

# US Traffic Accident Data Visualization

This is a countrywide car accident dataset, which covers 49 states of the USA. The accident data are collected from February 2016 to December 2020, using multiple APIs that provide streaming traffic incident (or event) data. These APIs broadcast traffic data captured by a variety of entities, such as the US and state departments of transportation, law enforcement agencies, traffic cameras, and traffic sensors within the road-networks. Currently, there are about 1.5 million accident records in this dataset.

## Basic Questions

Which City in US has reported most no. of Accident Cases in last 5 years (2016-2020)?

Which are the top 10 accident prone streets in US ?

Per Day averagely how many road accidents took place in US ?

In which hours of the day most accidents happened in US ?

How are the basic weather conditions in most of the accident cases in US ?

Which are the top 10 States most no. of road accident cases in US ?

## Import all necessary libraries

```
In [5]: import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import matplotlib.ticker as ticker
import matplotlib.patches as mpatches
%matplotlib inline
import seaborn as sns
import calendar
import plotly as pt
from plotly import graph_objs as go
import plotly.express as px
import plotly.figure_factory as ff
from pylab import *
import matplotlib.path_effects as PathEffects

import descartes
import geopandas as gpd
from Levenshtein import distance
from itertools import product
from fuzzywuzzy import fuzz
from fuzzywuzzy import process
from scipy.spatial.distance import pdist, squareform
from shapely.geometry import Point, Polygon

import geoplot
from geopy.geocoders import Nominatim

import warnings
warnings.filterwarnings('ignore')

plt.rcParams['font.family'] = "Microsoft JhengHei UI Light"
plt.rcParams['font.serif'] = ["Microsoft JhengHei UI Light"]
```

```
In [6]: # read & Load the dataset into pandas dataframe
df = pd.read_csv('../input/us-accidents/US_Accidents_March23.csv')
```

```
In [7]: # check the no. of columns & rows
print('The Dataset Contains, Rows: {}, Columns: {}'.format(df.shape[0], df.shape[1]))
```

The Dataset Contains, Rows: 7,728,394 & Columns: 46

```
In [8]: # convert the Start_Time & End_Time Variable into Datetime Feature
df.Start_Time = pd.to_datetime(df.Start_Time)
df.End_Time = pd.to_datetime(df.End_Time)
```

## Location Analysis

In this dataset, we have different attributes like City, State, Timezone and even street for each accident records. Here we will analyze these four features based on the no. of cases for each distinct location.

## City Analysis

```
In [9]: # create a dataframe of city and their corresponding accident cases
city_df = pd.DataFrame(df['City'].value_counts()).reset_index().rename(columns={'index':'City', 'City':'Cases'})
```

```
In [10]: top_10_cities = pd.DataFrame(city_df.head(10))
```

```
In [11]: fig, ax = plt.subplots(figsize = (12,7), dpi = 80)

cmap = cm.get_cmap('rainbow', 10)
clrs = [matplotlib.colors.rgb2hex(cmap(i)) for i in range(cmap.N)]
```

```

ax=sns.barplot(y=top_10_cities['Cases'], x=top_10_cities['City'], palette='rainbow')

total = sum(city_df['Cases'])
for i in ax.patches:
    ax.text(i.get_x()*.03, i.get_height()-2500, \
            str(round((i.get_height()/total)*100, 2))+'%', fontsize=15, weight='bold',
            color='white')

plt.title('\nTop 10 Cities in US with most no. of Road Accident Cases (2016-2020)\n', size=20, color='grey')

plt.rcParams['font.family'] = "Microsoft JhengHei UI Light"
plt.rcParams['font.serif'] = ["Microsoft JhengHei UI Light"]

plt.ylim(1000, 50000)
plt.xticks(rotation=10, fontsize=12)
plt.yticks(fontsize=12)

ax.set_xlabel('\nCities\n', fontsize=15, color='grey')
ax.set_ylabel('\nAccident Cases\n', fontsize=15, color='grey')

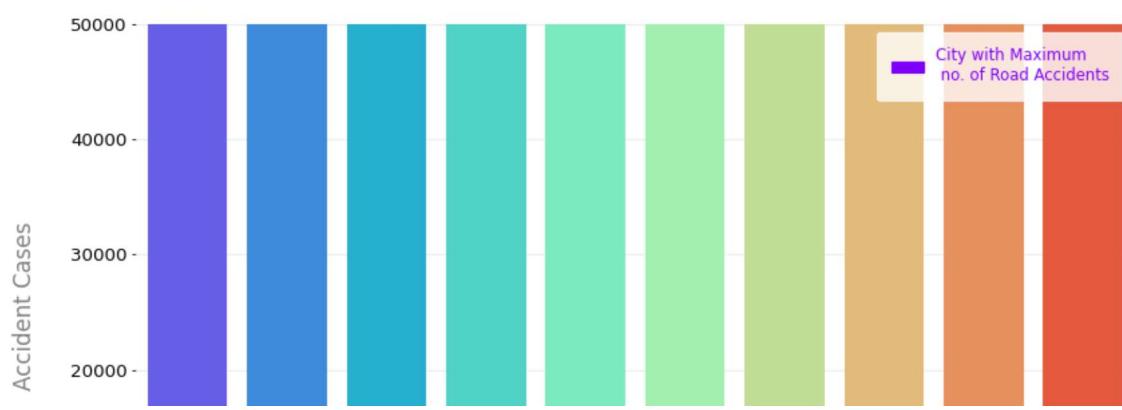
for i in ['bottom', 'left']:
    ax.spines[i].set_color('white')
    ax.spines[i].set_linewidth(1.5)

right_side = ax.spines["right"]
right_side.set_visible(False)
top_side = ax.spines["top"]
top_side.set_visible(False)

ax.set_axisbelow(True)
ax.grid(color='#b2d6c7', linewidth=1, axis='y', alpha=.3)
MA = mpatches.Patch(color=clrs[0], label='City with Maximum\nno. of Road Accidents')
ax.legend(handles=[MA], prop={'size': 10.5}, loc='best', borderpad=1,
          labelcolor=clrs[0], edgecolor='white');
plt.show()

```

### Top 10 Cities in US with most no. of Road Accident Cases (2016-2020)





```
In [13]: # US States
states = gpd.read_file('../input/us-states-map')
```

```
def lat(city):
    address=city
    geolocator = Nominatim(user_agent="Your_Name")
    location = geolocator.geocode(address)
    return (location.latitude)

def lng(city):
    address=city
    geolocator = Nominatim(user_agent="Your_Name")
    location = geolocator.geocode(address)
    return (location.longitude)

# List of top 10 cities
top_ten_city_list = list(city_df.City.head(10))

top_ten_city_lat_dict = {}
top_ten_city_lng_dict = {}
for i in top_ten_city_list:
    top_ten_city_lat_dict[i] = lat(i)
    top_ten_city_lng_dict[i] = lng(i)

top_10_cities_df = df[df['City'].isin(list(top_10_cities.City))]

top_10_cities_df['New_Start_Lat'] = top_10_cities_df['City'].map(top_ten_city_lat_dict)
top_10_cities_df['New_Start_Lng'] = top_10_cities_df['City'].map(top_ten_city_lng_dict)
```

```
In [14]: geometry_cities = [Point(xy) for xy in zip(top_10_cities_df['New_Start_Lng'], top_10_cities_df['New_Start_Lat'])]
geo_df_cities = gpd.GeoDataFrame(top_10_cities_df, geometry=geometry_cities)
```

```
fig, ax = plt.subplots(figsize=(15,15))
ax.set_xlim([-125, -65])
ax.set_ylim([22,55])
states.boundary.plot(ax=ax, color='grey');

colors = ['#e6194B', '#f58231', '#ffe119', '#bfe445', '#3cb44b', '#aaffc3', '#42d4f4', '#4363d8', '#911eb4', '#f032e6']
markersizes = [50+(i*20) for i in range(10)][::-1]
for i in range(10):
    geo_df_cities[geo_df_cities['City'] == top_ten_city_list[i]].plot(ax=ax, markersize=markersizes[i],
                                                                      color=colors[i], marker='o',
                                                                      label=top_ten_city_list[i], alpha=0.7);

plt.legend(prop={'size': 13}, loc='best', bbox_to_anchor=(0.5, 0., 0.5, 0.5), edgecolor='white', title="Cities", title_fontsize=15);

for i in ['bottom', 'top', 'left', 'right']:
    side = ax.spines[i]
    side.set_visible(False)

plt.tick_params(top=False, bottom=False, left=False, right=False,
               labelleft=False, labelbottom=False)

plt.title('\nVisualization of Top 10 Accident Prone Cities in US (2016-2020)', size=20, color='grey');
```

## Visualization of Top 10 Accident Prone Cities in US (2016-2020)



3 out of top 10 cities with most no. of accident cases is from the state

```
In [16]: def city_cases_percentage(val, operator):
    if operator == '<':
        res = city_df[city_df['Cases']<val].shape[0]
    elif operator == '>':
        res = city_df[city_df['Cases']>val].shape[0]
    elif operator == '=':
        res = city_df[city_df['Cases']==val].shape[0]
    print(f'{res} Cities, {round(res*100/city_df.shape[0], 2)}%')

city_cases_percentage(1, '=')
city_cases_percentage(100, '<')
city_cases_percentage(1000, '<')
city_cases_percentage(1000, '>')
city_cases_percentage(5000, '>')
city_cases_percentage(10000, '>')

1023 Cities, 7.48%
8947 Cities, 65.41%
12460 Cities, 91.1%
1215 Cities, 8.88%
231 Cities, 1.69%
105 Cities, 0.77%
```

In this Dataset, we have the records of total 10,657 Cities

11% (1167 Cities) only 1 accident record in past 5 years.

81% (8,682 Cities) of all cities in US, have less than 100 total no. of road accidents.

97.64% (10,406 Cities) cities in US, have the road accident records (2016-2020), less than 1,000

There are 251 Cities (2.36%) in US, which have more than 1,000 total no. of road accidents in past 5 years.

40 Cities (0.38%) in US, have more than 5,000 road accident records.

Only 13 Cities (0.12%) in US, have more than 10,000 road accident records.

### State Analysis

```
In [17]: # create a dictionary using US State code and their corresponding Name
us_states = {'AK': 'Alaska',
'AL': 'Alabama',
'AR': 'Arkansas',
'AS': 'American Samoa',
'AZ': 'Arizona',
'CA': 'California',
'CO': 'Colorado',
'CT': 'Connecticut',
'DC': 'District of Columbia',
'DE': 'Delaware',
'FL': 'Florida',
'GA': 'Georgia',
'GU': 'Guam',
```

```

'HI': 'Hawaii',
'IA': 'Iowa',
'ID': 'Idaho',
'IL': 'Illinois',
'IN': 'Indiana',
'KS': 'Kansas',
'KY': 'Kentucky',
'LA': 'Louisiana',
'MA': 'Massachusetts',
'MD': 'Maryland',
'ME': 'Maine',
'MI': 'Michigan',
'MN': 'Minnesota',
'MO': 'Missouri',
'MP': 'Northern Mariana Islands',
'MS': 'Mississippi',
'MT': 'Montana',
'NC': 'North Carolina',
'ND': 'North Dakota',
'NE': 'Nebraska',
'NH': 'New Hampshire',
'NJ': 'New Jersey',
'NM': 'New Mexico',
'NV': 'Nevada',
'NY': 'New York',
'OH': 'Ohio',
'OK': 'Oklahoma',
'OR': 'Oregon',
'PA': 'Pennsylvania',
'PR': 'Puerto Rico',
'RI': 'Rhode Island',
'SC': 'South Carolina',
'SD': 'South Dakota',
'TN': 'Tennessee',
'TX': 'Texas',
'UT': 'Utah',
'VA': 'Virginia',
'VI': 'Virgin Islands',
'VT': 'Vermont',
'WA': 'Washington',
'WI': 'Wisconsin',
'WV': 'West Virginia',
'WY': 'Wyoming'}

# create a dataframe of State and their corresponding accident cases
state_df = pd.DataFrame(df['State'].value_counts()).reset_index().rename(columns={'index':'State', 'State':'Cases'})

# Function to convert the State Code with the actual corresponding Name
def convert(x): return us_states[x]

state_df['State'] = state_df['State'].apply(convert)

top_ten_states_name = list(state_df['State'].head(10))

```

```

In [18]: fig, ax = plt.subplots(figsize = (12,6), dpi = 80)

cmap = cm.get_cmap('winter', 10)
clrs = [matplotlib.colors.rgb2hex(cmap(i)) for i in range(cmap.N)]

ax=sns.barplot(y=state_df['Cases'].head(10), x=state_df['State'].head(10), palette='winter')
ax1 = ax.twinx()
sns.lineplot(data = state_df[:10], marker='o', x='State', y='Cases', color = 'white', alpha = .8)

total = df.shape[0]
for i in ax.patches:
    ax.text(i.get_x()-0.2, i.get_height()+10000, \
            '{}\n({})'.format(int(i.get_height()), round(100*i.get_height()/total, 1)), fontsize=15,
            color='black')

ax.set(ylim=(-10000, 600000))
ax1.set(ylim=(-100000, 1700000))

plt.title('\nTop 10 States with most no. of Accident cases in US (2016-2020)\n', size=20, color='grey')
ax1.axes.yaxis.set_visible(False)
ax.set_xlabel('\nStates\n', fontsize=15, color='grey')
ax.set_ylabel('\nAccident Cases\n', fontsize=15, color='grey')

for i in ['top','right']:
    side1 = ax.spines[i]
    side1.set_visible(False)
    side2 = ax1.spines[i]
    side2.set_visible(False)

ax.set_axisbelow(True)
ax.grid(color="#b2d6c7", linewidth=1, axis='y', alpha=.3)

```

```

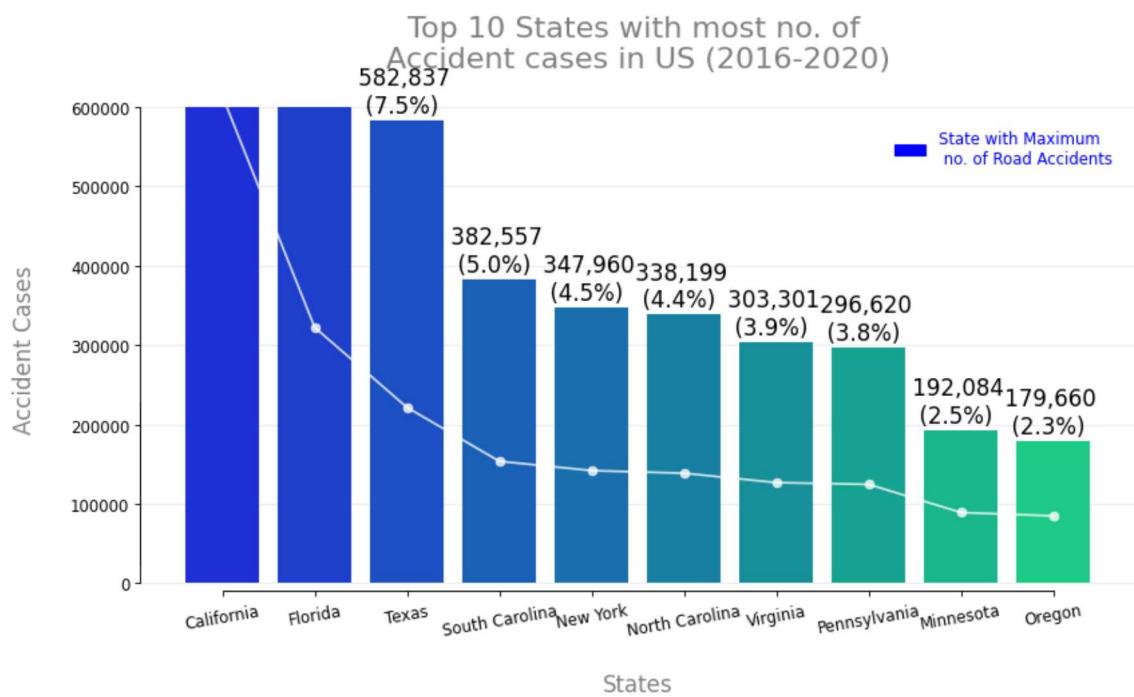
ax.spines['bottom'].set_bounds(0.005, 9)
ax.spines['left'].set_bounds(0, 600000)
ax1.spines['bottom'].set_bounds(0.005, 9)
ax1.spines['left'].set_bounds(0, 600000)
ax.tick_params(axis='y', which='major', labelsize=10.6)
ax.tick_params(axis='x', which='major', labelsize=10.6, rotation=10)

MA = mpatches.Patch(color=clrs[0], label='State with Maximum\nno. of Road Accidents')
ax.legend(handles=[MA], prop={'size': 10.5}, loc='best', borderpad=1,
          labelcolor=clrs[0], edgecolor='white');

```

1,741,433  
(22.5%)

880,192  
(11.4%)



In US, California is the state with highest no. of road accidents in past 5 years.

About 30% of the total accident records of past 5 years in US is only from California

```
In [19]: geometry = [Point(xy) for xy in zip(df['Start_Lng'], df['Start_Lat'])]
geo_df = gpd.GeoDataFrame(df, geometry=geometry)

geo_df['year'] = geo_df.Start_Time.dt.year
geo_df['State'] = geo_df['State'].apply(convert)

In [20]: fig, ax = plt.subplots(figsize=(15,15))
ax.set_xlim([-125,-65])
ax.set_ylim([22,55])

states.boundary.plot(ax=ax, color='grey');
states.apply(lambda x: None if (x.NAME not in top_ten_states_name) else ax.annotate(s=x.NAME, xy=x.geometry.centroid.coords[0], ha='center', va='bottom', fontweight='bold', color='black', size=12))

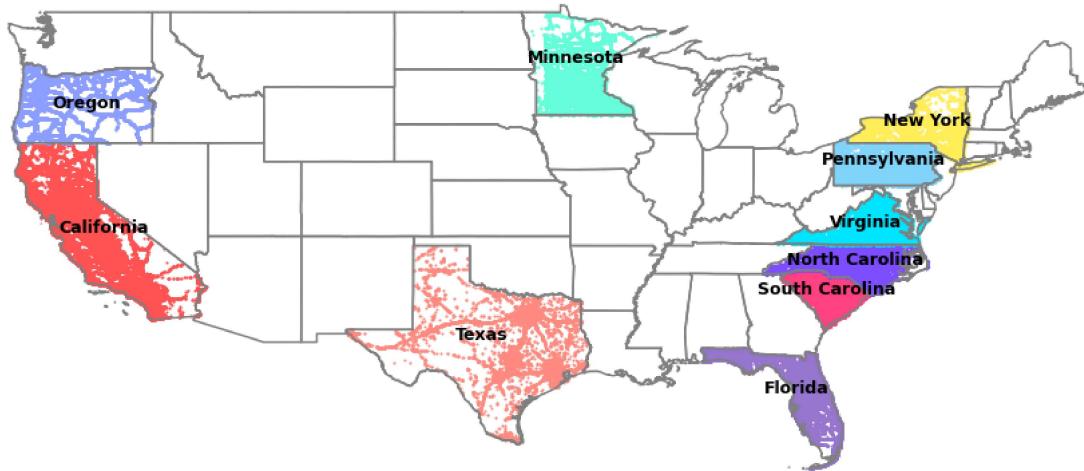
# CFOTNYMVNP1
colors = ['#FF5252', '#9575CD', '#FF8A80', '#FF4081', '#FFEE58', '#7C4dff', '#00E5FF', '#81D4FA', '#64FFDA', '#8C9EFF']
count = 0
for i in list(state_df['State'].head(10)):
    geo_df[geo_df['State'] == i].plot(ax=ax, markersize=1, color=colors[count], marker='o');
    count += 1

for i in ['bottom', 'top', 'left', 'right']:
    side = ax.spines[i]
    side.set_visible(False)

plt.tick_params(top=False, bottom=False, left=False, right=False,
               labelleft=False, labelbottom=False)

plt.title('\nVisualization of Top 10 Accident Prone States in US (2016-2020)', size=20, color='grey');
```

Visualization of Top 10 Accident Prone States in US (2016-2020)



```
In [21]: fig, ax = plt.subplots(figsize = (12,6), dpi = 80)

cmap = cm.get_cmap('cool', 10)
clrs = [matplotlib.colors.rgb2hex(cmap(i)) for i in range(cmap.N)]

ax=sns.barplot(y=state_df['Cases'].tail(10), x=state_df['State'].tail(10), palette='cool')
ax1 = ax.twinx()
sns.lineplot(data = state_df[-10:], marker='o', x='State', y='Cases', color = 'white', alpha = .8)

total = df.shape[0]
for i in ax.patches:
    ax.text(i.get_x()-0.1, i.get_height()+100, \
        '{:,.0f}'.format(int(i.get_height())), round(100*i.get_height()/total, 2)), fontsize=15,
    color='black')

ax.set(ylim =(-50, 5000))
ax1.set(ylim =(-50, 6000))

plt.title('\nTop 10 States with least no. of \nAccident cases in US (2016-2020)\n', size=20, color='grey')
ax1.axes.yaxis.set_visible(False)
ax.set_xlabel('\nStates\n', fontsize=15, color='grey')
ax.set_ylabel('\nAccident Cases\n', fontsize=15, color='grey')

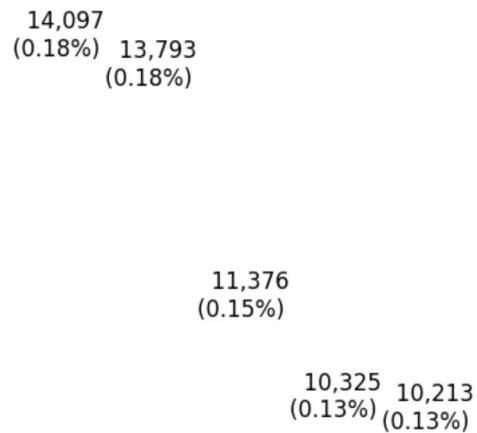
for i in ['top', 'right']:
    side = ax.spines[i]
    side.set_visible(False)
```

```
side1 = ax1.spines[i]
side1.set_visible(False)

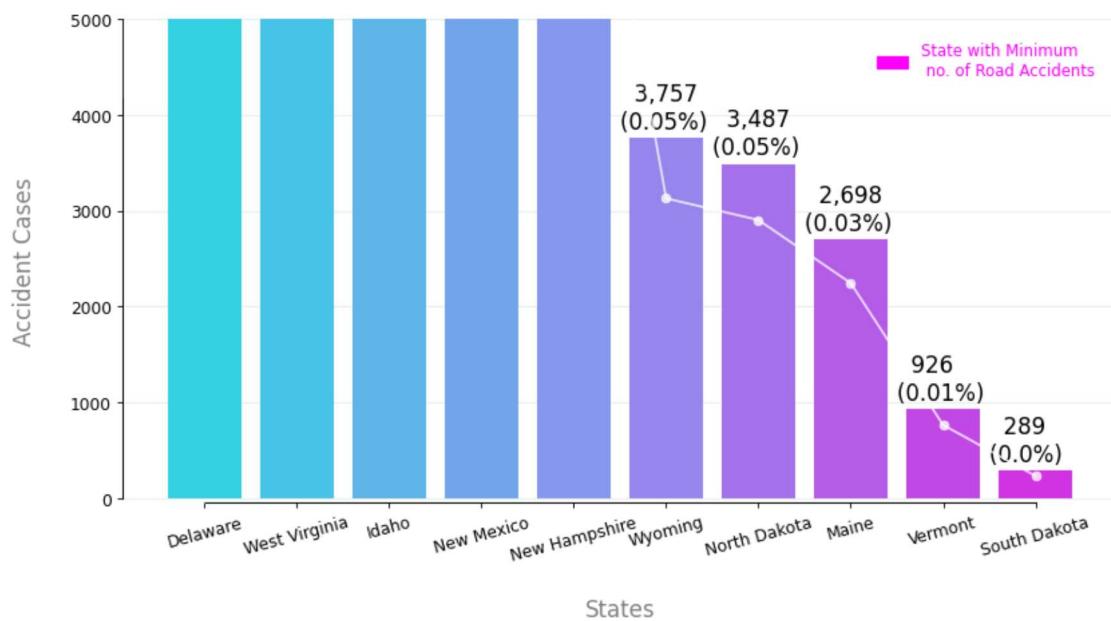
ax.set_axisbelow(True)
ax.grid(color="#b2d6c7", linewidth=1, axis='y', alpha=.3)

ax.spines['bottom'].set_bounds(0.005, 9)
ax.spines['left'].set_bounds(0, 5000)
ax1.spines['bottom'].set_bounds(0.005, 9)
ax1.spines['left'].set_bounds(0, 5000)
ax.tick_params(axis='y', which='major', labelsize=11)
ax.tick_params(axis='x', which='major', labelsize=11, rotation=15)

MI = mpatches.Patch(color=clrs[-1], label='State with Minimum\n no. of Road Accidents')
ax.legend(handles=[MI], prop={'size': 10.5}, loc='best', borderpad=1,
          labelcolor=clrs[-1], edgecolor='white');
```



Top 10 States with least no. of Accident cases in US (2016-2020)



South Dakota is the city with lowest no. of road accidents in past 5 years.

#### Timezone Analysis

```
In [22]: timezone_df = pd.DataFrame(df['Timezone'].value_counts()).reset_index().rename(columns={'index':'Timezone', 'Timezone':'Cases'})
```

```
In [23]: fig, ax = plt.subplots(figsize = (10,6), dpi = 80)
cmap = cm.get_cmap('spring', 4)
clrs = [matplotlib.colors.rgb2hex(cmap(i)) for i in range(cmap.N)]
ax=sns.barplot(y=timezone_df['Cases'], x=timezone_df['Timezone'], palette='spring')
total = df.shape[0]
for i in ax.patches:
```

```

    ax.text(i.get_x()+0.3, i.get_height()-50000, \
        '{}%'.format(round(i.get_height()*100/total)), fontsize=15, weight='bold', \
        color='white')

plt.ylim(-20000, 700000)
plt.title('\nPercentage of Accident Cases for \ndifferent Timezone in US (2016-2020)\n', size=20, color='grey')
plt.ylabel('\nAccident Cases\n', fontsize=15, color='grey')
plt.xlabel('\nTimezones\n', fontsize=15, color='grey')
plt.xticks(fontsize=13)
plt.yticks(fontsize=12)

for i in ['top', 'right']:
    side = ax.spines[i]
    side.set_visible(False)

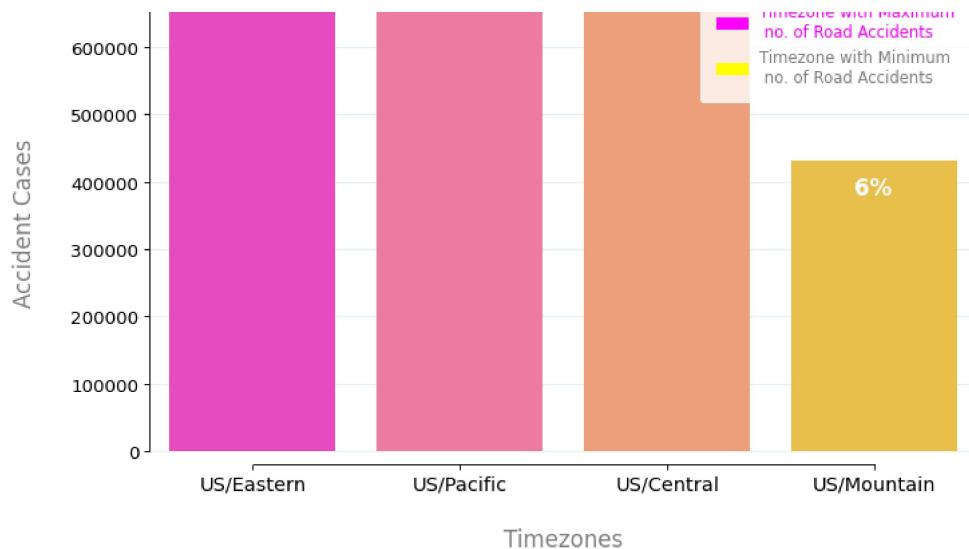
ax.set_axisbelow(True)
ax.grid(color="#b2d6c7", linewidth=1, axis='y', alpha=.3)
ax.spines['bottom'].set_bounds(0.005, 3)
ax.spines['left'].set_bounds(0, 700000)

MA = mpatches.Patch(color=clrs[0], label='Timezone with Maximum\nno. of Road Accidents')
MI = mpatches.Patch(color=clrs[-1], label='Timezone with Minimum\nno. of Road Accidents')
ax.legend(handles=[MA, MI], prop={'size': 10.5}, loc='best', borderpad=1,
          labelcolor=[clrs[0], 'grey'], edgecolor='white');

```

Percentage of Accident Cases for  
different Timezone in US (2016-2020)





Eastern time zone region of US has the highest no. of road accident cases (39%) in past 5 years.

Mountain time zone region of US has the lowest no. of road accident cases (6%) in past 5 years.

```
In [24]: fig, ax = plt.subplots(figsize=(15,15))
ax.set_xlim([-125,-65])
ax.set_ylim([22,55])
states.boundary.plot(ax=ax, color='black');

colors = ['#00db49', '#ff5e29', '#88ff33', '#ffffb29']
#4132
count = 0
for i in list(timezone_df.Timezone):
    geo_df[geo_df['Timezone'] == i].plot(ax=ax, markersize=1, color=colors[count], marker='o', label=i);
    count += 1

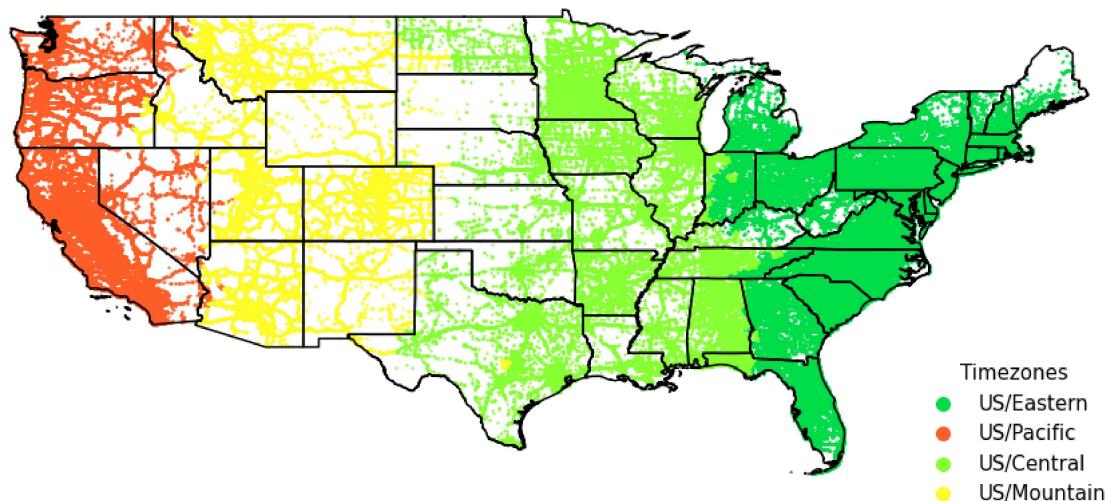
plt.legend(markerscale=10., prop={'size': 15}, edgecolor='white', title="Timezones", title_fontsize=15, loc='lower right');

for i in ['bottom', 'top', 'left', 'right']:
    side = ax.spines[i]
    side.set_visible(False)

plt.tick_params(top=False, bottom=False, left=False, right=False,
               labelleft=False, labelbottom=False)

plt.title('\nVisualization of Road Accidents \nfor different Timezones in US (2016-2020)', size=20, color='grey');
```

Visualization of Road Accidents  
for different Timezones in US (2016-2020)



```
In [25]: # create a dataframe of Street and their corresponding accident cases
street_df = pd.DataFrame(df['Street'].value_counts()).reset_index().rename(columns={'index':'Street No.', 'Street':'Cases'})

In [26]: top_ten_streets_df = pd.DataFrame(street_df.head(10))

In [27]: fig, ax = plt.subplots(figsize = (12,6), dpi = 80)

cmap = cm.get_cmap('gnuplot2', 10)
clrs = [matplotlib.colors.rgb2hex(cmap(i)) for i in range(cmap.N)]

ax=sns.barplot(y=top_ten_streets_df['Cases'], x=top_ten_streets_df['Street No.'], palette='gnuplot2')
ax1 = ax.twinx()
sns.lineplot(data = top_ten_streets_df, marker='o', x='Street No.', y='Cases', color = 'white', alpha = .8)

total = df.shape[0]
for i in ax.patches:
    ax.text(i.get_x()+0.04, i.get_height()-2000, \
        '{:,d}'.format(int(i.get_height())), fontsize=12.5, weight='bold', \
        color='white')

ax.axes.set_ylim(-1000, 30000)
ax1.axes.set_xlim(-1000, 40000)
plt.title('\nTop 10 Accident Prone Streets in US (2016-2020)\n', size=20, color='grey')

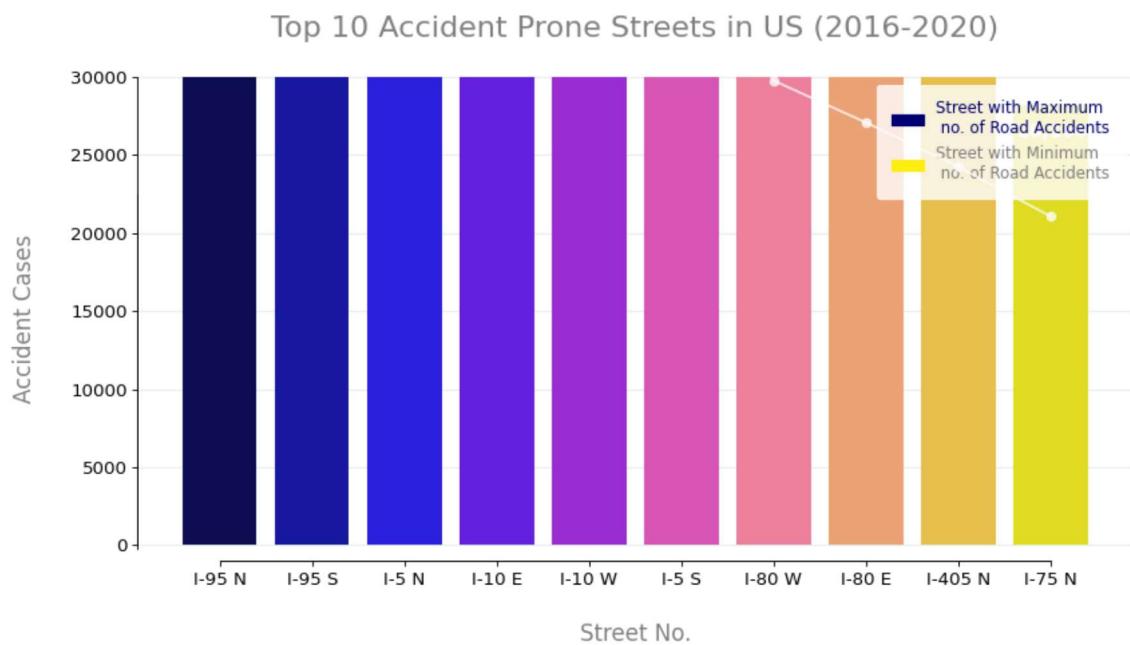
ax1.axes.yaxis.set_visible(False)
ax.set_xlabel('\nStreet No.\n', fontsize=15, color='grey')
ax.set_ylabel('\nAccident Cases\n', fontsize=15, color='grey')

for i in ['top','right']:
    side1 = ax.spines[i]
    side1.set_visible(False)
    side2 = ax1.spines[i]
    side2.set_visible(False)

ax.set_axisbelow(True)
ax.grid(color='#b2d6c7', linewidth=1, axis='y', alpha=.3)

ax.spines['bottom'].set_bounds(0.005, 9)
ax.spines['left'].set_bounds(0, 30000)
ax1.spines['bottom'].set_bounds(0.005, 9)
ax1.spines['left'].set_bounds(0, 30000)
ax.tick_params(axis='both', which='major', labelsize=12)

MA = mpatches.Patch(color=clrs[1], label='Street with Maximum\nno. of Road Accidents')
MI = mpatches.Patch(color=clrs[-2], label='Street with Minimum\nno. of Road Accidents')
ax.legend(handles=[MA, MI], prop={'size': 10.5}, loc='best', borderpad=1,
           labelcolor=[clrs[1], 'grey'], edgecolor='white');
```



```
In [28]: def street_cases_percentage(val, operator):
    if operator == '=':
        val = street_df[street_df['Cases']==val].shape[0]
    elif operator == '>':
        val = street_df[street_df['Cases']>val].shape[0]
    elif operator == '<':
        val = street_df[street_df['Cases']<val].shape[0]
    print('{:,d} Streets, {:.%}'.format(val, round(val*100/street_df.shape[0], 2)))

street_cases_percentage(1, '=')
street_cases_percentage(100, '<')
street_cases_percentage(1000, '<')
street_cases_percentage(1000, '>')
street_cases_percentage(5000, '>')

129,934 Streets, 38.64%
326,421 Streets, 97.06%
335,489 Streets, 99.76%
817 Streets, 0.24%
133 Streets, 0.04%
```

In Our dataset, there are total 93,048 Streets enlisted for accidental cases,

There are 36,441 Streets (39%) in US which have only 1 accident record in past 5 years.

98% Streets of US, have less than 100 road accident cases.

0.2% Streets in US have the accident cases greater than 1000

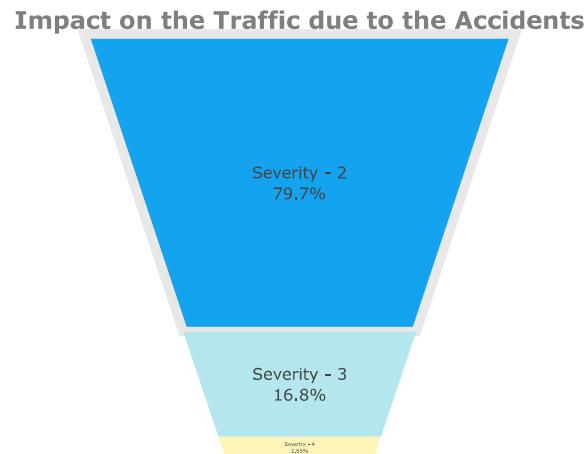
In last 5 years record of road accidents, only 24 Streets (0.03%) have greater than 5000 cases.

#### Severity Analysis

It shows the severity of the accident, a number between 1 and 4, where 1 indicates the least impact on traffic (i.e., a short delay as a result of the accident), and 4 indicates a significant impact on traffic (i.e., a long delay). Note that the severity reported by different sources may differ in their underlying impact on traffic, so please separate data from different sources when conducting a severity-based analysis.

```
In [29]: # create a dataframe of Severity and the corresponding accident cases
severity_df = pd.DataFrame(df['Severity'].value_counts()).rename(columns={'index':'Severity', 'Severity':'Cases'})
```

```
In [30]: fig = go.Funnelarea(
    text = ["Severity - 2", "Severity - 3", "Severity - 4", "Severity - 1"],
    values = severity_df.Cases,
    title = {"position": "top center",
              "text": "<b>Impact on the Traffic due to the Accidents</b>",
              'font':dict(size=18,color="#7f7f7f")},
    marker = {"colors": ['#14a3ee', '#b4e6ee', '#fdf4b8', '#ff4f4e'],
              "line": {"color": ["#e8e8e8", "wheat", "wheat", "wheat"], "width": [7, 0, 0, 2]}})
fig.show()
```



In 80% Cases of road accidents, the impact on the traffic was Moderate (Severity-2)

In 7.5% Cases of road accidents, the impact on the traffic was highly Severe (Severity-4)

```
In [31]: fig, ax = plt.subplots(figsize=(15,15))
ax.set_xlim([-125, -65])
ax.set_ylim([22, 55])
states.boundary.plot(ax=ax, color='black');

geo_df[geo_df['Severity'] == 1].plot(ax=ax, markersize=50, color="#5cff4a", marker='o', label='Severity 1');
geo_df[geo_df['Severity'] == 3].plot(ax=ax, markersize=10, color="#ff1c1c", marker='x', label='Severity 3');
geo_df[geo_df['Severity'] == 4].plot(ax=ax, markersize=1, color="#6459ff", marker='v', label='Severity 4');
geo_df[geo_df['Severity'] == 2].plot(ax=ax, markersize=5, color="#ffb340", marker='+', label='Severity 2');

for i in ['bottom', 'top', 'left', 'right']:
    side = ax.spines[i]
    side.set_visible(False)

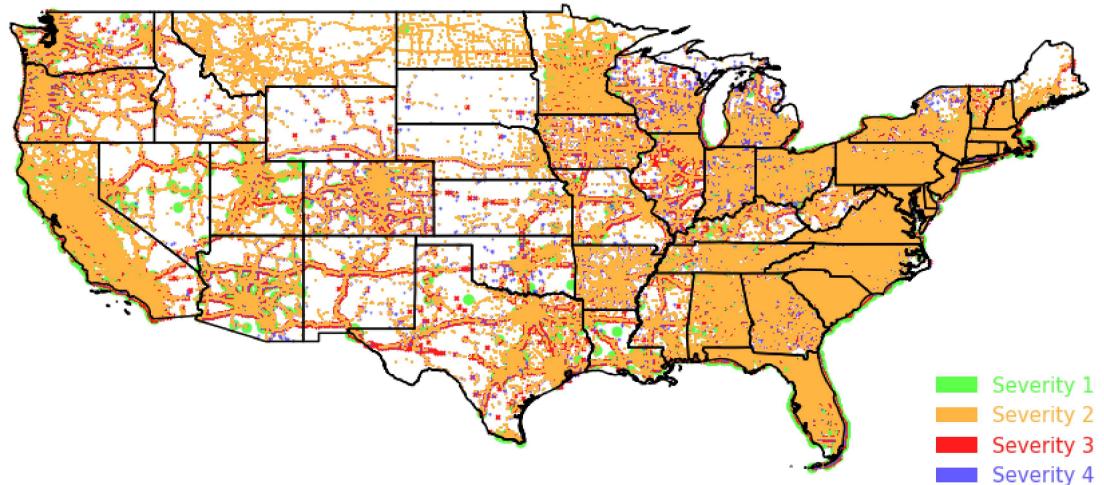
plt.tick_params(top=False, bottom=False, left=False, right=False,
               labelleft=False, labelbottom=False)

plt.title('\nDifferent level of Severity visualization in US map', size=20, color='grey');

One = mpatches.Patch(color="#5cff4a", label='Severity 1')
Two = mpatches.Patch(color="#ffb340", label='Severity 2')
Three = mpatches.Patch(color="#ff1c1c", label='Severity 3')
Four = mpatches.Patch(color="#6459ff", label='Severity 4')
```

```
ax.legend(handles=[One, Two, Three, Four], prop={'size': 15}, loc='lower right', borderpad=1,
labelcolor=['#5cff4a', '#ffb340', '#ff1c1c', '#6459ff'], edgecolor='white');
```

Different level of Severity visualization in US map



#### Time Analysis

In this dataset we have Start\_Time & End\_Time for the timings of each accident.

Start\_Time shows start time of the accident in local time zone.

End\_Time shows end time of the accident in local time zone. End time here refers to when the impact of accident on traffic flow

#### Accident Duration Analysis

```
In [32]: accident_duration_df = pd.DataFrame(df['End_Time'] - df['Start_Time']).reset_index().rename(columns={'index':'Id', 0:'Duration'})
```

```
In [33]: top_10_accident_duration_df = pd.DataFrame(accident_duration_df['Duration'].value_counts().head(10).sample(frac = 1)).reset_index().rename(columns={'index':'Duration'})
```

```
Duration = [str(i).split('days')[ -1].strip() for i in top_10_accident_duration_df.Duration]
```

```
top_10_accident_duration_df['Duration'] = Duration
```

```
In [34]: fig, ax = plt.subplots(figsize = (12,6), dpi = 80)
ax.set_facecolor('#e6f2ed')
fig.patch.set_facecolor('#e6f2ed')

cmap = cm.get_cmap('bwr', 10)
clrs = [matplotlib.colors.rgb2hex(cmap(i)) for i in range(cmap.N)]

ax=sns.barplot(y=top_10_accident_duration_df['Cases'], x=top_10_accident_duration_df['Duration'], palette='bwr')
ax1 = ax.twinx()
sns.lineplot(data = top_10_accident_duration_df, marker='o', x='Duration', y='Cases', color = 'white', alpha = 1)

total = df.shape[0]
for i in ax.patches:
    ax.text(i.get_x(), i.get_height() + 5000, \
            str(round((i.get_height()/total)*100, 2)) + '%', fontsize=15,
            color='black')

ax.set(ylim =(1000, 400000))
ax1.set(ylim =(1000, 500000))

plt.title('\nMost Impacted Durations on the \nTraffic flow due to the Accidents \n', size=20, color='grey')

ax1.axes.yaxis.set_visible(False)
ax.set_xlabel('\nDuration of Accident (HH:MM:SS)\n', fontsize=15, color='grey')
ax.set_ylabel('\nAccident Cases\n', fontsize=15, color='grey')

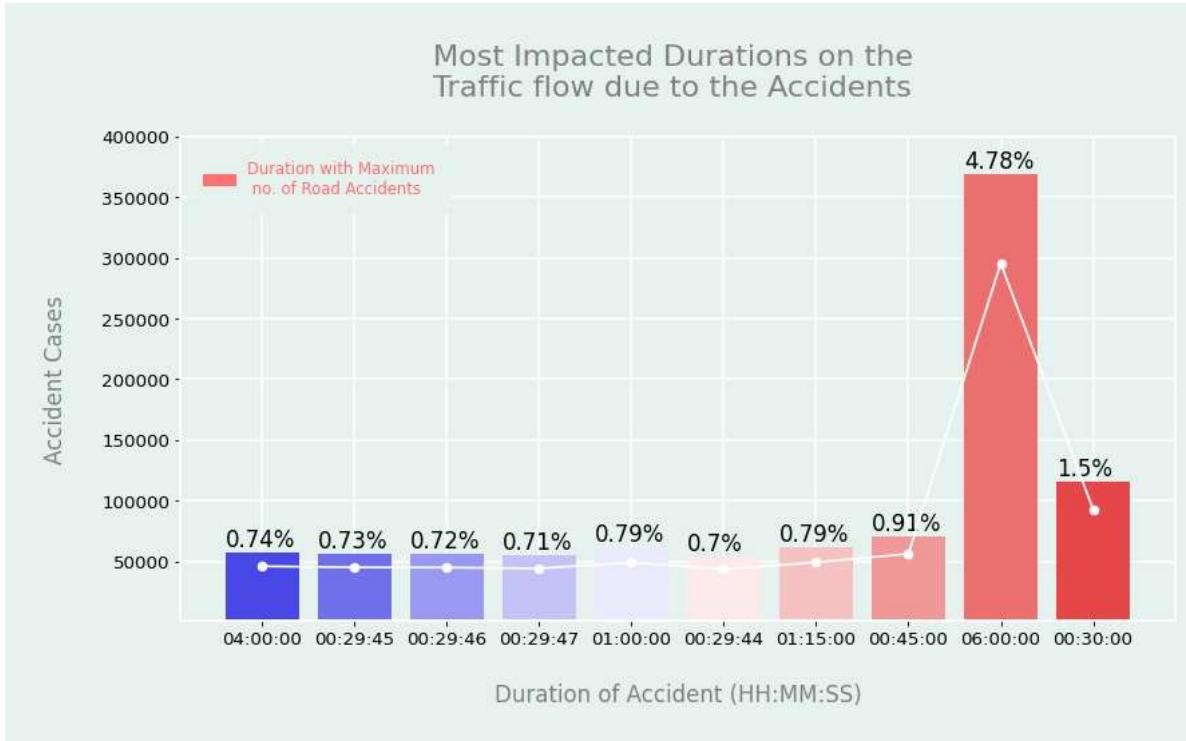
for i in ['bottom', 'top', 'left', 'right']:
    ax.spines[i].set_color('white')
    ax.spines[i].set_linewidth(1.5)
    ax1.spines[i].set_color('white')
    ax1.spines[i].set_linewidth(1.5)

ax.set_axisbelow(True)
ax.grid(color='white', linewidth=1.5)
```

```

ax.tick_params(axis='both', which='major', labelsize=12)
MA = mpatches.Patch(color=clrs[-3], label='Duration with Maximum\n no. of Road Accidents')
ax.legend(handles=[MA], prop={'size': 10.5}, loc='best', borderpad=1,
         labelcolor=clrs[-3], facecolor='#e6f2ed', edgecolor='#e6f2ed');

```



From the above plot, it is inferred that majority (24.25%) of road accidents, have impacted on the traffic flow for 6 hours

#### Year Analysis

```

In [35]: year_df = pd.DataFrame(df.Start_Time.dt.year.value_counts()).reset_index().rename(columns={'index':'Year', 'Start_Time':'Cases'}).sort_values('Cases', ascending=False)

In [36]: fig, ax = plt.subplots(figsize = (12,6), dpi = 80)

ax=sns.barplot(y=year_df['Cases'], x=year_df['Year'], palette=['#9a90e8', '#5d82de', '#3ee6e0', '#40ff53', '#2ee88e'])

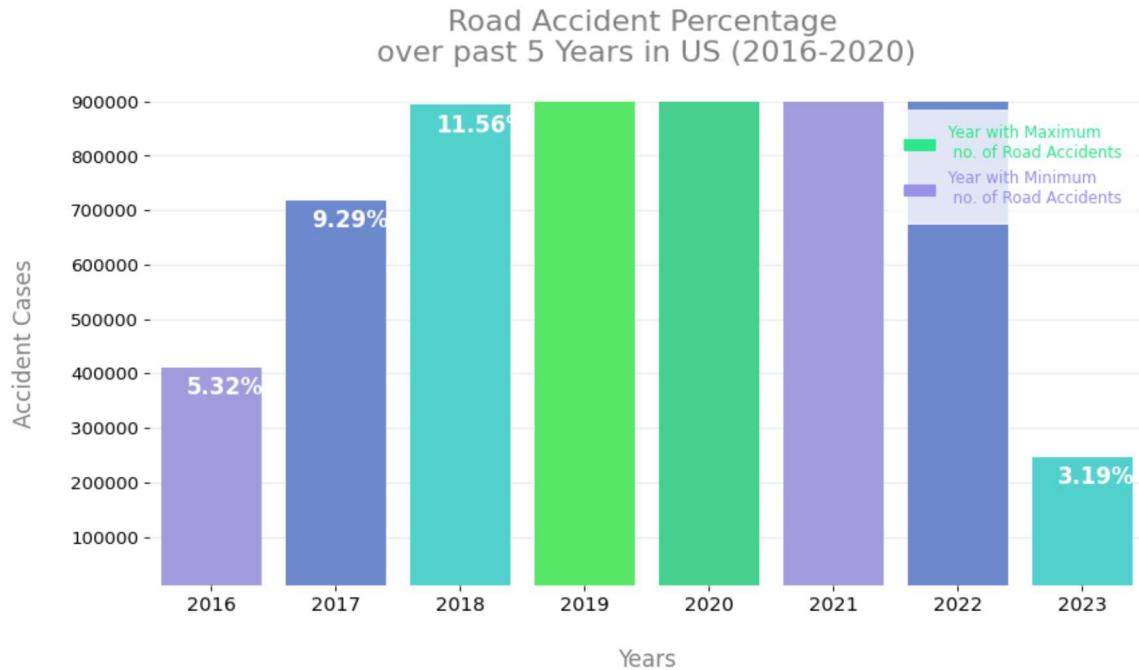
total = df.shape[0]
for i in ax.patches:
    ax.text(i.get_x()+0.2, i.get_height()-50000, \
            str(round((i.get_height()/total)*100, 2))+'%', fontsize=15, weight='bold',
            color='white')

plt.ylim(10000, 900000)
plt.title('\nRoad Accident Percentage \nover past 5 Years in US (2016-2020)\n', size=20, color='grey')
plt.ylabel('\nAccident Cases\n', fontsize=15, color='grey')
plt.xlabel('\nYears\n', fontsize=15, color='grey')
plt.xticks(fontsize=13)
plt.yticks(fontsize=12)
for i in ['bottom', 'top', 'left', 'right']:
    ax.spines[i].set_color('white')
    ax.spines[i].set_linewidth(1.5)

for k in ['top', 'right', "bottom", 'left']:
    side = ax.spines[k]
    side.set_visible(False)

ax.set_axisbelow(True)
ax.grid(color='#b2d6c7', linewidth=1, axis='y', alpha=0.3)
MA = mpatches.Patch(color='#2ee88e', label='Year with Maximum\n no. of Road Accidents')
MI = mpatches.Patch(color='#9a90e8', label='Year with Minimum\n no. of Road Accidents')
ax.legend(handles=[MA, MI], prop={'size': 10.5}, loc='best', borderpad=1,
          labelcolor=['#2ee88e', '#9a90e8'], edgecolor='white');
plt.show()

```



From the above figure, it is clear that in last 5 years (2016-2020) in US accidents percentage has increased significantly

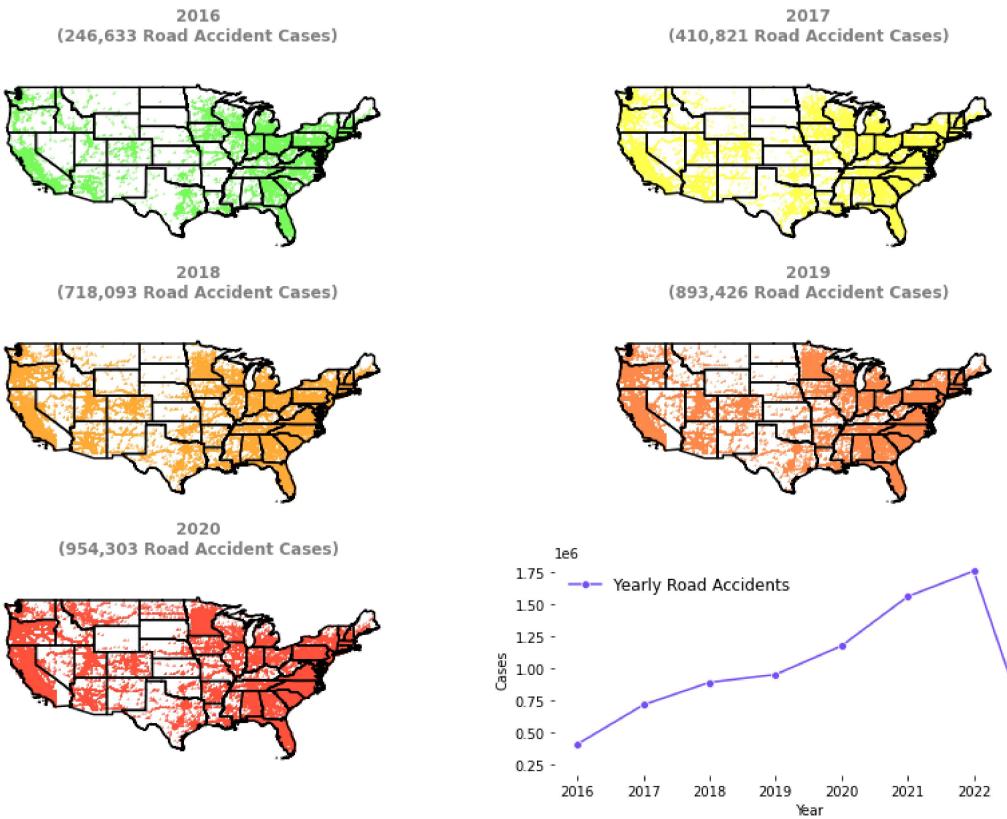
70% of the total road accident records of last 5 years happened only within last 2 years (2019, 2020)

```
In [37]: fig, ((ax1, ax2), (ax3, ax4), (ax5, ax6)) = plt.subplots(nrows=3, ncols=2, figsize=(15, 10))
fig.suptitle('Accident Cases over the past 5 years in US', fontsize=20, fontweight ="bold", color='grey')
count = 0
years = ['2016', '2017', '2018', '2019', '2020']
colors = ['#77fa5a', '#ffff4d', '#ffab36', '#ff894a', '#ff513b']
for i in [ax1, ax2, ax3, ax4, ax5]:
    i.set_xlim([-125,-65])
    i.set_ylim([22,55])
    states.boundary.plot(ax=i, color='black');
    geo_df[geo_df['year']==int(years[count])].plot(ax=i, markersize=1, color=colors[count], marker='+', alpha=0.5)
    for j in ['bottom', 'top', 'left', 'right']:
        side = i.spines[j]
        side.set_visible(False)
    i.set_title(years[count] + '\n{:,.0f} Road Accident Cases'.format(list(year_df.Cases)[count]), fontsize=12, color='grey', weight='bold')
    i.axis('off')
    count += 1

sns.lineplot(data = year_df, marker='o', x='Year', y='Cases', color = '#734dff', ax=ax6, label="Yearly Road Accidents");

for k in ['bottom', 'top', 'left', 'right']:
    side = ax6.spines[k]
    side.set_visible(False)
ax6.xaxis.set_ticks(year_df.Year);
ax6.legend(prop={'size': 12}, loc='best', edgecolor='white');
```

## Accident Cases over the past 5 years in US



### Year Analysis based on Severity

```
In [38]: accident_severity_df = geo_df.groupby(['year', 'Severity']).size().unstack()

In [39]: ax = accident_severity_df.plot(kind='barh', stacked=True, figsize=(12, 6),
                                         color=['#fcfa5d', '#ffe066', '#fab666', '#f68f6a'],
                                         rot=0);

ax.set_title('\nSeverity and Corresponding Accident \nPercentage for past 5 years in US\n', fontsize=20, color='grey');

for i in ['top', 'left', 'right']:
    side = ax.spines[i]
    side.set_visible(False)

ax.spines['bottom'].set_bounds(0, 800000);
ax.set_ylabel('Years', fontsize=15, color='grey');
ax.set_xlabel('Accident Cases', fontsize=15, color='grey');
ax.legend(prop={'size': 12.5}, loc='best', fancybox = True, title="Severity", title_fontsize=15, edgecolor='white');
ax.tick_params(axis='both', which='major', labelsize=12.5)
#ax.set_facecolor('#e6f2ed')

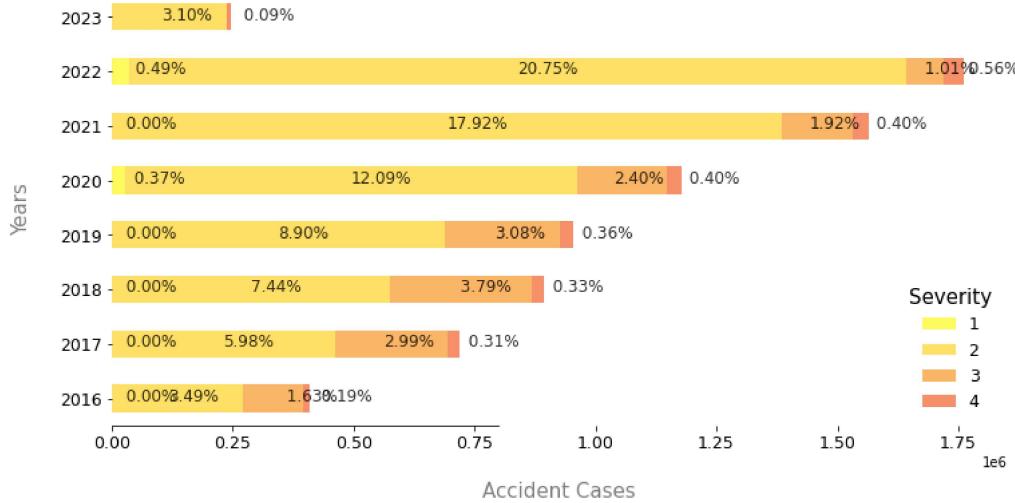
for p in ax.patches:
    width, height = p.get_width(), p.get_height()
    x, y = p.get_xy()
    var = width*100/df.shape[0]
    if var > 0:
        if var > 4:
            ax.text(x+width/2,
                    y+height/2-0.05,
                    '{:.2f}%'.format(width*100/df.shape[0]),
                    fontsize=12, color='black', alpha= 0.8)
        elif var > 1.8 and var < 3.5:
            ax.text(x+width/2-17000,
                    y+height/2-0.05,
                    '{:.2f}%'.format(width*100/df.shape[0]),
                    fontsize=12, color='black', alpha= 0.8)
        elif var>1.5 and var<1.8:
            ax.text(x+width/2+7000,
                    y+height/2-0.05,
                    '{:.2f}%'.format(width*100/df.shape[0]),
                    fontsize=12, color='black', alpha= 0.8)
        elif var>1:
            ax.text(x+width/2-20000,
                    y+height/2-0.05,
                    '{:.2f}%'.format(width*100/df.shape[0]),
                    fontsize=12, color='black', alpha= 0.8)
        else:
            ax.text(x+width/2+10000,
```

```

y+height/2-0.05,
' {:.2f}%' .format(width*100/df.shape[0]),
fontsize=12, color='black', alpha= 0.8)

```

## Severity and Corresponding Accident Percentage for past 5 years in US



In last 4 years (2017-2020) highly severe (Severity-4) accident cases in us remain in the range of 1.55% to 1.8%

45% of the total road accidents of last 5 years which occurred only in color:#122ecc">2020 moderately severe (Severity-2)

```
In [40]: year_df['accident/day'] = round(year_df['Cases']/(5*365))
year_df['accident/hour'] = round(year_df['Cases']/(5*365*24))
```

```
In [41]: fig, (ax1, ax2) = plt.subplots(1, 2, figsize = (12.5,6), dpi = 80)

count = 0
plots = ['accident/day', 'accident/hour']
plots_limit = [(-10, 500), (-0.5, 22.5)]
plots_bound = [(0, 500), (0, 20)]
plot_text = [60, 2.5]

colors = [[ '#ffb74b', '#ffd6a4', '#ceb1f2', '#a071ff', '#6f71f7'],
          ['#cd7cf2', '#f27ec8', '#fa70b3', '#ff5e86', '#ff1732']]

for i in [ax1, ax2]:
    sns.barplot(ax=i, y=year_df[plots[count]], x=year_df['Year'], palette=colors[count])

    var = plots[count].split('/')[-1].capitalize()

    for j in i.patches:
        i.text(j.get_x() + 0.06, j.get_height() - plot_text[count], \
               str(int(j.get_height())) + '\nAccidents\nPer {}'.format(var), fontsize=8.5, color='white', weight='bold')

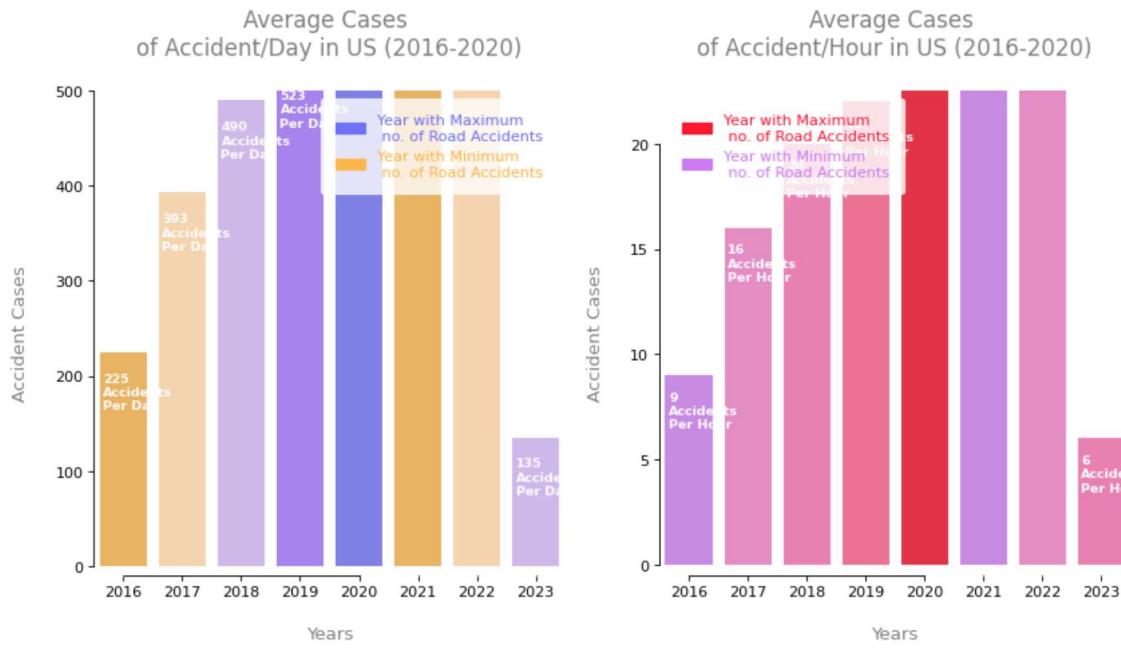
    i.axes.set_xlim(plots_limit[count])
    i.axes.set_ylabel('\nAccident Cases\n', fontsize=12, color='grey')
    i.axes.set_xlabel('\nYears\n', fontsize=12, color='grey')
    i.tick_params(axis='both', which='major', labelsize=10)

    i.set_title('\nAverage Cases \nof Accident/{} in US (2016-2020)\n'.format(var), fontsize =15, color='grey')
    i.spines['bottom'].set_bounds(0.005, 4)
    i.spines['left'].set_bounds(plots_bound[count])

    for k in ['top', 'right']:
        side = i.spines[k]
        side.set_visible(False)

    i.set_axisbelow(True)
    MA = mpatches.Patch(color=colors[count][-1], label='Year with Maximum\nno. of Road Accidents')
    MI = mpatches.Patch(color=colors[count][0], label='Year with Minimum\nno. of Road Accidents')
    i.legend(handles=[MA, MI], prop={'size': 10}, loc='best', borderpad=1,
             labelcolor=[colors[count][-1], colors[count][0]], edgecolor='white');

    count += 1
```



In the year 2020, averagely 432 accidents happened per day in US.

From 2019 to 2020 the average accident/day has increased 3 times in US.

#### Month Analysis

```
In [42]: month_df = pd.DataFrame(df.Start_Time.dt.month.value_counts()).reset_index().rename(columns={'index':'Month', 'Start_Time':'Cases'}).sort_values('Cases', ascending=False)
month_names = list(calendar.month_name)[1:]
month_df.Month = month_names
```

```
In [43]: fig, ax = plt.subplots(figsize = (10,8), dpi = 80)

cmap = cm.get_cmap('plasma', 12)
clrs = [matplotlib.colors.rgb2hex(cmap(i)) for i in range(cmap.N)]

ax=sns.barplot(x=month_df['Cases'], y=month_df['Month'], palette='plasma')

total = df.shape[0]
for p in ax.patches:
    plt.text(p.get_width()-17000, p.get_y()+0.4,
              '{:.2f}%'.format(p.get_width()*100/total), ha='center', va='center', fontsize=15, color='white', weight='bold')

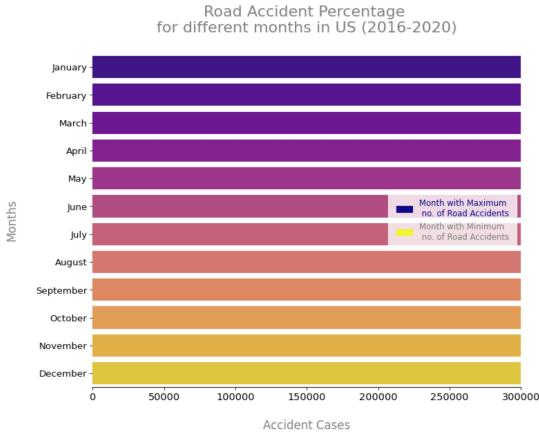
plt.title('\nRoad Accident Percentage \nfor different months in US (2016-2020)\n', size=20, color='grey')
plt.xlabel('\nAccident Cases\n', fontsize=15, color='grey')
plt.ylabel('\nMonths\n', fontsize=15, color='grey')
plt.xticks(fontsize=13)
plt.yticks(fontsize=12)
plt.xlim(0, 30000)

for i in ['top', 'left', 'right']:
    side = ax.spines[i]
    side.set_visible(False)

ax.set_axisbelow(True)
ax.spines['bottom'].set_bounds(0, 30000)
ax.grid(color='#b2d6c7', linewidth=1, axis='y', alpha=.3)

MA = mpatches.Patch(color=clrs[0], label='Month with Maximum\nno. of Road Accidents')
MI = mpatches.Patch(color=clrs[-1], label='Month with Minimum\nno. of Road Accidents')
```

```
ax.legend(handles=[MA, MI], prop={'size': 10.5}, loc='best', borderpad=1,
         labelcolor=[clrs[0], 'grey'], edgecolor='white');
```



Around 18% of the road accidents occurred in the month of December

July is month with least (3.54%) no. of road accidents in US.

#### Day Analysis

```
In [44]: day_df = pd.DataFrame(df.Start_Time.dt.day_name().value_counts()).reset_index().rename(columns={'index':'Day', 'Start_Time':'Cases'})
```

```
In [45]: fig, ax = plt.subplots(figsize = (12,6), dpi = 80)

ax=sns.barplot(y=day_df['Cases'], x=day_df['Day'], palette=['#D50000', '#FF1744', '#FF5252', '#ff7530', '#ffa245', '#50fa9d', '#7eedb0'])

total = df.shape[0]
for i in ax.patches:
    ax.text(i.get_x()+0.1, i.get_height()-20000, \
            str(round((i.get_height()/total)*100, 2))+'%', fontsize=15, weight='bold',
            color='white')

plt.ylim(-10000, 300000)
plt.title('\nRoad Accident Percentage \nfor different days over the week\n', size=20, color='grey')
plt.ylabel('\nAccident Cases\n', fontsize=15, color='grey')
plt.xlabel('\nDay of the Week\n', fontsize=15, color='grey')
plt.xticks(fontsize=13)
plt.yticks(fontsize=12)

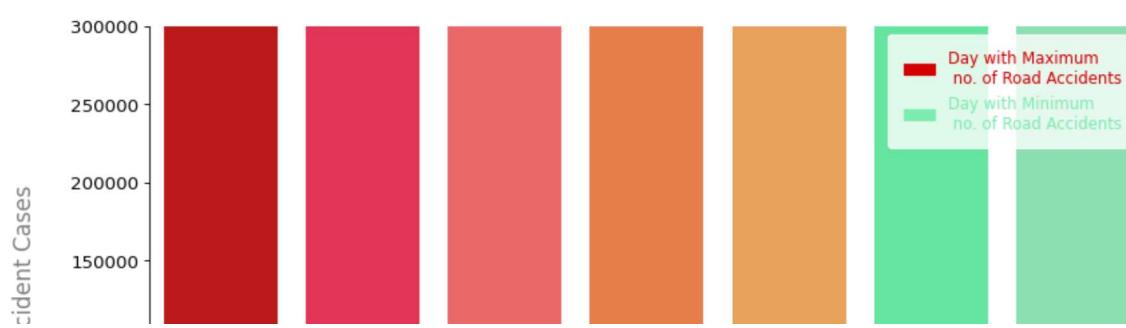
for i in ['top', 'right']:
    side = ax.spines[i]
    side.set_visible(False)

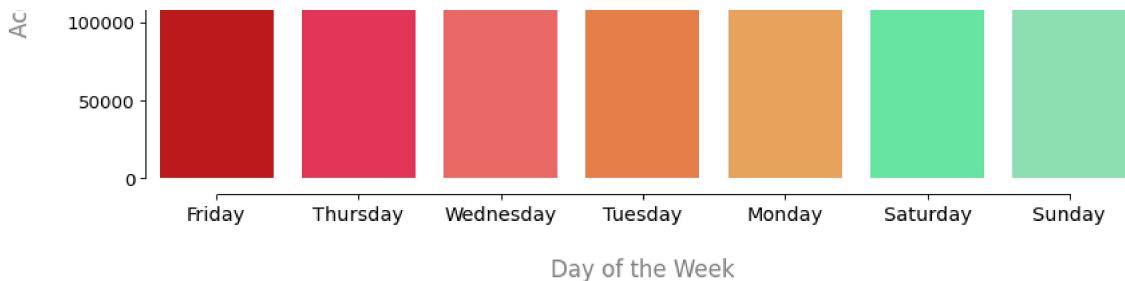
ax.set_axisbelow(True)
ax.spines['bottom'].set_bounds(0.005, 6)
ax.spines['left'].set_bounds(0, 300000)

MA = mpatches.Patch(color='#D50000', label='Day with Maximum\nno. of Road Accidents')
MI = mpatches.Patch(color='#7eedb0', label='Day with Minimum\nno. of Road Accidents')

ax.legend(handles=[MA, MI], prop={'size': 10.5}, loc='best', borderpad=1, edgecolor='white', labelcolor=['#D50000', '#7eedb0']);
```

Road Accident Percentage  
for different days over the week





Working Days of the week have almost 2 times higher accident percentage, compared with the Weekend Days which is as our expectation.

Only around 17% road accident records occurred in weekend

Thursday of a week is having the highest percentage of road accidents.

#### Hour Analysis

```
In [46]: hour_df = pd.DataFrame(df.Start_Time.dt.hour.value_counts()).reset_index().rename(columns={'index':'Hours', 'Start_Time':'Cases'}).sort_values('Cases', ascending=False)

In [47]: fig, ax = plt.subplots(figsize = (12,6), dpi = 80)

clrs = []
for x in hour_df['Cases']:
    if int(hour_df[hour_df['Cases']==x]['Hours']) <= 11:
        if (x == max(list(hour_df['Cases'])[:12])):
            clrs.append('grey')
        else:
            clrs.append('#05ffda')
    else:
        if (x == max(list(hour_df['Cases'])[12:])):
            clrs.append('grey')
        else:
            clrs.append('#2426b3')
ax=sns.barplot(y=hour_df['Cases'], x=hour_df['Hours'], palette=clrs)
ax1 = ax.twinx()

sns.lineplot(data = hour_df, marker='o', x='Hours', y='Cases', color = 'white', alpha = 1)

total = df.shape[0]
for i in ax.patches:
    ax.text(i.get_x(), i.get_height()+1000, \
            str(round((i.get_height()/total)*100, 2))+'%', fontsize=10,
            color='black')

plt.ylim(1000, 150000)
plt.title('\nRoad Accident Percentage \nfor different hours along the day\n', size=20, color='grey')

ax1.axes.yaxis.set_visible(False)
ax.set_xlabel('\nHours\n', fontsize=15, color='grey')
ax.set_ylabel('\nAccident Cases\n', fontsize=15, color='grey')

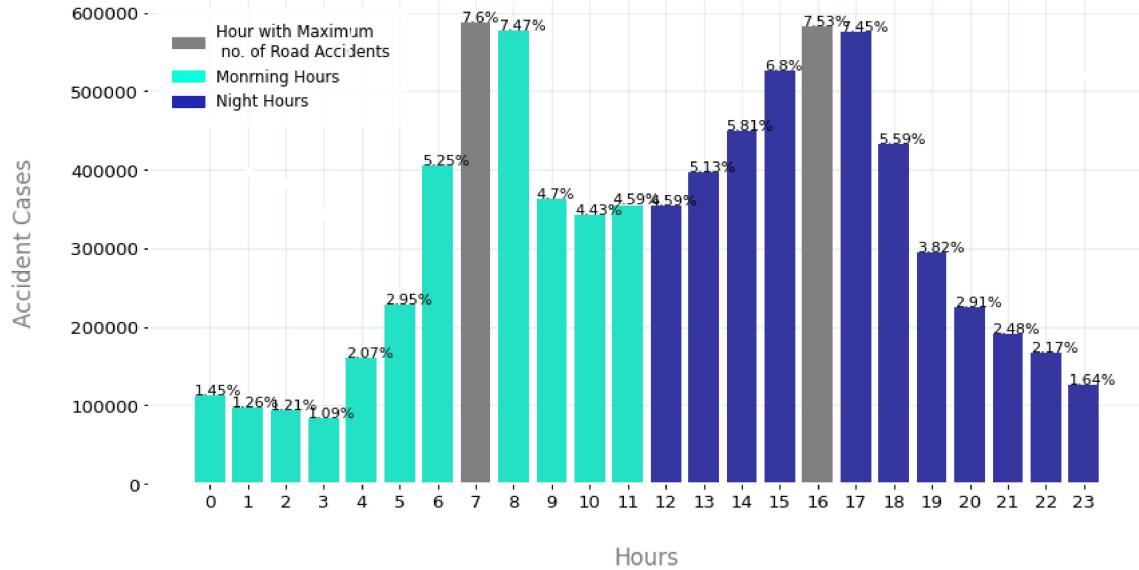
for i in ['bottom', 'top', 'left', 'right']:
    ax.spines[i].set_color('white')
    ax.spines[i].set_linewidth(1.5)
    ax1.spines[i].set_color('white')
    ax1.spines[i].set_linewidth(1.5)

ax.set_axisbelow(True)
ax.grid(color="#b2d6c7", linewidth=1, alpha=.3)
ax.tick_params(axis='both', which='major', labelsize=12)

MA = mpatches.Patch(color='grey', label='Hour with Maximum\nno. of Road Accidents')
MO = mpatches.Patch(color='#05ffda', label='Morning Hours')
NI = mpatches.Patch(color='#2426b3', label='Night Hours')

ax.legend(handles=[MA, MO, NI], prop={'size': 10.5}, loc='upper left', borderpad=1, edgecolor='white');
```

## Road Accident Percentage for different hours along the day



Around 18% of the road accidents occurred in between 6:00AM to 9:00AM

In evening, around 27% of the road accidents occurred in between 3:00PM6:00PM

### Road Condition Analysis

```
In [48]: fig, ((ax1, ax2), (ax3, ax4), (ax5, ax6), (ax7, ax8)) = plt.subplots(nrows=4, ncols=2, figsize = (16,20))

road_conditions = ['Bump', 'Crossing', 'Give_Way', 'Junction', 'Stop', 'No_Exit', 'Traffic_Signal', 'Turning_Loop']
colors = [('#6662b3', '#00FF00'), ('#7881ff', '#0e1ce8'), ('#18f2c7', '#09ad8c'), ('#08ff83', '#02a352'), ('#ffcf87', '#f5ab3d'),
          ('#f5f53d', '#949410'), ('#ff9187', '#ffc7c2'), ('tomato', '#008000')]

count = 0

def func(pct, allvals):
    absolute = int(round(pct/100*np.sum(allvals), 2))
    return "{:.2f}%\n({:,d} Cases)".format(pct, absolute)

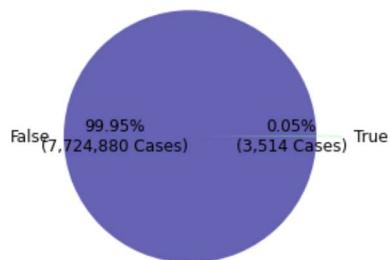
for i in [ax1, ax2, ax3, ax4, ax5, ax6, ax7, ax8]:
    size = list(df[road_conditions[count]].value_counts())
    if len(size) != 2:
        size.append(0)
    labels = ['False', 'True']

    i.pie(size, labels = labels, colors = colors[count],
          autopct = lambda pct: func(pct, size), labeldistance=1.1,
          textprops={'fontsize': 12}, explode=[0, 0.2])

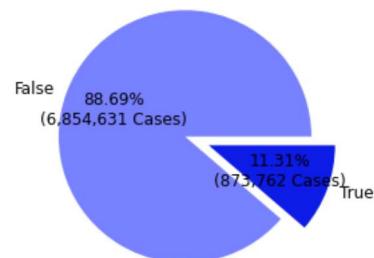
    title = '\nPresence of {}'.format(road_conditions[count])
    i.set_title(title, fontsize = 18, color='grey')

    count += 1
```

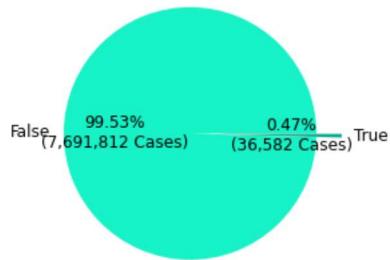
Presence of Bump



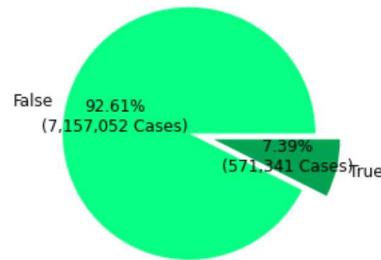
Presence of Crossing



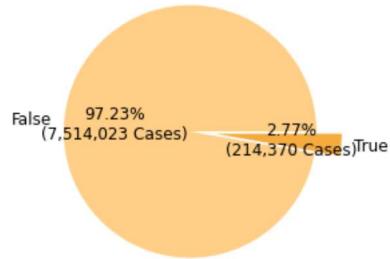
Presence of Give\_Way



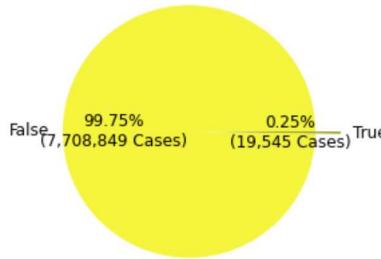
Presence of Junction



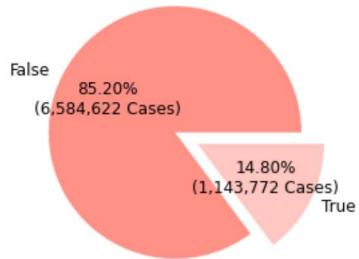
Presence of Stop



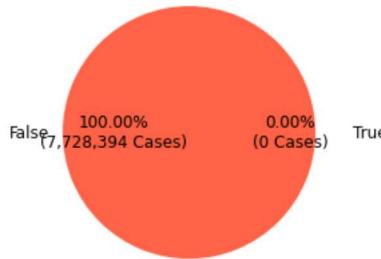
Presence of No\_Exit



Presence of Traffic\_Signal



Presence of Turning\_Loop



Almost in every case (99.98%) Bumper was absent in the accident spot.

In 5.7% cases, road accidents happened near the crossing

In 98.83% cases, there were no Stop near the accident area.

#### Weather Analysis

```
In [49]: def generate_intervals_labels(attribute, split, gap):
    var_min = min(df[attribute])
    intervals = [int(var_min)]
    labels = []
    for i in range(1, split+1):
        lower_limit = int(var_min + ((i-1)*gap))
        if i==split:
            upper_limit = int(max(df[attribute]))
```

```

    else:
        upper_limit = int(var_min + (i*gap))

    #intervals
    intervals.append(upper_limit)

    # Labels
    label_var = '({} to {})'.format(lower_limit, upper_limit)
    labels.append(label_var)

return intervals, labels

```

```

In [50]: def Feature_Bin_Plot(dataframe, attribute, clrs, intervals, labels, fig_size, font_size, y_lim, adjust, title):
    new_df = dataframe.copy()
    xlabel = 'Different {} Grouped Value'.format(attribute)
    new_df[xlabel] = pd.cut(x = new_df[attribute], bins = intervals, labels = labels, include_lowest=True)
    temp_df = pd.DataFrame(new_df[xlabel].value_counts()).reset_index().rename(columns={'index':'Bins', xlabel:'Cases'}).sort_values('Bins')

    count,max_index = 0, 0
    cases_list = list(temp_df['Cases'])
    for i in cases_list:
        if i == max(temp_df['Cases']):
            max_index = count
            break
        count += 1

    total = len(new_df[xlabel])
    plt.figure(figsize=fig_size)

#    clrs = ['mediumspringgreen' if (x < max(temp_df['Cases'])) else 'grey' for x in temp_df['Cases']]
    cmap = cm.get_cmap(clrs, len(intervals))
    clrs = [matplotlib.colors.rgb2hex(cmap(i)) for i in range(cmap.N)]

    ax=sns.barplot(y=temp_df['Cases'], x=temp_df['Bins'], palette=clrs);

    for i in ax.patches:
        ax.text(i.get_x() + adjust[0], i.get_height() + adjust[-1], \
                '{:,d}\nCases\n({}%)'.format(int(i.get_height()), round(100*i.get_height()/total, 2)), fontsize=font_size,
               color='black')

    plt.title(title, size=20, color='grey')
    plt.ylim(y_lim)

    for i in ['bottom', 'top', 'left', 'right']:
        ax.spines[i].set_color('white')
        ax.spines[i].set_linewidth(1.5)

    ax.set_xlabel('\n{}\n'.format(xlabel), fontsize=15, color='grey')
    ax.set_ylabel('\nAccident Cases\n', fontsize=15, color='grey')

    ax.set_axisbelow(True)
    ax.grid(color='#b2d6c7', linewidth=1, alpha=.3)
    ax.tick_params(axis='both', which='major', labelsize=12)
    MA = mpatches.Patch(color=clrs[max_index], label='{} Range with Maximum\nno. of Road Accidents'.format(attribute))
    ax.legend(handles=[MA], prop={'size': 10.5}, loc='best', borderpad=1,
              labelcolor=[clrs[max_index]], edgecolor='white');

```

```

In [51]: temp_intervals, temp_labels = generate_intervals_labels('Temperature(F)', 9, 30)

Feature_Bin_Plot(df, 'Temperature(F)', 'gist_ncar',temp_intervals, temp_labels,
                  (12, 6), 14, (-20000, 800000), [0.01, 10000], '\nPercentage of different Temperature range\n')

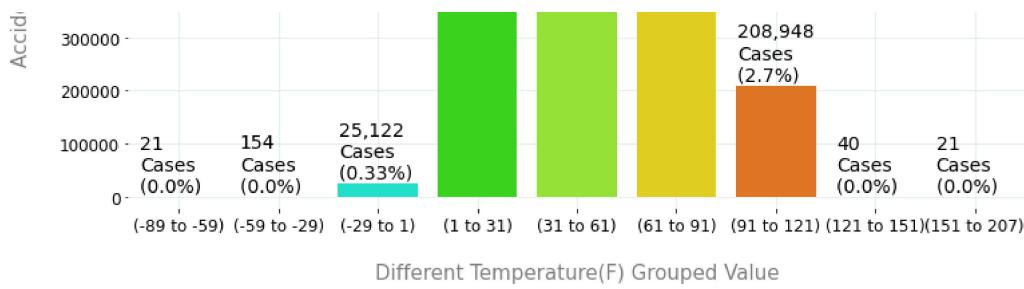
```

3,907,749  
Cases  
(50.56%)

2,906,028  
Cases  
(37.6%)

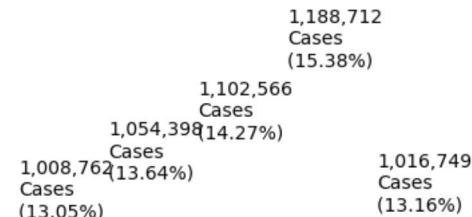
Percentage of different Temperature range





```
In [52]: Humidity_intervals, Humidity_labels = generate_intervals_labels('Humidity(%)', 10, 10)

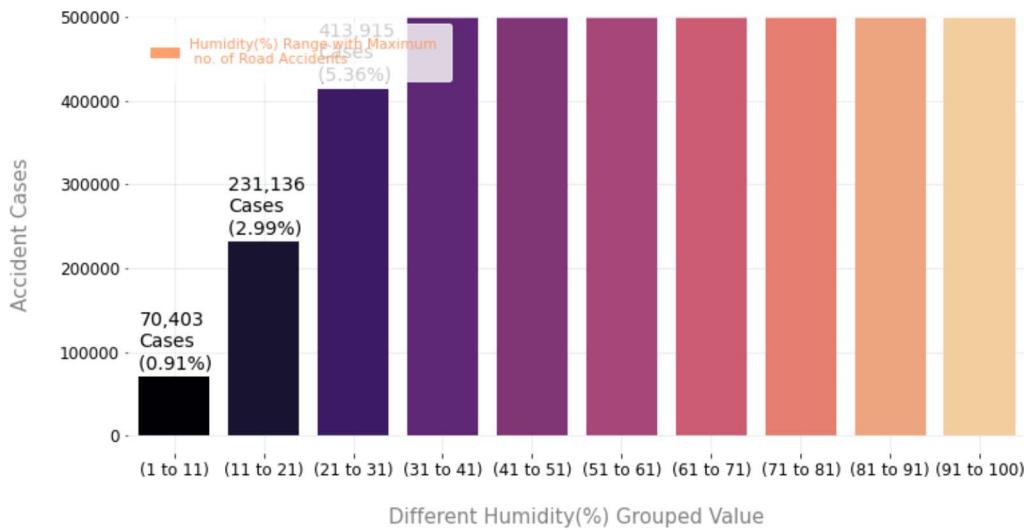
Feature_Bin_Plot(df, 'Humidity(%)', 'magma', Humidity_intervals, Humidity_labels,
(12, 6), 14, (-20000, 500000), [0.01, 10000], '\nPercentage of different Humidity range\n')
```



840,871  
Cases  
(10.88%)

626,738  
Cases  
(8.11%)

Percentage of different Humidity range



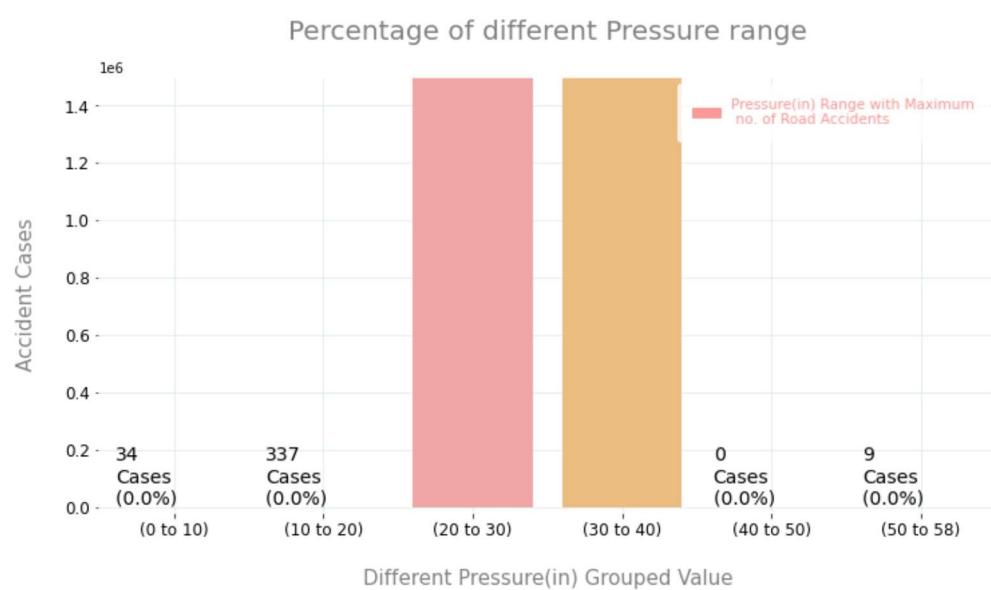
In maximum cases (15.74%) of road accident, the humidity range is between 81% - 91%

```
In [53]: Pressure_intervals, Pressure_labels = generate_intervals_labels('Pressure(in)', 6, 10)

Feature_Bin_Plot(df, 'Pressure(in)', 'Paired', Pressure_intervals, Pressure_labels,
(12, 6), 14, (-20000, 1500000), [0.01, 10000], '\nPercentage of different Pressure range\n')
```

5,383,660  
Cases  
(69.66%)

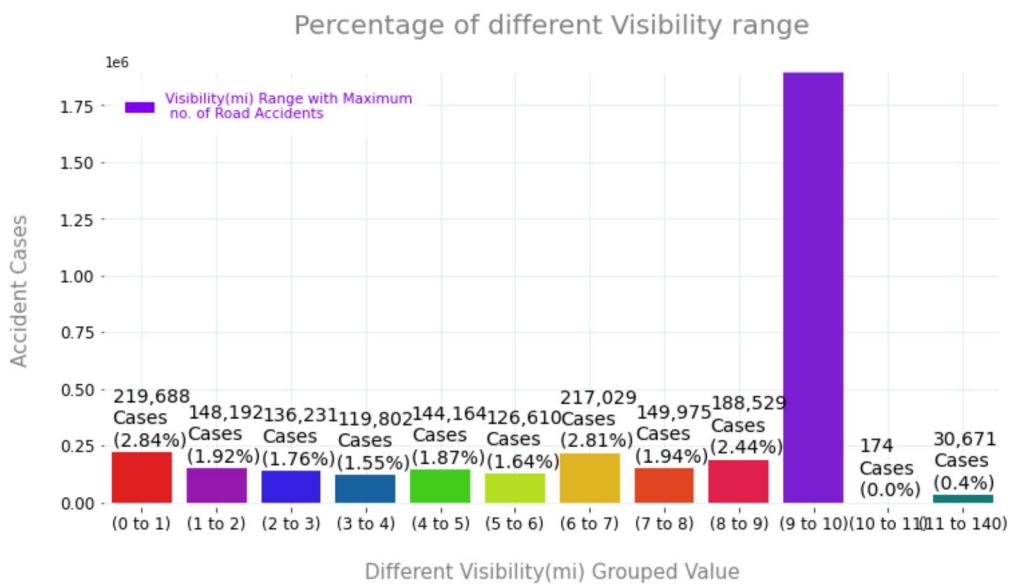
2,203,654  
Cases  
(28.51%)



```
In [56]: Visibility_intervals, Visibility_labels = generate_intervals_labels('Visibility(mi)', 12, 1)

Feature_Bin_Plot(df, 'Visibility(mi)', 'prism', Visibility_intervals, Visibility_labels,
(12, 6), 14, (-20000, 1900000), [0.01, 30000], '\nPercentage of different Visibility range\n')
```

6,070,231  
Cases  
(78.54%)



In maximum cases (77.71%) of road accident, the Visibility range is between 9(mi) - 10(mi)

```
In [57]: weather_condition_df = pd.DataFrame(df.Weather_Condition.value_counts().head(10).reset_index().rename(columns={'index':'Weather_Condition'}))
```

```
In [58]: fig, ax = plt.subplots(figsize = (10,8), dpi = 80)
```

```
cmap = cm.get_cmap('rainbow_r', 10)
clrs = [matplotlib.colors.rgb2hex(cmap(i)) for i in range(cmap.N)]  
  
ax=sns.barplot(x=weather_condition_df['Cases'], y=weather_condition_df['Weather_Condition'], palette='rainbow_r')  
  
total = df.shape[0]
for p in ax.patches:
    plt.text(p.get_width()+40000, p.get_y()+0.4,
              '{:.2f}'.format(p.get_width()*100/total), ha='center', va='center', fontsize=15, color='black', weight='bold')
```

```

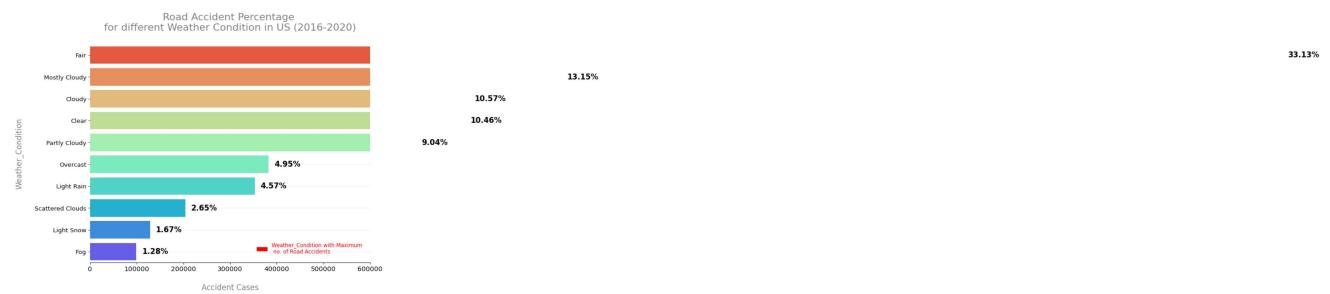
plt.title('Road Accident Percentage\nfor different Weather Condition in US (2016-2020)\n', size=20, color='grey')
plt.xlabel('Accident Cases\n', fontsize=15, color='grey')
plt.ylabel('Weather Condition\n', fontsize=15, color='grey')
plt.xticks(fontsize=13)
plt.yticks(fontsize=12)
plt.xlim(0, 600000)

for i in ['top', 'left', 'right']:
    side = ax.spines[i]
    side.set_visible(False)

ax.set_axisbelow(True)
ax.spines['bottom'].set_bounds(0, 600000)
ax.grid(color='#b2d6c7', linewidth=1, axis='y', alpha=.3)

MA = mpatches.Patch(color=clrs[0], label='Weather Condition with Maximum\nno. of Road Accidents')
ax.legend(handles=[MA], prop={'size': 10.5}, loc='best', borderpad=1,
          labelcolor=[clrs[0]], edgecolor='white');

```



In most of the cases (30.69%) the weather was Fair and approximately in 13% cases it was mostly cloudy