

# The Sparks Foundation

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## Terrorism Data Analysis Project 1

### Task : Exploratory Data Analysis

```
In [ ]: import pandas as pd
import numpy as np

from matplotlib import pyplot as plt
import seaborn as sns

import warnings
warnings.filterwarnings("ignore")
```

#### Reading csv file

```
In [2]: df = pd.read_csv(r"C:\Users\Asus\Downloads\GRIP_data\Grip_data_new.csv")
pd.options.display.max_columns = None
```

#### Data Manipulation and Cleaning

```
In [3]: df.head()
```

```
Out[3]:
```

	eventid	iyear	imonth	iday	approxdate	extended	resolution	country	country_txt	rt
--	---------	-------	--------	------	------------	----------	------------	---------	-------------	----

0	1.970000e+11	1970	7	2	NaN	0	NaN	58	Dominican Republic	
---	--------------	------	---	---	-----	---	-----	----	--------------------	--

1	1.970000e+11	1970	0	0	NaN	0	NaN	130	Mexico	
---	--------------	------	---	---	-----	---	-----	-----	--------	--

2	1.970010e+11	1970	1	0	NaN	0	NaN	160	Philippines	
---	--------------	------	---	---	-----	---	-----	-----	-------------	--

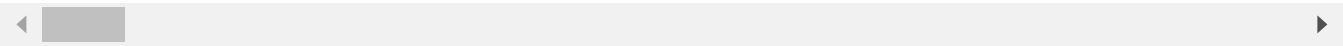
3	1.970010e+11	1970	1	0	NaN	0	NaN	78	Greece	
---	--------------	------	---	---	-----	---	-----	----	--------	--

4	1.970010e+11	1970	1	0	NaN	0	NaN	101	Japan	
---	--------------	------	---	---	-----	---	-----	-----	-------	--

```
In [4]: df.tail()
```

Out[4]:

	eventid	iyear	imonth	iday	approxdate	extended	resolution	country	country_
181686	2.017120e+11	2017	12	31	NaN	0	NaN	182	Somali
181687	2.017120e+11	2017	12	31	NaN	0	NaN	200	Syria
181688	2.017120e+11	2017	12	31	NaN	0	NaN	160	Philippines
181689	2.017120e+11	2017	12	31	NaN	0	NaN	92	Indonesia
181690	2.017120e+11	2017	12	31	NaN	0	NaN	160	Philippines



```
In [5]: df.columns.values
```

```
Out[5]: array(['eventid', 'iyear', 'imonth', 'iday', 'approxdate', 'extended',
'resolution', 'country', 'country_txt', 'region', 'region_txt',
'provstate', 'city', 'latitude', 'longitude', 'specificity',
'vicinity', 'location', 'summary', 'crit1', 'crit2', 'crit3',
'doubtterr', 'alternative', 'alternative_txt', 'multiple',
'success', 'suicide', 'attacktype1', 'attacktype1_txt',
'attacktype2', 'attacktype2_txt', 'attacktype3', 'attacktype3_txt',
'targtype1', 'targtype1_txt', 'targsubtype1', 'targsubtype1_txt',
'corp1', 'target1', 'natlty1', 'natlty1_txt', 'targtype2',
'targtype2_txt', 'targsubtype2', 'targsubtype2_txt', 'corp2',
'target2', 'natlty2', 'natlty2_txt', 'targtype3', 'targtype3_txt',
'targsubtype3', 'targsubtype3_txt', 'corp3', 'target3', 'natlty3',
'natlty3_txt', 'gname', 'gsubname', 'gname2', 'gsubname2',
'gname3', 'gsubname3', 'motive', 'guncertain1', 'guncertain2',
'guncertain3', 'individual', 'nperps', 'nperpcap', 'claimed',
'claimmode', 'claimmode_txt', 'claim2', 'claimmode2',
'claimmode2_txt', 'claim3', 'claimmode3', 'claimmode3_txt',
'compclaim', 'weaptype1', 'weaptype1_txt', 'weapsubtype1',
'weapsubtype1_txt', 'weaptype2', 'weaptype2_txt', 'weapsubtype2',
'weapsubtype2_txt', 'weaptype3', 'weaptype3_txt', 'weapsubtype3',
'weapsubtype3_txt', 'weaptype4', 'weaptype4_txt', 'weapsubtype4',
'weapsubtype4_txt', 'weapdetail', 'nkill', 'nkillus', 'nkillter',
'nwound', 'nwoundus', 'nwoundte', 'property', 'propextent',
'propextent_txt', 'propvalue', 'propcomment', 'ishostkid',
'nhostkid', 'nhostkidus', 'nhours', 'ndays', 'divert',
'kidhijcountry', 'ransom', 'ransomamt', 'ransomamtus',
'ransompaid', 'ransompaidus', 'ransomnote', 'hostkidoutcome',
'hostkidoutcome_txt', 'nreleased', 'addnotes', 'scite1', 'scite2',
'scite3', 'dbsource', 'INT_LOG', 'INT_IDEO', 'INT_MISC', 'INT_ANY',
'related'], dtype=object)
```

```
In [6]: data = df[['iyear', 'imonth', 'iday', 'country_txt', 'region_txt', 'provstate', 'city', 'lat', 'lon',
'targtype1_txt', 'summary', 'suicide', 'targsubtype1_txt', 'natlty1_txt', 'gname', 'gsubname', 'gname2', 'gsubname2', 'gname3', 'gsubname3', 'motive', 'guncertain1', 'guncertain2', 'guncertain3', 'individual', 'nperps', 'nperpcap', 'claimed', 'claimmode', 'claimmode_txt', 'claim2', 'claimmode2', 'claimmode2_txt', 'claim3', 'claimmode3', 'claimmode3_txt', 'compclaim', 'weaptype1', 'weaptype1_txt', 'weapsubtype1', 'weapsubtype1_txt', 'weaptype2', 'weaptype2_txt', 'weapsubtype2', 'weapsubtype2_txt', 'weaptype3', 'weaptype3_txt', 'weapsubtype3', 'weapsubtype3_txt', 'weaptype4', 'weaptype4_txt', 'weapsubtype4', 'weapsubtype4_txt', 'weapdetail', 'nkill', 'nkillus', 'nkillter', 'nwound', 'nwoundus', 'nwoundte', 'property', 'propextent', 'propextent_txt', 'propvalue', 'propcomment', 'ishostkid', 'nhostkid', 'nhostkidus', 'nhours', 'ndays', 'divert', 'kidhijcountry', 'ransom', 'ransomamt', 'ransomamtus', 'ransompaid', 'ransompaidus', 'ransomnote', 'hostkidoutcome', 'hostkidoutcome_txt', 'nreleased', 'addnotes', 'scite1', 'scite2', 'scite3', 'dbsource', 'INT_LOG', 'INT_IDEO', 'INT_MISC', 'INT_ANY', 'related']]
data
```

Out[6]:

	iyear	imonth	iday	country_txt	region_txt	provstate	city	latitude	longit
--	-------	--------	------	-------------	------------	-----------	------	----------	--------

0	1970	7	2	Dominican Republic	Central America & Caribbean	NaN	Santo Domingo	18.456792	-69.951
1	1970	0	0	Mexico	North America	Federal	Mexico city	19.371887	-99.086
2	1970	1	0	Philippines	Southeast Asia	Tarlac	Unknown	15.478598	120.599
3	1970	1	0	Greece	Western Europe	Attica	Athens	37.997490	23.762
4	1970	1	0	Japan	East Asia	Fukouka	Fukouka	33.580412	130.396
...	...	...	...	...	...	...	...	...	...
181686	2017	12	31	Somalia	Sub-Saharan Africa	Middle Shebelle	Ceelka Geelow	2.359673	45.385
181687	2017	12	31	Syria	Middle East & North Africa	Lattakia	Jableh	35.407278	35.942
181688	2017	12	31	Philippines	Southeast Asia	Maguindanao	Kubentog	6.900742	124.437
181689	2017	12	31	India	South Asia	Manipur	Imphal	24.798346	93.940
181690	2017	12	31	Philippines	Southeast Asia	Maguindanao	Cotabato City	7.209594	124.241

181691 rows × 21 columns



```
In [7]: data.shape
Out[7]: (181691, 21)

In [8]: data.isnull().sum()
```

```
Out[8]: iyear          0
        imonth       0
        iday         0
        country_txt   0
        region_txt    0
        provstate     421
        city          434
        latitude      4556
        longitude     4557
        attacktype1_txt 0
        nkill         10313
        nwound        16311
        targtype1_txt  0
        summary       66129
        suicide        0
        targsubtype1_txt 10373
        natlty1_txt    1559
        gname          0
        weaptype1_txt  0
        weapsubtype1_txt 20768
        dbsource       0
        dtype: int64
```

```
In [7]: df["region_txt"].nunique()
```

```
Out[7]: 12
```

```
In [10]: df.country_txt.nunique()
```

```
Out[10]: 205
```

Here It should be noted that there are only 195 contries that have been registered in the United Nations. So there might by some error in the country data.

```
In [11]: data['nwound']=data['nwound'].fillna(0)
        data['nkill']=data['nkill'].fillna(0)
```

```
In [12]: casualties = data.nkill + data.nwound
        casualties
```

```
Out[12]: 0          1.0
        1          0.0
        2          1.0
        3          0.0
        4          0.0
        ...
        181686     3.0
        181687     9.0
        181688     0.0
        181689     0.0
        181690     0.0
        Length: 181691, dtype: float64
```

```
In [13]: data.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 181691 entries, 0 to 181690
Data columns (total 21 columns):
#   Column                Non-Null Count  Dtype
---  -
0   iyear                  181691 non-null int64
1   imonth                 181691 non-null int64
2   iday                   181691 non-null int64
3   country_txt            181691 non-null object
4   region_txt             181691 non-null object
5   provstate              181270 non-null object
6   city                   181257 non-null object
7   latitude                177135 non-null float64
8   longitude               177134 non-null float64
9   attacktype1_txt        181691 non-null object
10  nkill                   181691 non-null float64
11  nwound                  181691 non-null float64
12  targtype1_txt          181691 non-null object
13  summary                 115562 non-null object
14  suicide                 181691 non-null int64
15  targsubtype1_txt       171318 non-null object
16  natlty1_txt             180132 non-null object
17  gname                   181691 non-null object
18  weaptype1_txt           181691 non-null object
19  weapsubtype1_txt        160923 non-null object
20  dbsource                181691 non-null object
dtypes: float64(4), int64(4), object(13)
memory usage: 29.1+ MB
```

In [14]: `data.describe()`

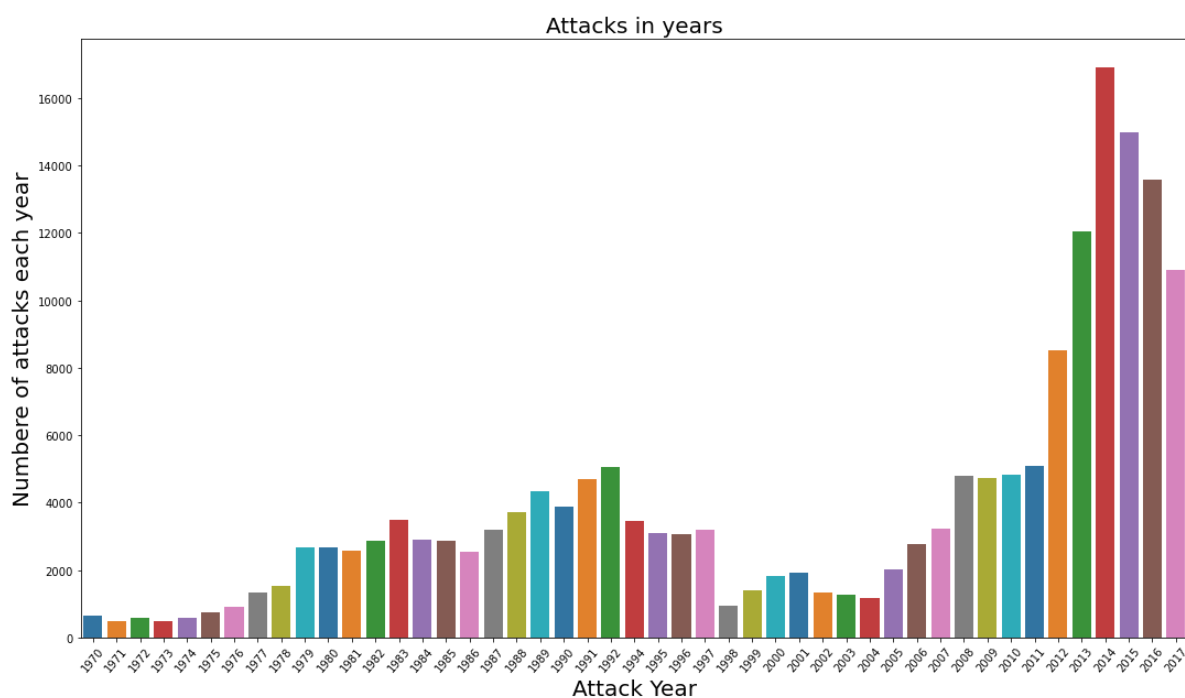
Out[14]:

	iyear	imonth	iday	latitude	longitude	nkill
<b>count</b>	181691.000000	181691.000000	181691.000000	177135.000000	1.771340e+05	181691.000000
<b>mean</b>	2002.638997	6.467277	15.505644	23.498343	-4.586957e+02	2.266860
<b>std</b>	13.259430	3.388303	8.814045	18.569242	2.047790e+05	11.227057
<b>min</b>	1970.000000	0.000000	0.000000	-53.154613	-8.618590e+07	0.000000
<b>25%</b>	1991.000000	4.000000	8.000000	11.510046	4.545640e+00	0.000000
<b>50%</b>	2009.000000	6.000000	15.000000	31.467463	4.324651e+01	0.000000
<b>75%</b>	2014.000000	9.000000	23.000000	34.685087	6.871033e+01	2.000000
<b>max</b>	2017.000000	12.000000	31.000000	74.633553	1.793667e+02	1570.000000

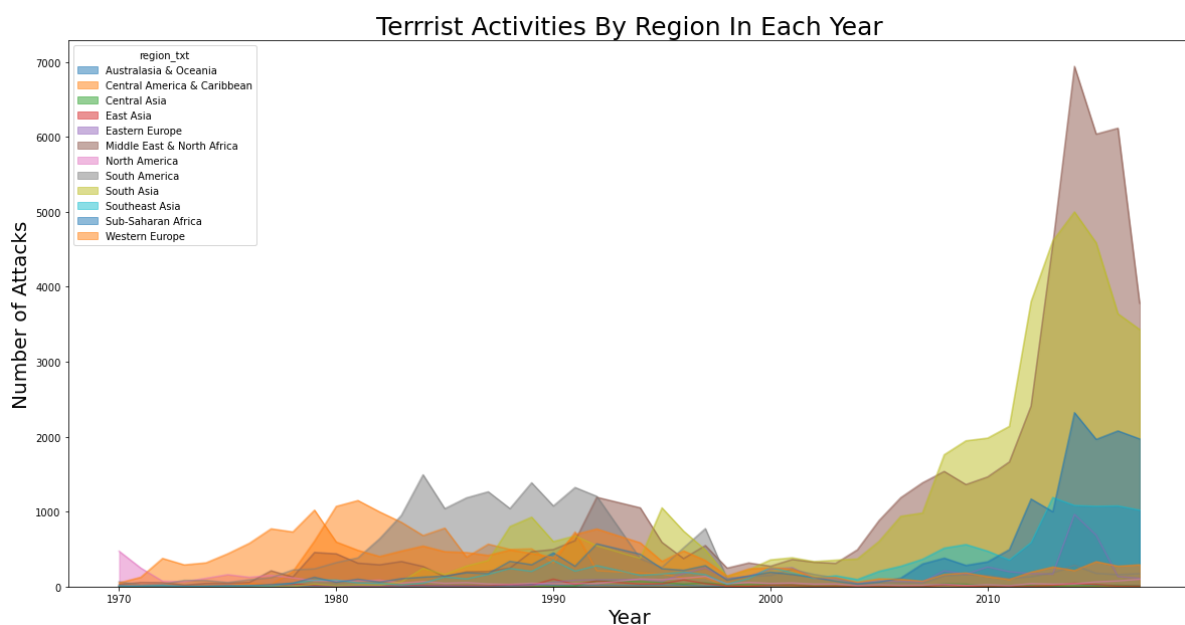
## Data Visualizations using various charts and Graphs

```
In [15]: year=data['iyear'].unique()
years_count=data['iyear'].value_counts(dropna=False).sort_index()
plt.figure(figsize=(18,10))
sns.barplot(x=year,
            y=years_count,
            palette='tab10')
plt.xticks(rotation=50)
plt.xlabel('Attack Year',fontsize=20)
plt.ylabel('Numbere of attacks each year',fontsize=20)
```

```
plt.title('Attacks in years',fontsize=20)
plt.show()
```



```
In [16]: pd.crosstab(data.iyear,data.region_txt).plot(kind='area',stacked=False
                                                    ,figsize=(20,10))
plt.title('Terrrist Activities By Region In Each Year',fontsize=25)
plt.xlabel('Year',fontsize=20)
plt.ylabel('Number of Attacks',fontsize=20)
plt.show()
```



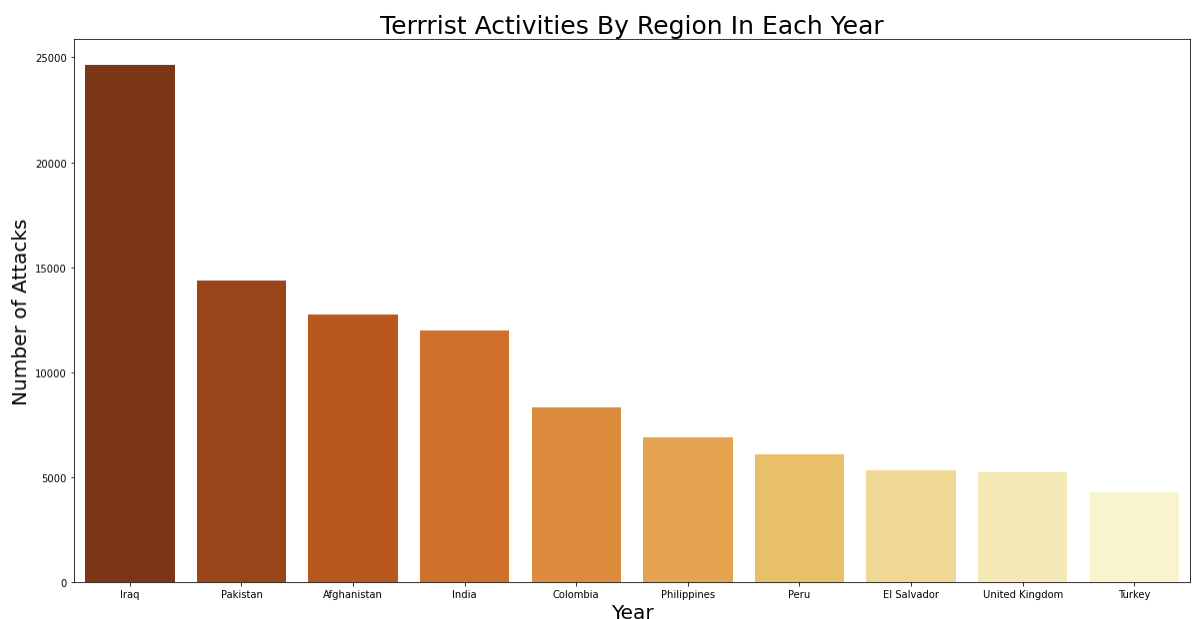
```
In [17]: attack= data.country_txt.value_counts()[:10]
attack
```

```
Out[17]: Iraq                24636
Pakistan            14368
Afghanistan         12731
India               11960
Colombia            8306
Philippines         6908
Peru                6096
El Salvador         5320
United Kingdom      5235
Turkey              4292
Name: country_txt, dtype: int64
```

```
In [18]: data.gname.value_counts()[1:10]
```

```
Out[18]: Taliban                7478
Islamic State of Iraq and the Levant (ISIL)  5613
Shining Path (SL)                4555
Farabundo Marti National Liberation Front (FMLN)  3351
Al-Shabaab                       3288
New People's Army (NPA)          2772
Irish Republican Army (IRA)       2671
Revolutionary Armed Forces of Colombia (FARC)  2487
Boko Haram                       2418
Name: gname, dtype: int64
```

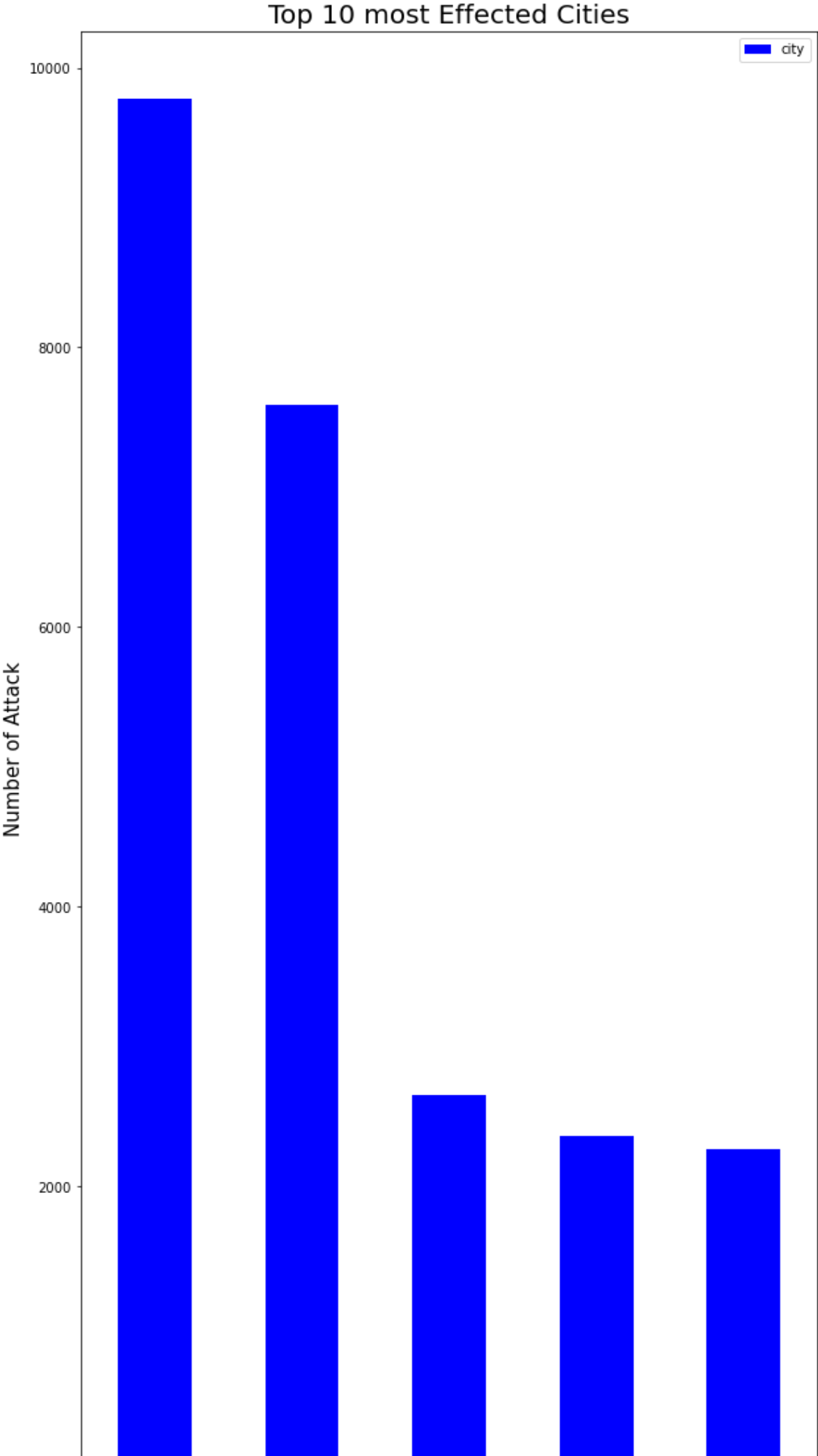
```
In [19]: plt.subplots(figsize=(20,10))
sns.barplot(data['country_txt'].value_counts()[1:10].index,data['country_txt'].value_counts()[1:10].values)
plt.title('Terrrist Activities By Region In Each Year',fontsize=25)
plt.xlabel('Year',fontsize=20)
plt.ylabel('Number of Attacks',fontsize=20)
plt.show()
```

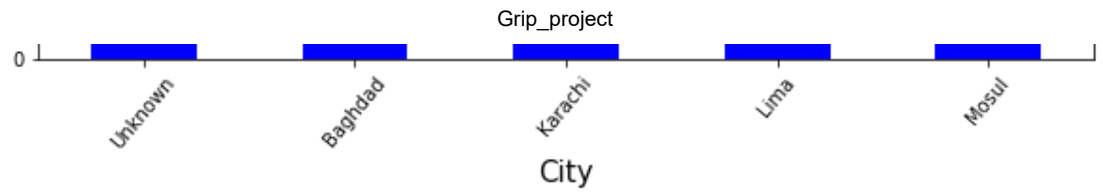


```
In [ ]: df1= data[['iyear','nkill']].groupby(['iyear']).sum()
fig,ax4 = plt.subplots(figsize=(20,10))
df.plot(kind='bar',alpha=0.7,ax=ax4)
plt.xticks(rotation=50)
plt.title('People Died during attack',fontsize=25)
plt.xlabel('Number of killed people',fontsize=20)
plt.ylabel('Year',fontsize=20)
top_side = ax4.spines["top"]
top_side.set_visible(False)
right_side = ax4.spines['right']
right_side.set_visible(False)
```

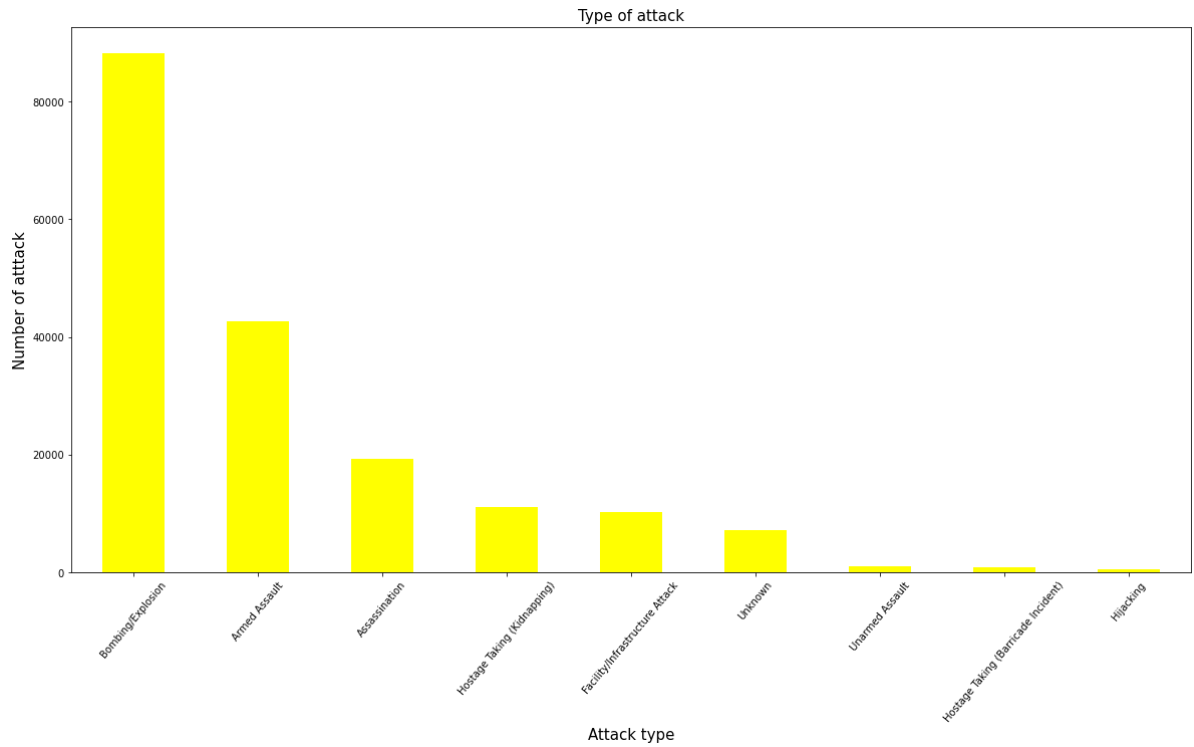


```
In [8]: data.city.value_counts().to_frame().sort_values('city',axis = 0,ascending=False).head(10)
plt.xlabel('City',fontsize=15)
plt.xticks(rotation=50)
plt.ylabel('Number of Attack',fontsize=15)
plt.title('Top 10 most Effectuated Cities',fontsize=20)
plt.show()
```

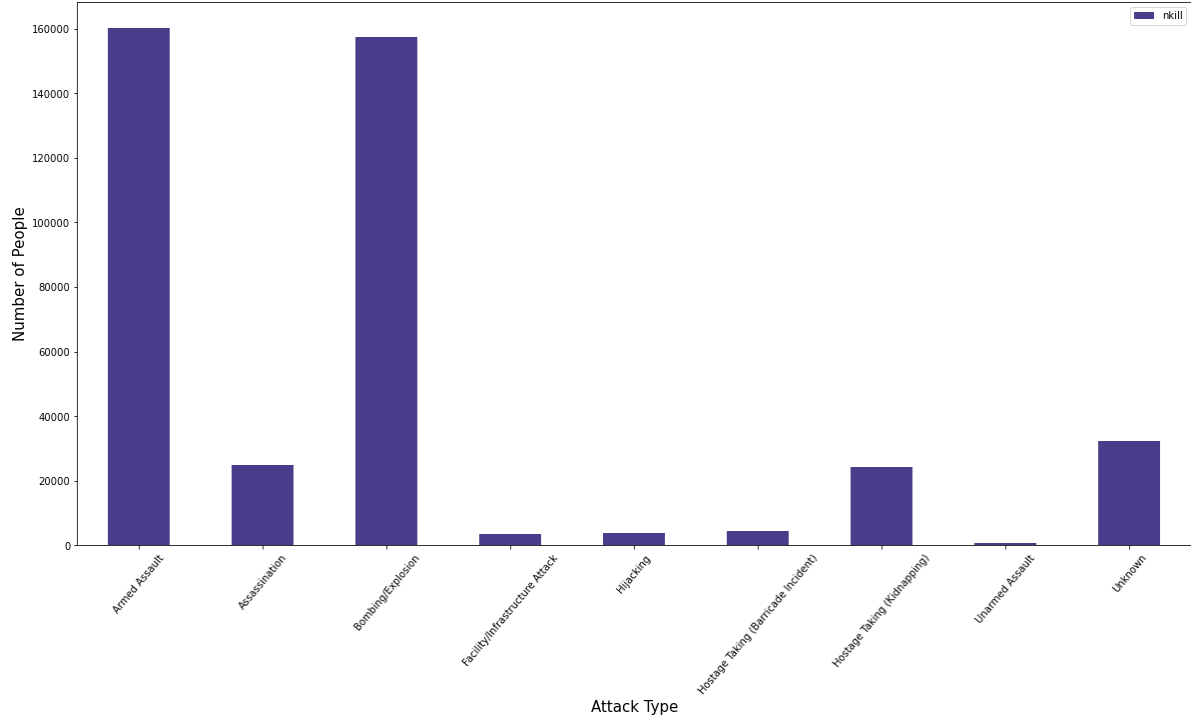




```
In [9]: data.attacktype1_txt.value_counts().plot(kind='bar',figsize=(20,10),color='yellow')
plt.xlabel('Attack type',fontsize=15)
plt.xticks(rotation=50)
plt.ylabel('Number of attack',fontsize=15)
plt.title('Type of attack',fontsize=15)
plt.show()
```

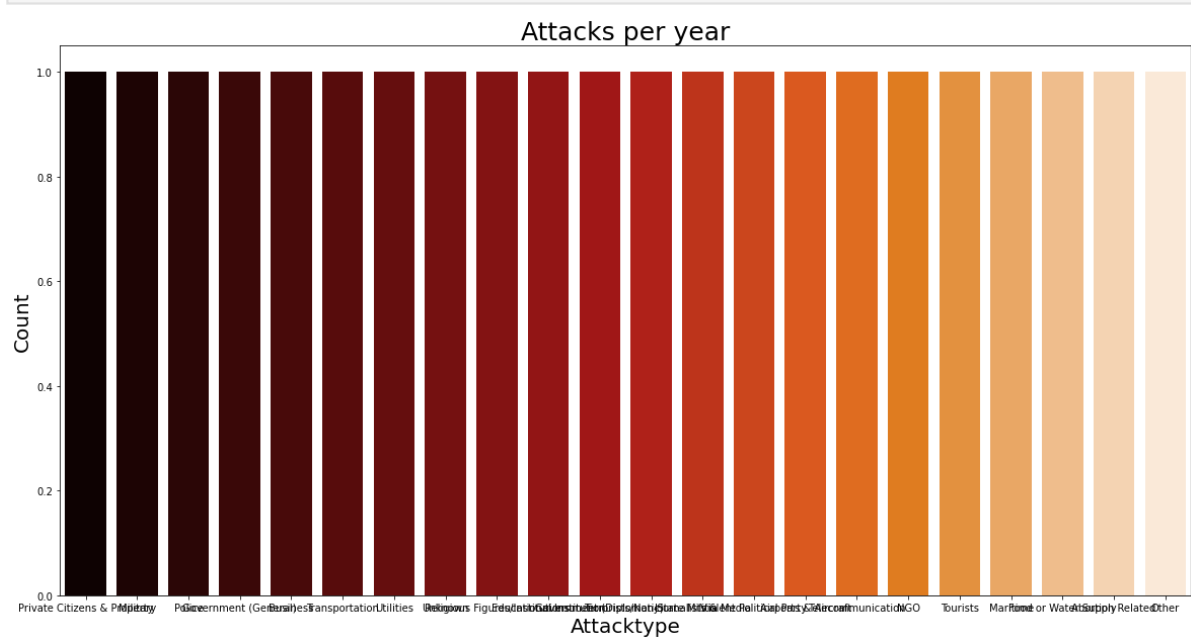


```
In [13]: data[['attacktype1_txt','nkill']].groupby(['attacktype1_txt'],axis=0).sum().plot(kind='bar',figsize=(20,10),color='yellow')
plt.xlabel('Attack Type',fontsize=15)
plt.xticks(rotation=50)
plt.ylabel('Number of People',fontsize=15)
plt.title('Number of Killed',fontsize=20)
plt.show()
```



```
In [ ]: data[['attacktype1_txt', 'nwound']].groupby(['attacktype1_txt'],axis=0).plot(kind='bar')
plt.xlabel('Attack Type',fontsize=15)
plt.xticks(rotation=50)
plt.ylabel('Number of People Wounded',fontsize=15)
plt.title('Number of Wounded',fontsize=20)
plt.show()
```

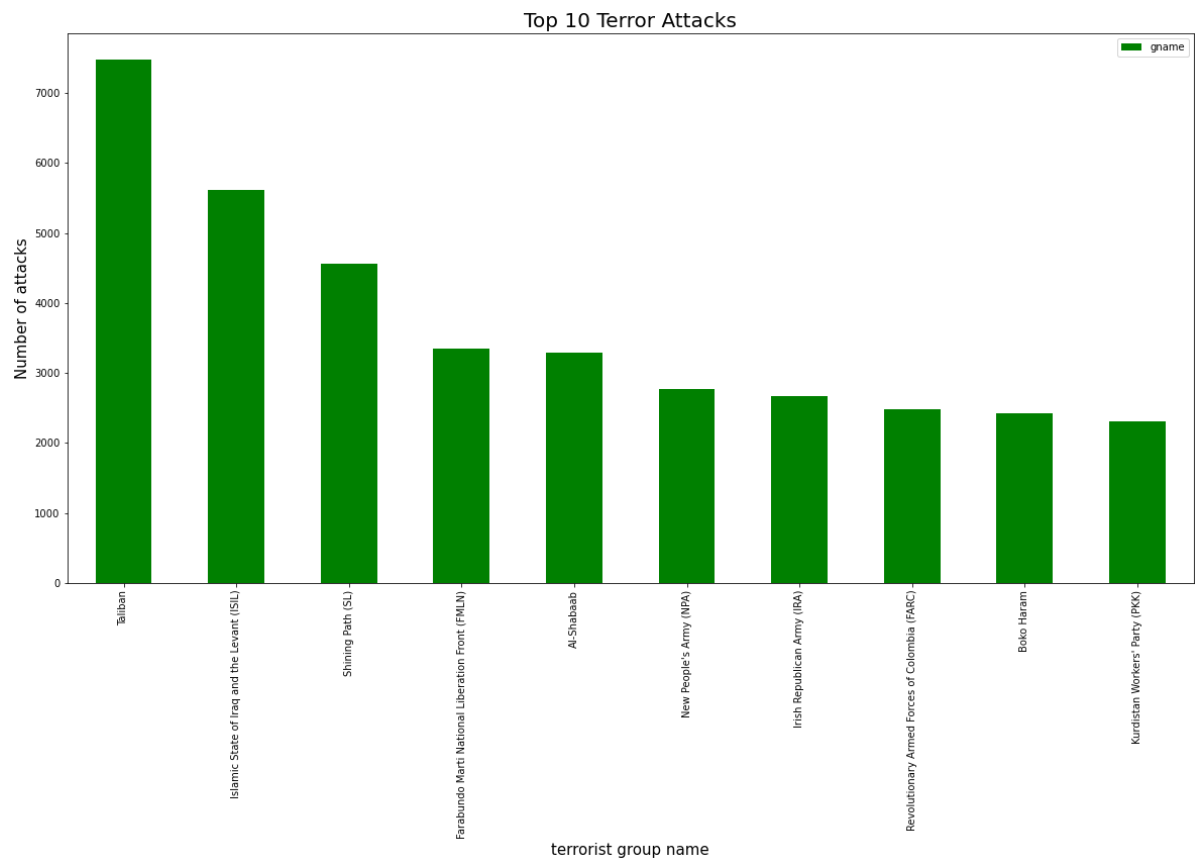
```
In [7]: plt.subplots(figsize=(20,10))
sns.countplot(data['targettype1_txt'].value_counts().index,palette='gist_heat')
plt.title('Attacks per year',fontsize=25)
plt.xlabel('Attacktype',fontsize=20)
plt.ylabel('Count',fontsize=20)
plt.show()
```



Country with the most Attacks:Iraq

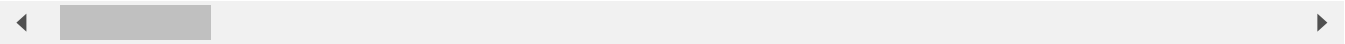
```
In [8]: data.gname.value_counts().to_frame().drop('Unknown').head(10).plot(kind='bar',color='red')
plt.xlabel('terrorist group name',fontsize=15)
```

```
plt.ylabel('Number of attacks',fontsize=15)
plt.title('Top 10 Terror Attacks',fontsize=20)
plt.show()
```



```
In [9]: df2=data[['gname','country_txt','nkill']]
df=df.groupby(['gname','country_txt'],axis=0).sum().sort_values('nkill',ascending=True)
df
```

	gname	country_txt	eventid	iyear	imonth	iday	extended	country	region	latitude
1	Islamic State of Iraq and the Levant (ISIL)	Iraq	9.668001e+14	9667687	31408	76074	325	455715	47970	165025.991200
2	Taliban	Afghanistan	1.494438e+15	14943888	49482	117122	683	29692	44538	250969.882708
3	Boko Haram	Nigeria	4.203335e+14	4203203	13202	33374	143	306789	22957	23771.586275
4	Shining Path (SL)	Peru	9.025177e+14	9024885	29154	70421	32	722019	13623	-51556.667335
5	Liberation Tigers of Tamil Eelam (LTTE)	Sri Lanka	3.187303e+14	3187199	10154	24656	16	296856	9576	12841.009096
6	Al-Shabaab	Somalia	5.775416e+14	5775226	18970	44999	191	521794	31537	7720.968002
7	Farabundo Marti National Liberation Front (FMLN)	El Salvador	6.613985e+14	6613775	20983	49414	14	203130	6660	40761.351577
8	Islamic State of Iraq and the Levant (ISIL)	Syria	1.197167e+14	1197127	3918	9938	105	118800	5940	20802.549564
9	Nicaraguan Democratic Force (FDN)	Nicaragua	1.758443e+14	1758386	5730	12427	2	128470	1772	8697.532230
10	Tehrik-i-Taliban Pakistan (TTP)	Pakistan	2.686405e+14	2686321	8368	20704	126	204255	8010	43572.555983



In [10]:

```
kill=data.loc[:, 'nkill']
print('Number of people killed by terror attack: ',int(sum(kill.dropna())))
```

Number of people killed by terror attack: 411868

In [11]:

```
typekill=data.pivot_table(columns='attacktype1_txt',values='nkill',aggfunc='sum')
typekill
```

Out[11]:

	attacktype1_txt	Armed Assault	Assassination	Bombing/Explosion	Facility/Infrastructure Attack	Hijacking	(B&In
	nkill	160297.0	24920.0	157321.0	3642.0	3718.0	



```
In [12]: countrykill=data.pivot_table(columns='country_txt',values='nkill',aggfunc='sum')
countrykill
```

Out[12]:

country_txt	Afghanistan	Albania	Algeria	Andorra	Angola	Antigua and Barbuda	Argentina	Armenia	Aus
nkill	39384.0	42.0	11066.0	0.0	3043.0	0.0	490.0	37.0	

## Conclusion and Results:

City with the most attacks: Baghdad

Region with the most attacks: Middle East & North Africa

Year with the most attacks: Middle East & North Africa

Month with the most attacks: 5

Most Dangerous Attacking Group : Taliban

Most Frequent Used Attack Types : Bombing/Explosions

Thank You!