FBI_Gun_Date

December 20, 2021

1 Project: Investigate a Dataset - [FBI_Gun_Data]

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Introduction

1.1.1 Dataset Description

In this notebook, we will analyze data for two related data sets:

1- Gun Data (NICS Data), this data comes from the FBI's National Instant Criminal Background Check System, it is a system that contains people who are allowed to own weapons and people who have a criminal history. Our data is columns that contains the number of firearm checks by month, state, type, and totals.

2-Census Data: It contains several variables at the state level.variables may be have one data point per state, or have data for more than one year, columns(fact,fact note,states).

1.1.2 Questions:

- 1- How much growth rate in gun registration in each state?
 - 2- What is the over all trend in gun phrchases?
 - 3- How many persons are permitted to own gun in last date?
- 4- How many persons are permitted versus not permitted to own gun in Arizona state in last date?
 - 5- How much quantity of each types of guns?
 - 6- in which state did men owned firms by maximum number of gun in 2012?
 - 7- How many gun registered in all states in 2017?
 - 8- how many gun registered in each state i 2000?
 - 9- What is the average of guns registered in each states since 1998?
 - 10- How many guns registered in Texas in 2017?
 - 11- What is the total revenue of all fims in all states in 2012?

```
In [1]: #import packages
        import pandas as pd
        import numpy as np
        %matplotlib inline
        import matplotlib.pyplot as plt
        import datetime
In [2]: # Upgrade pandas to use dataframe.explode() function.
        #!pip install --upgrade pandas==0.25.0
   ## Data Wrangling
In [3]: # Loading DataFrames
        # read_csv to read and load csv file
        # read_excel to read and load xlsx file
        df_census = pd.read_csv('US_Census_Data.csv')
        df_gun = pd.read_excel('gun_data.xlsx')
In [4]: # print out first 5 rows of census data
        df_census.head()
Out[4]:
                                                         Fact Fact Note
                                                                           Alabama \
        0
                Population estimates, July 1, 2016,
                                                      (V2016)
                                                                    NaN
                                                                        4,863,300
           Population estimates base, April 1, 2010, (V2...
                                                                    NaN 4,780,131
        2
           Population, percent change - April 1, 2010 (es...
                                                                    NaN
                                                                              1.70%
                           Population, Census, April 1, 2010
        3
                                                                    {\tt NaN}
                                                                         4,779,736
        4 Persons under 5 years, percent, July 1, 2016, ...
                                                                              6.00%
                                                                    NaN
            Alaska
                      Arizona
                                Arkansas California
                                                        Colorado Connecticut Delaware
         741,894
                   6,931,071
                               2,988,248
                                           39,250,017
                                                       5,540,545
                                                                   3,576,452
                                                                              952,065
                    6,392,301
        1
           710,249
                               2,916,025
                                           37,254,522
                                                       5,029,324
                                                                   3,574,114
                                                                              897,936
             4.50%
                        8.40%
                                   2.50%
                                                5.40%
                                                                       0.10%
                                                          10.20%
                                                                                 6.00%
                               2,915,918
        3
          710,231
                    6,392,017
                                           37,253,956
                                                       5,029,196
                                                                   3,574,097
                                                                              897,934
             7.30%
                        6.30%
                                   6.40%
                                                6.30%
                                                           6.10%
                                                                       5.20%
                                                                                 5.80%
                   South Dakota Tennessee
                                                 Texas
                                                             Utah
                                                                  Vermont
                                                                              Virginia
        0
                         865454
                                  6651194
                                          27,862,596
                                                        3,051,217
                                                                   624,594
                                                                           8,411,808
            . . .
        1
            . . .
                         814195
                                  6346298
                                            25,146,100
                                                        2,763,888
                                                                   625,741
                                                                            8,001,041
        2
                          0.063
                                    0.048
                                                10.80%
                                                           10.40%
                                                                    -0.20%
                                                                                 5.10%
            . . .
        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
        0 7,288,000
                         1,831,102
                                    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%
           6,724,540
                         1,852,994 5,686,986
                                                563,626
               6.20%
                             5.50%
                                         5.80%
                                                  6.50%
```

[5 rows x 52 columns]

```
In [5]: # info() to show some general information of data
        # there are missing values
        # there are incorrect data types
        # shape(85,52)
        df_census.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 85 entries, 0 to 84
Data columns (total 52 columns):
Fact
                  80 non-null object
Fact Note
                  28 non-null object
Alabama
                  65 non-null object
                  65 non-null object
Alaska
Arizona
                  65 non-null object
Arkansas
                  65 non-null object
California
                  65 non-null object
Colorado
                  65 non-null object
Connecticut
                  65 non-null object
Delaware
                  65 non-null object
Florida
                  65 non-null object
Georgia
                  65 non-null object
Hawaii
                  65 non-null object
Idaho
                  65 non-null object
Illinois
                  65 non-null object
Indiana
                  65 non-null object
Iowa
                  65 non-null object
Kansas
                  65 non-null object
Kentucky
                  65 non-null object
Louisiana
                  65 non-null object
Maine
                  65 non-null object
Maryland
                  65 non-null object
Massachusetts
                  65 non-null object
Michigan
                  65 non-null object
Minnesota
                  65 non-null object
Mississippi
                  65 non-null object
Missouri
                  65 non-null object
Montana
                  65 non-null object
Nebraska
                  65 non-null object
Nevada
                  65 non-null object
New Hampshire
                  65 non-null object
New Jersey
                  65 non-null object
New Mexico
                  65 non-null object
New York
                  65 non-null object
North Carolina
                  65 non-null object
North Dakota
                  65 non-null object
Ohio
                  65 non-null object
Oklahoma
                  65 non-null object
                  65 non-null object
Oregon
```

```
Pennsylvania
                  65 non-null object
Rhode Island
                  65 non-null object
South Carolina
                  65 non-null object
South Dakota
                  65 non-null object
Tennessee
                  65 non-null object
Texas
                  65 non-null object
Utah
                  65 non-null object
                  65 non-null object
Vermont
Virginia
                  65 non-null object
                  65 non-null object
Washington
West Virginia
                  65 non-null object
                  65 non-null object
Wisconsin
                  65 non-null object
Wyoming
dtypes: object(52)
memory usage: 34.6+ KB
In [6]: # see number of columns that contain missing values (NaN)
        df_census.isnull().any().sum()
Out[6]: 52
In [7]: # number of missing values
        df_census.isnull().sum().sum()
Out[7]: 1062
In [8]: # which columns have missing and count it
        df_census.isnull().sum()
Out[8]: Fact
                            5
        Fact Note
                           57
        Alabama
                           20
        Alaska
                           20
        Arizona
                           20
        Arkansas
                           20
        California
                           20
        Colorado
                           20
        Connecticut
                           20
        Delaware
                           20
        Florida
                           20
                           20
        Georgia
        Hawaii
                           20
        Idaho
                           20
        Illinois
                           20
        Indiana
                           20
        Towa
                           20
        Kansas
                           20
        Kentucky
                           20
```

Louisiana	20
Maine	20
Maryland	20
Massachusetts	20
Michigan	20
Minnesota	20
Mississippi	20
Missouri	20
Montana	20
Nebraska	20
Nevada	20
New Hampshire	20
New Jersey	20
New Mexico	20
New York	20
North Carolina	20
North Dakota	20
Ohio	20
Oklahoma	20
Oregon	20
Pennsylvania	20
Rhode Island	20
South Carolina	20
South Dakota	20
Tennessee	20
Texas	20
Utah	20
Vermont	20
Virginia	20
Washington	20
West Virginia	20
Wisconsin	20
Wyoming	20
dtype: int64	

Out[9]: 3

In [10]: # do the same with df_gun df_gun.head()

Out[10]:		month	state	permit	permit_recheck	handgun	long_gun	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	Arizona	5069.0	382.0	11063.0	7946.0	920.0	
	3	2017-09	Arkansas	2935.0	632.0	4347.0	6063.0	165.0	
	4	2017-09	California	57839.0	0.0	37165.0	24581.0	2984.0	

```
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 \
                                                  9.0
                                                                         16.0
         0
                          0.0
                                                 17.0
                          0.0
                                                                         24.0
         1
         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
                            3.0
                                                        0.0
                                                                                     0.0
                            1.0
                                                        0.0
                                                                                     0.0
         1
         2
                            2.0
                                                        0.0
                                                                                     0.0
                                                                                     2.0
         3
                            0.0
                                                        0.0
         4
                            0.0
                                                        0.0
                                                                                     0.0
            return_to_seller_other
                                      totals
         0
                                       32019
                                 3.0
         1
                                 0.0
                                        6303
         2
                                       28394
                                 0.0
         3
                                 1.0
                                       17747
         4
                                 0.0 123506
         [5 rows x 27 columns]
In [11]: # show general information
         # missing values
         # incorrect data types
         # shape(12485,27)
         df_gun.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 12485 entries, 0 to 12484
Data columns (total 27 columns):
month
                              12485 non-null object
state
                              12485 non-null object
                              12461 non-null float64
permit
permit_recheck
                              1100 non-null float64
                              12465 non-null float64
handgun
long_gun
                              12466 non-null float64
other
                              5500 non-null float64
multiple
                              12485 non-null int64
```

multiple

admin prepawn_handgun

returned_other

rentals_handgun \

```
admin
                             12462 non-null float64
                             10542 non-null float64
prepawn_handgun
prepawn_long_gun
                             10540 non-null float64
prepawn_other
                             5115 non-null float64
redemption_handgun
                             10545 non-null float64
redemption_long_gun
                             10544 non-null float64
redemption_other
                             5115 non-null float64
returned_handgun
                             2200 non-null float64
returned_long_gun
                             2145 non-null float64
returned_other
                             1815 non-null float64
rentals_handgun
                             990 non-null float64
rentals_long_gun
                             825 non-null float64
                             2750 non-null float64
private_sale_handgun
private_sale_long_gun
                             2750 non-null float64
                             2750 non-null float64
private_sale_other
return_to_seller_handgun
                             2475 non-null float64
return_to_seller_long_gun
                             2750 non-null float64
                             2255 non-null float64
return_to_seller_other
totals
                             12485 non-null int64
dtypes: float64(23), int64(2), object(2)
memory usage: 2.6+ MB
In [12]: # number of columns has missing values
         df_gun.isnull().any().sum()
Out[12]: 23
In [13]: # number of missing values
         df_gun.isnull().sum().sum()
Out[13]: 154595
In [14]: # which columns contain missing value
         df_gun.isnull().sum()
Out[14]: month
                                           0
         state
                                           0
                                          24
         permit
         permit_recheck
                                       11385
         handgun
                                          20
                                          19
         long_gun
                                        6985
         other
         multiple
                                           0
         admin
                                          23
         prepawn_handgun
                                        1943
         prepawn_long_gun
                                        1945
         prepawn_other
                                       7370
         redemption_handgun
                                        1940
```

```
redemption_long_gun
                                        1941
         redemption_other
                                        7370
         returned_handgun
                                       10285
         returned_long_gun
                                       10340
         returned_other
                                       10670
         rentals_handgun
                                       11495
         rentals_long_gun
                                       11660
         private_sale_handgun
                                        9735
         private_sale_long_gun
                                        9735
         private_sale_other
                                        9735
         return_to_seller_handgun
                                       10010
         return_to_seller_long_gun
                                        9735
         return_to_seller_other
                                       10230
                                           0
         dtype: int64
In [15]: # check duplicates value
         # there are no duplicates
         df_gun.duplicated().sum()
Out[15]: 0
```

1.1.3 Data Cleaning

```
In [16]: # fixing data type
         # we need to convert type of states column in census data from object type to float typ
         # but state data separated by (,) then when we try conver this data using extract and a
         # data will converted as minimum float number
         # to solve this we remove sympol like , and % then convert it
         # but astype() method can't convert string to float(its NaN value)
         # first we fill NaN with type of same data because float object has no attibute split
         # after convert, we get NaN again then we fill it again by mean, that is better.
         \#for\ column\ in\ df\_census.columns[2:]:
              df_census[column] = df_census[column] \cdot str.extract('(\d+)') \cdot astype(float)
              df_census[column] = pd.to_numeric(df_census[column],errors='coerce')
              df_census[column] = df_census[column].replace(', ', ', '.').str.extract('(\d)').astype(flower)
         df_census.fillna('1,111',inplace=True)
         for column in df_census.columns[2:]:
             df_census[column]=df_census[column].apply(lambda x:x.split()[0].replace(',',''))
             df_census[column]=df_census[column].apply(lambda x:x.split()[0].replace('\",',''))
             df_{census}[column] = df_{census}[column] . str.extract('(\d+)') . astype(float)
         df_census.replace('1,111',np.NaN, inplace=True)
         df_census.replace(1111.0, np.NaN, inplace=True)
```

```
Out[17]:
                                                           Fact \
                  Population estimates, July 1, 2016,
                                                        (V2016)
         1
             Population estimates base, April 1, 2010,
         2
             Population, percent change - April 1, 2010 (es...
                             Population, Census, April 1, 2010
         3
         4
             Persons under 5 years, percent, July 1, 2016, ...
         5
                 Persons under 5 years, percent, April 1, 2010
         6
             Persons under 18 years, percent, July 1, 2016,...
         7
                Persons under 18 years, percent, April 1, 2010
         8
             Persons 65 years and over, percent, July 1, 2...
         9
             Persons 65 years and over, percent, April 1, 2010
              Female persons, percent, July 1, 2016,
                                                       (V2016)
         10
                        Female persons, percent, April 1, 2010
         11
         12
                  White alone, percent, July 1, 2016,
         13
             Black or African American alone, percent, July...
         14
             American Indian and Alaska Native alone, perce...
         15
                  Asian alone, percent, July 1, 2016,
                                                       (V2016)
         16
             Native Hawaiian and Other Pacific Islander alo...
             Two or More Races, percent, July 1, 2016,
         17
             Hispanic or Latino, percent, July 1, 2016, (V...
             White alone, not Hispanic or Latino, percent, ...
         20
                                           Veterans, 2011-2015
         21
                      Foreign born persons, percent, 2011-2015
         22
                        Housing units, July 1, 2016,
                                                       (V2016)
         23
                                  Housing units, April 1, 2010
         24
                   Owner-occupied housing unit rate, 2011-2015
             Median value of owner-occupied housing units, ...
         25
         26
             Median selected monthly owner costs -with a mo...
         27
             Median selected monthly owner costs -without a...
         28
                                  Median gross rent, 2011-2015
         29
                                        Building permits, 2016
             With a disability, under age 65 years, percent...
         37
             Persons without health insurance, under age 6...
            In civilian labor force, total, percent of pop...
         38
             In civilian labor force, female, percent of po...
             Total accommodation and food services sales, 2...
         41
             Total health care and social assistance receip...
                  Total manufacturers shipments, 2012 ($1,000)
         43
                Total merchant wholesaler sales, 2012 ($1,000)
         44
                             Total retail sales, 2012 ($1,000)
         45
                           Total retail sales per capita, 2012
         46 Mean travel time to work (minutes), workers ag...
             Median household income (in 2015 dollars), 201...
             Per capita income in past 12 months (in 2015 d...
```

49	Persons in poverty,	percent									
50	Total employer establishment	s, 2015									
51	Total employmen	t, 2015									
52	Total annual payroll, 2015 (\$1,000)										
53	Total employment, percent change, 2014-2015										
54	Total nonemployer establishments, 2015										
55		All firms, 2012									
56	Men-owned firm										
57	Women-owned firm	•									
58	Minority-owned firm	•									
59	Nonminority-owned firm										
60	Veteran-owned firm										
61	Nonveteran-owned firm										
62	Population per square mil										
63	Land area in square mile										
64	-	PS Code									
	LT.										
65		NaN									
	T W .		47 1	,							
•	Fact Note	Alabama	Alaska	/							
0	NaN	4863300.0	741894.0								
1	NaN	4780131.0	710249.0								
2	NaN	1.0	4.0								
3	NaN	4779736.0	710231.0								
4	NaN	6.0	7.0								
5	NaN	6.0	7.0								
6	NaN	22.0	25.0								
7	NaN	23.0	26.0								
8	NaN	16.0	10.0								
9	NaN	13.0	7.0								
10	NaN	51.0	47.0								
11	NaN	51.0	48.0								
12	(a)	69.0	66.0								
13	(a)	26.0	3.0								
14	(a)	0.0	15.0								
15	(a)	1.0	6.0								
16	(a)	0.0	1.0								
17	NaN	1.0	7.0								
18	(b)	4.0	7.0								
19	NaN	65.0	61.0								
20	NaN	363170.0	69323.0								
21	NaN	3.0	7.0								
22	NaN	2230185.0	310658.0								
23	NaN	2171853.0	306967.0								
24	NaN	68.0	63.0								
2 1 25	NaN	125500.0	250000.0								
26 26	NaN	1139.0	1827.0								
20 27	NaN NaN	345.0	554.0								
28	NaN	717.0	1146.0								

29				NaN	1500	1.0	1503	3.0
 36				 NaN	1	1.0		3.0
37				NaN		0.0		5.0
38				NaN		8.0		· . 0
39				NaN		3.0		0.6
3 <i>9</i> 40				(c)	757646		2221335	
41				(c)			6375483	
42				(c)				aN
43				(c)	5774656		5216303	
44				(c)			10474275	
45				(c)	1214		14320	
46						4.0		
47				NaN NaN	4362		72515	0.0
47 48				nan NaN	2409		33413	
40 49				NaN NaN		7.0		
	T., al., d. a., d. + a.	d:	+ . d b					0.0
50 51	Includes data		•				20907	
51	Includes data		•	•			267999	
52 52	Includes data		•	•			15643303	
53 E4	Includes data	not distri	outed by co	•		1.0		0.0
54 				NaN	32202		55521	
55 56				NaN N-N	37415		68032	
56 57				NaN N-N	20360		35402	
57				NaN N-N	13763		22141	
58				NaN	9221		13688	
59				NaN	27265		51147	
60				NaN	4194		7953	
61				NaN	31698		56091	
62				NaN		4.0		0
63				NaN	5064		570640	
64				NaN		1.0		2.0
65				NaN		NaN	IV	laN
	Arizona	Arkansas	Californi	а	Colorado	Con	necticut	\
0	6931071.0	2988248.0	39250017.		5540545.0		576452.0	`
1	6392301.0	2916025.0	37254522.		5029324.0		574114.0	
2	8.0	2.0	5.		10.0	J	0.0	
3	6392017.0	2915918.0	37253956.		5029196.0	3	574097.0	
4	6.0	6.0	6.		6.0	Ū	5.0	
5	7.0	6.0	6.		6.0		5.0	
6	23.0	23.0	23.		22.0		21.0	
7	25.0	24.0	25.		24.0		22.0	
8	16.0	16.0	13.		13.0		16.0	
9	13.0	14.0	11.		10.0		14.0	
10	50.0	50.0	50.		49.0		51.0	
11	50.0	50.0	50.		49.0		51.0	
12	83.0	79.0	72.		87.0		80.0	
13	4.0	15.0	6.		4.0		11.0	
			٠.					

1 /	5.0	1 0	1 0	1.0	0.0
14		1.0	1.0		0.0
15	3.0	1.0	14.0	3.0	4.0
16	0.0	0.0	0.0	0.0	0.0
17	2.0	2.0	3.0	3.0	2.0
18	30.0	7.0	38.0	21.0	15.0
19	55.0	72.0	37.0	68.0	67.0
20	505794.0	220953.0	1777410.0	391725.0	199331.0
21	13.0	4.0	27.0	9.0	13.0
22	2961003.0	1354762.0	14060525.0	2339118.0	1499116.0
23	2844526.0	1316299.0	13680081.0	2212898.0	1487891.0
24	62.0	66.0	54.0	64.0	67.0
25	167500.0	111400.0	385500.0	247800.0	270500.0
26	1343.0	1019.0	2155.0	1577.0	2067.0
27	380.0	327.0	500.0	419.0	833.0
28	913.0	677.0	1255.0	1002.0	1075.0
29	35578.0	9474.0	102350.0	38974.0	5504.0
36	8.0	12.0	6.0	7.0	7.0
37	11.0	9.0	8.0	8.0	5.0
38	59.0	58.0	63.0	67.0	67.0
39	54.0	53.0	57.0	62.0	62.0
40	13996635.0		90830372.0	13617654.0	9542068.0
41	37055881.0	15792628.0	248953592.0	29488161.0	29573119.0
42	51243473.0	62712925.0	512303164.0	50447098.0	55160095.0
43	69437272.0	31256110.0	666652186.0	77034971.0	161962244.0
44	84716542.0	36815256.0	481800461.0	67815200.0	51632467.0
45	12927.0	12483.0	12665.0	13073.0	14381.0
46	24.0	21.0	28.0	24.0	25.0
47	50255.0	41371.0	61818.0	60629.0	70331.0
48	25848.0	22798.0	30318.0	32217.0	38803.0
49	16.0	17.0	14.0	11.0	9.0
50	136352.0	65175.0	908120.0	161737.0	89232.0
51	2295186.0	1003113.0	14325377.0	2253795.0	1503102.0
52	102671393.0	39451191.0	856954246.0	117539555.0	92555072.0
53	2.0	1.0	3.0	3.0	1.0
54	451951.0	198380.0	3206958.0	480847.0	272809.0
55	499926.0	231959.0	3548449.0	547352.0	326693.0
56	245243.0	123158.0	1852580.0	284554.0	187845.0
57	182425.0	75962.0	1320085.0		
			1619857.0	194508.0	106678.0
58	135313.0	35982.0		85849.0	56113.0
59	344981.0	189029.0	1819107.0	442365.0	259614.0
60	46780.0	25915.0	252377.0	51722.0	31056.0
61	427582.0	192988.0	3176341.0	469524.0	281182.0
62	56.0	56.0	239.0	48.0	738.0
63	113594.0	52035.0	155779.0	103641.0	4842.0
64	4.0	5.0	6.0	8.0	9.0
65	NaN	NaN	NaN	NaN	NaN

	Delaware		South Dakota	Tennessee	Texas	\
0	952065.0		865454.0	6651194.0	27862596.0	١
1	897936.0		814195.0	6346298.0	25146100.0	
2	6.0		0.0	0.0	10.0	
3	897934.0	•••	814180.0	6346105.0	25145561.0	
4	5.0	•••	0.0	0.0	7.0	
5	6.0	• • •	0.0	0.0	7.0	
6	21.0	• • •	0.0	0.0	26.0	
7	22.0	• • •	0.0	0.0	27.0	
8	17.0	• • •	0.0	0.0	12.0	
9	14.0	• • •	0.0	0.0	10.0	
10	51.0	• • •	0.0	0.0	50.0	
11	51.0	• • •	0.0	0.0	50.0	
12	70.0	• • •	0.0	0.0	79.0	
13	22.0	• • •	0.0	0.0	12.0	
14	0.0	• • •	0.0	0.0	1.0	
15	4.0	• • •	0.0	0.0	4.0	
16	0.0	• • •	0.0	0.0	0.0	
17	2.0	• • •	0.0	0.0	1.0	
18	9.0	• • •	0.0	0.0	39.0	
19	62.0	•••	0.0	0.0	42.0	
20	71213.0		63742.0	462414.0	1539655.0	
21	8.0		0.0	0.0	16.0	
22	426149.0		383838.0	2919671.0	10753629.0	
23	405885.0		363438.0	2812133.0	9977436.0	
24	71.0		0.0	0.0	62.0	
25	231500.0		140500.0	142100.0	136000.0	
26	1537.0		1210.0	1181.0	1432.0	
27	445.0		433.0	359.0	460.0	
28	1018.0		655.0	764.0	882.0	
29	5804.0		5686.0	36157.0	165853.0	
36	8.0		0.0	0.0	8.0	
37	6.0		0.0	0.0	18.0	
38	63.0		0.0	0.0	64.0	
39	59.0		0.0	0.0	57.0	
40	2148437.0		1873699.0	12499013.0	54480811.0	
41	7003251.0		6211731.0	42383683.0	145035130.0	
42	22597384.0		16882647.0	139960482.0	702603073.0	
43	5628914.0		20411059.0	111718421.0	691242607.0	
44	14456001.0		13791827.0	91641605.0	356116376.0	
45	15763.0		16550.0	14194.0	13666.0	
46	25.0		16.0	24.0	25.0	
47	60509.0		50957.0	45219.0	53207.0	
48	30554.0		26747.0	25227.0	26999.0	
49	11.0		0.0	0.0	15.0	
50	24852.0		26511.0	133344.0	569091.0	
51	397385.0		353540.0	2507205.0	10239710.0	

52	21305227.0		13812997.0	110481280.0	521095797.0	
53	1.0		0.0	0.0	3.0	
54	60734.0		64006.0	495703.0	2205149.0	
55	73418.0		81314.0	550453.0	2356748.0	
56	38328.0		42418.0	302249.0	1251696.0	
57	23964.0		23722.0	195694.0	866678.0	
58	14440.0		4101.0	105234.0	1070392.0	
59	54782.0		74228.0	434025.0	1224845.0	
60	7206.0	• • •	8604.0	59379.0	213590.0	
61	60318.0		66219.0	469392.0	2057218.0	
62	460.0		10.0	153.0	96.0	
63	1948.0		75811.0	41234.0	261231.0	
64	10.0		46.0	47.0	48.0	
65	NaN		NaN	NaN	NaN	
03	IVAIV	• • •	IV all	Nan	wan	
	Utah	Vermont	Virginia	Washington	West Virginia	\
0	3051217.0	624594.0	8411808.0	7288000.0	1831102.0	
1	2763888.0	625741.0	8001041.0	6724545.0	1853011.0	
2	10.0	0.0	5.0	8.0	1.0	
3	2763885.0	625741.0	8001024.0	6724540.0	1852994.0	
4	8.0	4.0	6.0	6.0	5.0	
5	9.0	5.0	6.0	6.0	5.0	
6	30.0	19.0	22.0	22.0	20.0	
7	31.0	20.0	23.0	23.0	20.0	
8	10.0	18.0	14.0	14.0	18.0	
9	9.0	14.0	12.0	12.0	16.0	
10	49.0	50.0	50.0	50.0	50.0	
11	49.0	50.0	50.0	50.0	50.0	
12	91.0	94.0	70.0	80.0	93.0	
13	1.0	1.0	19.0	4.0	3.0	
14	1.0	0.0	0.0	1.0	0.0	
15	2.0	1.0	6.0	8.0	0.0	
16	1.0	NaN	0.0	0.0	NaN	
17	2.0	1.0	2.0	4.0	1.0	
18	13.0	1.0	9.0	12.0	1.0	
19	78.0	93.0	62.0	69.0	92.0	
20	134332.0	44708.0	706539.0	564864.0	150021.0	
21	8.0	4.0	11.0	13.0	1.0	
22	1054164.0	329525.0	3491054.0	3025685.0	886640.0	
23	979709.0	322539.0	3364939.0	2885677.0	881917.0	
24	69.0	71.0	66.0	62.0	72.0	
25	215900.0	217500.0	245000.0	259500.0	103800.0	
26	1428.0	1535.0	1711.0	1731.0	966.0	
20 27	388.0	641.0	433.0	511.0	293.0	
28	887.0	895.0	1116.0	1014.0	643.0	
20 29	22662.0	1771.0	31132.0	44077.0	2544.0	
 36	6.0	10.0	7.0	8.0	14.0	
30	0.0	10.0	7.0	0.0	14.0	

37	9.0	4.0	10.0	6.0	6.0
38	67.0	66.0	64.0	63.0	53.0
39	59.0	63.0	60.0	58.0	49.0
40	4789281.0	1564272.0	17795901.0	14297278.0	4036333.0
41	14521857.0	4457996.0	47705003.0	43966889.0	12259395.0
	50046429.0	9315494.0	96389872.0	131530601.0	24553072.0
42					
43	30927885.0	6450076.0	86613641.0	83313366.0	14295437.0
44	38024486.0	9933751.0	110002385.0	118924049.0	22637923.0
45	13317.0	15868.0	13438.0	17243.0	12201.0
46	21.0	22.0	27.0	26.0	25.0
47	60727.0	55176.0	65015.0	61062.0	41751.0
48	24686.0	29894.0	34152.0	31762.0	23450.0
49	10.0	11.0	11.0	11.0	17.0
50	75463.0	21121.0	197384.0	182913.0	36993.0
51	1203954.0	266363.0	3198718.0	2602408.0	565435.0
52	51453266.0	10615093.0	165788897.0	149258789.0	22159084.0
53	4.0	2.0	1.0	2.0	1.0
54	216280.0	60312.0	576446.0	444135.0	88136.0
55	251419.0	75827.0	653193.0	541522.0	114435.0
56	132163.0	41270.0	353012.0	262650.0	63112.0
57	76269.0	23417.0	236290.0	187677.0	39065.0
58	24423.0	2354.0	185043.0	92807.0	5777.0
59	218826.0	70491.0	450109.0	426697.0	104785.0
60	18754.0	8237.0	76434.0	49331.0	12912.0
61	219807.0	63317.0	548439.0	461401.0	94960.0
62	33.0	67.0	202.0	101.0	77.0
63	82169.0	9216.0	39490.0	66455.0	24038.0
64	49.0	50.0	51.0	53.0	54.0
65	NaN	NaN	NaN	NaN	NaN
	Wisconsin	Wyoming			
0	5778708.0	585501.0			
1	5687289.0	563767.0			
2	1.0	3.0			
3	5686986.0	563626.0			
4	5.0	6.0			
5	6.0	7.0			
6	22.0	23.0			
7	23.0	24.0			
8	16.0	15.0			
9	13.0	12.0			
10	50.0	48.0			
11	50.0	49.0			
12	87.0	92.0			
13	6.0	1.0			
14	1.0	2.0			
15	2.0	1.0			
16	0.0	0.0			

17	1.0	2.0
18	6.0	10.0
19	81.0	84.0
20	381940.0	48505.0
21	4.0	3.0
22	2668444.0	270600.0
23	2624358.0	261868.0
24	67.0	69.0
25	165800.0	194800.0
26	1402.0	1348.0
27	532.0	386.0
28	776.0	789.0
29	19274.0	1727.0
36	8.0	8.0
37	6.0	13.0
38	67.0	67.0
39	63.0	62.0
40	10303256.0	1644844.0
41	40680625.0	3291478.0
42	177728926.0	10783794.0
43	77066883.0	5597891.0
44	78201822.0	9446043.0
45	13656.0	16388.0
46	21.0	18.0
47	53357.0	58840.0
48	28340.0	29803.0
49	11.0	11.0
50	139500.0	21040.0
51	2503532.0	219881.0
52	112406494.0	10094010.0
53	2.0	NaN
54	341935.0	48140.0
55	432980.0	62427.0
56	236252.0	30039.0
57	133859.0	19344.0
58	40507.0	4077.0
59	379934.0	55397.0
60	39830.0	6470.0
61	370755.0	51353.0
62	105.0	5.0
63	54157.0	97093.0
64	55.0	56.0
65	NaN	NaN

[66 rows x 52 columns]

In [18]: # fixing NaN values

```
# first one to fill numerical NaN with mean
         # second one to fill string NaN with any word like non
         # and confirm changes
         df_census.fillna(df_census.mean(), inplace=True)
         df_census.fillna('non',inplace=True)
         df_census.isnull().any().sum()
Out[18]: 0
In [19]: # drop duplicates and confirm changes
         df_census.drop_duplicates(inplace=True)
         df_census.duplicated().sum()
Out[19]: 0
In [20]: # convert time in month column to datetime
         # confirm changes
         df_gun['month'] = pd.to_datetime(df_gun['month'])
         df_gun['month'].dtype
Out[20]: dtype('<M8[ns]')</pre>
In [21]: # fixing missing value and confirm changes
         df_gun.fillna(df_gun.mean(), inplace=True)
         df_gun.isnull().any().sum()
Out[21]: 0
In [22]: # confirm census data after cleaning
         df census.head(66)
Out[22]:
                                                           Fact \
                  Population estimates, July 1, 2016,
         0
                                                        (V2016)
             Population estimates base, April 1, 2010, (V2...
         1
         2
             Population, percent change - April 1, 2010 (es...
                             Population, Census, April 1, 2010
         3
         4
             Persons under 5 years, percent, July 1, 2016, ...
         5
                 Persons under 5 years, percent, April 1, 2010
             Persons under 18 years, percent, July 1, 2016,...
         6
         7
                Persons under 18 years, percent, April 1, 2010
             Persons 65 years and over, percent, July 1, 2...
         8
             Persons 65 years and over, percent, April 1, 2010
         9
             Female persons, percent, July 1, 2016, (V2016)
         10
         11
                        Female persons, percent, April 1, 2010
                  White alone, percent, July 1, 2016, (V2016)
         12
             Black or African American alone, percent, July...
         13
             American Indian and Alaska Native alone, perce...
         14
                  Asian alone, percent, July 1, 2016, (V2016)
         15
         16 Native Hawaiian and Other Pacific Islander alo...
```

```
Two or More Races, percent, July 1, 2016,
17
   Hispanic or Latino, percent, July 1, 2016, (V...
    White alone, not Hispanic or Latino, percent, ...
19
20
                                   Veterans, 2011-2015
21
             Foreign born persons, percent, 2011-2015
22
                               July 1, 2016,
               Housing units,
                                              (V2016)
23
                         Housing units, April 1, 2010
24
          Owner-occupied housing unit rate, 2011-2015
    Median value of owner-occupied housing units, ...
25
26
   Median selected monthly owner costs -with a mo...
27
    Median selected monthly owner costs -without a...
28
                         Median gross rent, 2011-2015
29
                               Building permits, 2016
36
    With a disability, under age 65 years, percent...
   Persons without health insurance, under age 6...
   In civilian labor force, total, percent of pop...
   In civilian labor force, female, percent of po...
    Total accommodation and food services sales, 2...
40
    Total health care and social assistance receip...
41
         Total manufacturers shipments, 2012 ($1,000)
42
       Total merchant wholesaler sales, 2012 ($1,000)
43
44
                    Total retail sales, 2012 ($1,000)
                  Total retail sales per capita, 2012
45
   Mean travel time to work (minutes), workers ag...
46
    Median household income (in 2015 dollars), 201...
47
    Per capita income in past 12 months (in 2015 d...
48
49
                          Persons in poverty, percent
50
                  Total employer establishments, 2015
51
                               Total employment, 2015
52
                  Total annual payroll, 2015 ($1,000)
53
          Total employment, percent change, 2014-2015
54
               Total nonemployer establishments, 2015
55
                                       All firms, 2012
56
                                Men-owned firms, 2012
57
                              Women-owned firms, 2012
58
                           Minority-owned firms, 2012
59
                        Nonminority-owned firms, 2012
60
                            Veteran-owned firms, 2012
61
                         Nonveteran-owned firms, 2012
62
                     Population per square mile, 2010
                      Land area in square miles, 2010
63
                                             FIPS Code
64
65
                                                   non
                                    Fact Note
                                                   Alabama
                                                                  Alaska
0
                                                 4863300.0
                                                            7.418940e+05
                                          non
1
                                                 4780131.0 7.102490e+05
                                          non
```

2						non	1.0	4.000000e+00
3						non	4779736.0	7.102310e+05
4						non	6.0	7.000000e+00
5						non	6.0	7.000000e+00
6						non	22.0	2.500000e+01
7						non	23.0	2.600000e+01
8						non	16.0	1.000000e+01
9						non	13.0	7.000000e+00
10						non	51.0	4.700000e+01
11						non	51.0	4.800000e+01
12						(a)	69.0	6.600000e+01
13						(a)	26.0	3.000000e+00
14						(a)	0.0	1.500000e+01
15						(a)	1.0	6.000000e+00
16						(a)	0.0	1.000000e+00
17						non	1.0	7.000000e+00
18						(b)	4.0	7.000000e+00
19						non	65.0	6.100000e+01
20						non	363170.0	6.932300e+04
21						non	3.0	7.000000e+00
22						non	2230185.0	3.106580e+05
23						non	2171853.0	3.069670e+05
24						non	68.0	6.300000e+01
25						non	125500.0	2.500000e+05
26						non	1139.0	1.827000e+03
27						non	345.0	5.540000e+02
28						non	717.0	1.146000e+03
29						non	15001.0	1.503000e+03
36						non	11.0	8.000000e+00
37						non	10.0	1.500000e+01
38						non	58.0	6.700000e+01
39						non	53.0	6.500000e+01
40						(c)	7576462.0	2.221335e+06
41						(c)	26039632.0	6.375483e+06
42						(c)	124809759.0	6.965095e+05
43						(c)	57746565.0	5.216303e+06
44						(c)	58564965.0	1.047428e+07
45						(c)	12145.0	1.432000e+04
46						non	24.0	1.900000e+01
47						non	43623.0	7.251500e+04
48						non	24091.0	3.341300e+04
49						non	17.0	9.000000e+00
50	Includes	data	not	${\tt distributed}$	by	county.	98540.0	2.090700e+04
51	Includes	data	not	${\tt distributed}$	by	county.	1634391.0	2.679990e+05
52	Includes	data	not	${\tt distributed}$	by	county.	67370353.0	1.564330e+07
53	Includes	data	not	${\tt distributed}$	by	county.	1.0	0.000000e+00
54						non	322025.0	5.552100e+04

```
55
                                                    374153.0
                                                               6.803200e+04
                                           non
56
                                                    203604.0
                                                               3.540200e+04
                                           non
57
                                                    137630.0
                                                               2.214100e+04
                                           non
58
                                                               1.368800e+04
                                           non
                                                     92219.0
59
                                                    272651.0
                                                               5.114700e+04
                                           non
60
                                                     41943.0
                                                               7.953000e+03
                                           non
61
                                                    316984.0
                                                               5.609100e+04
                                           non
62
                                                         94.0
                                                               1.000000e+00
                                           non
                                                     50645.0
63
                                                               5.706400e+05
                                           non
64
                                                         1.0
                                                               2.000000e+00
                                           non
                                                               6.965095e+05
65
                                                   5644810.4
                                            non
         Arizona
                       Arkansas
                                    California
                                                     Colorado
                                                                 Connecticut
0
    6.931071e+06
                   2.988248e+06
                                  3.925002e+07
                                                 5.540545e+06
                                                                3.576452e+06
1
    6.392301e+06
                   2.916025e+06
                                  3.725452e+07
                                                 5.029324e+06
                                                                3.574114e+06
2
    8.00000e+00
                   2.000000e+00
                                  5.000000e+00
                                                 1.000000e+01
                                                                0.00000e+00
3
                                                                3.574097e+06
    6.392017e+06
                   2.915918e+06
                                  3.725396e+07
                                                 5.029196e+06
4
    6.000000e+00
                   6.000000e+00
                                  6.000000e+00
                                                 6.000000e+00
                                                                5.000000e+00
5
    7.000000e+00
                   6.000000e+00
                                  6.000000e+00
                                                 6.000000e+00
                                                                5.000000e+00
6
    2.300000e+01
                   2.300000e+01
                                  2.300000e+01
                                                 2.200000e+01
                                                                2.100000e+01
7
    2.500000e+01
                   2.400000e+01
                                  2.500000e+01
                                                 2.400000e+01
                                                                2.200000e+01
8
                   1.600000e+01
    1.600000e+01
                                  1.300000e+01
                                                 1.300000e+01
                                                                1.600000e+01
9
    1.300000e+01
                   1.400000e+01
                                  1.100000e+01
                                                 1.000000e+01
                                                                1.400000e+01
10
    5.000000e+01
                   5.000000e+01
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    3.092788e+07
                   6.450076e+06
                                  8.661364e+07
                                                8.331337e+07
                                                                 1.429544e+07
44
    3.802449e+07
                   9.933751e+06
                                  1.100024e+08
                                                1.189240e+08
                                                                 2.263792e+07
45
    1.331700e+04
                   1.586800e+04
                                  1.343800e+04
                                                1.724300e+04
                                                                 1.220100e+04
46
    2.100000e+01
                   2.200000e+01
                                  2.700000e+01
                                                2.600000e+01
                                                                 2.500000e+01
    6.072700e+04
                   5.517600e+04
                                  6.501500e+04
                                                6.106200e+04
                                                                 4.175100e+04
47
48
    2.468600e+04
                   2.989400e+04
                                  3.415200e+04
                                                3.176200e+04
                                                                 2.345000e+04
49
    1.000000e+01
                   1.100000e+01
                                  1.100000e+01
                                                1.100000e+01
                                                                 1.700000e+01
50
    7.546300e+04
                   2.112100e+04
                                  1.973840e+05
                                                1.829130e+05
                                                                 3.699300e+04
51
    1.203954e+06
                   2.663630e+05
                                  3.198718e+06
                                                2.602408e+06
                                                                 5.654350e+05
52
    5.145327e+07
                   1.061509e+07
                                  1.657889e+08
                                                1.492588e+08
                                                                 2.215908e+07
53
    4.000000e+00
                   2.000000e+00
                                  1.000000e+00
                                                2.000000e+00
                                                                 1.000000e+00
                   6.031200e+04
54
    2.162800e+05
                                  5.764460e+05
                                                                 8.813600e+04
                                                4.441350e+05
55
    2.514190e+05
                   7.582700e+04
                                  6.531930e+05
                                                5.415220e+05
                                                                 1.144350e+05
56
    1.321630e+05
                   4.127000e+04
                                  3.530120e+05
                                                2.626500e+05
                                                                 6.311200e+04
    7.626900e+04
                   2.341700e+04
                                  2.362900e+05
                                                1.876770e+05
57
                                                                 3.906500e+04
```

```
58
    2.442300e+04
                   2.354000e+03
                                  1.850430e+05
                                                9.280700e+04
                                                                 5.777000e+03
59
    2.188260e+05
                  7.049100e+04
                                  4.501090e+05
                                                4.266970e+05
                                                                 1.047850e+05
60
    1.875400e+04
                  8.237000e+03
                                  7.643400e+04
                                                4.933100e+04
                                                                 1.291200e+04
61
    2.198070e+05
                   6.331700e+04
                                  5.484390e+05
                                                4.614010e+05
                                                                 9.496000e+04
                                                1.010000e+02
62
    3.300000e+01
                   6.700000e+01
                                  2.020000e+02
                                                                 7.700000e+01
63
    8.216900e+04
                   9.216000e+03
                                  3.949000e+04
                                                6.645500e+04
                                                                 2.403800e+04
64
    4.900000e+01
                   5.000000e+01
                                  5.100000e+01
                                                5.300000e+01
                                                                 5.400000e+01
    3.142726e+06
                   7.208260e+05
                                  8.711424e+06
                                                8.875524e+06
                                                                 1.710532e+06
       Wisconsin
                        Wyoming
0
    5.778708e+06
                   5.855010e+05
1
                   5.637670e+05
    5.687289e+06
2
    1.000000e+00
                   3.000000e+00
3
    5.686986e+06
                   5.636260e+05
4
    5.000000e+00
                   6.000000e+00
5
    6.00000e+00
                   7.000000e+00
6
    2.200000e+01
                   2.300000e+01
7
    2.300000e+01
                   2.400000e+01
8
    1.600000e+01
                   1.500000e+01
9
    1.300000e+01
                   1.200000e+01
10
    5.000000e+01
                   4.800000e+01
11
    5.000000e+01
                   4.900000e+01
12
    8.700000e+01
                   9.200000e+01
13
    6.000000e+00
                   1.000000e+00
14
    1.000000e+00
                   2.000000e+00
    2.000000e+00
15
                   1.000000e+00
    0.00000e+00
                   0.000000e+00
16
17
    1.000000e+00
                   2.000000e+00
    6.000000e+00
18
                   1.000000e+01
19
    8.100000e+01
                   8.400000e+01
20
    3.819400e+05
                   4.850500e+04
21
    4.000000e+00
                   3.000000e+00
22
    2.668444e+06
                   2.706000e+05
23
    2.624358e+06
                   2.618680e+05
24
    6.700000e+01
                   6.900000e+01
25
    1.658000e+05
                   1.948000e+05
26
    1.402000e+03
                   1.348000e+03
27
    5.320000e+02
                   3.860000e+02
28
                   7.890000e+02
    7.760000e+02
29
    1.927400e+04
                   1.727000e+03
    8.000000e+00
                  8.000000e+00
36
37
    6.000000e+00
                   1.300000e+01
38
    6.700000e+01
                   6.700000e+01
39
    6.300000e+01
                   6.200000e+01
40
    1.030326e+07
                   1.644844e+06
41
    4.068062e+07
                   3.291478e+06
```

1.078379e+07

42

1.777289e+08

```
7.820182e+07
                            9.446043e+06
         44
         45
             1.365600e+04
                            1.638800e+04
             2.100000e+01
                            1.800000e+01
         46
         47
             5.335700e+04
                            5.884000e+04
             2.834000e+04
                            2.980300e+04
         48
         49
             1.100000e+01
                            1.100000e+01
         50
             1.395000e+05
                            2.104000e+04
             2.503532e+06
                            2.198810e+05
         51
         52
             1.124065e+08
                            1.009401e+07
         53
             2.000000e+00
                            6.921724e+05
         54
             3.419350e+05
                            4.814000e+04
         55
            4.329800e+05
                            6.242700e+04
                            3.003900e+04
             2.362520e+05
         57
             1.338590e+05
                            1.934400e+04
         58 4.050700e+04
                           4.077000e+03
         59
            3.799340e+05
                            5.539700e+04
         60
             3.983000e+04
                            6.470000e+03
             3.707550e+05
                            5.135300e+04
         61
         62
            1.050000e+02
                            5.000000e+00
         63
             5.415700e+04
                            9.709300e+04
         64 5.500000e+01
                            5.600000e+01
             8.099572e+06 6.921724e+05
         [66 rows x 52 columns]
In [23]: # confirm nics data after cleaning
         df_gun.head()
Out [23]:
                 month
                             state
                                      permit
                                              permit_recheck handgun
                                                                        long_gun
                                                                                    other
         0 2017-09-01
                           Alabama
                                    16717.0
                                                          0.0
                                                                5734.0
                                                                           6320.0
                                                                                    221.0
         1 2017-09-01
                            Alaska
                                       209.0
                                                          2.0
                                                                2320.0
                                                                           2930.0
                                                                                    219.0
         2 2017-09-01
                           Arizona
                                      5069.0
                                                        382.0
                                                               11063.0
                                                                           7946.0
                                                                                    920.0
         3 2017-09-01
                          Arkansas
                                      2935.0
                                                        632.0
                                                                4347.0
                                                                           6063.0
                                                                                    165.0
         4 2017-09-01
                       California 57839.0
                                                          0.0
                                                               37165.0
                                                                          24581.0
                                                                                   2984.0
                                                                          rentals_handgun
            multiple
                       admin
                             prepawn_handgun
                                                         returned_other
         0
                         0.0
                                          15.0
                                                                     0.0
                                                                                       0.0
                  317
                                                  . . .
         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
                                                 9.0
         0
                          0.0
                                                                         16.0
         1
                          0.0
                                                17.0
                                                                         24.0
                                                38.0
         2
                          0.0
                                                                         12.0
```

7.706688e+07 5.597891e+06

13.0

23.0

0.0

3

```
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
                                                        0.0
         1
                            1.0
                                                                                     0.0
         2
                            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
                                       32019
                                 3.0
         1
                                 0.0
                                        6303
         2
                                 0.0
                                       28394
         3
                                 1.0
                                       17747
         4
                                 0.0
                                      123506
         [5 rows x 27 columns]
In [24]: # show some general properties
         df census describe()
Out[24]:
                      Alabama
                                      Alaska
                                                    Arizona
                                                                  Arkansas
                                                                               California
                 8.200000e+01
                                8.200000e+01
                                               8.200000e+01
                                                              8.200000e+01
                                                                             8.200000e+01
         count
                 5.644810e+06
                                6.965095e+05
                                               6.042079e+06
                                                              3.162765e+06
                                                                             4.686571e+07
         mean
         std
                 1.778849e+07
                                2.217958e+06
                                               1.739900e+07
                                                              9.604165e+06
                                                                             1.408072e+08
         min
                 0.000000e+00
                                0.000000e+00
                                               0.00000e+00
                                                              0.000000e+00
                                                                             0.00000e+00
         25%
                 2.325000e+01
                                2.050000e+01
                                               2.625000e+01
                                                              2.150000e+01
                                                                             3.250000e+01
         50%
                 4.713400e+04
                                2.152400e+04
                                               8.192450e+04
                                                              3.867650e+04
                                                                             2.040780e+05
         75%
                 5.644810e+06
                                6.965095e+05
                                               6.042079e+06
                                                              3.162765e+06
                                                                             4.686571e+07
                                1.564330e+07
                                                              6.271292e+07
                                                                             8.569542e+08
                 1.248098e+08
                                               1.026714e+08
         max
                     Colorado
                                 Connecticut
                                                   Delaware
                                                                   Florida
                                                                                  Georgia
                 8.200000e+01
                                8.200000e+01
                                               8.200000e+01
                                                              8.200000e+01
                                                                             8.200000e+01
         count
                 5.907422e+06
                                6.449429e+06
                                               1.203696e+06
                                                              1.905439e+07
                                                                             1.101339e+07
         mean
                                                                             3.246234e+07
         std
                 1.784105e+07
                                2.189089e+07
                                               3.797209e+06
                                                              5.638734e+07
                 0.00000e+00
                                0.00000e+00
                                               0.000000e+00
                                                              0.000000e+00
                                                                             0.00000e+00
         min
         25%
                 2.400000e+01
                                2.275000e+01
                                               2.275000e+01
                                                              2.625000e+01
                                                                             2.725000e+01
         50%
                 7.323900e+04
                                4.745800e+04
                                               1.986350e+04
                                                              1.376200e+05
                                                                             7.715000e+04
                 5.907422e+06
         75%
                                6.449429e+06
                                               1.203696e+06
                                                              1.905439e+07
                                                                             1.101339e+07
                 1.175396e+08
                                               2.259738e+07
                                                              3.370745e+08
                                1.619622e+08
                                                                             1.748394e+08
         max
                                South Dakota
                                                  Tennessee
                                                                     Texas
                                                                                     Utah
                                8.200000e+01
                                               8.200000e+01
                                                              8.200000e+01
                                                                             8.200000e+01
         count
         mean
                                1.195122e+06
                                               8.342865e+06
                                                              4.004406e+07
                                                                             3.142726e+06
         std
                                3.573824e+06
                                               2.490916e+07
                                                              1.262991e+08
                                                                             9.412073e+06
                     . . .
                                0.00000e+00
                                               0.00000e+00
                                                              0.000000e+00
                                                                             1.000000e+00
         min
                     . . .
         25%
                                0.000000e+00
                                               0.000000e+00
                                                              3.600000e+01
                                                                             3.100000e+01
                     . . .
```

2.511650e+04

50%

5.229900e+04

1.897215e+05

4.270650e+04

```
75%
                               1.195122e+06
                                              8.342865e+06
                                                             4.004406e+07
                                                                            3.142726e+06
                     . . .
                               2.041106e+07
                                              1.399605e+08
                                                             7.026031e+08
                                                                            5.145327e+07
         max
                      Vermont
                                                Washington
                                                             West Virginia
                                                                                Wisconsin
                                    Virginia
         count
                8.200000e+01
                               8.200000e+01
                                              8.200000e+01
                                                              8.200000e+01
                                                                             8.200000e+01
                7.208260e+05
                               8.711424e+06
                                              8.875524e+06
                                                              1.710532e+06
                                                                             8.099572e+06
         mean
         std
                2.019675e+06
                               2.588748e+07
                                              2.672587e+07
                                                              4.717679e+06
                                                                             2.579573e+07
         min
                0.000000e+00
                               0.00000e+00
                                              0.000000e+00
                                                              0.000000e+00
                                                                             0.000000e+00
                3.950000e+01
                               2.925000e+01
                                              2.750000e+01
                                                              3.100000e+01
                                                                             2.400000e+01
         25%
         50%
                2.226900e+04
                               7.072450e+04
                                              6.375850e+04
                                                              3.051550e+04
                                                                             4.693200e+04
         75%
                7.208260e+05
                               8.711424e+06
                                              8.875524e+06
                                                              1.710532e+06
                                                                             8.099572e+06
                1.061509e+07
                               1.657889e+08
                                              1.492588e+08
                                                              2.455307e+07
                                                                             1.777289e+08
         max
                      Wyoming
                8.200000e+01
         count
                6.921724e+05
         mean
         std
                 1.996627e+06
                0.00000e+00
         min
         25%
                2.425000e+01
         50%
                2.542150e+04
         75%
                6.921724e+05
                 1.078379e+07
         max
         [8 rows x 50 columns]
In [25]: # show some general properties
         df_gun.describe()
Out [25]:
                                permit_recheck
                                                        handgun
                                                                       long_gun
                        permit
                  12485.000000
                                   12485.000000
                                                   12485.000000
                                                                  12485.000000
         count
         mean
                   6413.629404
                                    1165.956364
                                                    5940.881107
                                                                   7810.847585
                  23729.495816
                                    2736.848174
                                                    8611.677589
                                                                   9302.758891
         std
         min
                      0.000000
                                       0.000000
                                                       0.00000
                                                                       0.000000
         25%
                      0.00000
                                    1165.956364
                                                    868.000000
                                                                   2079.000000
         50%
                    522.000000
                                    1165.956364
                                                   3067.000000
                                                                   5130.000000
         75%
                   4338.000000
                                    1165.956364
                                                    7277.000000
                                                                   10374.000000
                522188.000000
                                  116681.000000
                                                 107224.000000
                                                                 108058.000000
         max
```

	other	multiple	admin	prepawn_handgun	\
count	12485.000000	12485.000000	12485.000000	12485.000000	
mean	360.471636	268.603364	58.898090	4.828021	
std	895.634628	783.185073	604.257419	10.023040	
min	0.000000	0.000000	0.000000	0.000000	
25%	163.000000	15.000000	0.000000	0.000000	
50%	360.471636	125.000000	0.000000	1.000000	
75%	360.471636	301.000000	0.000000	4.828021	
max	77929.000000	38907.000000	28083.000000	164.000000	

```
prepawn_long_gun
                          prepawn_other
                                                           returned other
                                                . . .
            12485.000000
                            12485.000000
                                                              12485.000000
count
                7.834156
                                                                  1.027548
                                0.165591
mean
               15.130888
                                                                  1.672013
std
                                0.676584
min
                0.000000
                                0.000000
                                                                  0.000000
                                                . . .
25%
                0.000000
                                0.000000
                                                                  1.027548
50%
                3.000000
                                0.165591
                                                                  1.027548
                                                . . .
75%
                7.834156
                                0.165591
                                                                  1.027548
                                                . . .
              269.000000
                               49.000000
                                                                 64.000000
max
                                                . . .
       rentals_handgun
                                             private_sale_handgun
                         rentals_long_gun
           12485.000000
                              12485.000000
                                                      12485.000000
count
               0.076768
                                                         14.936000
                                  0.087273
mean
std
               0.178589
                                  0.172556
                                                         33.418596
min
               0.000000
                                  0.000000
                                                          0.000000
25%
                                                         14.936000
               0.076768
                                  0.087273
50%
               0.076768
                                  0.087273
                                                         14.936000
75%
               0.076768
                                  0.087273
                                                         14.936000
              12.000000
                                  12.000000
                                                       1017.000000
max
       private_sale_long_gun
                                private_sale_other
                                                      return_to_seller_handgun
                                                                   12485.000000
                 12485.000000
                                       12485.000000
count
mean
                    11.602909
                                           1.030182
                                                                       0.402020
                     25.458626
                                           2.096565
                                                                       0.643964
std
min
                     0.000000
                                           0.000000
                                                                       0.00000
25%
                                           1.030182
                    11.602909
                                                                       0.402020
50%
                    11.602909
                                           1.030182
                                                                       0.402020
75%
                     11.602909
                                           1.030182
                                                                       0.402020
                   777.000000
                                                                      28.000000
                                          71.000000
max
                                     return_to_seller_other
       return_to_seller_long_gun
                                                                      totals
                      12485.000000
                                                12485.000000
                                                                12485.000000
count
                          0.441818
                                                    0.105987
                                                                21595.725911
mean
std
                          0.717129
                                                    0.181592
                                                                32591.418387
                          0.000000
                                                    0.000000
                                                                    0.000000
min
25%
                          0.441818
                                                    0.105987
                                                                 4638.000000
50%
                          0.441818
                                                    0.105987
                                                                12399.000000
75%
                                                    0.105987
                                                                25453.000000
                          0.441818
                         17.000000
                                                    4.000000
                                                               541978.000000
max
[8 rows x 25 columns]
```

```
Out[26]: 0 Population estimates, July 1, 2016, (V2016)

1 Population estimates base, April 1, 2010, (V2...
2 Population, percent change - April 1, 2010 (es...
```

```
3
                      Population, Census, April 1, 2010
4
      Persons under 5 years, percent, July 1, 2016, ...
5
          Persons under 5 years, percent, April 1, 2010
6
      Persons under 18 years, percent, July 1, 2016,...
         Persons under 18 years, percent, April 1, 2010
7
8
      Persons 65 years and over, percent,
                                           July 1, 2...
9
      Persons 65 years and over, percent, April 1, 2010
10
       Female persons, percent, July 1, 2016,
                                                 (V2016)
11
                 Female persons, percent, April 1, 2010
12
           White alone, percent, July 1, 2016, (V2016)
13
      Black or African American alone, percent, July...
14
      American Indian and Alaska Native alone, perce...
           Asian alone, percent, July 1, 2016, (V2016)
15
16
      Native Hawaiian and Other Pacific Islander alo...
17
      Two or More Races, percent, July 1, 2016,
18
      Hispanic or Latino, percent, July 1, 2016, (V...
19
      White alone, not Hispanic or Latino, percent, ...
20
                                     Veterans, 2011-2015
21
               Foreign born persons, percent, 2011-2015
22
                 Housing units,
                                 July 1, 2016, (V2016)
23
                           Housing units, April 1, 2010
24
            Owner-occupied housing unit rate, 2011-2015
25
      Median value of owner-occupied housing units, ...
      Median selected monthly owner costs -with a mo...
26
27
      Median selected monthly owner costs -without a...
28
                           Median gross rent, 2011-2015
29
                                  Building permits, 2016
52
                    Total annual payroll, 2015 ($1,000)
53
            Total employment, percent change, 2014-2015
54
                 Total nonemployer establishments, 2015
55
                                         All firms, 2012
56
                                   Men-owned firms, 2012
57
                                 Women-owned firms, 2012
58
                             Minority-owned firms, 2012
59
                          Nonminority-owned firms, 2012
60
                               Veteran-owned firms, 2012
                           Nonveteran-owned firms, 2012
61
62
                       Population per square mile, 2010
63
                        Land area in square miles, 2010
64
                                               FIPS Code
65
                                                     non
66
      NOTE: FIPS Code values are enclosed in quotes ...
68
                                             Value Notes
69
71
                                              Fact Notes
72
                                                      (a)
73
                                                      (b)
```

```
77
         78
                                                                D
         79
                                                                F
         80
                                                               FN
         81
                                                              non
         82
                                                                S
         83
                                                                Х
         84
                                                                7.
         Name: Fact, Length: 82, dtype: object
In [27]: # check columns in df_gun to understand data
         df_gun.columns
Out[27]: Index(['month', 'state', 'permit', 'permit_recheck', 'handgun', 'long_gun',
                'other', 'multiple', 'admin', 'prepawn_handgun', 'prepawn_long_gun',
                'prepawn_other', 'redemption_handgun', 'redemption_long_gun',
                'redemption_other', 'returned_handgun', 'returned_long_gun',
                'returned_other', 'rentals_handgun', 'rentals_long_gun',
                'private_sale_handgun', 'private_sale_long_gun', 'private_sale_other',
                'return_to_seller_handgun', 'return_to_seller_long_gun',
                'return_to_seller_other', 'totals'],
               dtype='object')
   ## Exploratory Data Analysis
In [28]: # summary(it takes long time but you can run it !!!!)
         # pd.plotting.scatter_matrix(df_gun, figsize=(50,50));
   ### Research Question 1 (How much growth in gun registration in each state?)
In [29]: # grouped data by month, state to show total registration
         filt = df_gun.groupby(['month', 'state'])['totals'].sum()
In [30]: # calculate growth rating by subtract total registration in current date from total rec
         growth = filt.loc[df_gun['month'].max()] - filt.loc[df_gun['month'].min()]
In [31]: # visualize result
         growth_plot = growth.plot(kind='bar', figsize=(8,8), title='Growth rate in gun registra
         growth_plot.set_xlabel('State')
         growth_plot.set_ylabel('Growth')
Out[31]: Text(0,0.5,'Growth')
```

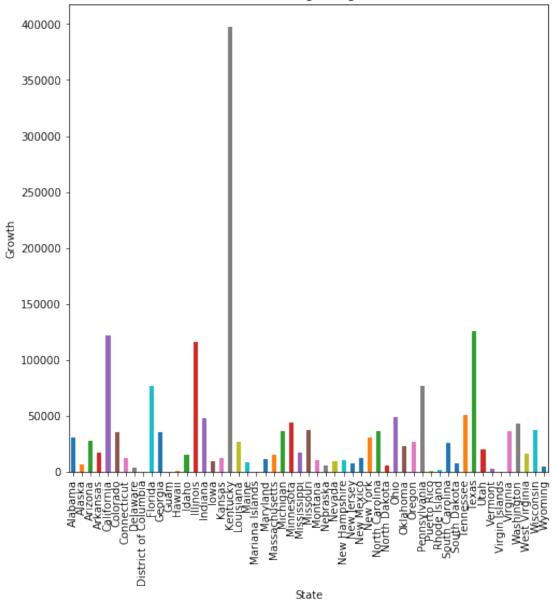
(c)

Value Flags

74

76

Growth rate in gun registration



Out[32]: (state

Kentucky 397866

Name: totals, dtype: int64, state

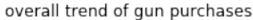
Virgin Islands 9

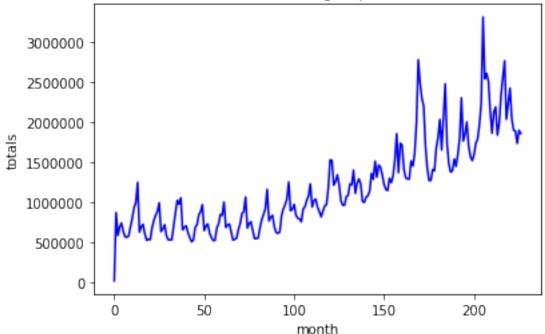
Name: totals, dtype: int64)

Maximum growth registration in (Kentucky) equal (397866)

Minimum growth registration in (Virgin) equal (9)

Research Question 2 (what is the overall trend of gun purchases?)

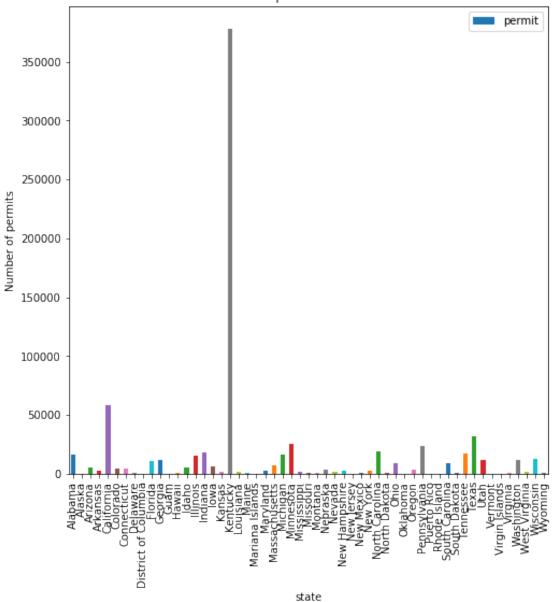




overall trend of purchases is constantly increasing.

Research Question 3 (how many persons are permitted to own gun in last date)





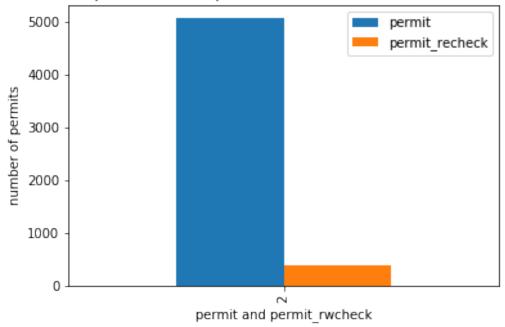
```
Out[38]: 383238.0
```

Kentucky state has high permit.

persons permitted to own gun in (Kentucky state) equal to approximately person permitted to own gun in (ALL) other states

Research Question 4 (How many persons are permitted versus not permitted in (Arizona state) in last date ?)

number ofpermits versus permit rechech in Arizona state in last date



In [41]: Arizona_filt.sum()
Out[41]: permit 5069

permit_recheck 382 state Arizona

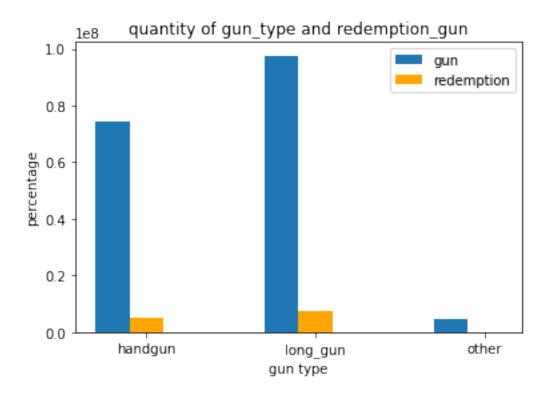
dtype: object

```
total permut_recheck in Arizona in 09-2017: 382
  ### Research Question 5 (quantity types of guns)
In [42]: # select type of guns and sum
         df_gun_type = df_gun.iloc[:,4:26].sum()
         df_gun_type
Out [42]: handgun
                                      7.417190e+07
                                     9.751843e+07
        long_gun
        other
                                     4.500488e+06
        multiple
                                     3.353513e+06
        admin
                                     7.353427e+05
                                     6.027785e+04
        prepawn_handgun
        prepawn_long_gun
                                     9.780943e+04
        prepawn_other
                                     2.067409e+03
        redemption_handgun
                                    5.093511e+06
        redemption_long_gun
                                     7.482665e+06
        redemption_other
                                     2.266339e+04
        returned_handgun
                                     3.697149e+05
        returned_long_gun
                                     9.435633e+04
        returned other
                                     1.282894e+04
        rentals_handgun
                                     9.584444e+02
        rentals_long_gun
                                    1.089600e+03
                                    1.864760e+05
        private_sale_handgun
        private_sale_long_gun
                                    1.448623e+05
        private_sale_other
                                     1.286182e+04
        return_to_seller_handgun
                                    5.019222e+03
        return_to_seller_long_gun 5.516100e+03
        return_to_seller_other
                                      1.323244e+03
        dtype: float64
In [43]: # index to use it in visualization using matplotlib
         # labels to use it in visualization using matplotlin
         # function return selected rwos of type
         ind=np.arange(3)
         labels=['handgun','long_gun','other']
         def return_rwo(a,b):
             return df_gun_type.iloc[a:b]
In [44]: # visualize guns with redemption guns alone because they have high quantaty
        plt.bar(ind,return_rwo(0,3),width=0.2,label='gun')
        plt.bar(ind+0.2,return_rwo(8,11),color='orange',width=0.2,label='redemption')
        plt.legend()
        plt.xticks(ind+0.2,labels);
```

total permit in Arizona in 09-2017: 5069

```
plt.xlabel('gun type')
plt.ylabel('percentage')
plt.title('quantity of gun_type and redemption_gun')
```

Out[44]: Text(0.5,1,'quantity of gun_type and redemption_gun')



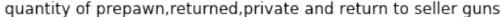
In [45]: # visualize other types

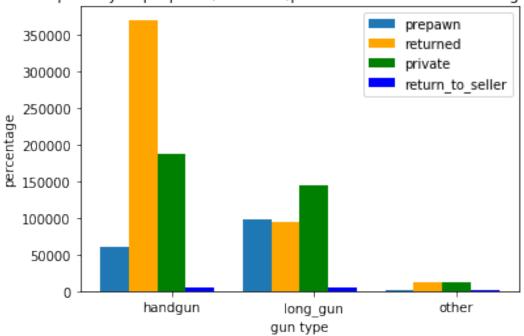
```
plt.bar(ind,return_rwo(5,8),width=0.2,label='prepawn')
#plt.bar(ind+0.2,return_rwo(8,11),width=0.2,color='red')
plt.bar(ind+0.2,return_rwo(11,14),width=0.2,color='orange',label='returned')
#plt.bar(np.arange(2)+0.6,return_rwo(14,16),width=0.2,color='pink')
plt.bar(ind+0.4,return_rwo(16,19),width=0.2,color='green',label='private')
plt.bar(ind+0.6,return_rwo(19,22),width=0.2,color='blue',label='return_to_seller')

plt.legend()

plt.xticks(ind+0.4,labels);
plt.xlabel('gun type')
plt.ylabel('percentage')
plt.title('quantity of prepawn,returned,private and return to seller guns')
```

Out[45]: Text(0.5,1,'quantity of prepawn,returned,private and return to seller guns')





long_gun have maximum quantity in (gun_type, redemption, prepawn)

hand_gun have maximum quantity in (returned, private, return_to_seller)

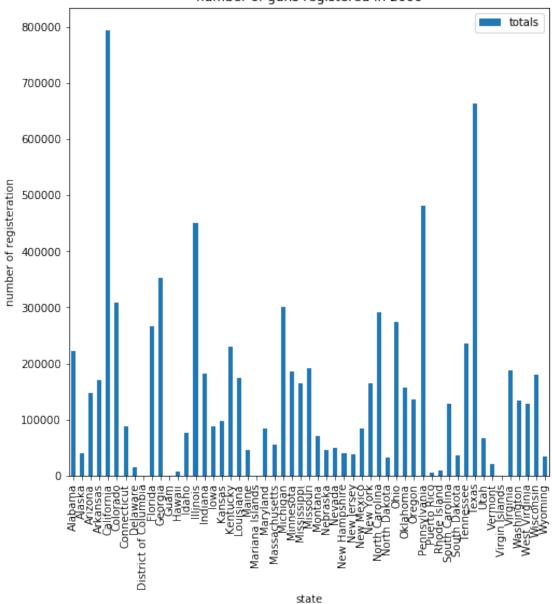
Research Question 6 (In which state did men owned firms by maximum number of gun in 2012?)

maximum number of gund that men owned firms in 2012 owned in Nebraska state

Research Question 7 (How many guns registered in 2017 in all states?)

```
In [47]: \# copy df_gun
         # append year column in new dataframe from month column
         # filter data by year 2017 and select only totals registeration
         # calculate sum of totals in 2017 dataframe
         df_copy = df_gun.copy()
         df_copy['year'] = df_copy['month'].dt.year
         df_copy.query('year == "2017"')['totals'].sum()
Out [47]: 17990528
    there are 17990528 guns regustered in all state in 2017
   ### Research Question 8 (How many guns registered in 2000 in each state?)
In [48]: # filter data by year 2000 and select only state and totals columns
         # grouped data by state
         # visualize result
         filter_2000 = df_copy.query('year == "2000"')[['state','totals']]
         group = filter_2000.groupby('state').sum()
         filter_2000_plot = group.plot(kind='bar',figsize=(8,8), title='number of guns registere
         filter_2000_plot.set_ylabel('number of registeration')
Out[48]: Text(0,0.5, 'number of registeration')
```

number of guns registered in 2000



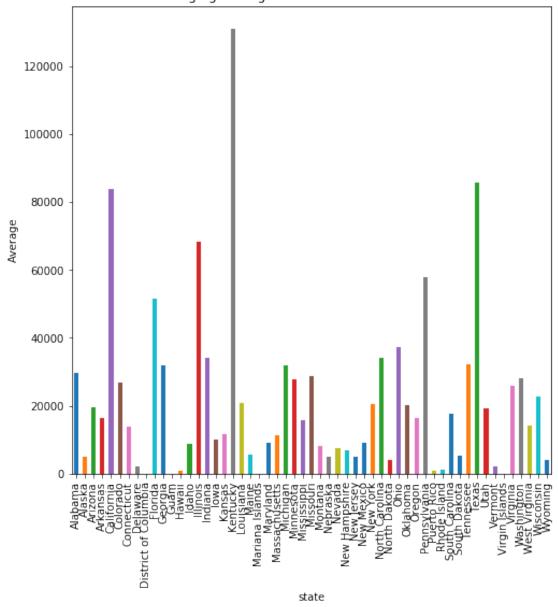
In [49]: group.max()

Out[49]: totals 794506 dtype: int64

California has the highest number of guns registration in 2000

Research Question 9 (Average guns registered in each state since 1998)

Average guns registered in each state since 1998



Kentucky has the highest average of gun registration since 1998

California and Texas have the same average of gun registration

Research Question 10 (How many guns registered in 2017 in Texas)?

there are 1074971 gun registrations in Texas in 2017

Research Question 11 (What is the total revenue of all firms in all state in 2012?)

27744592 is the total revenue of all firms in all states in 2012

Conclusions

from the previous analyzes we draw some important conclusions in several aspects:

growth in gun registration

- > 1- the highest growth rate in gun registration in KENTUCKY state (growth = 397899) from 1998 to 2017.
 - > 2- the lowest growth rate in VIRGIN state (growth = 9).
 - > 3- growth rate in CALIFORNIA, ILINOIS and TEXAS very velise and ranks third of growth.

registration

- > 1- there are 17990528 total guns registered in all states in 2017.
- > 2- CALIFORNIA has the highest number of guns registration in 2000.
- > 3- KENTUCKY has the highest average of gun registration since 1998.
- > 4- CALIFORNIA and TEXAS have the same average of gun registration.
- > 5- there are 1074971 gun registered in TEXAS in 2017.

overall trend

- > overall trend of gun purchases is constantly increasing and qickly.
- > permits
- > 1- KENTUCKY state has the highest number of permits.
- > 2- number of permits in KENTUCKY is equal approximately number of permits in all other states.
 - > 3- number of permits in ARIZONA in 09-2017 is 5069.
 - > 4- number of permits recheck in ARIZONA in 09-2017 is 382.

quantities of guns types

- > 1- long_gun has the highest quantity in (gun type,redemption,and prepawn)
- > 2- hand_gun has the highest quantity in (returned,private, and return_to_seller) > other
- > 1- the highest number of guns that men owned firms buy in 2017was in NEBRASCA state.
- > 2- the total revenue of all firms in all states in 2012 equal 27744592.

1.1.4 Limitations

- 1- in census data, all columns contain missing values, and the majority of columns contain 20 missing value out of 85 rows. meaning that approximately 25% of the data are missing and this is an exaggeration.
- 2- there are 154595 missing in the gun data, this represents about 45% of the total values, this is avery large number even if we try to complete it using appropriate methods, the result will still be somewhat inaccurate.
- 3- in gun data, there are months of specific years that have no been recorded, and there also states that have no been recorded.
- 4- the numeric values in census data separated by a comma, this makes converting them into float more difficult, and when doing this in the best way, there are completely inaccurate values and this changes the accuracy of the result.