Do Western Countries tend to export more Arms than any other country?

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Dataset

World Development Indicators Dataset

Motivation

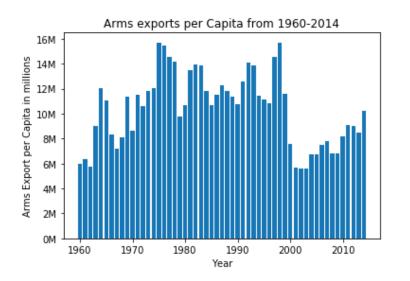
Does USA export more arms than other countries? Countries have been known for supplying/selling arms to the side of a warring faction that they support. But is the USA the only/main country to blame for the wide spread of arms?

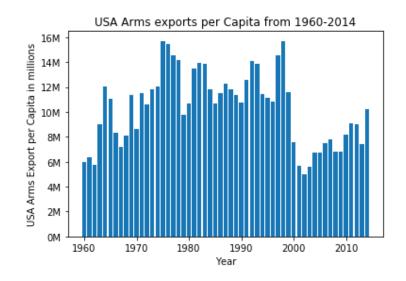
Research Question(s)

Do Western Countries export more arms than any other country?

Is there a perceived correlation between death rates and arms exports?

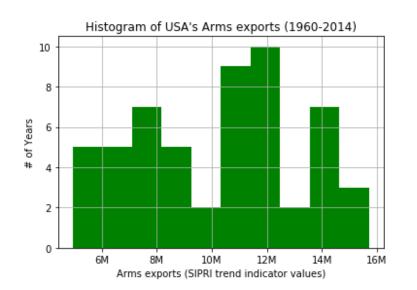
Findings

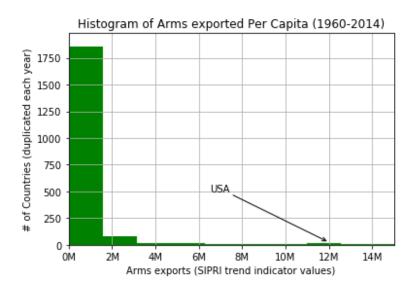




Between these two bar charts we can see that in 2002 and 2013 there were greater arms exports Globally than in the USA. So in 2002 and in 2013 the USA was not the leading contributor to arms exported but from 1960-2001 and 2003-2012 and 2014 the USA arms exports per capita almost identically match up with the arms exported per capita globally.

Findings





With the first histogram we can see the arms exported per capita by the USA from 1960-2014. This chart shows that for most of those years the USA exported between 11 and 13 million arms. Using this information the second histogram displays the arms exported per capita globally from 1960-2014, with the USA annotated above the 12 million marker. Most countries lie between 0 and 1 million arms exported, while the USA and several other countries contribute on a larger scale.

Findings

From this data it seems that the USA is a top contributor to arms exports globally from 1960-2014, except in 2002 and 2013.

Acknowledgements

Ilkay and Leo for their fantastically designed and taught class.

References

All my own work, except for matplotlib documentation and things I've learned in this course.

Mini Project

December 13, 2017

```
In [1]: import pandas as pd
        import numpy as np
        import random
        import matplotlib.pyplot as plt
        from matplotlib.ticker import FuncFormatter
In [2]: data = pd.read_csv('~/EdX-Data-Scientist-Education/UCSanDiegoX-DSE200x-Python-for-Data
        data.shape
Out[2]: (5656458, 6)
In [3]: data.head(10)
Out [3]:
          CountryName CountryCode
                                                                         IndicatorName
                                    Adolescent fertility rate (births per 1,000 wo...
          Arab World
        0
                               ARB
        1 Arab World
                               ARB
                                    Age dependency ratio (% of working-age populat...
        2 Arab World
                                    Age dependency ratio, old (% of working-age po...
                               ARB
          Arab World
                                    Age dependency ratio, young (% of working-age ...
                               ARB
         Arab World
                               ARB
                                          Arms exports (SIPRI trend indicator values)
          Arab World
                                          Arms imports (SIPRI trend indicator values)
                               ARB
          Arab World
                               ARB
                                                 Birth rate, crude (per 1,000 people)
          Arab World
                               ARB
                                                                    CO2 emissions (kt)
          Arab World
                               ARB
                                               CO2 emissions (metric tons per capita)
           Arab World
                               ARB
                                    CO2 emissions from gaseous fuel consumption (%...
               IndicatorCode
                              Year
                                            Value
        0
                                     1.335609e+02
                 SP.ADO.TFRT
                               1960
        1
                 SP.POP.DPND
                               1960
                                     8.779760e+01
        2
              SP.POP.DPND.OL
                               1960
                                     6.634579e+00
              SP.POP.DPND.YG
        3
                               1960
                                     8.102333e+01
        4
              MS.MIL.XPRT.KD
                               1960
                                     3.000000e+06
                                     5.380000e+08
        5
              MS.MIL.MPRT.KD
                               1960
        6
              SP.DYN.CBRT.IN
                                    4.769789e+01
                               1960
        7
              EN.ATM.CO2E.KT
                                     5.956399e+04
                               1960
              EN.ATM.CO2E.PC
                               1960
                                     6.439635e-01
```

5.041292e+00

1960

EN.ATM.CO2E.GF.ZS

0.1 What is the range of years?

0.2 What are the unique Country names and codes, and how many are there?

0.3 Checking for null values

0.4 Value Statistics - use to evaluate overall country exports from 1980 - 2015

```
In [7]: data['Value'].describe()
Out[7]: count
                 5.656458e+06
        mean
                 1.070501e+12
        std
                 4.842469e+13
        min
                -9.824821e+15
        25%
                5.566242e+00
        50%
                 6.357450e+01
        75%
                 1.346722e+07
                 1.103367e+16
        Name: Value, dtype: float64
In [8]: data.std(axis=0)
Out[8]: Year
                 1.387895e+01
        Value
                 4.842469e+13
        dtype: float64
```

```
In [9]: data['CountryName'].count()
Out[9]: 5656458
0.5 Most common value in column 'Value'
In [10]: data['Value'].mode()
Out[10]: 0
             0.0
         dtype: float64
0.6 Lowest value in column 'Value'
In [11]: data['Value'].min()
Out[11]: -9824821297572060.0
0.7 Highest value in column 'Value'
In [12]: data['Value'].max()
Out[12]: 11033666000000000.0
0.8 Remove Unwanted CountryCode rows
0.8.1 Find grouped countries via the country code
In [13]: data.columns
Out[13]: Index(['CountryName', 'CountryCode', 'IndicatorName', 'IndicatorCode', 'Year',
                'Value'],
               dtype='object')
In [14]: data.set_index('CountryCode', inplace=True, drop=False)
In [15]: data = data.drop(['HIC', 'OEC', 'OED', 'NOC', 'CEB', 'EAP', 'EMU', 'ECS', 'ECA', 'EUU
         #data.head(10)
In [16]: data = data.reset_index(drop=True)
In [17]: data.shape
```

Out[17]: (5059963, 6)

0.9 Select Arms Exports from all countries

In [99]: # Data selected: Arms exports

```
arms_stage = data[data['IndicatorName'].str.contains('Arms exports \(SIPRI'))]
In [100]: arms_stage.shape
Out[100]: (2024, 6)
In [101]: arms_stage.head()
Out[101]:
                          CountryName CountryCode \
          4664484
                       United States
          4606252 Russian Federation
                                              RUS
          4472579
                               France
                                              FRA
          4453682
                      United Kingdom
                                              GBR.
          4408557
                              Germany
                                              DEU
                                                                 IndicatorCode Year \
                                                 IndicatorName
                                                                                2014
          4664484 Arms exports (SIPRI trend indicator values)
                                                                MS.MIL.XPRT.KD
          4606252 Arms exports (SIPRI trend indicator values)
                                                                MS.MIL.XPRT.KD 2014
          4472579 Arms exports (SIPRI trend indicator values)
                                                                MS.MIL.XPRT.KD 2014
          4453682 Arms exports (SIPRI trend indicator values)
                                                                MS.MIL.XPRT.KD 2014
          4408557
                  Arms exports (SIPRI trend indicator values)
                                                                MS.MIL.XPRT.KD 2014
                          Value
          4664484 1.019400e+10
          4606252 5.971000e+09
          4472579 1.978000e+09
          4453682 1.704000e+09
          4408557 1.200000e+09
0.10 Filter for yearly USA exports
In [95]: # select Arms export for the World
        hist_indicator = 'Arms exports \((SIPRI')
        hist_year = 2014
        hist country = 'USA'
        mask1 = data['IndicatorName'].str.contains(hist_indicator)
         #mask2 = data['Year'].isin([hist_year])
        mask2 = data['Year'].between(1960, 1980)
        mask3 = data['CountryCode'].str.contains(hist_country)
         # stage is just those indicators matching the 1980 for year and Arms export over time
        usa_stage = data[mask1 & mask3]
        usa_67 = data[mask1 & mask2 & mask3]
In [96]: usa_stage.head(11)
```

```
Out [96]:
                   CountryName CountryCode
         4664484 United States
                                       USA
         4629943 United States
                                       USA
         4651699 United States
                                       USA
         4652810 United States
                                       USA
         4640880 United States
                                       USA
         4621048 United States
                                       USA
         4620931 United States
                                       USA
         4636237 United States
                                       USA
         4631888 United States
                                       USA
         4620019 United States
                                       USA
         4619906 United States
                                       USA
                                                IndicatorName
                                                                IndicatorCode
                                                                               Year
         4664484 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                               2014
         4629943 Arms exports (SIPRI trend indicator values)
                                                                               2013
                                                              MS.MIL.XPRT.KD
         4651699 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                               2012
         4652810 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                               2011
         4640880 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                               2010
         4621048 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                               2009
         4620931 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                               2008
         4636237 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                               2007
         4631888 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                               2006
         4620019 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                               2005
         4619906 Arms exports (SIPRI trend indicator values)
                                                              MS.MIL.XPRT.KD
                                                                              2004
                        Value
                1.019400e+10
         4664484
         4629943
                 7.384000e+09
         4651699 9.018000e+09
         4652810 9.111000e+09
         4640880 8.169000e+09
         4621048 6.822000e+09
         4620931 6.814000e+09
         4636237 7.834000e+09
         4631888 7.521000e+09
         4620019 6.758000e+09
         4619906 6.752000e+09
In [23]: type(usa_stage)
Out[23]: pandas.core.frame.DataFrame
     Bar Chart Arms Export per Capita
In [93]: # get the years
         years = arms_stage['Year'].values
```

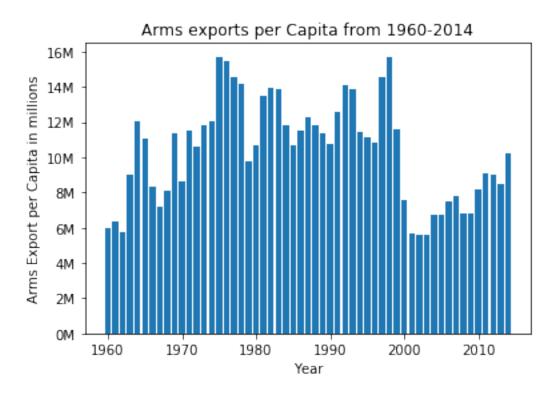
get the values

```
# create
plt.bar(years,arms)
plt.title("Arms exports per Capita from 1960-2014")
plt.xlabel("Year")
plt.ylabel("Arms Export per Capita in millions")

# format the number output on the y-axis
ax = plt.gca()
ax.yaxis.get_major_formatter().set_scientific(False)

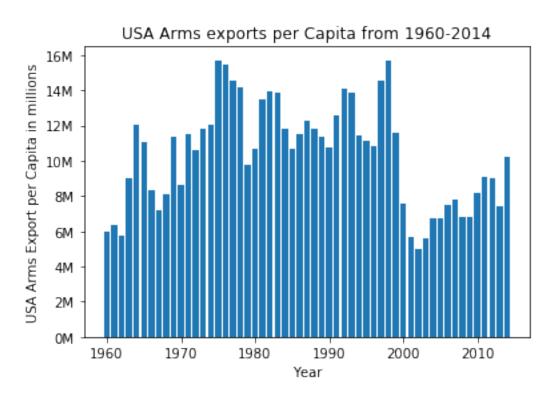
def millions(x, pos):
    'The two args are the value and tick position'
    return '{:.0f}M'.format(x*1e-9)

formatter = FuncFormatter(millions)
ax.yaxis.set_major_formatter(formatter)
plt.show()
```



0.12 Bar chart of yearly USA arms exports

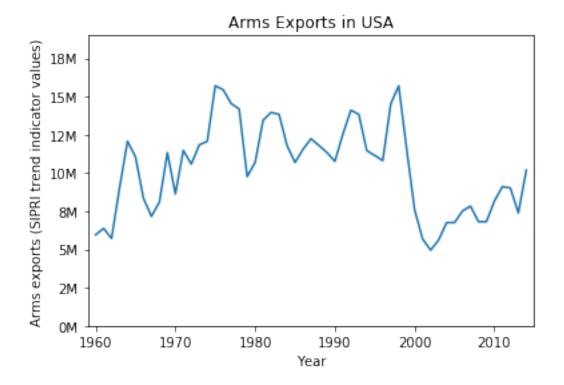
```
In [97]: # get the years
         years = usa_stage['Year'].values
         # get the values
         arms = usa_stage['Value'].values
         # create
         plt.bar(years,arms)
         plt.title("USA Arms exports per Capita from 1960-2014")
         plt.xlabel("Year")
         plt.ylabel("USA Arms Export per Capita in millions")
         # format the number output on the y-axis
         ax = plt.gca()
         ax.yaxis.get_major_formatter().set_scientific(False)
         def millions(x, pos):
             'The two args are the value and tick position'
             return '{:.0f}M'.format(x*1e-9)
         formatter = FuncFormatter(millions)
         ax.yaxis.set_major_formatter(formatter)
         plt.show()
```



Notable years: 2002, 2013 There is an increase in global exports compared to USA

0.13 Line Graph of USA arms exports annual

```
In [30]: # switch to a line plot
        plt.plot(usa_stage['Year'].values, usa_stage['Value'].values)
         # Label the axes
         plt.xlabel('Year')
         plt.ylabel(usa_stage['IndicatorName'].iloc[0])
         #label the figure
         plt.title('Arms Exports in USA')
         # to make more honest, start the y axis at 0
         plt.axis([1959, 2015, 0, 1.9e10])
         ax = plt.gca()
         ax.yaxis.get_major_formatter().set_scientific(False)
         def millions(x, pos):
             'The two args are the value and tick position'
             return '{:.0f}M'.format(x*1e-9)
         formatter = FuncFormatter(millions)
         ax.yaxis.set_major_formatter(formatter)
        plt.show()
```



0.14 Histogram of Global and USA Arms exports annual

```
In [31]: hist_data = usa_stage['Value'].values
    plt.hist(usa_stage['IndicatorName'].iloc[0])
    plt.xlabel(usa_stage['IndicatorName'].iloc[0])
    plt.ylabel('# of Years')
    plt.title("Histogram of USA's Arms exports (1960-2014)")

    ax = plt.gca()
    ax.xaxis.get_major_formatter().set_scientific(False)

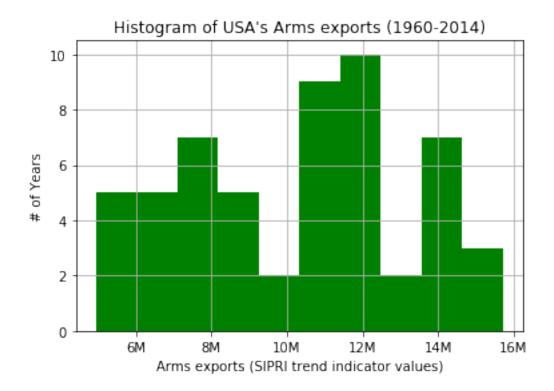
def millions(x, pos):
    'The two args are the value and tick position'
    return '{:.0f}M'.format(x*1e-9)

formatter = FuncFormatter(millions)

ax.xaxis.set_major_formatter(formatter)

#plt.axis([10, 22, 0, 14])
    plt.grid(True)

plt.show()
```



So the USA has many years where it exported between 10M-12M arms per capita with outliers on either side.

In [32]: print(hist_data)

```
[ 5.96100000e+09
                    6.37600000e+09
                                      5.72500000e+09
                                                       9.02900000e+09
   1.20770000e+10
                    1.10540000e+10
                                      8.34900000e+09
                                                       7.16500000e+09
  8.10100000e+09
                    1.13340000e+10
                                      8.63400000e+09
                                                       1.14780000e+10
   1.05850000e+10
                    1.18390000e+10
                                      1.20740000e+10
                                                       1.57080000e+10
   1.54400000e+10
                    1.45370000e+10
                                      1.41860000e+10
                                                       9.76400000e+09
  1.06970000e+10
                    1.34510000e+10
                                      1.39600000e+10
                                                       1.38340000e+10
  1.17960000e+10
                                      1.15480000e+10
                    1.06890000e+10
                                                       1.22430000e+10
  1.18010000e+10
                    1.13420000e+10
                                      1.07620000e+10
                                                       1.25400000e+10
   1.41070000e+10
                    1.38360000e+10
                                      1.14610000e+10
                                                       1.11460000e+10
  1.08080000e+10
                    1.45180000e+10
                                      1.57080000e+10
                                                       1.15530000e+10
  7.59100000e+09
                    5.68200000e+09
                                      4.95500000e+09
                                                       5.61800000e+09
  6.75200000e+09
                    6.75800000e+09
                                      7.52100000e+09
                                                       7.83400000e+09
                    6.82200000e+09
                                      8.16900000e+09
                                                       9.11100000e+09
  6.81400000e+09
  9.01800000e+09
                    7.38400000e+09
                                      1.01940000e+10]
```

0.15 How does USA compare to other countries

```
Out [120]:
                  CountryName CountryCode \
          4918852
                   South Asia
                                       SAS
          4914010
                     Pakistan
                                       PAK
                   South Asia
                                       SAS
          4913622
          4913619
                   South Asia
                                       SAS
          4913319
                     Pakistan
                                       PAK
          4913320
                     Pakistan
                                       PAK
          4730595
                      Romania
                                       ROM
          4727366
                       Mexico
                                       MEX
          4724948
                   South Asia
                                       SAS
          4721109
                       Mexico
                                       MEX
                                                                         IndicatorCode
                                                         IndicatorName
                   Disbursements on external debt, long-term (DIS...
          4918852
                                                                        DT.DIS.DLXF.CD
                   Disbursements on external debt, long-term (DIS...
          4914010
                                                                        DT.DIS.DLXF.CD
                           PPG, private creditors (DIS, current US$)
          4913622
                                                                        DT.DIS.PRVT.CD
          4913619
                            PPG, commercial banks (DIS, current US$)
                                                                        DT.DIS.PCBK.CD
          4913319
                           PPG, private creditors (DIS, current US$)
                                                                        DT.DIS.PRVT.CD
                            PPG, commercial banks (DIS, current US$)
          4913320
                                                                        DT.DIS.PCBK.CD
                   Principal repayments on external debt, long-te...
          4730595
                                                                        DT.AMT.DLXF.CD
          4727366
                   Principal repayments on external debt, long-te...
                                                                        DT.AMT.DLXF.CD
                          PPG, official creditors (DIS, current US$)
          4724948
                                                                        DT.DIS.OFFT.CD
          4721109
                           PPG, private creditors (AMT, current US$)
                                                                        DT.AMT.PRVT.CD
                   Year
                                 Value
          4918852
                   2015
                         2.287139e+11
          4914010
                   2015
                         2.111025e+11
          4913622
                   2015
                         2.097367e+11
          4913619
                   2015
                         2.097213e+11
          4913319
                   2015
                         2.087984e+11
                        2.087984e+11
          4913320
                   2015
          4730595
                   2015 2.014780e+10
          4727366
                   2015
                         1.946834e+10
                         1.897722e+10
          4724948
                   2015
          4721109
                   2015
                        1.821751e+10
In [121]: # select arms exports for all countries in 2011
          hist_indicator = 'Arms exports \((SIPRI')
          hist_year = 1990
          mask1 = data['IndicatorName'].str.contains(hist_indicator)
          mask2 = data['Year'].isin([hist_year])
          mask3 = data['Year'].between(1973, 1981)
          mask4 = data['Year'].between(1989, 1996)
          # apply our mask
          arms_1990 = data[mask1 & mask2]
          arms_range1 = data[mask1 & mask3].head(20)
```

```
arms_range2 = data[mask1 & mask4].head(20)
arms_1990.head(5)
```

arms_199	o.nead(5)	U.nead(5)		
Out[121]: 4670076 4465903 4462962 4453239 4375760	CountryName Coun United States United Kingdom Germany France China	utryCode \ USA GBR DEU FRA CHN		
4670076 4465903 4462962 4453239 4375760	Arms exports (SIPRI Arms exports (SIPRI Arms exports (SIPRI	IndicatorName trend indicator values)	IndicatorCode MS.MIL.XPRT.KD MS.MIL.XPRT.KD MS.MIL.XPRT.KD MS.MIL.XPRT.KD MS.MIL.XPRT.KD	Year 1990 1990 1990 1990
4670076 4465903 4462962 4453239 4375760 In [122]: arms_ram	1.877000e+09 1.834000e+09 1.698000e+09 9.410000e+08			
Out [122]: 4692070 4553128 4496997 4475814 4452661 4355588 4323869 4323240 4240877 4211955 4178697 4178696 4117226 4109226 4109194 4104846	CountryName Countr	OUNTRYCODE USA FRA GBR DEU ITA NLD CHN CHE POL NOR ISR ARB SWE KOR ESP CAN		

\

LBY

MKD

EGY

AUT

Libya

Austria

Macedonia, FYR

4038655 Egypt, Arab Rep.

4083097

4061197

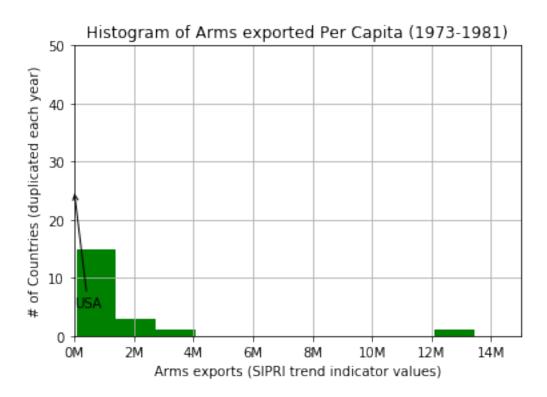
4031566

```
IndicatorName
                                                       IndicatorCode
                                                                      Year \
4692070
        Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
4553128
        Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
         Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
4496997
                                                                       1981
        Arms exports (SIPRI trend indicator values)
4475814
                                                      MS.MIL.XPRT.KD
                                                                       1981
         Arms exports (SIPRI trend indicator values)
4452661
                                                      MS.MIL.XPRT.KD
                                                                       1981
4355588
        Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
4323869
         Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
        Arms exports (SIPRI trend indicator values)
4323240
                                                      MS.MIL.XPRT.KD
                                                                       1981
4240877
         Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
4211955
        Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
         Arms exports (SIPRI trend indicator values)
4178697
                                                      MS.MIL.XPRT.KD
                                                                       1981
         Arms exports (SIPRI trend indicator values)
                                                                       1981
4178696
                                                      MS.MIL.XPRT.KD
         Arms exports (SIPRI trend indicator values)
4117226
                                                      MS.MIL.XPRT.KD
                                                                       1981
4109226
         Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
         Arms exports (SIPRI trend indicator values)
4109194
                                                      MS.MIL.XPRT.KD
                                                                       1981
4104846
         Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
        Arms exports (SIPRI trend indicator values)
4083097
                                                      MS.MIL.XPRT.KD
                                                                       1981
         Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
4061197
        Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                       1981
4038655
         Arms exports (SIPRI trend indicator values)
4031566
                                                      MS.MIL.XPRT.KD
                                                                       1981
                Value
4692070
        1.345100e+10
4553128
        3.786000e+09
4496997
         2.403000e+09
        2.029000e+09
4475814
4452661
         1.690000e+09
4355588
        8.120000e+08
4323869
         6.420000e+08
4323240
         6.390000e+08
4240877
        3.460000e+08
4211955
         2.780000e+08
         2.170000e+08
4178697
4178696
        2.170000e+08
4117226
        1.380000e+08
4109226
        1.300000e+08
4109194
        1.300000e+08
4104846
        1.260000e+08
4083097
         1.070000e+08
         9.100000e+07
4061197
        7.700000e+07
4038655
4031566
        7.300000e+07
```

0.15.1 Histogram of Top 20 arms contributors from 1973-1981

In [113]: # let's plot a histogram of the arms exported per capita by country

```
# subplots returns a touple with the figure, axis attributes.
fig, ax = plt.subplots()
ax.annotate("USA",
            xy=(20, 25), xycoords='data',
            xytext=(15, 5), textcoords='data',
            arrowprops=dict(arrowstyle="->",
                            connectionstyle="arc3"),
            )
plt.hist(arms_range1['Value'], 10, normed=False, facecolor='green')
plt.xlabel(arms_range1['IndicatorName'].iloc[0])
plt.ylabel('# of Countries (duplicated each year)')
plt.title('Histogram of Arms exported Per Capita (1973-1981)')
plt.axis([0, 1.5e10, 0, 50])
plt.grid(True)
ax = plt.gca()
ax.xaxis.get_major_formatter().set_scientific(False)
def millions(x, pos):
    'The two args are the value and tick position'
    return '{:.0f}M'.format(x*1e-9)
formatter = FuncFormatter(millions)
ax.xaxis.set_major_formatter(formatter)
plt.show()
```



In [8	38]	:	arms	rang	e2
-------	-----	---	------	------	----

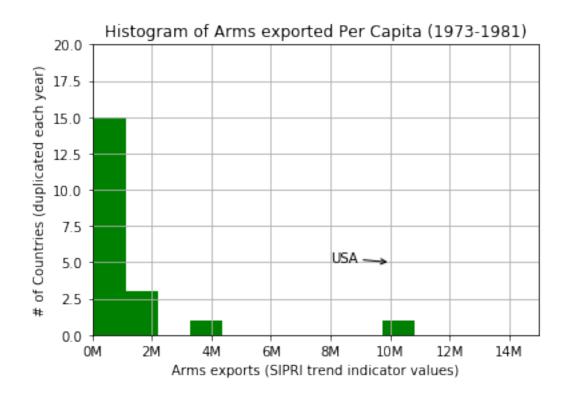
Out[88]:		CountryName	CountryCode '
	4696661	United States	USA
	4694834	United States	USA
	4685231	United States	USA
	4676393	United States	USA
	4675317	United States	USA
	4673572	United States	USA
	4670520	United States	USA
	4670076	United States	USA
	4556602	Russian Federation	RUS
	4544913	Russian Federation	RUS
	4544264	United Kingdom	GBR
	4541527	Russian Federation	RUS
	4513924	Germany	DEU
	4507509	Russian Federation	RUS
	4502729	Germany	DEU
	4486259	France	FRA
	4472323	Germany	DEU
	4467214	France	FRA
	4465903	United Kingdom	GBR
	4462962	Germany	DEU

```
IndicatorName
                                                       IndicatorCode
                                                                     Year
4696661 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1992
4694834
       Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1993
4685231 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1991
4676393 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1994
4675317 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1989
4673572 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1995
4670520 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1996
4670076 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1990
4556602 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1995
4544913 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1996
4544264 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1989
4541527 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1993
4513924 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1994
4507509 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1992
4502729 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1991
4486259 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1989
4472323 Arms exports (SIPRI trend indicator values)
                                                                      1996
                                                      MS.MIL.XPRT.KD
4467214 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1996
4465903 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1990
4462962 Arms exports (SIPRI trend indicator values)
                                                      MS.MIL.XPRT.KD
                                                                      1990
                Value
4696661
        1.410700e+10
4694834 1.383600e+10
4685231 1.254000e+10
4676393
        1.146100e+10
4675317
        1.134200e+10
4673572
        1.114600e+10
4670520
        1.080800e+10
4670076
        1.076200e+10
4556602 3.900000e+09
4544913 3.539000e+09
4544264 3.520000e+09
4541527
        3.442000e+09
4513924 2.751000e+09
4507509 2.613000e+09
4502729
        2.516000e+09
4486259 2.207000e+09
4472323 1.974000e+09
4467214 1.896000e+09
4465903 1.877000e+09
4462962 1.834000e+09
```

0.15.2 Histogram of Top 20 contributors from 1989-1996

In [119]: # let's plot a histogram of the arms exported per capita by country

```
# subplots returns a touple with the figure, axis attributes.
fig, ax = plt.subplots()
ax.annotate("USA",
            xy=(10e9, 5), xycoords='data',
            xytext=(8e9, 5), textcoords='data',
            arrowprops=dict(arrowstyle="->",
                            connectionstyle="arc3"),
            )
plt.hist(arms_range2['Value'], 10, normed=False, facecolor='green')
plt.xlabel(arms_range2['IndicatorName'].iloc[0])
plt.ylabel('# of Countries (duplicated each year)')
plt.title('Histogram of Arms exported Per Capita (1973-1981)')
plt.axis([0, 1.5e10, 0, 20])
plt.grid(True)
ax = plt.gca()
ax.xaxis.get_major_formatter().set_scientific(False)
def millions(x, pos):
    'The two args are the value and tick position'
   return '{:.0f}M'.format(x*1e-9)
formatter = FuncFormatter(millions)
ax.xaxis.set_major_formatter(formatter)
plt.show()
```



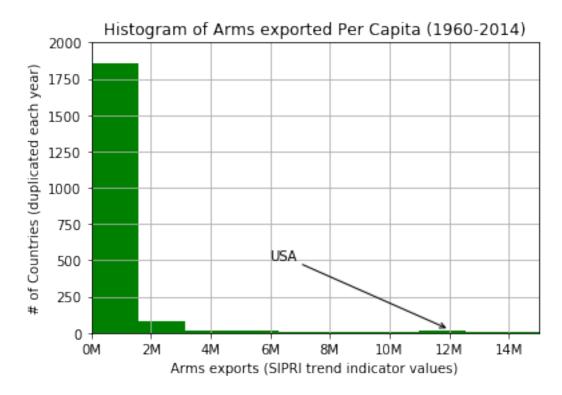
0.16 Histogram of arms exports per capita by country

```
ax = plt.gca()
ax.xaxis.get_major_formatter().set_scientific(False)

def millions(x, pos):
    'The two args are the value and tick position'
    return '{:.0f}M'.format(x*1e-9)

formatter = FuncFormatter(millions)

ax.xaxis.set_major_formatter(formatter)
```



In [34]: print(len(arms_stage))
2024

So the USA, at \sim 12M arms is an outlier, as most countries have 0-1M arms exported from 1960-2014