

```
In [1]: # section 1 importing Libs:

import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import os

# my style:
sns.set(style= "whitegrid")
```

```
In [2]: from plotly import __version__
import cufflinks as cf

from plotly.offline import download_plotlyjs, init_notebook_mode, plot, iplot
init_notebook_mode(connected=True)

cf.go_offline()
```

```
In [3]: df = pd.read_csv("911.csv")
```

2. Exploring Data set:

```
In [4]: # head of DEFAULT data frame:
df.head(2)
```

```
Out[4]:
```

	lat	lng	desc	zip	title	timeStamp	twp	addr	e
0	40.297876	-75.581294	REINDEER CT & DEAD END; NEW HANOVER Station ...	19525.0	EMS: BACK PAINS/INJURY	2015-12-10 17:10:52	NEW HANOVER	REINDEER CT & DEAD END	1
1	40.258061	-75.264680	BRIAR PATH & WHITEMARSH LN; HATFIELD TOWNSHIP...	19446.0	EMS: DIABETIC EMERGENCY	2015-12-10 17:29:21	HATFIELD TOWNSHIP	BRIAR PATH & WHITEMARSH LN	1

```
In [5]: # all unique enteries in respective columns:
df.nunique()
```

```
Out[5]: lat          20843
lng          20864
desc        326362
zip          138
title        133
timeStamp   315575
twp           68
addr        33219
e              1
dtype: int64
```

```
In [6]: #dropping non usefull columns or dummy cols:
del df["e"]
```

```
In [7]: # information about the DEFAULT data frame:
df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 326425 entries, 0 to 326424
Data columns (total 8 columns):
 lat          326425 non-null float64
 lng          326425 non-null float64
 desc        326425 non-null object
 zip          286835 non-null float64
 title        326425 non-null object
 timeStamp    326425 non-null object
 twp          326310 non-null object
 addr         326425 non-null object
dtypes: float64(3), object(5)
memory usage: 19.9+ MB
```

```
In [8]: # as we can see timeStamp column is an object not a date time type:
# coverting:

df["timeStamp"] = pd.to_datetime(df["timeStamp"])

df["timeStamp"].loc[0]
```

```
Out[8]: Timestamp('2015-12-10 17:10:52')
```

3 Creating New Features and Columns for data analysis:

Creating columns like year, month, date etc on the basis of timeStamp column:

```
In [9]: df["reason category"] = df["title"].apply(lambda x: x.split(":")[0])

# The 3 category of reasons for calls.
df["reason category"].value_counts()
```

```
Out[9]: EMS          161441
Traffic    116065
Fire        48919
Name: reason category, dtype: int64
```

```
In [10]: p = df["timeStamp"].loc[0]
print(p)
print(p.year)
print(p.month)
print(p.date())
print(p.dayofweek)
print(p.time())

2015-12-10 17:10:52
2015
12
2015-12-10
3
17:10:52
```

```
In [11]: # adding new date time columns:

df["year"] = df["timeStamp"].apply(lambda x: x.year)

df["month"] = df["timeStamp"].apply(lambda x: x.month)

df["date"] = df["timeStamp"].apply(lambda x: x.date())

df["day of week"] = df["timeStamp"].apply(lambda x : x.dayofweek)

df["time"] = df["timeStamp"].apply(lambda x : x.time())
```

```
In [12]: # Mapping day of week (numeric) column into categorical:
dow = {0:"Mon", 1:"Tues", 2:"Wed", 3:"Thurs", 4:"Fri", 5:"Sat", 6:"Sun" }

df["Day of Week"] = df["day of week"].map(dow)

In [13]: # Creating a column of the basis of sunlight
df["day/night"] = df["timeStamp"].apply(lambda x : "night" if int(x.strftime("%H")) > 19 else "day")
```

4 Basic Q/A section:

```
In [14]: # Top 5 zipcode for 911 calls?
df["zip"].value_counts().head(5)

Out[14]: 19401.0    22136
19464.0    21588
19403.0    16488
19446.0    15793
19406.0    10800
Name: zip, dtype: int64

In [15]: # Top 5 reason for 911 calls:
df["title"].value_counts().head(5)

Out[15]: Traffic: VEHICLE ACCIDENT -    76179
Traffic: DISABLED VEHICLE -    23957
Fire: FIRE ALARM    18436
EMS: RESPIRATORY EMERGENCY    16602
EMS: FALL VICTIM    16438
Name: title, dtype: int64

In [16]: # Top 5 township from where calls were recieved:
df["twp"].value_counts().head(5)

Out[16]: LOWER MERION    28073
ABINGTON    20206
NORRISTOWN    18433
UPPER MERION    17276
CHELTENHAM    15026
Name: twp, dtype: int64

In [17]: # Top 10 dates of receiving the maximum in calls in all the years:
df["date"].value_counts().head(10)

Out[17]: 2018-03-02    2187
2018-03-07    920
2018-03-03    917
2016-01-23    887
2016-02-24    673
2017-12-15    667
2016-01-24    657
2017-06-21    654
2018-01-05    612
2018-01-12    608
Name: date, dtype: int64

In [18]: # Most busy year with total number of calls recieved:
df["year"].value_counts().head(1)

Out[18]: 2016    142360
Name: year, dtype: int64
```

5 Data Visualizing and Analysing

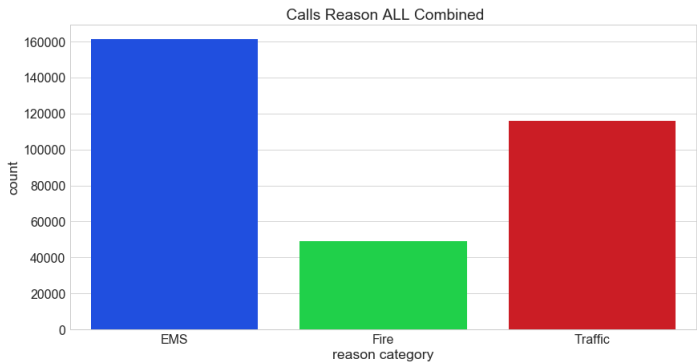
```
In [19]: # New customized Data Frame with additional features and columns:
df.head(1)

Out[19]:
```

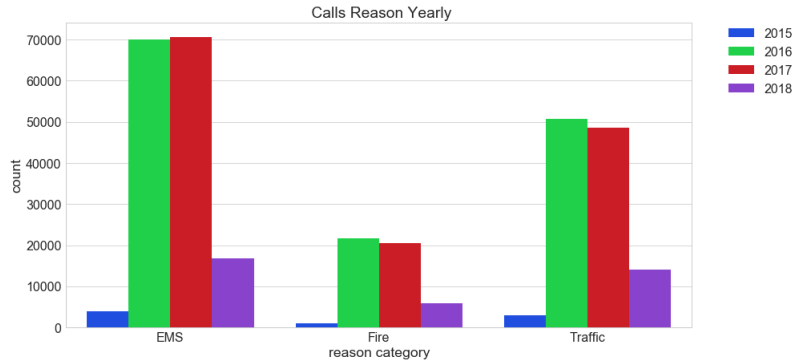
	lat	lng	desc	zip	title	timeStamp	twp	addr	reason	category	year	month	date	day of week	time	Day of Week	day/night
0	40.297876	-75.581294	REINDEER CT & DEAD END; NEW HANOVER; Station ...	19525.0	EMS: BACK PAINS/INJURY	2015-12-10 17:10:52	NEW HANOVER	REINDEER CT & DEAD END	EMS		2015	12	2015-12-10	3	17:10:52	Thurs	day

```
In [20]: # Plot for Category of reasons:

plt.figure(figsize=(14,7))
sns.set_context("paper", font_scale = 2)
sns.countplot(x= "reason category", data= df, palette="bright")
plt.title(" Calls Reason ALL Combined")
plt.show()
```



```
In [21]: plt.figure(figsize=(14,7))
sns.set_context("paper", font_scale = 2)
sns.countplot(x= "reason category", data= df, palette="bright" ,hue= "year")
plt.title(" Calls Reason Yearly")
plt.legend(bbox_to_anchor=(1.05, 1), loc=2, borderaxespad=0.)
plt.show()
```



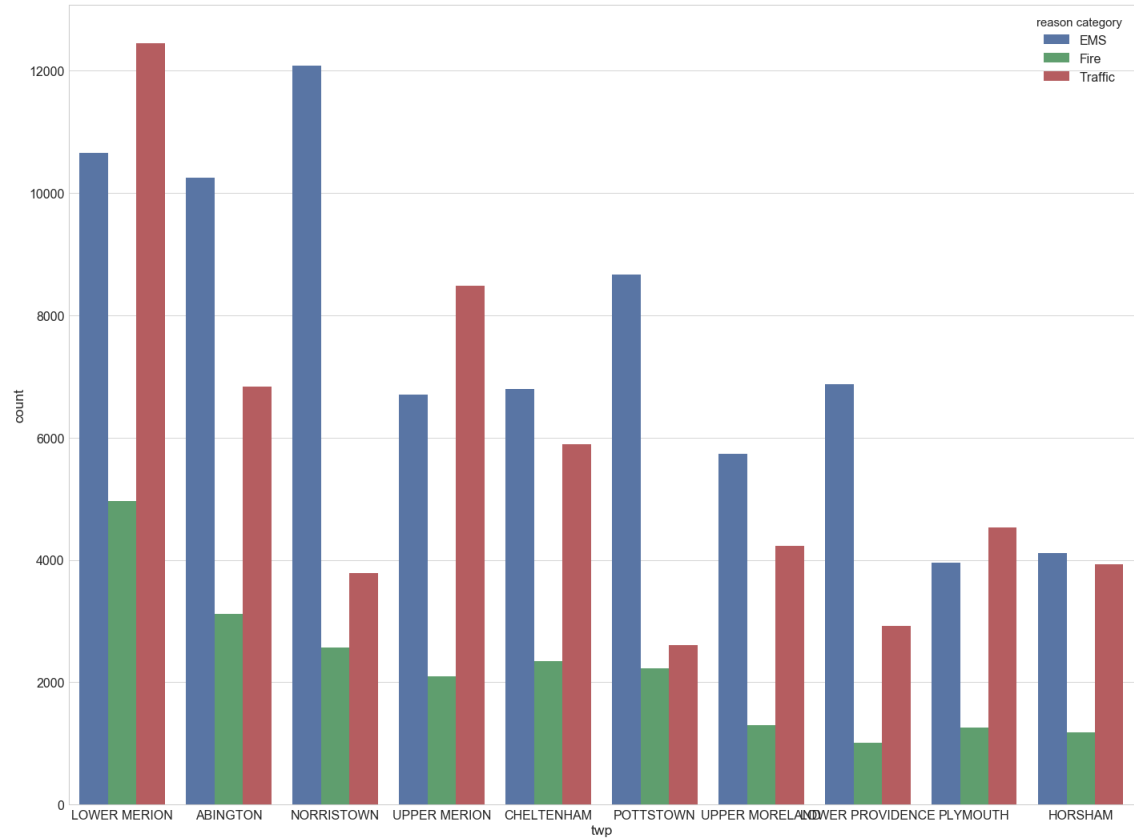
```
In [22]: df[df["twp"]=="LOWER MERION"]["title"].value_counts()
```

```
Out[22]: Traffic: VEHICLE ACCIDENT -          7745
Traffic: DISABLED VEHICLE -          2589
Fire: FIRE ALARM -          2475
Traffic: ROAD OBSTRUCTION -          1455
EMS: VEHICLE ACCIDENT -          1267
EMS: FALL VICTIM -          1053
EMS: RESPIRATORY EMERGENCY -          942
EMS: CARDIAC EMERGENCY -          894
EMS: HEAD INJURY -          679
EMS: SUBJECT IN PAIN -          576
Traffic: HAZARDOUS ROAD CONDITIONS -          492
EMS: MEDICAL ALERT ALARM -          483
Fire: VEHICLE ACCIDENT -          455
EMS: UNKNOWN MEDICAL EMERGENCY -          448
Fire: FIRE INVESTIGATION -          446
EMS: SYNCOPAL EPISODE -          438
Fire: GAS-ODOR/LEAK -          339
EMS: GENERAL WEAKNESS -          323
Fire: CARBON MONOXIDE DETECTOR -          302
EMS: UNCONSCIOUS SUBJECT -          290
EMS: CVA/STROKE -          275
EMS: SEIZURES -          275
EMS: ABDOMINAL PAINS -          272
EMS: HEMORRHAGING -          272
EMS: ALTERED MENTAL STATUS -          250
EMS: OVERDOSE -          212
EMS: NAUSEA/VOMITING -          203
Fire: BUILDING FIRE -          181
EMS: DIZZINESS -          167
Fire: VEHICLE FIRE -          156
...
Fire: DEBRIS/FLUIDS ON HIGHWAY -          6
Fire: CARDIAC ARREST -          6
Fire: BURN VICTIM -          5
Fire: TRANSFERRED CALL -          4
Fire: RESCUE - WATER -          4
EMS: RESCUE - ELEVATOR -          3
EMS: STABBING -          3
EMS: RESCUE - WATER -          3
EMS: HAZARDOUS MATERIALS INCIDENT -          2
Fire: RESCUE - TECHNICAL -          2
EMS: APPLIANCE FIRE -          2
EMS: FIRE SPECIAL SERVICE -          2
EMS: RESCUE - TECHNICAL -          2
Fire: HAZARDOUS MATERIALS INCIDENT -          2
EMS: FIRE INVESTIGATION -          2
EMS: AMPUTATION -          2
Fire: EMS SPECIAL SERVICE -          1
Fire: POLICE INFORMATION -          1
EMS: TRAIN CRASH -          1
Fire: TRAIN CRASH -          1
EMS: SHOOTING -          1
EMS: FIRE ALARM -          1
EMS: BOMB DEVICE FOUND -          1
EMS: ELECTROCUTION -          1
EMS: ELECTRICAL FIRE OUTSIDE -          1
EMS: UNKNOWN TYPE FIRE -          1
EMS: DROWNING -          1
Fire: CARDIAC EMERGENCY -          1
Fire: S/B AT HELICOPTER LANDING -          1
Fire: PUMP DETAIL -          1
Name: title, Length: 95, dtype: int64
```

```
In [23]: '''plt.figure(figsize=(20,15))
sns.countplot(x= df["twp"]=="LOWER MERION", data=df, order = df["title"].value_counts().index[:10],
             hue = "reason category")
plt.tight_layout()'''
```

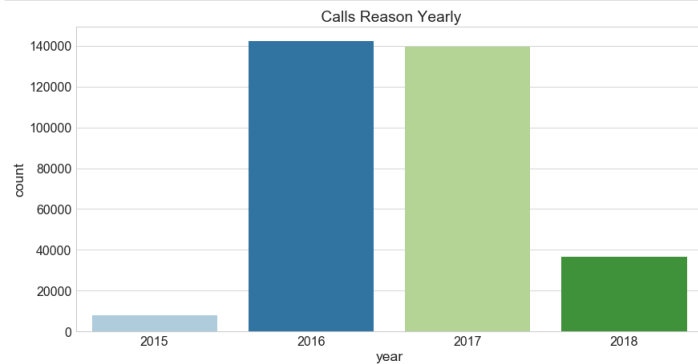
```
Out[23]: 'plt.figure(figsize=(20,15))\nsns.countplot(x= df["twp"]=="LOWER MERION", data=df, order = df["title"].value_counts().index[:10],\n             hue = "reason category")\nplt.tight_layout()'
```

```
In [24]: plt.figure(figsize=(20,15))
sns.countplot(x='twp', data=df, order= df['twp'].value_counts().index[:10],
             hue = "reason category")
plt.tight_layout()
```

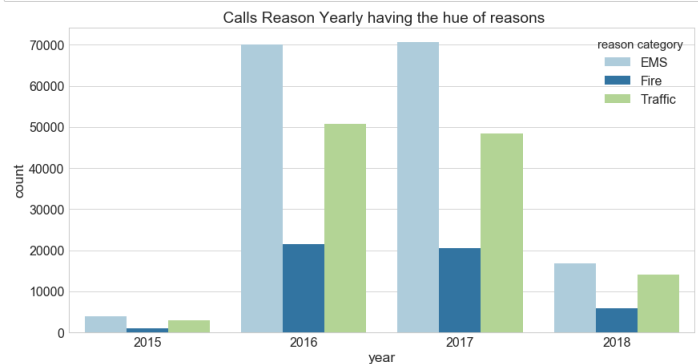


```
In [ ]:
```

```
In [25]: # Plot for calls recieved yearly:
plt.figure(figsize=(14,7))
sns.set_context("paper", font_scale = 2)
sns.countplot(x= "year", data= df, palette="Paired")
plt.title(" Calls Reason Yearly")
plt.show()
```



```
In [26]: plt.figure(figsize=(14,7))
sns.set_context("paper", font_scale = 2)
sns.countplot(x= "year", data= df, palette="Paired", hue = "reason category")
plt.title(" Calls Reason Yearly having the hue of reasons")
plt.show()
```

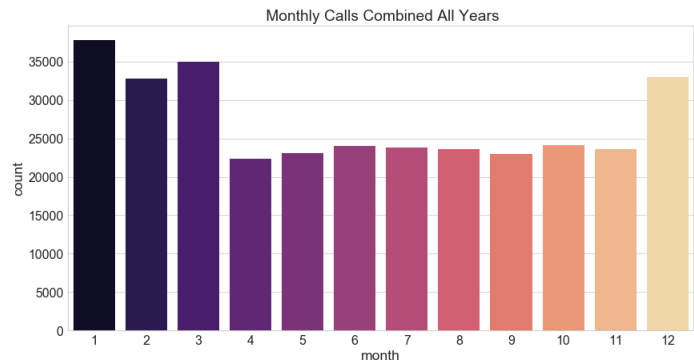


```
In [ ]:
```

```
In [27]: # Plot for calls recieved monthly combined of all years:
plt.figure(figsize=(14,7))

sns.set_context("paper", font_scale = 2)
sns.countplot(x= "month", data= df, palette="magma")

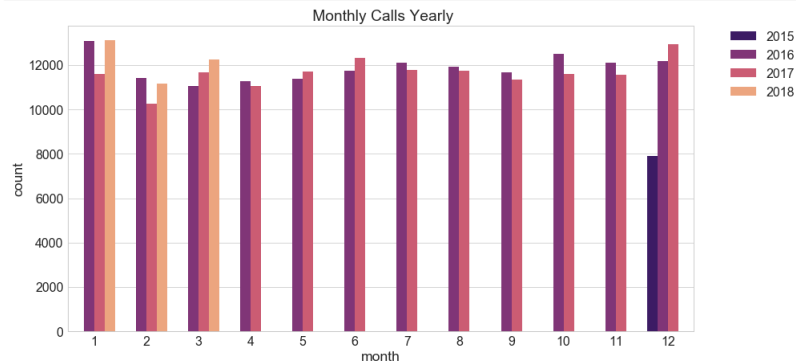
plt.title(" Monthly Calls Combined All Years")
plt.show()
```



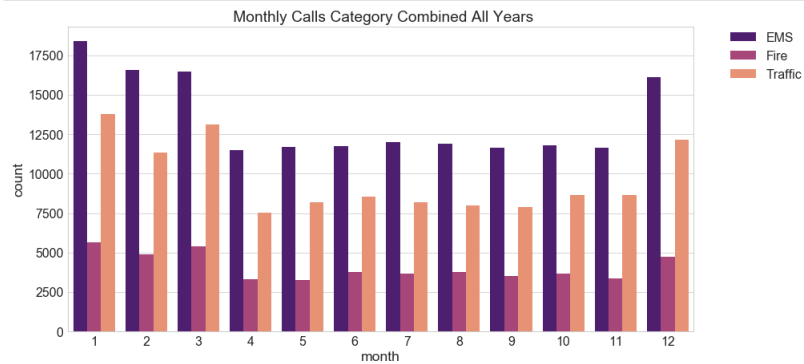
```
In [28]: plt.figure(figsize = (14,7))

sns.set_context("paper", font_scale=2)
sns.countplot(data= df, x= "month", hue= "year", palette="magma")

plt.title(" Monthly Calls Yearly")
plt.legend(bbox_to_anchor=(1.05, 1), loc=2, borderaxespad=0.)
plt.show()
```



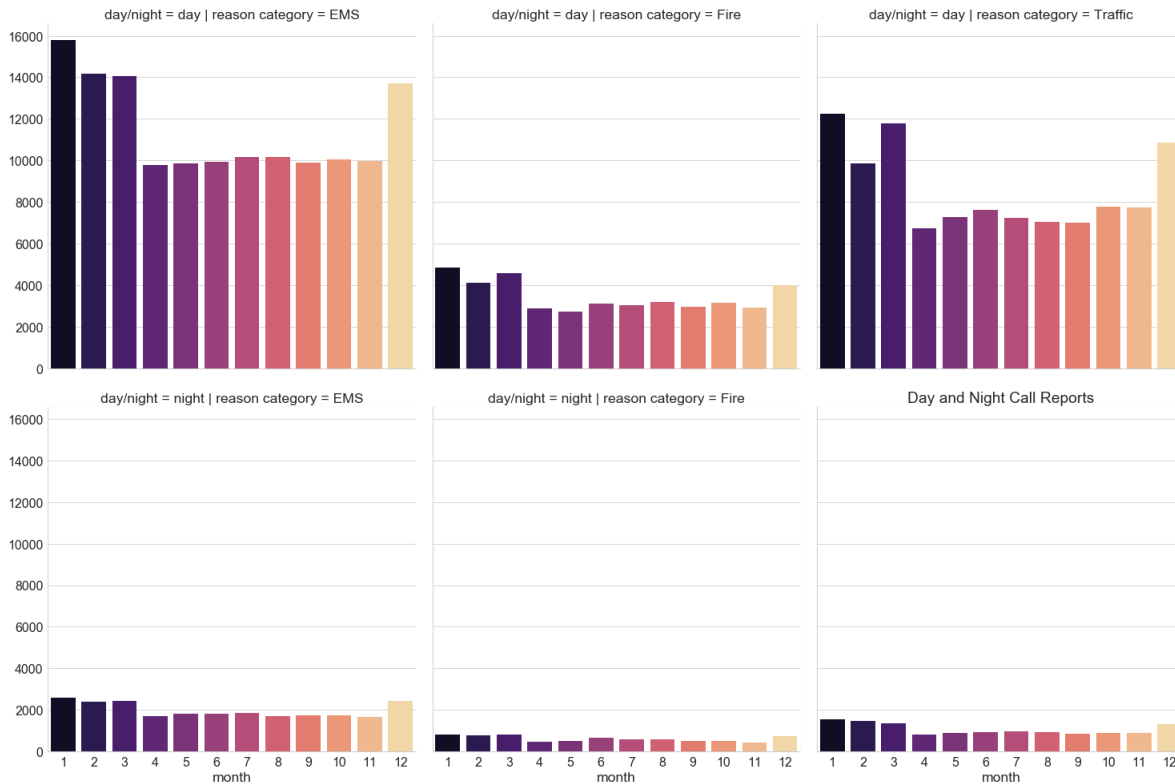
```
In [29]: plt.figure(figsize=(14,7))
sns.set_context("paper", font_scale = 2)
sns.countplot(x= "month", data= df, palette="magma", hue= "reason category")
plt.title(" Monthly Calls Category Combined All Years")
plt.legend(bbox_to_anchor=(1.05, 1), loc=2, borderaxespad=0.)
plt.show()
```



```
In [30]: # Day and Night Call Reports
g = sns.FacetGrid(df, row="day/night", col="reason category", size=7)
g.map(sns.countplot, "month", palette="magma")
plt.title("Day and Night Call Reports")
```

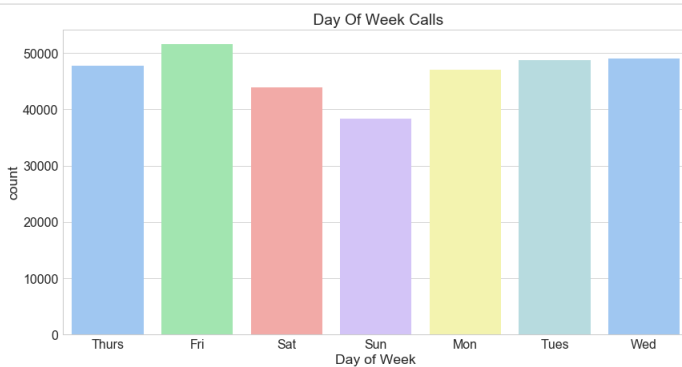
/Users/keshavrastogi/anaconda3/lib/python3.6/site-packages/seaborn/axisgrid.py:703: UserWarning:
Using the countplot function without specifying 'order' is likely to produce an incorrect plot.

```
Out[30]: Text(0.5,1,'Day and Night Call Reports')
```

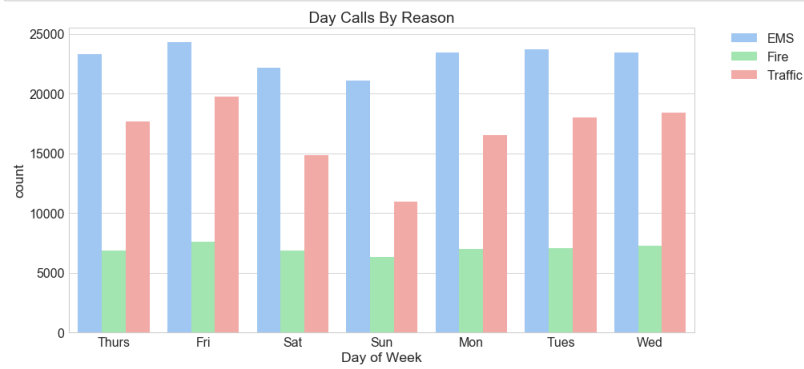


```
In [ ]:
```

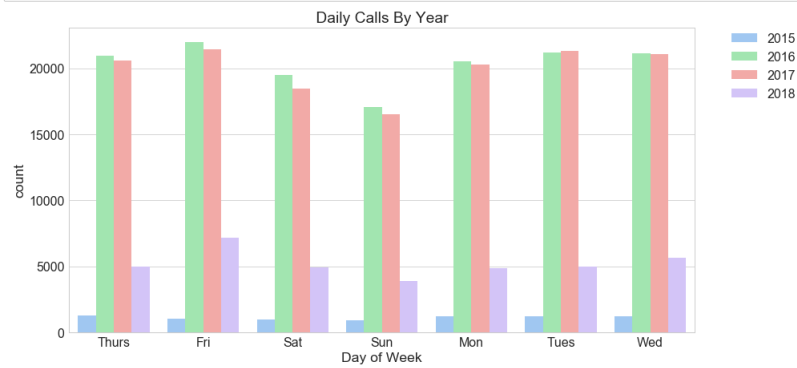
```
In [31]: # Calls report Daily:
plt.figure(figsize=(14,7))
sns.set_context("paper", font_scale=2)
sns.countplot(x="Day of Week", data=df, palette="pastel")
plt.title("Day Of Week Calls")
plt.show()
```



```
In [32]: plt.figure(figsize=(14,7))
sns.set_context("paper", font_scale = 2)
sns.countplot(x= "Day of Week", data= df, palette="pastel", hue= ("reason category") )
plt.title(" Day Calls By Reason ")
plt.legend(bbox_to_anchor=(1.05, 1), loc=2, borderaxespad=0.)
plt.show()
```



```
In [33]: plt.figure(figsize=(14,7))
sns.set_context("paper", font_scale = 2)
sns.countplot(x= "Day of Week", data= df, palette="pastel", hue= "year" )
plt.title(" Daily Calls By Year ")
plt.legend(bbox_to_anchor=(1.05, 1), loc=2, borderaxespad=0.)
plt.show()
```



```
In [ ] :
```

5 Line Plots on basis of aggregation:
Using interactive plots: Plotly

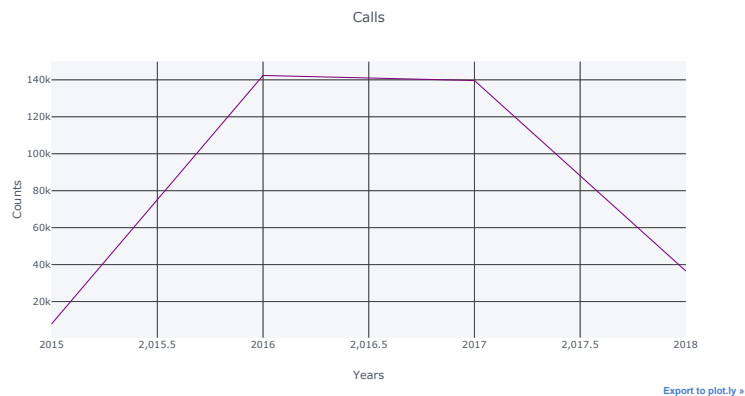
```
In [34]: df.groupby("year").count()
# this will return a df having Years as its index
```

Out[34]:

	lat	lng	desc	zip	title	timeStamp	twp	addr	reason	category	month	date	day of week	time	Day of Week	day/night
year																
2015	7916	7916	7916	6902	7916	7916	7911	7916		7916	7916	7916	7916	7916	7916	7916
2016	142360	142360	142360	124495	142360	142360	142317	142360		142360	142360	142360	142360	142360	142360	142360
2017	139617	139617	139617	123123	139617	139617	139562	139617		139617	139617	139617	139617	139617	139617	139617
2018	36532	36532	36532	32315	36532	36532	36520	36532		36532	36532	36532	36532	36532	36532	36532

```
In [35]: by_year = df.groupby("year").count()
df_year = by_year.reset_index()

df_year.iplot( x= "year", y= "lat", title = " Calls", colors="purple", xTitle="Years",
               yTitle = "Counts")
```



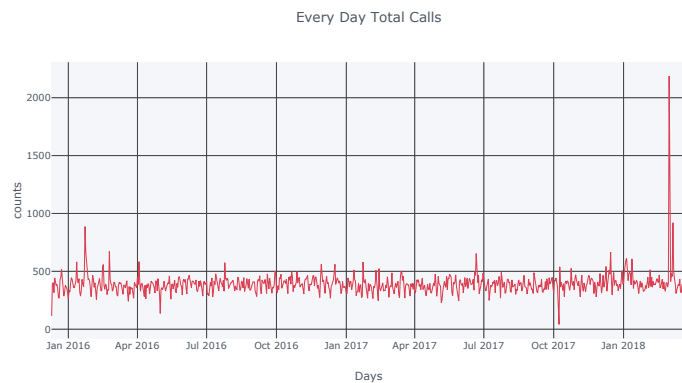
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```
In [36]: by_month= df.groupby("month").count()
# Changing index from months to default index(0:)
df_month= by_month.reset_index()
df_month.plot(x="month", y = "lat", colors= "pink", title="Monthly calls in all years", xTitle="Month",
yTitle = "Counts")
```



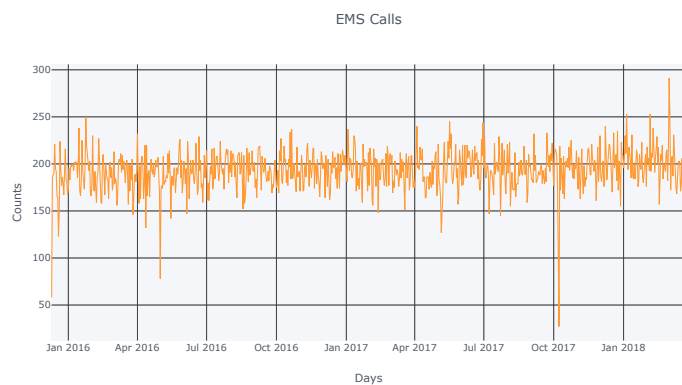
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```
In [37]: date_gr = df.groupby("date").count()
df_date = date_gr.reset_index()
df_date.plot(x= "date", y="lat", size= 6, color= "red", title= "Every Day Total Calls",
xTitle = "Days", yTitle = "counts")
```



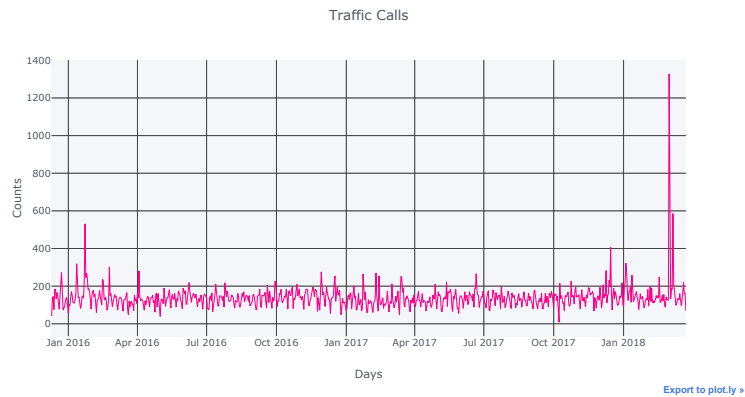
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```
In [38]: ems_gr = df[df["reason category"]=="EMS"].groupby("date").count()
df_ems = ems_gr.reset_index()
df_ems.plot(x= "date", y= "lat", colors= "orange", title="EMS Calls", xTitle="Days",
yTitle = "Counts")
```

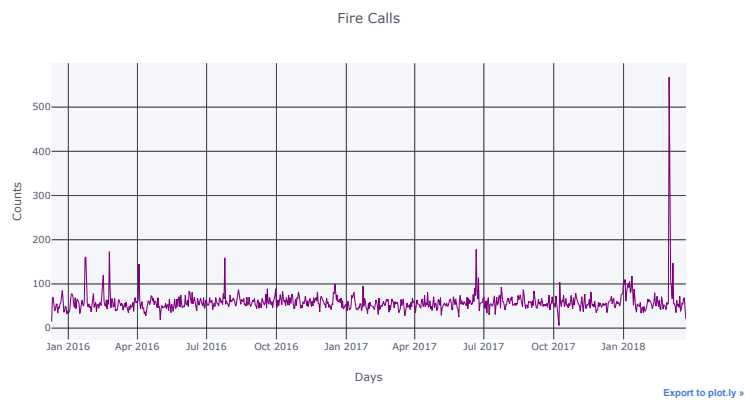


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```
In [39]: tra_gr = df[df["reason category"]=="Traffic"].groupby("date").count()
df_tra = tra_gr.reset_index()
df_tra.plot(x= "date", y= "lat", colors= "pink", title="Traffic Calls", xTitle="Days",
           yTitle = "Counts")
```



```
In [40]: fire_gr = df[df["reason category"]=="Fire"].groupby("date").count()
df_fire = fire_gr.reset_index()
df_fire.plot(x= "date", y= "lat", colors= "purple", title="Fire Calls", xTitle="Days",
            yTitle = "Counts")
```



```
In [ ]:
```

```
In [41]: df["year"].value_counts()
```

```
Out[41]: 2016    142360
         2017    139617
         2018    36532
         2015     7916
         Name: year, dtype: int64
```

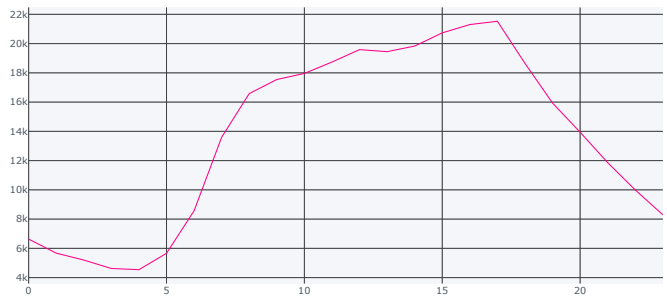
```
In [42]: df["hour"] = df["time"].apply(lambda x: x.hour)
tmap = {0:1, 1:2, 2:3, 3:4, 4:5, 5:6, 6:7, 7:8, 8:9, 9:10, 10:11, 11:12, 12:13, 13:14,
        14:15, 15:16, 16:17, 17:18, 18:19, 19:20, 20:21, 21:22, 22:23, 23:24}
df["hour"] = df["hour"].map(tmap)
print(df["hour"].value_counts())

df["hour"] = df["time"].apply(lambda x: x.hour)
hr_grp = df.groupby("hour").count()
df_time = hr_grp.reset_index()

df_time.plot(x="hour", y="lat", title= "Total number of calls Hourly: In all years :",
            colors = "pink")
```

```
18 21527
17 21302
16 20733
15 19833
13 19508
14 19449
12 18739
19 18650
11 17961
10 17544
9 16584
20 15933
21 13942
8 13595
22 11860
23 9993
7 8568
24 8293
1 6634
2 5672
6 5661
3 5199
4 4623
5 4542
Name: hour, dtype: int64
```

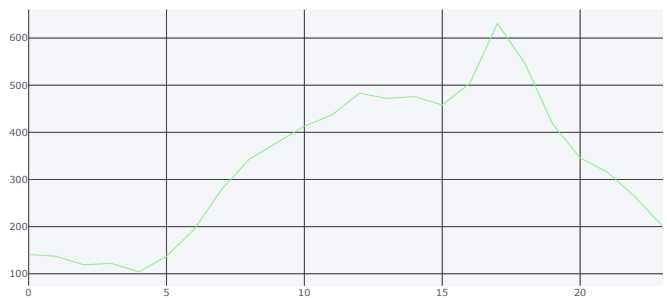
Total number of calls Hourly: In all years :



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```
In [43]: y15_grp = df[df["year"] == 2015].groupby("hour").count()
df_y15 = y15_grp.reset_index()
df_y15.plot(x="hour", y="lat", title= "Total number of calls hourly in Year: 2015",
            colors = "lightgreen")
```

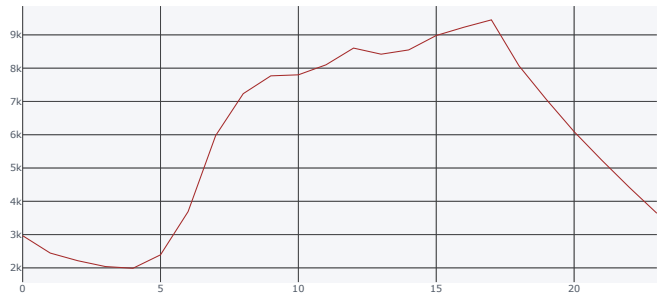
Total number of calls hourly in Year: 2015



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```
In [44]: y16_grp = df[df["year"] == 2016].groupby("hour").count()
df_y16 = y16_grp.reset_index()
df_y16.plot( x="hour", y="lat",title = "Total number of calls hourly in Year: 2016",
            colors = "brown")
```

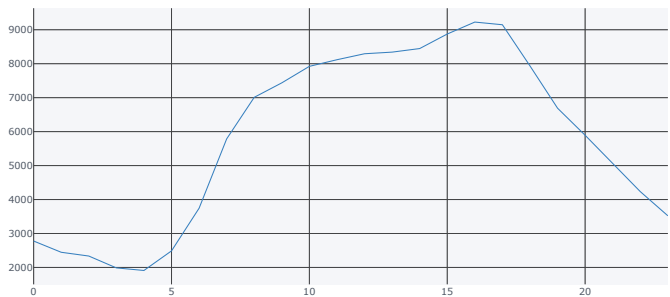
Total number of calls hourly in Year: 2016



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```
In [45]: y17_grp = df[df["year"] == 2017].groupby("hour").count()
df_y17 = y17_grp.reset_index()
df_y17.plot( x="hour", y="lat", title = "Total number of calls hourly in Year: 2017",
            colors = "blue")
```

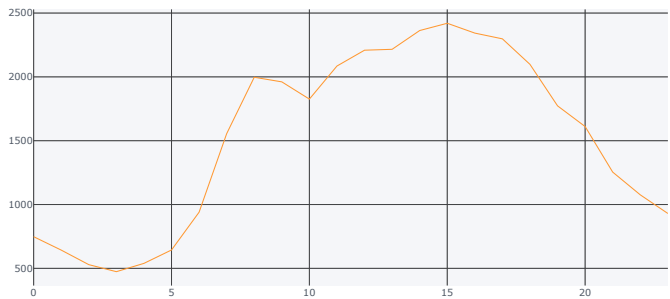
Total number of calls hourly in Year: 2017



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```
In [46]: y18_grp = df[df["year"] == 2018].groupby("hour").count()
df_y18 = y18_grp.reset_index()
df_y18.plot( x="hour", y="lat", title = "Total number of calls hourly in Year: 2018" )
```

Total number of calls hourly in Year: 2018



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In []:

6 Heat Maps:

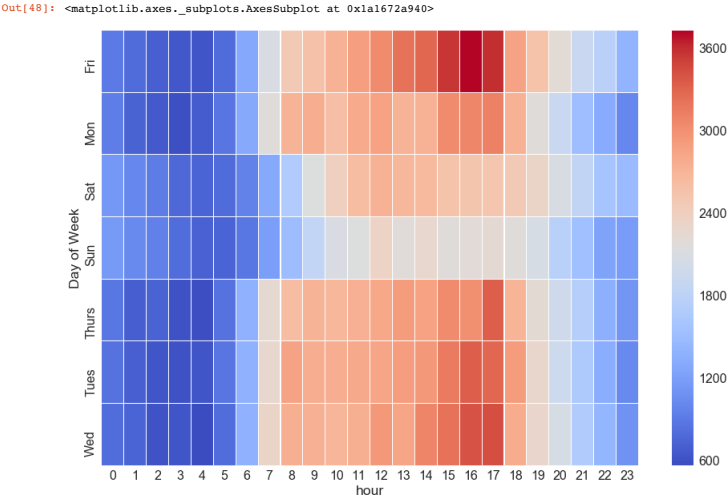
```
In [47]: dayvshour = df.groupby(["Day of Week", "hour"]).count()["lat"].unstack()
dayvshour.head()
```

Out[47]:

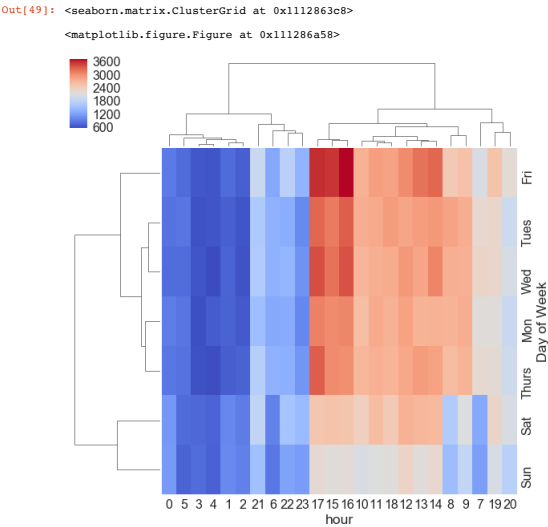
	hour	0	1	2	3	4	5	6	7	8	9	...	14	15	16	17	18	19	20	21	22	23	
Day of Week																							
Fri	896	789	701	644	633	786	1286	2087	2487	2570	...	3290	3562	3726	3596	2858	2562	2205	1916	1765	1396		
Mon	931	732	663	585	683	862	1291	2175	2714	2766	...	2729	3034	3082	3116	2729	2179	1912	1503	1303	1003		
Sat	1130	999	908	767	742	788	957	1295	1674	2132	...	2643	2563	2529	2525	2477	2320	2074	1839	1579	1469		
Sun	1159	1026	955	800	717	736	880	1196	1492	1849	...	2276	2170	2200	2234	2179	2067	1753	1536	1235	1177		
Thurs	871	690	727	603	573	833	1386	2254	2613	2719	...	2863	3044	3017	3335	2707	2226	1974	1724	1360	1120		

5 rows x 24 columns

```
In [48]: plt.figure(figsize= (15,10))
sns.heatmap(dayvshour, cmap = "coolwarm", linewidths=.1)
```



```
In [49]: plt.figure(figsize= (15,10))
sns.clustermap(dayvshour, cmap = "coolwarm")
```



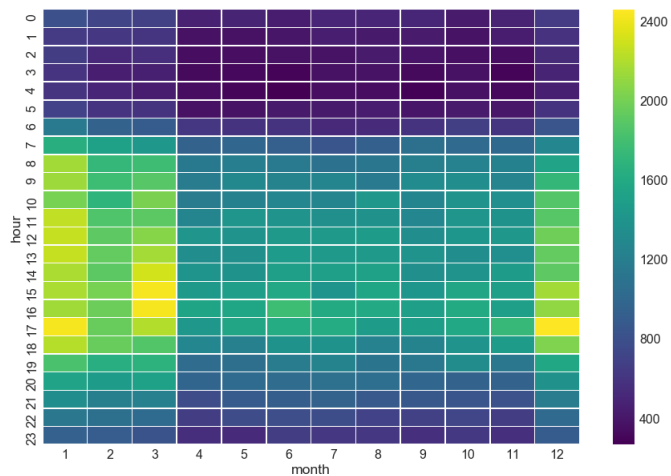
```
In [50]: monthvshour = df.groupby(["hour", "month"]).count()["lat"].unstack()
monthvshour.head()
```

Out[50]:

month	1	2	3	4	5	6	7	8	9	10	11	12
hour												
0	799	710	691	466	485	442	491	495	501	428	475	651
1	651	617	604	364	366	390	453	415	422	377	430	583
2	654	515	564	343	350	363	377	422	382	357	338	534
3	592	449	460	320	312	291	367	372	320	364	290	486
4	597	497	439	342	298	266	348	341	280	368	309	457

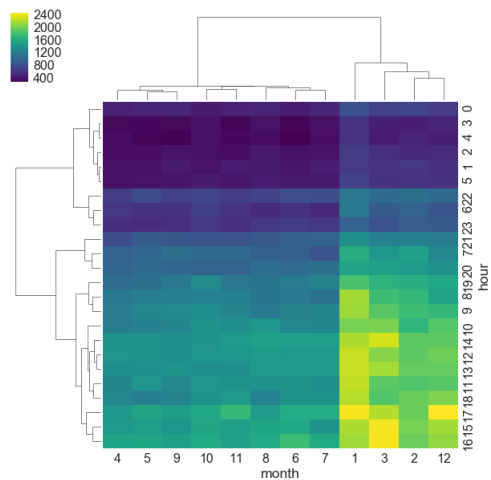
```
In [51]: plt.figure(figsize=(15,10))
sns.heatmap(monthvshour, cmap="viridis", linewidths=.5)
```

```
Out[51]: <matplotlib.axes._subplots.AxesSubplot at 0x1a196456d8>
```



```
In [52]: sns.clustermap(monthvshour, cmap = "viridis")
```

```
Out[52]: <seaborn.matrix.ClusterGrid at 0x1112864a8>
```



```
In [ ]:
```

Please, free to leave any comment or feedback.

Thanks!