```
In [1]: import pandas as pd
    import matplotlib.pyplot as plt
    from matplotlib import style
    import warnings
    warnings.filterwarnings('ignore')
```

```
In [2]: #theme used for all plots
    style.use("ggplot")
```

```
In [3]: #read csv file
  worldData = pd.read_csv("world_data.csv")
  worldData
```

	Country Name	Country Code	Series Name	Series Code	2014 [YR2014]	2015 [YR2015]	2016 [YR2016]	2017 [YR2017]	2018 [YR2018]
0	United States	USA	GDP (current US\$)	NY.GDP.MKTP.CD	1.752175e+13	1.821930e+13	1.870719e+13	1.948539e+13	2.049410e+13
1	United States	USA	Military expenditure (current USD)	MS.MIL.XPND.CD	6.099140e+11	5.961046e+11	6.001064e+11	6.058029e+11	6.487983e+11
2	United States	USA	Population, total	SP.POP.TOTL	3.183864e+08	3.207427e+08	3.230713e+08	3.251471e+08	3.271674e+08
3	China	CHN	GDP (current US\$)	NY.GDP.MKTP.CD	1.043853e+13	1.101554e+13	1.113795e+13	1.214349e+13	1.360815e+13
4	China	CHN	Military expenditure (current USD)	MS.MIL.XPND.CD	2.007722e+11	2.140931e+11	2.160313e+11	2.278294e+11	2.499969e+11
5	China	CHN	Population, total	SP.POP.TOTL	1.364270e+09	1.371220e+09	1.378665e+09	1.386395e+09	1.392730e+09
6	Russian Federation	RUS	GDP (current US\$)	NY.GDP.MKTP.CD	2.059984e+12	1.363594e+12	1.282724e+12	1.578624e+12	1.657554e+12
7	Russian Federation	RUS	Military expenditure (current USD)	MS.MIL.XPND.CD	8.469650e+10	6.641871e+10	6.924531e+10	6.652730e+10	6.138755e+10
8	Russian Federation	RUS	Population, total	SP.POP.TOTL	1.438197e+08	1.440969e+08	1.443424e+08	1.444967e+08	1.444780e+08
9	Germany	DEU	GDP (current US\$)	NY.GDP.MKTP.CD	3.898727e+12	3.381389e+12	3.495163e+12	3.693204e+12	3.996759e+12
10	Germany	DEU	Military expenditure (current USD)	MS.MIL.XPND.CD	4.610267e+10	3.981258e+10	4.157949e+10	4.538172e+10	4.947063e+10
11	Germany	DEU	Population, total	SP.POP.TOTL	8.098250e+07	8.168661e+07	8.234867e+07	8.265700e+07	8.292792e+07
12	United Kingdom	GBR	GDP (current US\$)	NY.GDP.MKTP.CD	3.034729e+12	2.896421e+12	2.659239e+12	2.637866e+12	2.825208e+12
13	United Kingdom	GBR	Military expenditure (current USD)	MS.MIL.XPND.CD	5.918286e+10	5.386219e+10	4.811894e+10	4.643330e+10	4.999719e+10
14	United Kingdom	GBR	Population, total	SP.POP.TOTL	6.461316e+07	6.512886e+07	6.559556e+07	6.605886e+07	6.648899e+07
15	France	FRA	GDP (current US\$)	NY.GDP.MKTP.CD	2.852166e+12	2.438208e+12	2.471286e+12	2.586285e+12	2.777535e+12
16	France	FRA	Military expenditure (current USD)	MS.MIL.XPND.CD	6.361357e+10	5.534213e+10	5.735841e+10	6.041750e+10	6.379968e+10
17	France	FRA	Population, total	SP.POP.TOTL	6.631610e+07	6.659337e+07	6.685977e+07	6.686514e+07	6.698724e+07

	Country Name	Country Code	Series Name	Series Code	2014 [YR2014]	2015 [YR2015]	2016 [YR2016]	2017 [YR2017]	2018 [YR2018]
18	Italy	ITA	GDP (current US\$)	NY.GDP.MKTP.CD	2.151733e+12	1.832273e+12	1.869202e+12	1.946570e+12	2.073902e+12
19	Italy	ITA	Military expenditure (current USD)	MS.MIL.XPND.CD	2.770103e+10	2.218085e+10	2.503303e+10	2.644789e+10	2.780751e+10
20	Italy	ITA	Population, total	SP.POP.TOTL	6.078914e+07	6.073058e+07	6.062750e+07	6.053671e+07	6.043128e+07
21	Saudi Arabia	SAU	GDP (current US\$)	NY.GDP.MKTP.CD	7.563503e+11	6.542699e+11	6.449355e+11	6.885861e+11	7.824835e+11
22	Saudi Arabia	SAU	Military expenditure (current USD)	MS.MIL.XPND.CD	8.076240e+10	8.718587e+10	6.367280e+10	7.040000e+10	6.755467e+10
23	Saudi Arabia	SAU	Population, total	SP.POP.TOTL	3.091699e+07	3.171767e+07	3.244257e+07	3.309915e+07	3.369995e+07
24	Korea, Rep.	KOR	GDP (current US\$)	NY.GDP.MKTP.CD	1.411334e+12	1.382764e+12	1.414804e+12	1.530751e+12	1.619424e+12
25	Korea, Rep.	KOR	Military expenditure (current USD)	MS.MIL.XPND.CD	3.755233e+10	3.657077e+10	3.688528e+10	3.917068e+10	4.306997e+10
26	Korea, Rep.	KOR	Population, total	SP.POP.TOTL	5.074666e+07	5.101495e+07	5.124571e+07	5.146620e+07	5.163526e+07
27	Israel	ISR	GDP (current US\$)	NY.GDP.MKTP.CD	3.100079e+11	3.004708e+11	3.193779e+11	3.532684e+11	3.696904e+11
28	Israel	ISR	Military expenditure (current USD)	MS.MIL.XPND.CD	1.848583e+10	1.696943e+10	1.478381e+10	1.558161e+10	1.594679e+10
29	Israel	ISR	Population, total	SP.POP.TOTL	8.215700e+06	8.380100e+06	8.546000e+06	8.713300e+06	8.883800e+06
30	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
31	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
32	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
33	Data from database: World Development Indicators	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN
34	Last Updated: 10/02/2019	NaN	NaN	NaN	NaN	NaN	NaN	NaN	NaN

	<b>Country Name</b>	Series Name	2014	2015	2016	2017	2018
0	United States	GDP	1.752175e+13	1.821930e+13	1.870719e+13	1.948539e+13	2.049410e+13
1	United States	Military Expenditure	6.099140e+11	5.961046e+11	6.001064e+11	6.058029e+11	6.487983e+11
2	United States	Population	3.183864e+08	3.207427e+08	3.230713e+08	3.251471e+08	3.271674e+08
3	China	GDP	1.043853e+13	1.101554e+13	1.113795e+13	1.214349e+13	1.360815e+13
4	China	Military Expenditure	2.007722e+11	2.140931e+11	2.160313e+11	2.278294e+11	2.499969e+11
5	China	Population	1.364270e+09	1.371220e+09	1.378665e+09	1.386395e+09	1.392730e+09
6	Russian Federation	GDP	2.059984e+12	1.363594e+12	1.282724e+12	1.578624e+12	1.657554e+12
7	Russian Federation	Military Expenditure	8.469650e+10	6.641871e+10	6.924531e+10	6.652730e+10	6.138755e+10
8	Russian Federation	Population	1.438197e+08	1.440969e+08	1.443424e+08	1.444967e+08	1.444780e+08
9	Germany	GDP	3.898727e+12	3.381389e+12	3.495163e+12	3.693204e+12	3.996759e+12
10	Germany	Military Expenditure	4.610267e+10	3.981258e+10	4.157949e+10	4.538172e+10	4.947063e+10
11	Germany	Population	8.098250e+07	8.168661e+07	8.234867e+07	8.265700e+07	8.292792e+07
12	United Kingdom	GDP	3.034729e+12	2.896421e+12	2.659239e+12	2.637866e+12	2.825208e+12
13	United Kingdom	Military Expenditure	5.918286e+10	5.386219e+10	4.811894e+10	4.643330e+10	4.999719e+10
14	United Kingdom	Population	6.461316e+07	6.512886e+07	6.559556e+07	6.605886e+07	6.648899e+07
15	France	GDP	2.852166e+12	2.438208e+12	2.471286e+12	2.586285e+12	2.777535e+12
16	France	Military Expenditure	6.361357e+10	5.534213e+10	5.735841e+10	6.041750e+10	6.379968e+10
17	France	Population	6.631610e+07	6.659337e+07	6.685977e+07	6.686514e+07	6.698724e+07
18	Italy	GDP	2.151733e+12	1.832273e+12	1.869202e+12	1.946570e+12	2.073902e+12
19	Italy	Military Expenditure	2.770103e+10	2.218085e+10	2.503303e+10	2.644789e+10	2.780751e+10
20	Italy	Population	6.078914e+07	6.073058e+07	6.062750e+07	6.053671e+07	6.043128e+07
21	Saudi Arabia	GDP	7.563503e+11	6.542699e+11	6.449355e+11	6.885861e+11	7.824835e+11
22	Saudi Arabia	Military Expenditure	8.076240e+10	8.718587e+10	6.367280e+10	7.040000e+10	6.755467e+10
23	Saudi Arabia	Population	3.091699e+07	3.171767e+07	3.244257e+07	3.309915e+07	3.369995e+07
24	South Korea	GDP	1.411334e+12	1.382764e+12	1.414804e+12	1.530751e+12	1.619424e+12
25	South Korea	Military Expenditure	3.755233e+10	3.657077e+10	3.688528e+10	3.917068e+10	4.306997e+10
26	South Korea	Population	5.074666e+07	5.101495e+07	5.124571e+07	5.146620e+07	5.163526e+07
27	Israel	GDP	3.100079e+11	3.004708e+11	3.193779e+11	3.532684e+11	3.696904e+11
28	Israel	Military Expenditure	1.848583e+10	1.696943e+10	1.478381e+10	1.558161e+10	1.594679e+10

	Country Name	Series Name	2014	2015	2016	2017	2018
29	Israel	Population	8.215700e+06	8.380100e+06	8.546000e+06	8.713300e+06	8.883800e+06

# In [5]: # Preprocessing worldData = worldData.set\_index(["Country Name", "Series Name"]).stack().unstack(1).unstack(1) worldData

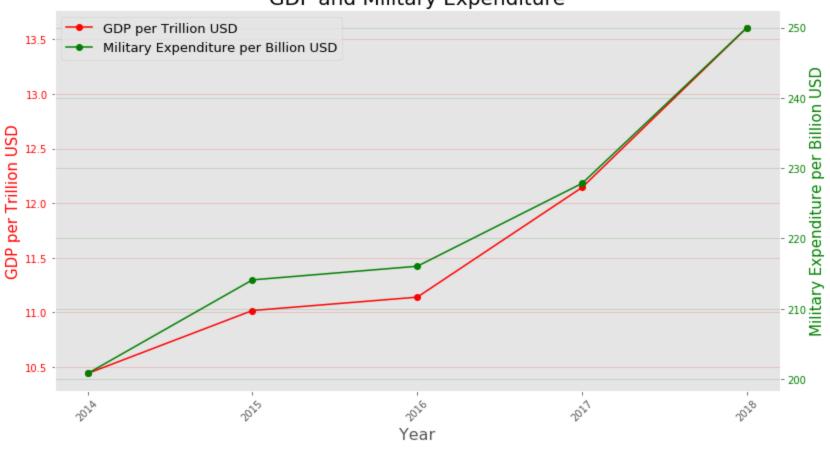
### Out[5]:

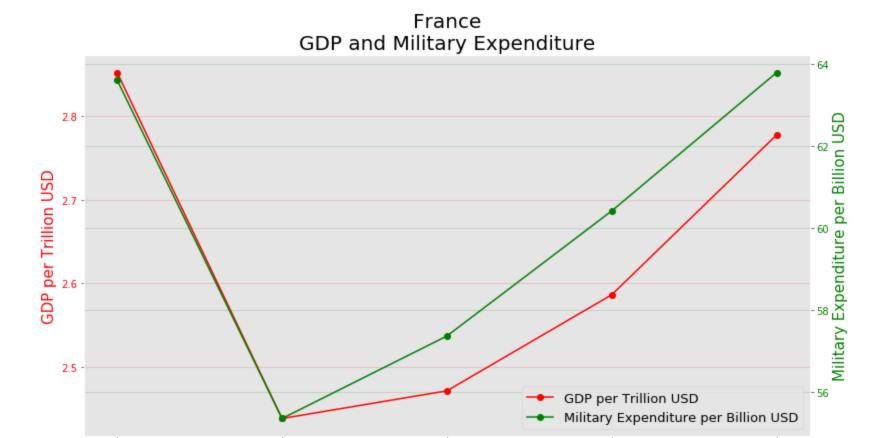
Series Name	GDP					Military Expenditure				
	2014	2015	2016	2017	2018	2014	2015	2016	2017	2018
Country Name										
China	1.043853e+13	1.101554e+13	1.113795e+13	1.214349e+13	1.360815e+13	2.007722e+11	2.140931e+11	2.160313e+11	2.278294e+11	2.499
France	2.852166e+12	2.438208e+12	2.471286e+12	2.586285e+12	2.777535e+12	6.361357e+10	5.534213e+10	5.735841e+10	6.041750e+10	6.379
Germany	3.898727e+12	3.381389e+12	3.495163e+12	3.693204e+12	3.996759e+12	4.610267e+10	3.981258e+10	4.157949e+10	4.538172e+10	4.947
Israel	3.100079e+11	3.004708e+11	3.193779e+11	3.532684e+11	3.696904e+11	1.848583e+10	1.696943e+10	1.478381e+10	1.558161e+10	1.594
Italy	2.151733e+12	1.832273e+12	1.869202e+12	1.946570e+12	2.073902e+12	2.770103e+10	2.218085e+10	2.503303e+10	2.644789e+10	2.780
Russian Federation	2.059984e+12	1.363594e+12	1.282724e+12	1.578624e+12	1.657554e+12	8.469650e+10	6.641871e+10	6.924531e+10	6.652730e+10	6.138
Saudi Arabia	7.563503e+11	6.542699e+11	6.449355e+11	6.885861e+11	7.824835e+11	8.076240e+10	8.718587e+10	6.367280e+10	7.040000e+10	6.755
South Korea	1.411334e+12	1.382764e+12	1.414804e+12	1.530751e+12	1.619424e+12	3.755233e+10	3.657077e+10	3.688528e+10	3.917068e+10	4.306
United Kingdom	3.034729e+12	2.896421e+12	2.659239e+12	2.637866e+12	2.825208e+12	5.918286e+10	5.386219e+10	4.811894e+10	4.643330e+10	4.999
United States	1.752175e+13	1.821930e+13	1.870719e+13	1.948539e+13	2.049410e+13	6.099140e+11	5.961046e+11	6.001064e+11	6.058029e+11	6.487

```
In [6]: def parasiteAxesLinePlot(y1AxisData, y2AxisData, xLabel, y1Label, y1Color, y2Color, title):
            ''' Creates a dual Y axes Line Plot with a common X axis '''
            fig = plt.figure(figsize = (13,7))
            plt.xticks(rotation=45)
            y1 = fig.add subplot(111)
            y1.plot(y1AxisData, label = y1Label, color = y1Color, marker = "o")
            y1.set xlabel(xLabel, fontsize = 16)
            #set y axis label
            y1.set ylabel(y1Label, fontsize = 15, color = y1Color)
            #set y axis tick color
            y1.tick params(axis="y", labelcolor = y1Color)
            #set y axis grid color
            y1.yaxis.grid(True, color = y1Color, alpha = 0.2)
            #hide x axis grid
            y1.xaxis.grid(False)
            #twin 'y1' plot keeping x-axis data common
            y2 = y1.twinx()
            y2.plot(y2AxisData, label = y2Label, color = y2Color, marker = "o")
            #set y axis label
            y2.set_ylabel(y2Label, fontsize = 15, color = y2Color)
            #set y axis tick color
            y2.tick_params(axis = "y", labelcolor = y2Color)
            #set y axis grid color
            y2.yaxis.grid(True, color = y2Color, alpha = 0.2)
            #hide x axis grid
            y2.xaxis.grid(False)
            lines, labels = y1.get legend handles labels()
            lines2, labels2 = y2.get legend handles labels()
            #to handle legends for parasite axes plot
            plt.legend(lines + lines2, labels + labels2, loc="best", fontsize = 13)
            plt.title(title, fontsize = 20)
            plt.show()
```

```
In [7]: # Compare the military data to that country's GDP
#iterate over all countries
for country in worldData.index.get_level_values(0).unique():
    parasiteAxesLinePlot(
        # divide by 10**12 to get data in trillions
        y1AxisData = worldData.loc[country,"GDP"]/(10**12),
        # divide by 10**9 to get data in billions
        y2AxisData = worldData.loc[country,"Military Expenditure"]/(10**9),
        xLabel = "Year",
        y1Label = "GDP per Trillion USD",
        y2Label = "Military Expenditure per Billion USD",
        y1Color = "Red",
        y2Color = "Green",
        title = country+"\nGDP and Military Expenditure"
)
```

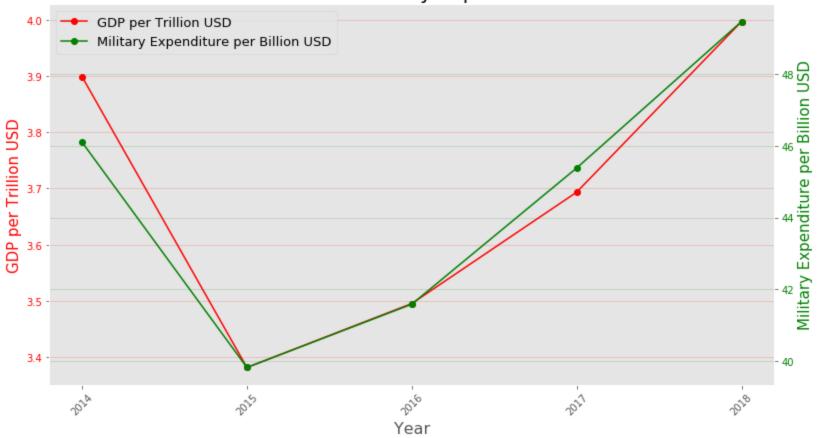
China GDP and Military Expenditure



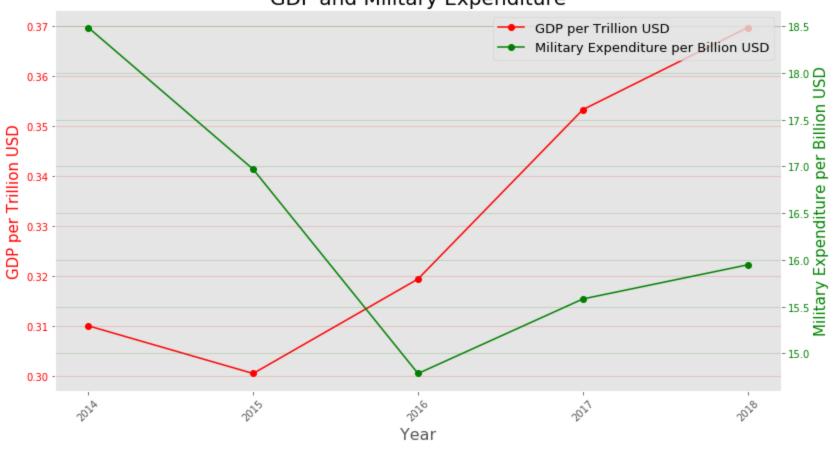


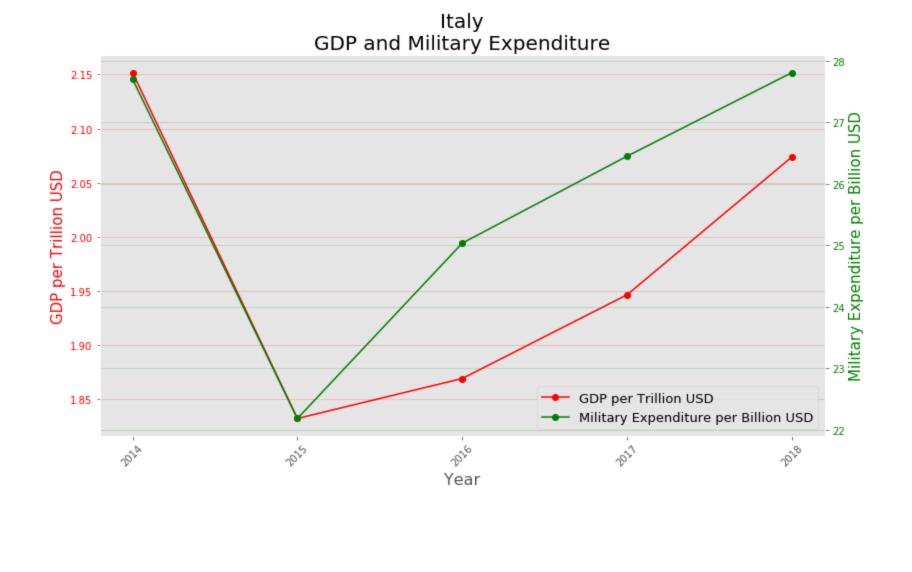
Year

Germany GDP and Military Expenditure

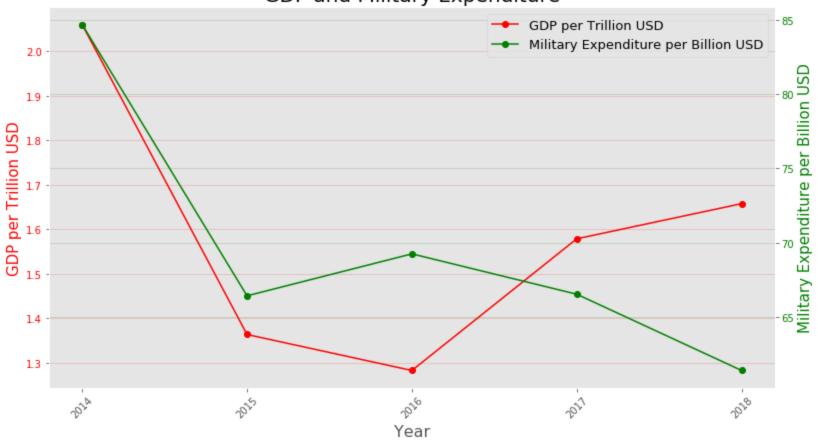


Israel GDP and Military Expenditure

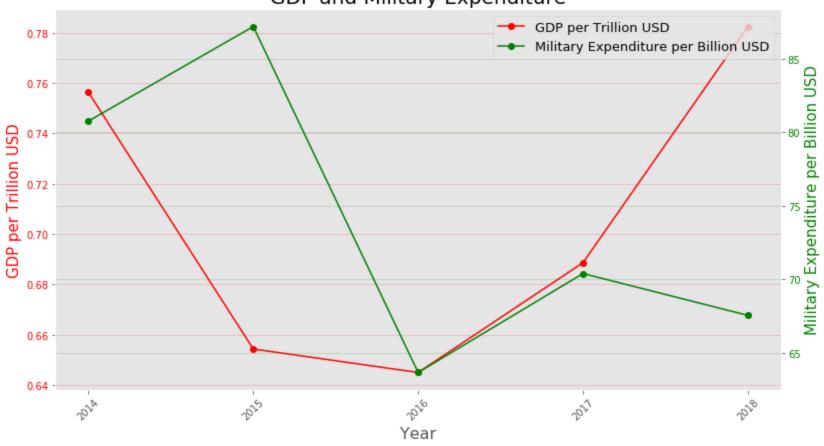




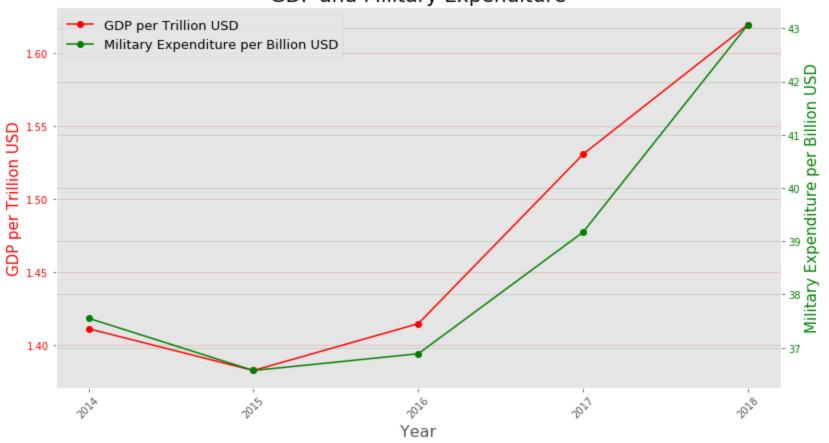
Russian Federation GDP and Military Expenditure



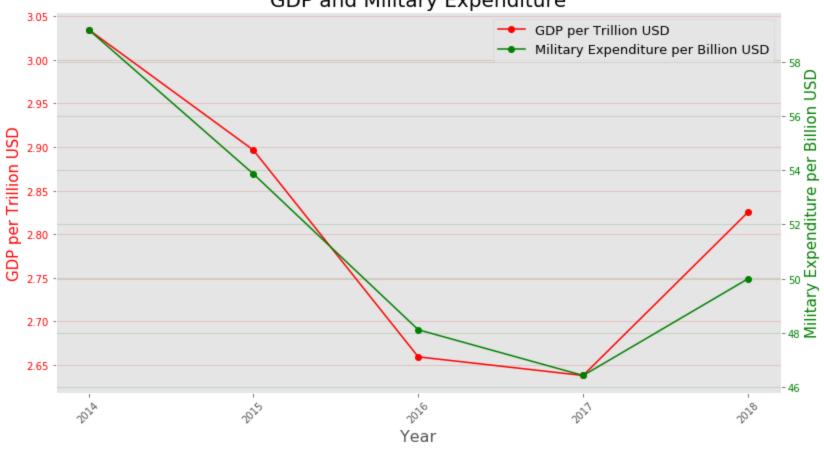
Saudi Arabia GDP and Military Expenditure



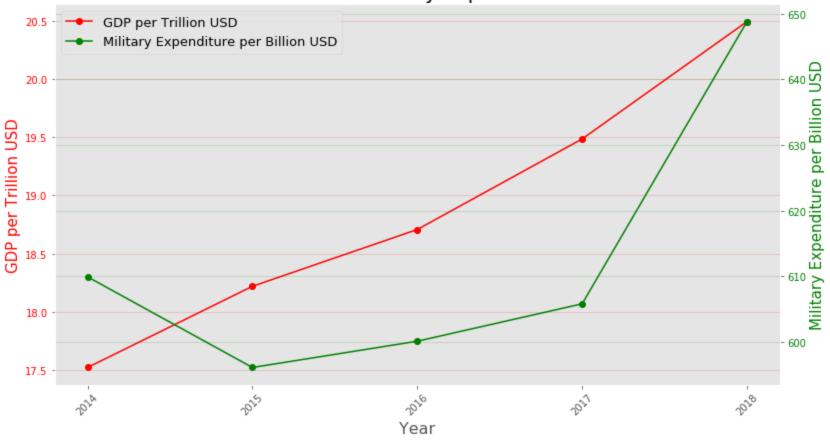
South Korea GDP and Military Expenditure



United Kingdom GDP and Military Expenditure

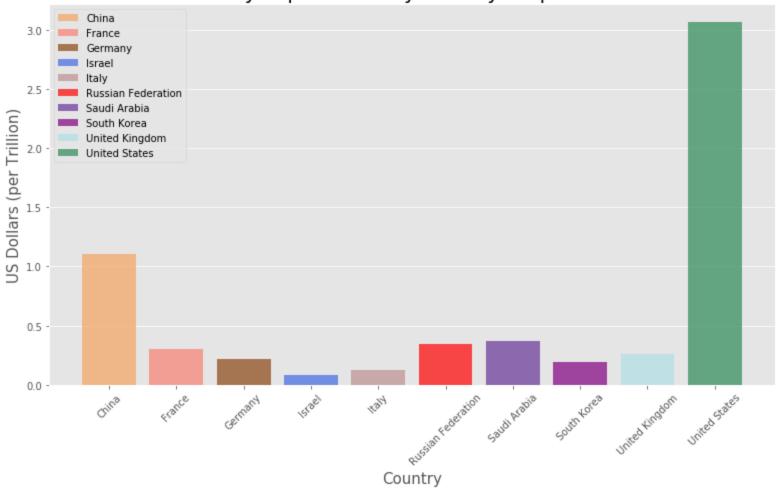


United States GDP and Military Expenditure

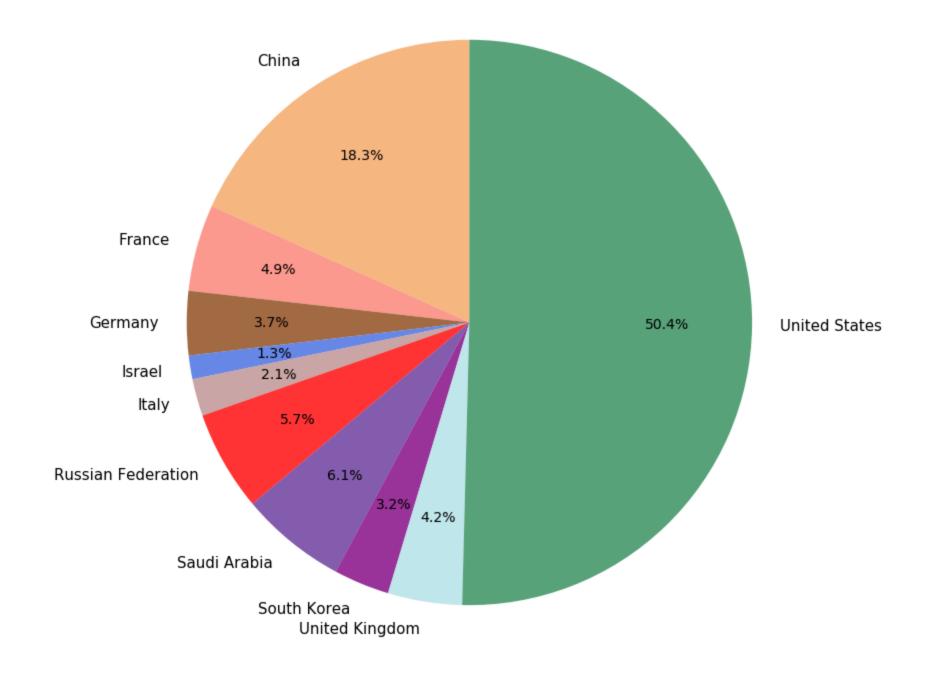


In [8]: # common color cycle
 colorArr = ["sandybrown","salmon","saddlebrown","royalblue","rosybrown","red","rebeccapurple","purple","powderblue","se
 agreen"]

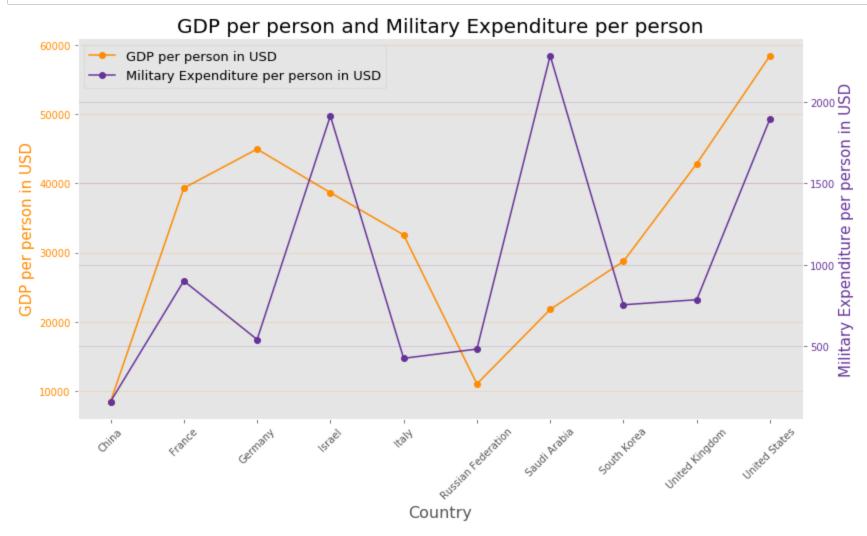
Overall Military Expenditure by country for period 2014-2018

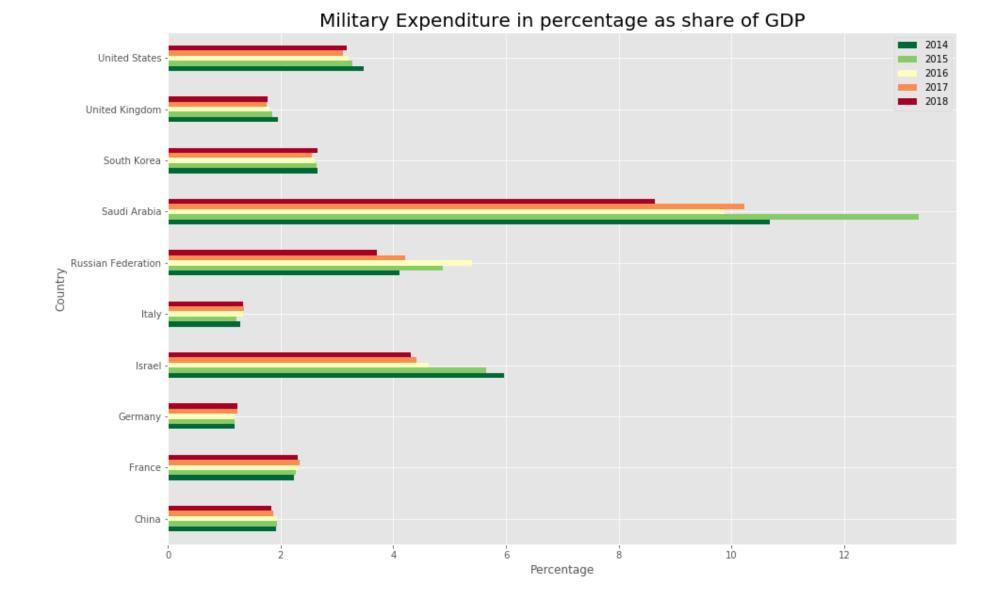


```
In [10]: # Compare the overall military spending of the all 10 countries in percentages
         #get all unique countries
         countries = worldData.index.get level values(0).unique()
         totalMilitarySpendingPerCountry = []
         for country in countries:
             # sum all military expenditure for country for all years
             totalMilitarySpendingPerCountry.append(worldData.loc[country]["Military Expenditure"].sum())
         fig = plt.figure(figsize=(13,13))
         fig1 = fig.add subplot(111)
         fig1.title.set text("Overall Military Expenditure in % by country for period 2014-2018")
         fig1.title.set size(20)
         #plot the pie chart
         wedges, texts, autotexts = fig1.pie(
             #totalMilitarySpendingPerCountry list contains data to plot
             totalMilitarySpendingPerCountry,
             labels=countries,
             autopct="%1.1f%%",
             startangle=90,
             pctdistance=0.7,
             #colors uses the colorArr which contains our custom colors
             colors=colorArr
         #sets the size for the percentage text inside each wedge
         for autotext in autotexts:
             autotext.set_size(14)
         #sets the size of label for each wedge
         for text in texts:
             text.set_size(15)
         #sets opacity property for each edge
         for wedge in wedges:
             wedge.set_alpha(0.8)
         plt.show()
```



```
In [11]: # Compare the per person military spending to the per person GDP in absolute
parasiteAxesLinePlot(
    # per person GDP
    y1AxisData = worldData["GDP"].mean(axis=1)/(worldData["Population"]).mean(axis=1),
    # per person military spending
    y2AxisData = worldData["Military Expenditure"].mean(axis=1)/(worldData["Population"].mean(axis=1)),
    xLabel = "Country",
    y1Label = "GDP per person in USD",
    y2Label = "Military Expenditure per person in USD",
    y1Color = "darkorange",
    y2Color = "rebeccapurple",
    title="GDP per person and Military Expenditure per person"
)
```





In [13]: # Single out the fastest growing countries in military spending in absolute values
worldData["Military Expenditure"]

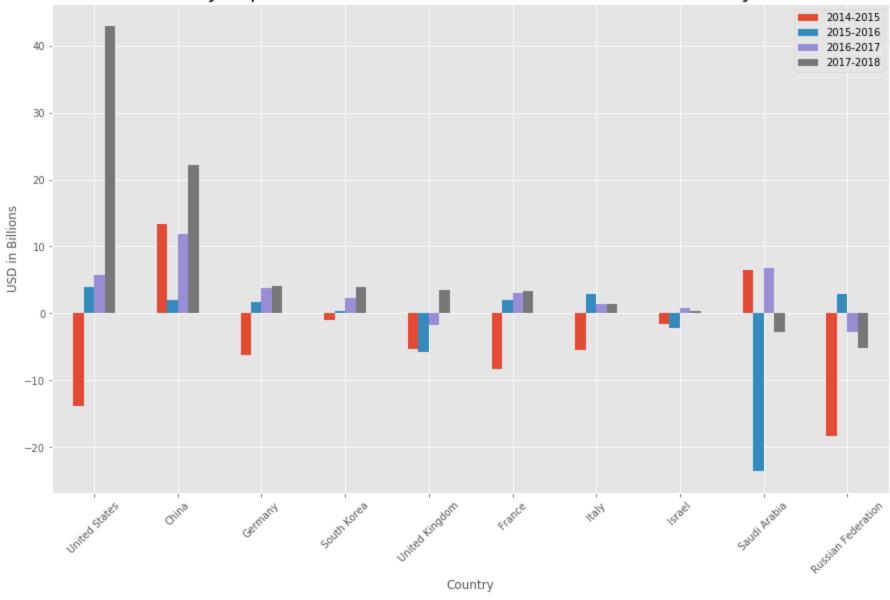
## Out[13]:

	2014	2015	2016	2017	2018
Country Name					
China	2.007722e+11	2.140931e+11	2.160313e+11	2.278294e+11	2.499969e+11
France	6.361357e+10	5.534213e+10	5.735841e+10	6.041750e+10	6.379968e+10
Germany	4.610267e+10	3.981258e+10	4.157949e+10	4.538172e+10	4.947063e+10
Israel	1.848583e+10	1.696943e+10	1.478381e+10	1.558161e+10	1.594679e+10
Italy	2.770103e+10	2.218085e+10	2.503303e+10	2.644789e+10	2.780751e+10
Russian Federation	8.469650e+10	6.641871e+10	6.924531e+10	6.652730e+10	6.138755e+10
Saudi Arabia	8.076240e+10	8.718587e+10	6.367280e+10	7.040000e+10	6.755467e+10
South Korea	3.755233e+10	3.657077e+10	3.688528e+10	3.917068e+10	4.306997e+10
<b>United Kingdom</b>	5.918286e+10	5.386219e+10	4.811894e+10	4.643330e+10	4.999719e+10
United States	6.099140e+11	5.961046e+11	6.001064e+11	6.058029e+11	6.487983e+11

#### Out[14]:

	2014-2015	2015-2016	2016-2017	2017-2018
Country Name				
China	1.332087e+10	1.938210e+09	1.179814e+10	2.216748e+10
France	-8.271438e+09	2.016283e+09	3.059084e+09	3.382178e+09
Germany	-6.290097e+09	1.766919e+09	3.802227e+09	4.088906e+09
Israel	-1.516398e+09	-2.185617e+09	7.977937e+08	3.651802e+08
Italy	-5.520189e+09	2.852183e+09	1.414865e+09	1.359621e+09
Russian Federation	-1.827780e+10	2.826601e+09	-2.718005e+09	-5.139757e+09
Saudi Arabia	6.423467e+09	-2.351307e+10	6.727200e+09	-2.845333e+09
South Korea	-9.815594e+08	3.145141e+08	2.285399e+09	3.899291e+09
<b>United Kingdom</b>	-5.320673e+09	-5.743242e+09	-1.685640e+09	3.563889e+09
<b>United States</b>	-1.380936e+10	4.001804e+09	5.696484e+09	4.299535e+10

# Military expenditure difference in absolute values over the years



```
In [16]: # Single out the fastest growing countries in military spending in percentage
         # Take difference in military spendings in percentages for consecutive years
         # percentageChange = ((new value - old value) / old value)
         worldData["Military Expenditure Percentage Difference","2014-2015 %"]= \
                         ((worldData["Military Expenditure","2015"]-worldData["Military Expenditure","2014"])
                          worldData["Military Expenditure","2014"])*100
         worldData["Military Expenditure Percentage Difference","2015-2016 %"]= \
                         ((worldData["Military Expenditure","2016"]-worldData["Military Expenditure","2015"])
                          worldData["Military Expenditure","2015"])*100
         worldData["Military Expenditure Percentage Difference","2016-2017 %"]= \
                         ((worldData["Military Expenditure","2017"]-worldData["Military Expenditure","2016"])
                          worldData["Military Expenditure","2016"])*100
         worldData["Military Expenditure Percentage Difference","2017-2018 %"]= \
                         ((worldData["Military Expenditure","2018"]-worldData["Military Expenditure","2017"])
                          worldData["Military Expenditure","2017"])*100
         worldData["Military Expenditure Percentage Difference"]
```

#### Out[16]:

2014-2015 % 2015-2016 % 2016-2017 % 2017-2018 %

#### **Country Name**

China	6.634816	0.905312	5.461310	9.729860
France	-13.002631	3.643305	5.333279	5.598010
Germany	-13.643670	4.438092	9.144477	9.010028
Israel	-8.203027	-12.879732	5.396399	2.343662
Italy	-19.927737	12.858765	5.651993	5.140754
Russian Federation	-21.580343	4.255731	-3.925184	-7.725786
Saudi Arabia	7.953536	-26.968897	10.565265	-4.041667
South Korea	-2.613844	0.860015	6.195964	9.954617
<b>United Kingdom</b>	-8.990227	-10.662846	-3.503070	7.675287
<b>United States</b>	-2.264149	0.671326	0.949246	7.097250

Military expenditure percentage difference over the years 2014-2015 % 2015-2016 % 2016-2017 % 2017-2018 % 10 -5 -0 -Percentage -5 --15 --20 --25 -Saudi Arabia South Korea Cernany China United States Islael Kaly

Country