(2, len(totals), 12)
         plt.style.use('seaborn')
         ax = totals.plot(kind='bar',figsize=(25,10))
         ax.set_title("Firearm Background Checks Per Capita from November 1998 to September 2017
         ax.set_yticklabels([ "{0:,.0f}".format(y) for y in ax.get_yticks() ], fontsize=14);
         plt.setp(ax.get_xticklabels(), rotation=0, fontsize=14)
         ax.set_xticks(tick_placement)
         ax.set_xticklabels([ totals.index[i].split("-")[0] for i in tick_placement ])
         ax.set_xlim(0, len(totals) - 1)
         ax.set_xlabel("")
```

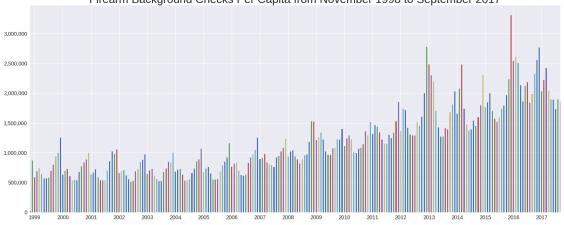




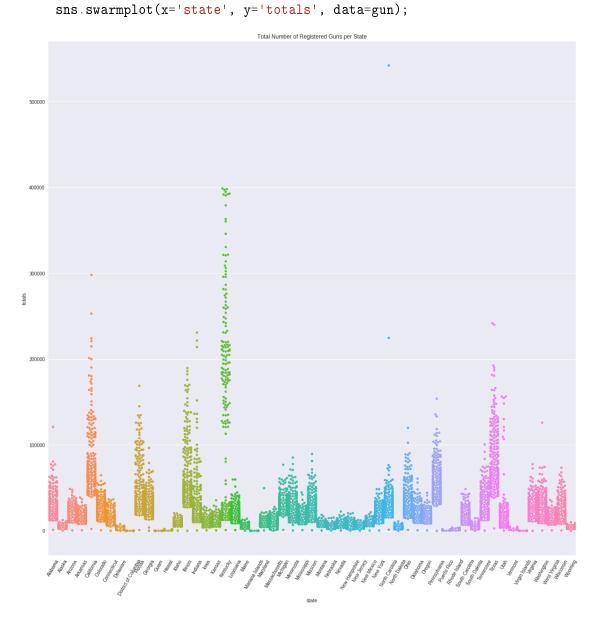


```
## Research Question 2: Which states have had the highest growth in gun registrations?
```

```
In [30]: #group by state
         gun_alltime = gun.groupby(['month', 'state'])['totals'].sum()
In [31]: #check registration date
         cur_date = gun['month'].max()
         year_date = gun['month'].min()
In [32]: # The amount of registed guns
         gun_grow_tot = gun_alltime.loc[cur_date] - gun_alltime.loc[year_date]
         gun_grow_tot.idxmax()
Out[32]: 'Kentucky'
In [33]: #The total amount in Kentucky
         gun_grow_tot.loc['Kentucky']
Out [33]: 397866
   ## Research Question 3: What is the overall trend of gun purchases?
In [34]: # sum total increasing by month from Nov 1998 to Sept 2017
         totals = gun.groupby("month")["totals"].sum()
         tick_placement = pd.np.arange(2, len(totals), 12)
         plt.style.use('seaborn')
         ax = totals.plot(kind='bar',figsize=(25,10))
         ax.set_title("Firearm Background Checks Per Capita from November 1998 to September 2017
         ax.set_yticklabels([ "{0:,.0f}".format(y) for y in ax.get_yticks() ], fontsize=14);
         plt.setp(ax.get_xticklabels(), rotation=0, fontsize=14)
         ax.set_xticks(tick_placement)
         ax.set_xticklabels([ totals.index[i].split("-")[0] for i in tick_placement ])
         ax.set_xlim(0, len(totals) - 1)
         ax.set_xlabel("")
Out[34]: Text(0.5,0,'')
                Firearm Background Checks Per Capita from November 1998 to September 2017
    3,000,000
```



In [37]: #The increasing number of registered guns in each state. With Kentucky with the most re
 plt.subplots(figsize=(20,20))
 plt.xticks(rotation=60);
 plt.title('Total Number of Registered Guns per State')



Findings

1. The dataset was from November 1998 through to September 2017 found that Kentucky has had the most activity in background checks for guns since Novmeber 1998 righ through to September 2017.

- 2. Through analysis, the state of kentucky had the highest growth in gun registration. The total registed number of guns was 397866.
- 3. As per the swarm plot diagram above, you can see that the sum of registered guns in each state with Kentucky with the increasing amount of registered guns.
- 4. As per the last swarm plot diagram, you can see the increasing number of registered guns in each state. With Kentucky with the most registered number of guns and increasing.
- 5. Kentucky, Califronia and Texas had the most registered guns per capita.

2.2 Conclusion

In this project, the gun dataset that was supplied had data from the time period of 1998-2017. Ac

2.3 Limitations

There were some limitations in this study, due to figuring out the calculating the total number of gun purchasing sales in this project. However, there is an increase over time of you can see the data trends from November 1998 through to September 2017 with Firearm Background Checks Per Capita from November 1998 to September 2017. According to the Guardian (2017) only one in five Americans obtain guns without background checks.

According to NICS statistics (2018) showed there were 25,235,215 background checks in 2017. Since 1998, there have been more than 230 million background checks, leading to more than 1.3 million denials.

2.4 References

- Investigate a Dataset Data Set Options: https://video.udacity-data.com/topher/2018/July/5b57919a_data-set-options/data-set-options.pdf
- GitHub support https://github.com/Alicelibinguo/Investigate-FBI-Gun-Data
- Stackoverflow help https://stackoverflow.com/questions/42406233/how-to-add-title-to-seaborn-boxplot
- Adding Title https://python-graph-gallery.com/4-add-title-and-axis-label/
- Just one in five Americans obtains gun without background check, survey finds: https://www.theguardian.com/us-news/2017/jan/02/guns-state-background-checks-study
- FBI Gun Data(2018) https://github.com/leicao-me/data-analysis-on-FBI-GUN-DATA
- Wikipeda Permits: https://en.wikipedia.org/wiki/Gun_laws_in_Kentucky
- https://github.com/BuzzFeedNews/nics-firearm-background-checks/blob/master/README.md
- How Many Guns Were Sold In The US In 2017 And 2018?https://www.ibtimes.com/how-many-guns-were-sold-us-2017-2018-2731175