

```
In [1]: import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import plotly.express as px
```

```
In [3]: df = pd.read_csv("US_Accidents_March23.csv")
```

```
In [4]: df
```

```
Out[4]:
```

	ID	Source	Severity	Start_Time	End_Time	Start_Lat	Start_Lng	End_Lat	End_Lng
0	A-1	Source2	3	2016-02-08 05:46:00	2016-02-08 11:00:00	39.865147	-84.058723	NaN	NaN
1	A-2	Source2	2	2016-02-08 06:07:59	2016-02-08 06:37:59	39.928059	-82.831184	NaN	NaN
2	A-3	Source2	2	2016-02-08 06:49:27	2016-02-08 07:19:27	39.063148	-84.032608	NaN	NaN
3	A-4	Source2	3	2016-02-08 07:23:34	2016-02-08 07:53:34	39.747753	-84.205582	NaN	NaN
4	A-5	Source2	2	2016-02-08 07:39:07	2016-02-08 08:09:07	39.627781	-84.188354	NaN	NaN
...
7728389	A-7777757	Source1	2	2019-08-23 18:03:25	2019-08-23 18:32:01	34.002480	-117.379360	33.99888	-117.379360
7728390	A-7777758	Source1	2	2019-08-23 19:11:30	2019-08-23 19:38:23	32.766960	-117.148060	32.76555	-117.148060
7728391	A-7777759	Source1	2	2019-08-23 19:00:21	2019-08-23 19:28:49	33.775450	-117.847790	33.77740	-117.847790
7728392	A-7777760	Source1	2	2019-08-23 19:00:21	2019-08-23 19:29:42	33.992460	-118.403020	33.98311	-118.403020
7728393	A-7777761	Source1	2	2019-08-23 18:52:06	2019-08-23 19:21:31	34.133930	-117.230920	34.13736	-117.230920

7728394 rows × 46 columns

```
In [5]: print(df.head())
print(df.info())
```

```

      ID  Source  Severity  Start_Time  End_Time \
0  A-1  Source2         3  2016-02-08 05:46:00  2016-02-08 11:00:00
1  A-2  Source2         2  2016-02-08 06:07:59  2016-02-08 06:37:59
2  A-3  Source2         2  2016-02-08 06:49:27  2016-02-08 07:19:27
3  A-4  Source2         3  2016-02-08 07:23:34  2016-02-08 07:53:34
4  A-5  Source2         2  2016-02-08 07:39:07  2016-02-08 08:09:07
```



	Start_Lat	Start_Lng	End_Lat	End_Lng	Distance(mi)	...	Roundabout	\
0	39.865147	-84.058723	NaN	NaN	0.01	...	False	
1	39.928059	-82.831184	NaN	NaN	0.01	...	False	
2	39.063148	-84.032608	NaN	NaN	0.01	...	False	
3	39.747753	-84.205582	NaN	NaN	0.01	...	False	
4	39.627781	-84.188354	NaN	NaN	0.01	...	False	

	Station	Stop	Traffic_Calming	Traffic_Signal	Turning_Loop	Sunrise_Sunset	\
0	False	False	False	False	False	Night	
1	False	False	False	False	False	Night	
2	False	False	False	True	False	Night	
3	False	False	False	False	False	Night	
4	False	False	False	True	False	Day	

	Civil_Twilight	Nautical_Twilight	Astronomical_Twilight
0	Night	Night	Night
1	Night	Night	Day
2	Night	Day	Day
3	Day	Day	Day
4	Day	Day	Day

```
[5 rows x 46 columns]
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7728394 entries, 0 to 7728393
Data columns (total 46 columns):
```

#	Column	Dtype
0	ID	object
1	Source	object
2	Severity	int64
3	Start_Time	object
4	End_Time	object
5	Start_Lat	float64
6	Start_Lng	float64
7	End_Lat	float64
8	End_Lng	float64
9	Distance(mi)	float64
10	Description	object
11	Street	object
12	City	object
13	County	object
14	State	object
15	Zipcode	object
16	Country	object
17	Timezone	object
18	Airport_Code	object
19	Weather_Timestamp	object
20	Temperature(F)	float64
21	Wind_Chill(F)	float64
22	Humidity(%)	float64
23	Pressure(in)	float64
24	Visibility(mi)	float64
25	Wind_Direction	object
26	Wind_Speed(mph)	float64
27	Precipitation(in)	float64
28	Weather_Condition	object
29	Amenity	bool
30	Bump	bool
31	Crossing	bool
32	Give_Way	bool
33	Junction	bool
34	No_Exit	bool



```

35 Railway bool
36 Roundabout bool
37 Station bool
38 Stop bool
39 Traffic_Calming bool
40 Traffic_Signal bool
41 Turning_Loop bool
42 Sunrise_Sunset object
43 Civil_Twilight object
44 Nautical_Twilight object
45 Astronomical_Twilight object
dtypes: bool(13), float64(12), int64(1), object(20)
memory usage: 2.0+ GB
None

```

```
In [6]: print(df['Start_Time'].head())
```

```

0    2016-02-08 05:46:00
1    2016-02-08 06:07:59
2    2016-02-08 06:49:27
3    2016-02-08 07:23:34
4    2016-02-08 07:39:07
Name: Start_Time, dtype: object

```

```
In [7]: df['Start_Time'] = pd.to_datetime(df['Start_Time'], errors='coerce')
```

```
In [8]: print(df[df['Start_Time'].isna()])
```

```

      ID  Source  Severity  Start_Time  \
3639775  A-3649658  Source1         2      NaT
3639776  A-3649659  Source1         4      NaT
3639777  A-3649660  Source1         3      NaT
3639778  A-3649661  Source1         3      NaT
3639779  A-3649662  Source1         3      NaT
...      ...      ...      ...      ...
6834080  A-6883265  Source1         2      NaT
6834081  A-6883266  Source1         2      NaT
6834082  A-6883267  Source1         2      NaT
6834083  A-6883268  Source1         2      NaT
6834084  A-6883269  Source1         2      NaT

      End_Time  Start_Lat  Start_Lng  End_Lat  \
3639775  2017-07-23 10:21:01.000000000  34.062650 -118.000680  34.061940
3639776  2017-07-23 11:18:46.000000000  33.931460 -118.390730  33.931530
3639777  2017-07-23 11:36:01.000000000  33.617890 -117.711160  33.611590
3639778  2017-07-23 14:36:01.000000000  33.697590 -117.940060  33.695730
3639779  2017-07-23 17:02:16.000000000  34.035340 -118.329820  34.034960
...      ...      ...      ...      ...
6834080  2020-11-24 05:07:29.000000000  25.943633 -80.205311  25.942485
6834081  2020-11-19 19:58:52.000000000  39.974916 -75.341137  40.036633
6834082  2020-11-03 18:47:44.000000000  29.831816 -95.567133  29.831840
6834083  2020-11-17 02:44:13.000000000  46.556711 -92.603733  46.562231
6834084  2020-11-25 04:07:32.000000000  38.566700 -121.504014  38.567670

      End_Lng  Distance(mi)  ...  Roundabout  Station  Stop  \
3639775 -118.000700         0.049  ...      False   False  False
3639776 -118.401020         0.590  ...      False   False  False
3639777 -117.704200         0.591  ...      False   False  False
3639778 -117.935590         0.287  ...      False   False  False
3639779 -118.337590         0.446  ...      False   False  False
...      ...      ...      ...      ...      ...      ...
6834080 -80.204455         0.095  ...      False   False  False

```

6834081	-75.355487	4.331	...	False	False	False
6834082	-95.565826	0.078	...	False	False	False
6834083	-92.595371	0.551	...	False	False	False
6834084	-121.506734	0.162	...	False	False	False

	Traffic_Calming	Traffic_Signal	Turning_Loop	Sunrise_Sunset	\
3639775	False	False	False	Night	
3639776	False	False	False	Night	
3639777	False	False	False	Night	
3639778	False	False	False	Day	
3639779	False	False	False	Day	
...	
6834080	False	False	False	Day	
6834081	False	False	False	Night	
6834082	False	False	False	Day	
6834083	False	False	False	Night	
6834084	False	False	False	Night	

	Civil_Twilight	Nautical_Twilight	Astronomical_Twilight
3639775	Night	Night	Day
3639776	Night	Day	Day
3639777	Day	Day	Day
3639778	Day	Day	Day
3639779	Day	Day	Day
...
6834080	Day	Day	Day
6834081	Night	Night	Day
6834082	Day	Day	Day
6834083	Night	Night	Night
6834084	Night	Night	Night

[743166 rows x 46 columns]

```
In [9]: df = df.dropna(subset=['Start_Time'])
```

```
In [10]: df['Start_Time'] = pd.to_datetime(df['Start_Time'])
```

C:\Users\vivek\AppData\Local\Temp\ipykernel_4296\2394841556.py:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
df['Start_Time'] = pd.to_datetime(df['Start_Time'])

```
In [11]: df['Hour'] = df['Start_Time'].dt.hour  
df['Weekday'] = df['Start_Time'].dt.day_name()
```

C:\Users\vivek\AppData\Local\Temp\ipykernel_4296\3270295720.py:1: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
df['Hour'] = df['Start_Time'].dt.hour

C:\Users\vivek\AppData\Local\Temp\ipykernel_4296\3270295720.py:2: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead



See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
df['Weekday'] = df['Start_Time'].dt.day_name()

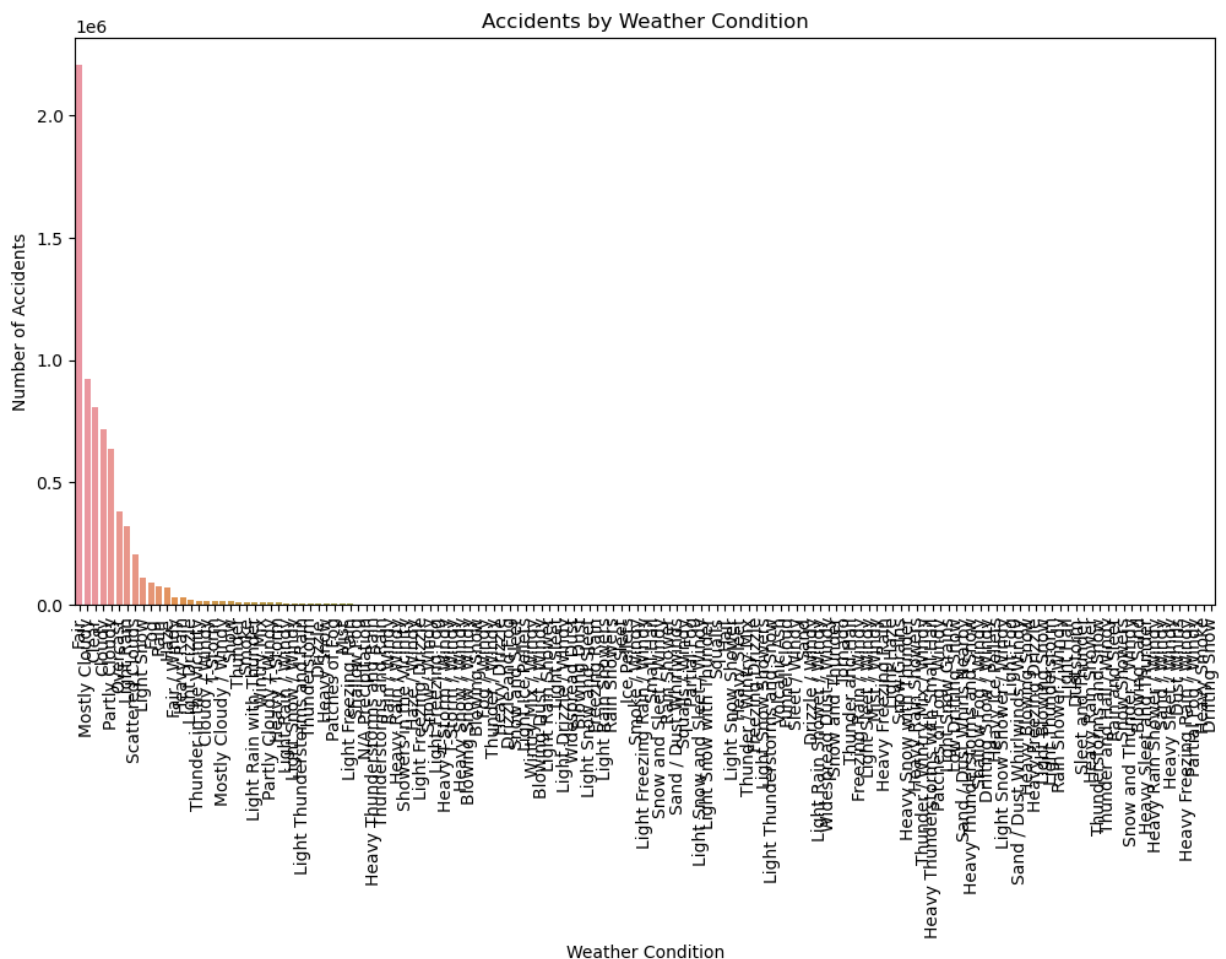
```
In [12]: df['Weekday'] = df['Start_Time'].dt.day_name()
```

C:\Users\vivek\AppData\Local\Temp\ipykernel_4296\2272440486.py:1: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
df['Weekday'] = df['Start_Time'].dt.day_name()

```
In [13]: weather_accidents = df['Weather_Condition'].value_counts().sort_values(ascending=False)
plt.figure(figsize=(12,6))
sns.barplot(x=weather_accidents.index, y=weather_accidents.values)
plt.xticks(rotation=90)
plt.title('Accidents by Weather Condition')
plt.xlabel('Weather Condition')
plt.ylabel('Number of Accidents')
plt.show()
```



```
In [14]: print(df.columns)
```

```
Index(['ID', 'Source', 'Severity', 'Start_Time', 'End_Time', 'Start_Lat',
       'Start_Lng', 'End_Lat', 'End_Lng', 'Distance(mi)', 'Description',
       'Street', 'City', 'County', 'State', 'Zipcode', 'Country', 'Timezone',
       'Airport_Code', 'Weather_Timestamp', 'Temperature(F)', 'Wind_Chill(F)'])
```



```

'Humidity(%)', 'Pressure(in)', 'Visibility(mi)', 'Wind_Direction',
'Wind_Speed(mph)', 'Precipitation(in)', 'Weather_Condition', 'Amenity',
'Bump', 'Crossing', 'Give_Way', 'Junction', 'No_Exit', 'Railway',
'Roundabout', 'Station', 'Stop', 'Traffic_Calming', 'Traffic_Signal',
'Turning_Loop', 'Sunrise_Sunset', 'Civil_Twilight', 'Nautical_Twigh
t',
'Astronomical_Twilight', 'Hour', 'Weekday'],
dtype='object')

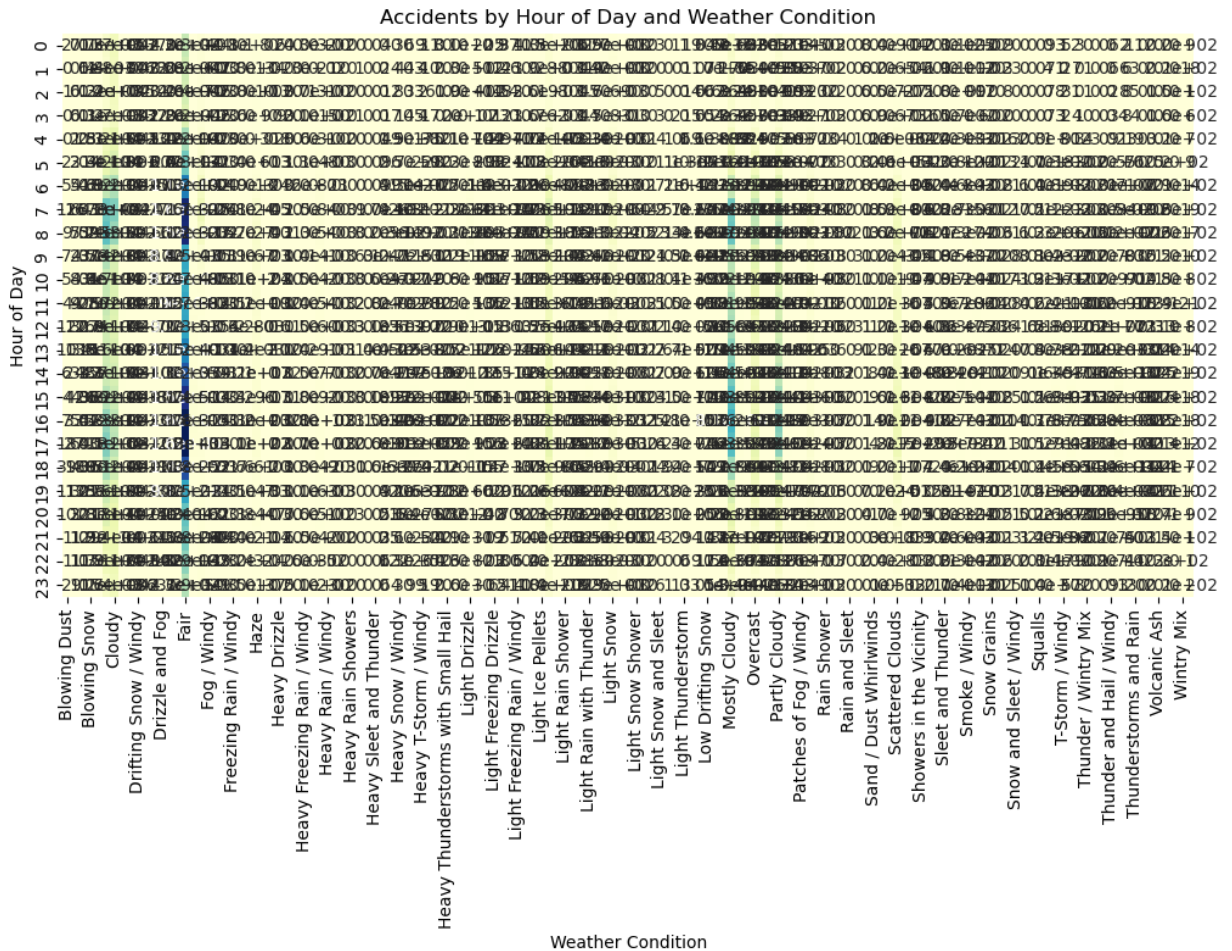
```

In [15]: `hour_weather_accidents = df.groupby(['Hour', 'Weather_Condition']).size().unstack()`

```

plt.figure(figsize=(12, 6))
sns.heatmap(hour_weather_accidents, cmap="YlGnBu", annot=True, cbar=False)
plt.title('Accidents by Hour of Day and Weather Condition')
plt.xlabel('Weather Condition')
plt.ylabel('Hour of Day')
plt.show()

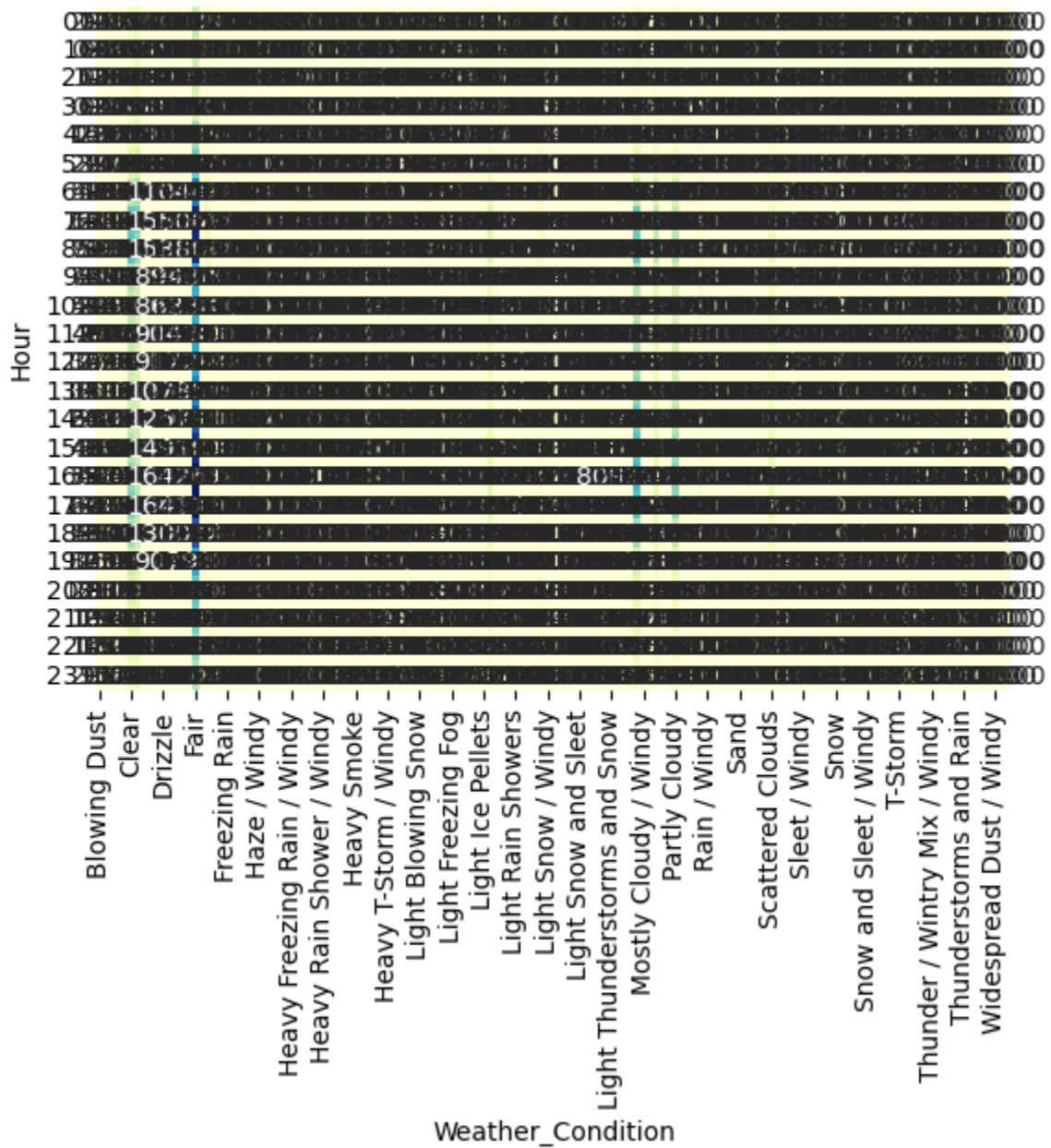
```



In [16]: `sns.heatmap(hour_weather_accidents, cmap="YlGnBu", annot=True, fmt=".2f", cbar`

Out[16]: `<Axes: xlabel='Weather_Condition', ylabel='Hour'>`



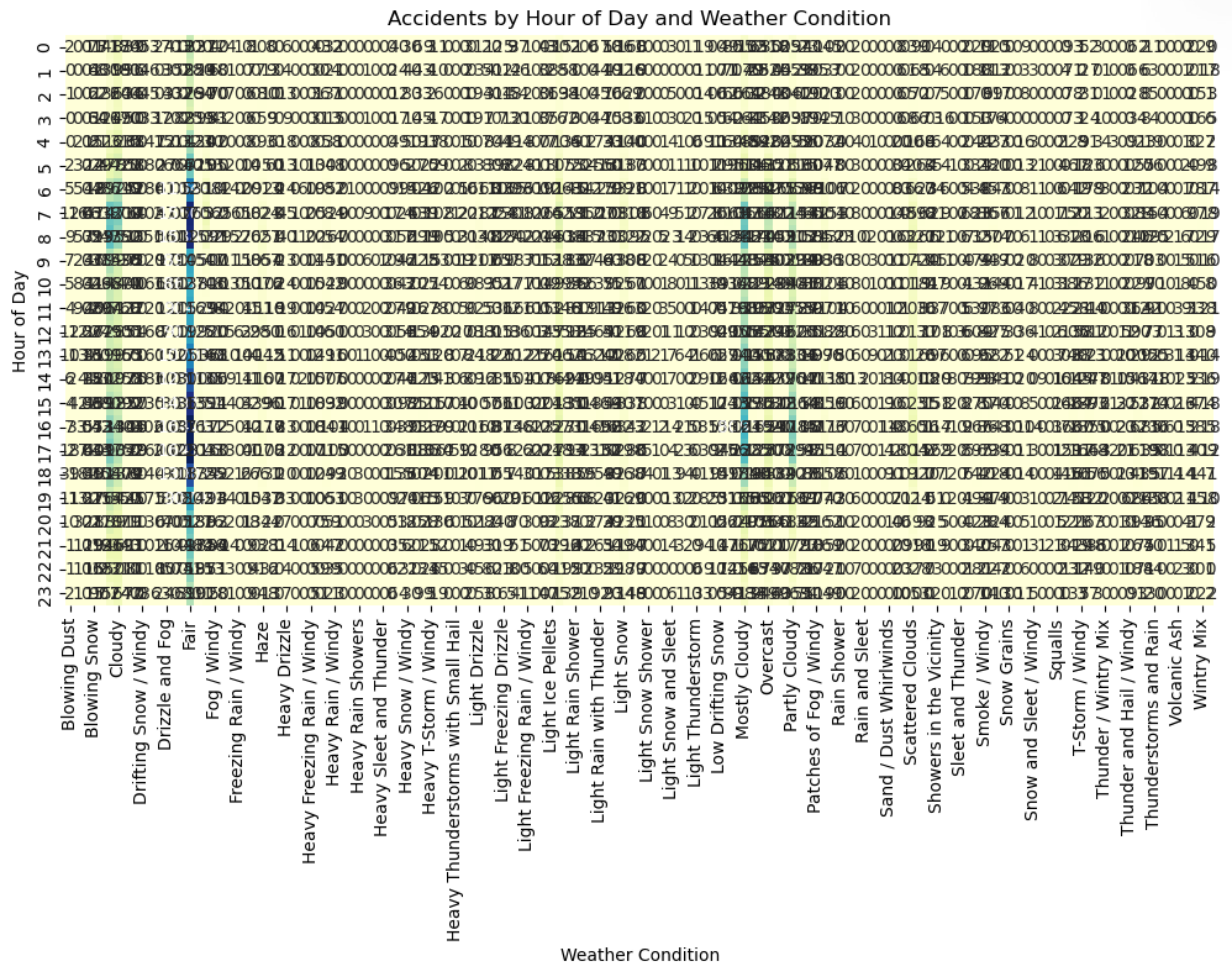


```
In [17]: hour_weather_accidents = df.groupby(['Hour', 'Weather_Condition']).size().unstack()

# Convert the grouped data to integers
hour_weather_accidents = hour_weather_accidents.astype(int)

# Plot the heatmap
plt.figure(figsize=(12, 6))
sns.heatmap(hour_weather_accidents, cmap="YlGnBu", annot=True, fmt="d", cbar=True)
plt.title('Accidents by Hour of Day and Weather Condition')
plt.xlabel('Weather Condition')
plt.ylabel('Hour of Day')
plt.show()
```





```
In [18]: condition_columns = [col for col in df.columns if 'Condition' in col]
print(condition_columns)

['Weather_Condition']
```

```
In [19]: print(df.columns)

Index(['ID', 'Source', 'Severity', 'Start_Time', 'End_Time', 'Start_Lat',
       'Start_Lng', 'End_Lat', 'End_Lng', 'Distance(mi)', 'Description',
       'Street', 'City', 'County', 'State', 'Zipcode', 'Country', 'Timezone',
       'Airport_Code', 'Weather_Timestamp', 'Temperature(F)', 'Wind_Chill(F)',
       'Humidity(%)', 'Pressure(in)', 'Visibility(mi)', 'Wind_Direction',
       'Wind_Speed(mph)', 'Precipitation(in)', 'Weather_Condition', 'Amenity',
       'Bump', 'Crossing', 'Give_Way', 'Junction', 'No_Exit', 'Railway',
       'Roundabout', 'Station', 'Stop', 'Traffic_Calming', 'Traffic_Signal',
       'Turning_Loop', 'Sunrise_Sunset', 'Civil_Twilight', 'Nautical_Twilight',
       'Astronomical_Twilight', 'Hour', 'Weekday'],
      dtype='object')
```

```
In [20]: print(df.columns)

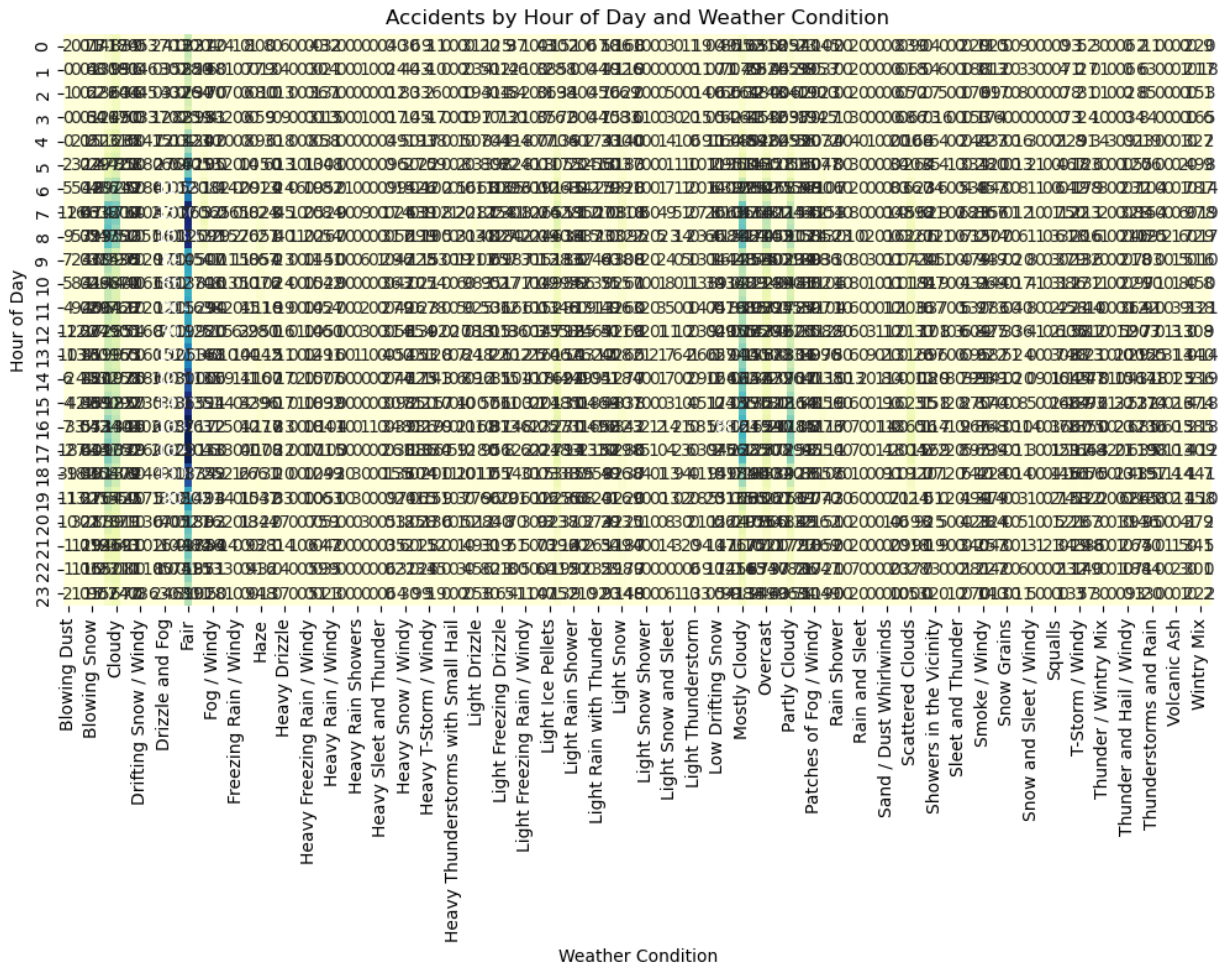
Index(['ID', 'Source', 'Severity', 'Start_Time', 'End_Time', 'Start_Lat',
       'Start_Lng', 'End_Lat', 'End_Lng', 'Distance(mi)', 'Description',
       'Street', 'City', 'County', 'State', 'Zipcode', 'Country', 'Timezone',
       'Airport_Code', 'Weather_Timestamp', 'Temperature(F)', 'Wind_Chill(F)',
       'Humidity(%)', 'Pressure(in)', 'Visibility(mi)', 'Wind_Direction',
       'Wind_Speed(mph)', 'Precipitation(in)', 'Weather_Condition', 'Amenity',
       'Bump', 'Crossing', 'Give_Way', 'Junction', 'No_Exit', 'Railway',
       'Roundabout', 'Station', 'Stop', 'Traffic_Calming', 'Traffic_Signal',
       'Turning_Loop', 'Sunrise_Sunset', 'Civil_Twilight', 'Nautical_Twilight',
```



```
t',
    'Astronomical_Twilight', 'Hour', 'Weekday'],
    dtype='object')
```

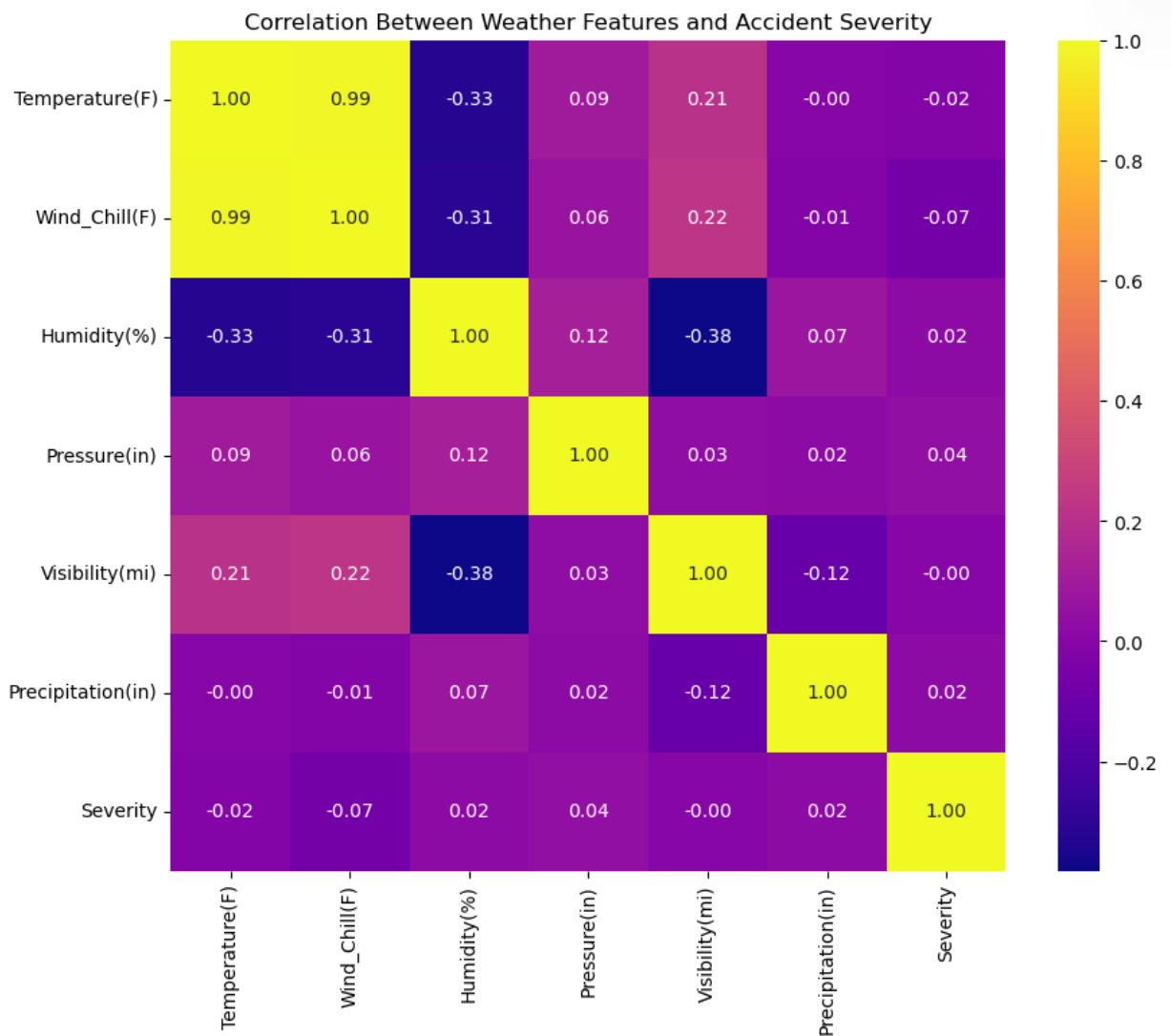
```
In [21]: hour_weather_accidents = hour_weather_accidents.astype(int)
```

```
plt.figure(figsize=(12, 6))
sns.heatmap(hour_weather_accidents, cmap="YlGnBu", annot=True, fmt="d", cbar=F
plt.title('Accidents by Hour of Day and Weather Condition')
plt.xlabel('Weather Condition')
plt.ylabel('Hour of Day')
plt.show()
```



```
In [22]: weather_features = ['Temperature(F)', 'Wind_Chill(F)', 'Humidity(%)', 'Pressur
correlation = df[weather_features + ['Severity']].corr()
```

```
plt.figure(figsize=(10, 8))
sns.heatmap(correlation, annot=True, cmap='plasma', fmt='.2f')
plt.title('Correlation Between Weather Features and Accident Severity')
plt.show()
```



```
In [25]: fig = px.scatter_mapbox(df, lat="Start_Lat", lon="Start_Lng", color="Weather_C",
                                size="Severity", hover_name="ID", color_continuous_sca
                                size_max=15, zoom=3, mapbox_style="carto-positron")
fig.show()
```

```
In [24]: print(df.dtypes)
```

```
ID                object
Source            object
Severity          int64
Start_Time        datetime64[ns]
End_Time         object
Start_Lat         float64
Start_Lng         float64
End_Lat           float64
End_Lng           float64
Distance(mi)      float64
Description        object
Street            object
City              object
County            object
State             object
Zipcode           object
Country           object
Timezone          object
Airport_Code      object
Weather_Timestamp object
```

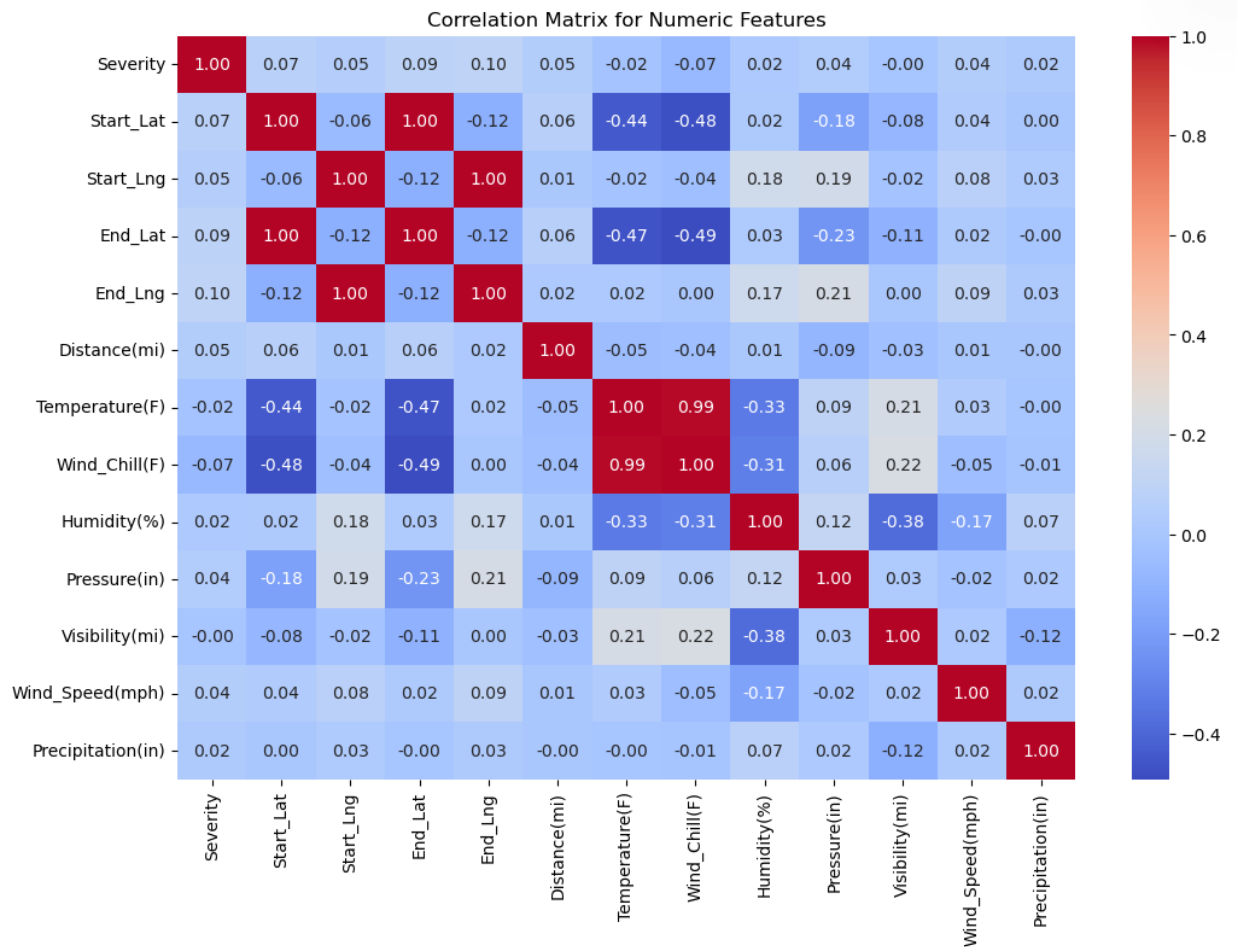
Temperature(F)	float64
Wind_Chill(F)	float64
Humidity(%)	float64
Pressure(in)	float64
Visibility(mi)	float64
Wind_Direction	object
Wind_Speed(mph)	float64
Precipitation(in)	float64
Weather_Condition	object
Amenity	bool
Bump	bool
Crossing	bool
Give_Way	bool
Junction	bool
No_Exit	bool
Railway	bool
Roundabout	bool
Station	bool
Stop	bool
Traffic_Calming	bool
Traffic_Signal	bool
Turning_Loop	bool
Sunrise_Sunset	object
Civil_Twilight	object
Nautical_Twilight	object
Astronomical_Twilight	object
Hour	int32
Weekday	object
dtype:	object

```
In [26]: numeric_df = df.select_dtypes(include=['float64', 'int64'])

correlation_matrix = numeric_df.corr()

plt.figure(figsize=(12, 8))
sns.heatmap(correlation_matrix, annot=True, cmap='coolwarm', fmt='.2f', cbar=True)
plt.title('Correlation Matrix for Numeric Features')
plt.show()
```





```
In [27]: from sklearn.preprocessing import LabelEncoder
label_encoder = LabelEncoder()
df['Weather_Condition_encoded'] = label_encoder.fit_transform(df['Weather_Condition'])

numeric_df = df.select_dtypes(include=['float64', 'int64']).copy()
numeric_df['Weather_Condition_encoded'] = df['Weather_Condition_encoded']

correlation_matrix = numeric_df.corr()

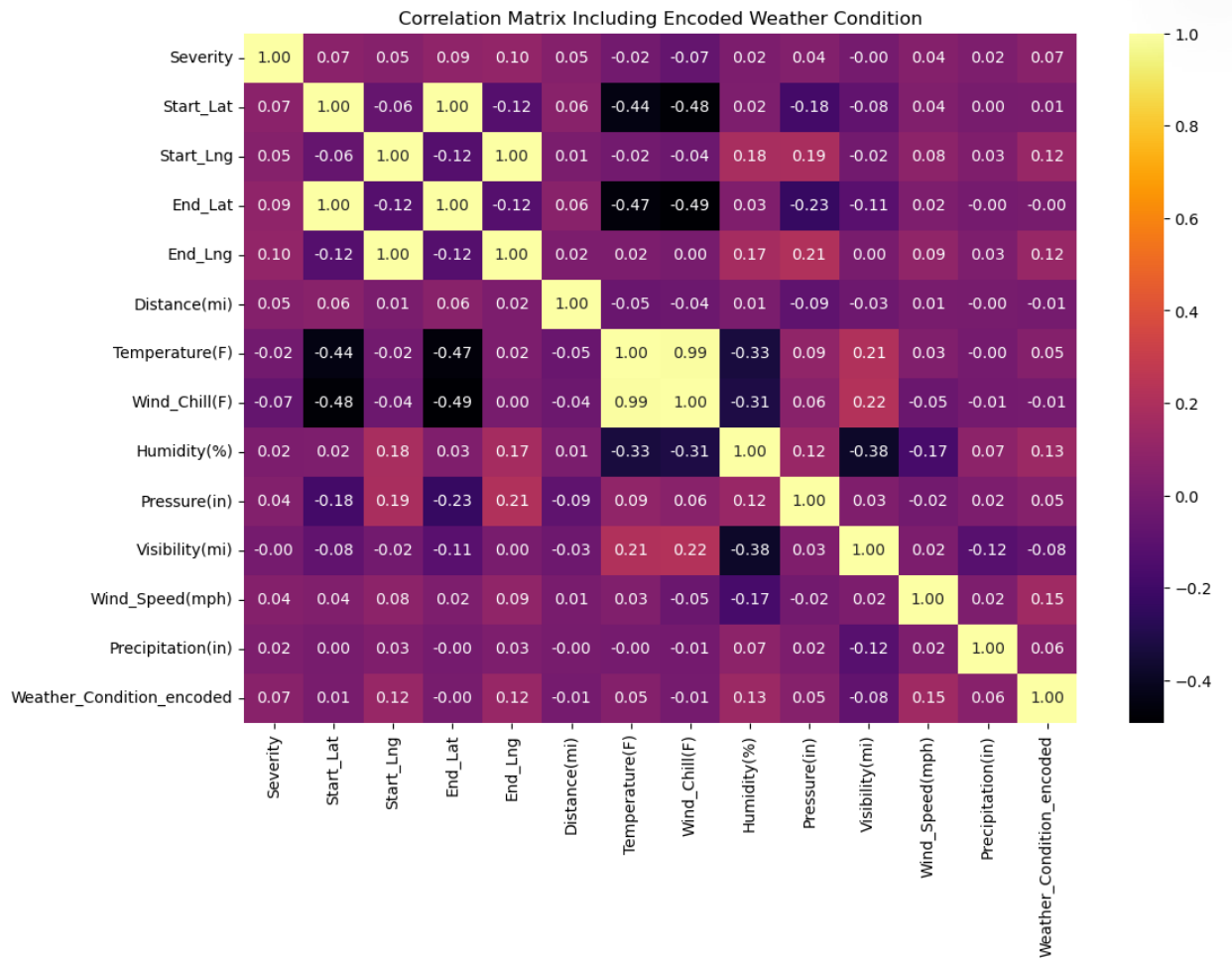
plt.figure(figsize=(12, 8))
sns.heatmap(correlation_matrix, annot=True, cmap='inferno', fmt='.2f', cbar=True)
plt.title('Correlation Matrix Including Encoded Weather Condition')
plt.show()
```

C:\Users\vivek\AppData\Local\Temp\ipykernel_4296\3411963840.py:3: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row_indexer,col_indexer] = value instead

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

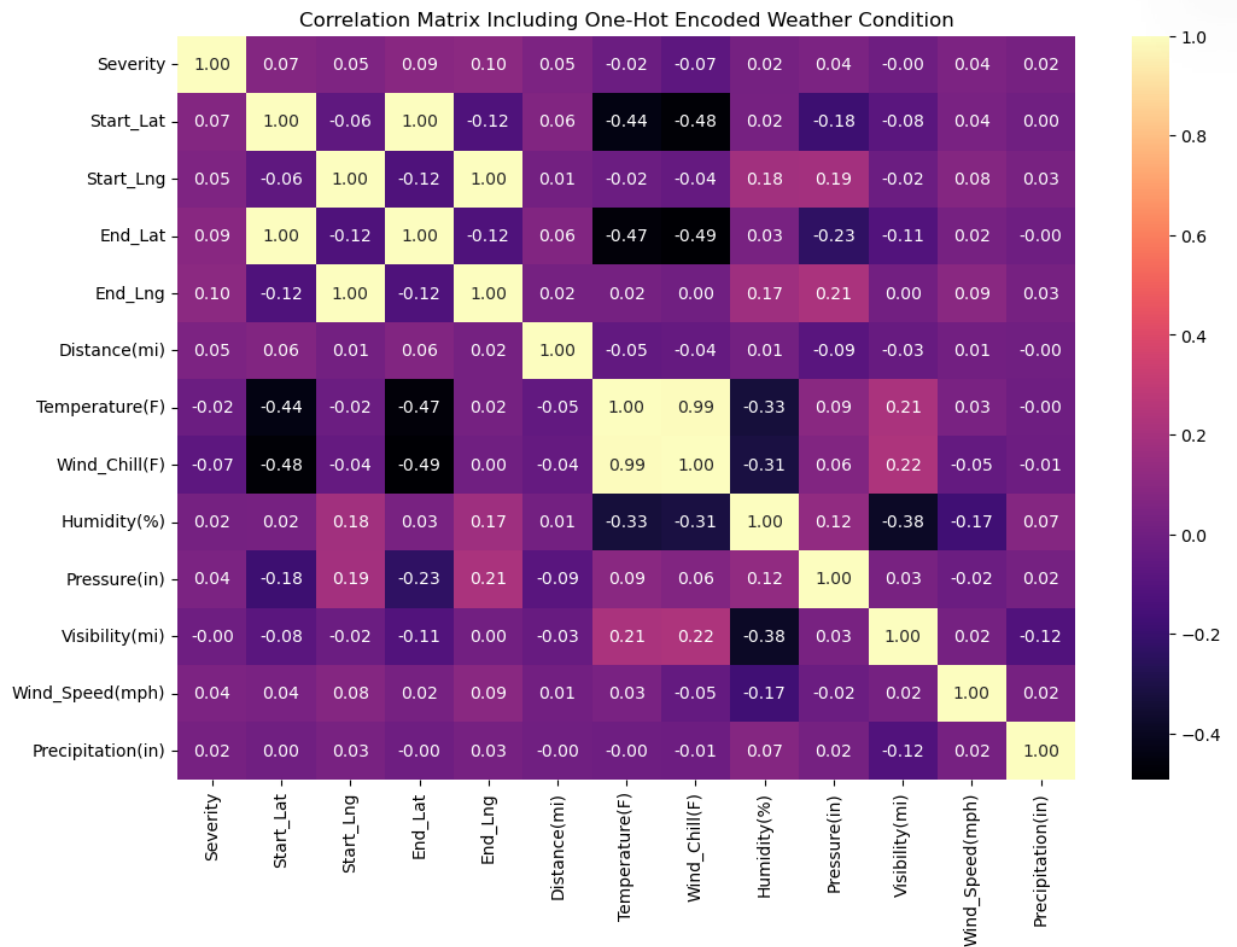




```
In [28]: df = pd.get_dummies(df, columns=['Weather_Condition'], drop_first=True)
numeric_df = df.select_dtypes(include=['float64', 'int64'])
correlation_matrix = numeric_df.corr()

plt.figure(figsize=(12, 8))
sns.heatmap(correlation_matrix, annot=True, cmap='magma', fmt='.2f', cbar=True)
plt.title('Correlation Matrix Including One-Hot Encoded Weather Condition')
plt.show()
```





```
In [29]: numeric_summary = df.describe()
print(numeric_summary)
```

	Severity	Start_Time	Start_Lat	\	
count	6.985228e+06	6985228	6.985228e+06		
mean	2.229248e+00	2020-03-21 21:49:59.056442112	3.622647e+01		
min	1.000000e+00	2016-01-14 20:18:33	2.455480e+01		
25%	2.000000e+00	2018-09-17 02:20:31.750000128	3.342209e+01		
50%	2.000000e+00	2020-06-23 13:37:23.500000	3.581521e+01		
75%	2.000000e+00	2021-10-28 15:44:07	4.009647e+01		
max	4.000000e+00	2023-03-31 23:30:00	4.900220e+01		
std	4.988711e-01	NaN	5.055433e+00		

	Start_Lng	End_Lat	End_Lng	Distance(mi)	Temperature(F)
count	6.985228e+06	3.582466e+06	3.582466e+06	6.985228e+06	6.839140e+06
mean	-9.476577e+01	3.632363e+01	-9.606114e+01	5.168789e-01	6.168508e+01
min	-1.246238e+02	2.456601e+01	-1.245457e+02	0.000000e+00	-8.900000e+01
25%	-1.172176e+02	3.350703e+01	-1.178403e+02	0.000000e+00	4.900000e+01
50%	-8.789415e+01	3.627421e+01	-8.963065e+01	1.000000e-02	6.400000e+01
75%	-8.038722e+01	4.023982e+01	-8.029351e+01	3.880000e-01	7.600000e+01
max	-6.711317e+01	4.907500e+01	-6.710924e+01	4.417500e+02	2.070000e+02
std	1.735545e+01	5.273354e+00	1.816974e+01	1.746987e+00	1.892246e+01

	Wind_Chill(F)	Humidity(%)	Pressure(in)	Visibility(mi)	\
count	5.011143e+06	6.829884e+06	6.859985e+06	6.827127e+06	
mean	5.799474e+01	6.501947e+01	2.955900e+01	9.093596e+00	
min	-8.900000e+01	1.000000e+00	0.000000e+00	0.000000e+00	
25%	4.200000e+01	4.800000e+01	2.939000e+01	1.000000e+01	
50%	6.200000e+01	6.700000e+01	2.987000e+01	1.000000e+01	
75%	7.500000e+01	8.400000e+01	3.004000e+01	1.000000e+01	

max	2.070000e+02	1.000000e+02	5.863000e+01	1.400000e+02
std	2.239818e+01	2.279870e+01	9.864551e-01	2.706562e+00

	Wind_Speed(mph)	Precipitation(in)	Hour \
count	6.435855e+06	4.812697e+06	6.985228e+06
mean	7.696474e+00	8.824113e-03	1.226779e+01
min	0.000000e+00	0.000000e+00	0.000000e+00
25%	4.600000e+00	0.000000e+00	8.000000e+00
50%	7.000000e+00	0.000000e+00	1.300000e+01
75%	1.040000e+01	0.000000e+00	1.700000e+01
max	1.087000e+03	3.647000e+01	2.300000e+01
std	5.411353e+00	1.170015e-01	5.455518e+00

	Weather_Condition_encoded
count	6.985228e+06
mean	4.456084e+01
min	0.000000e+00
25%	1.500000e+01
50%	1.500000e+01
75%	8.400000e+01
max	1.430000e+02
std	3.991002e+01

```
In [30]: import matplotlib.pyplot as plt
import seaborn as sns

# Select numeric columns from the DataFrame
numeric_columns = df.select_dtypes(include=['float64', 'int64']).columns

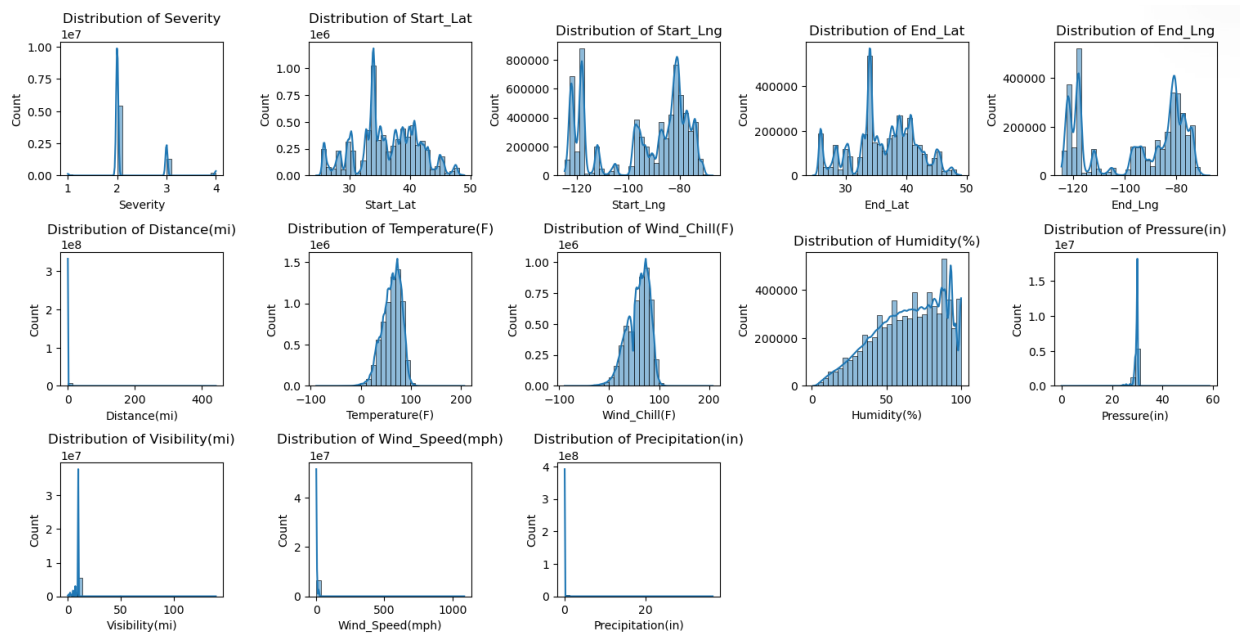
# Set the figure size
plt.figure(figsize=(15, 10))

# Loop through numeric columns and create subplots
for i, column in enumerate(numeric_columns, 1):
    plt.subplot(4, 5, i) # Adjust rows/columns as needed
    sns.histplot(df[column], kde=True, bins=30) # Plot histogram with KDE
    plt.title(f'Distribution of {column}')

# Adjust layout after all subplots have been created
plt.tight_layout()

# Display the plots
plt.show()
```



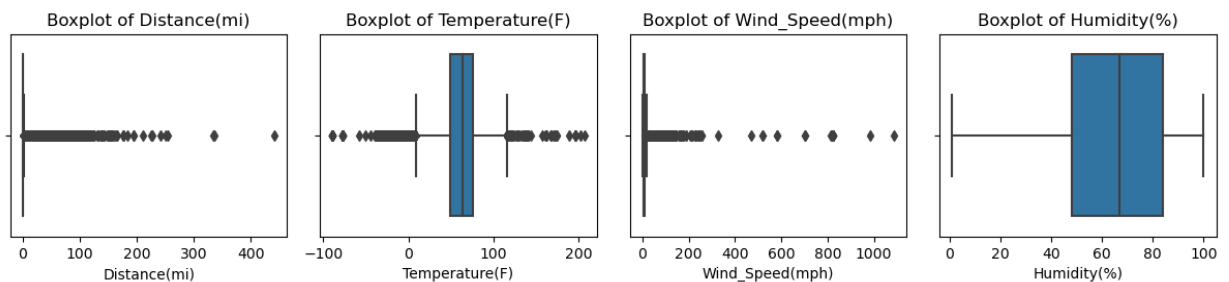


```
In [35]: plt.figure(figsize=(15, 10))

for i, column in enumerate(numeric_columns, 1):
    plt.subplot(4, 5, i)
    sns.boxplot(x=df[column])
    plt.title(f'Boxplot of {column}')

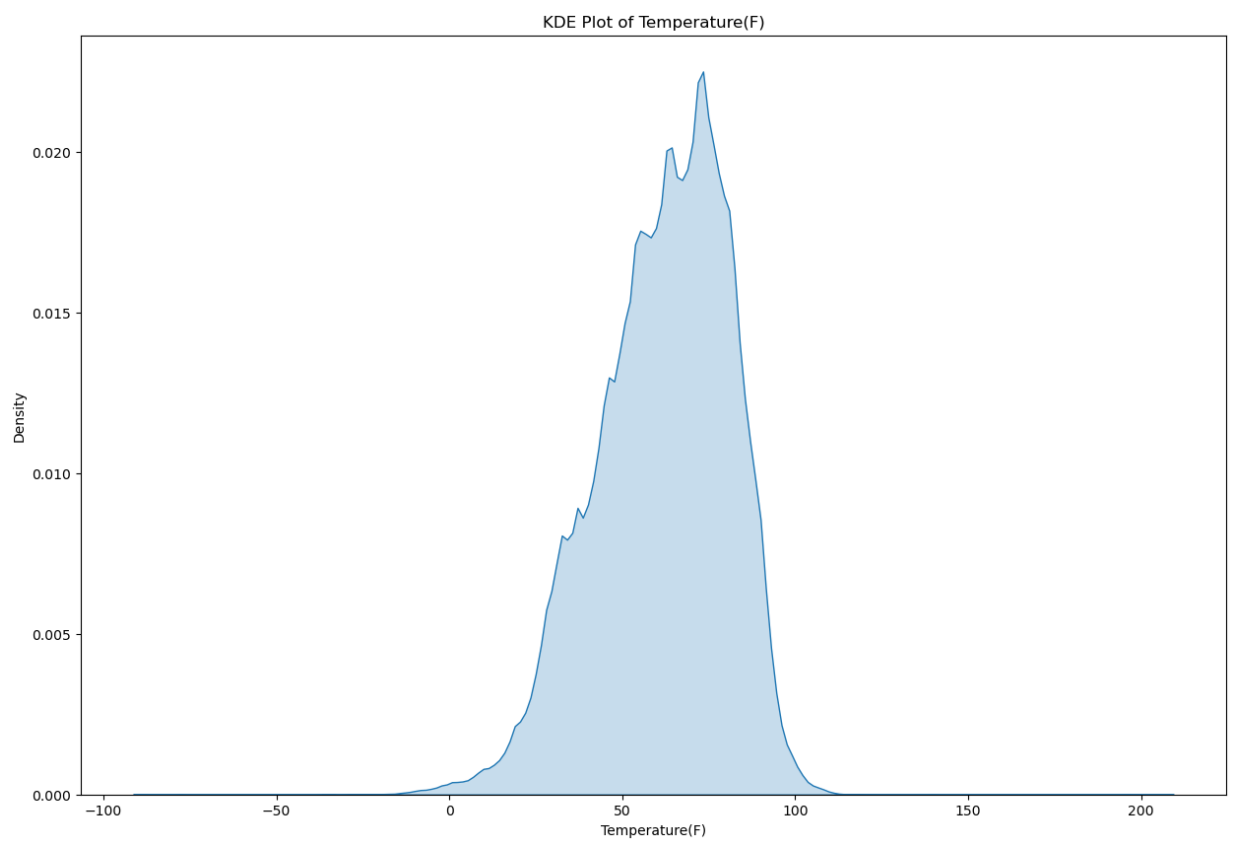
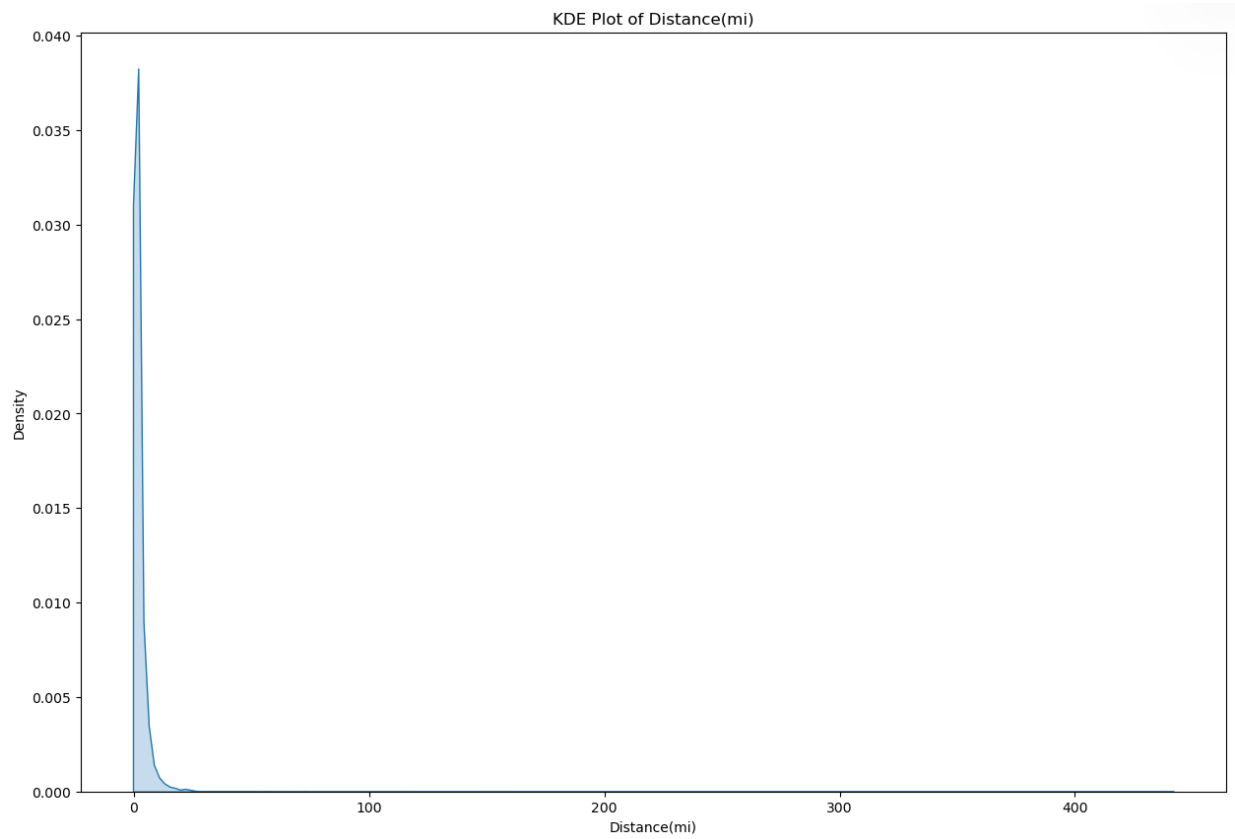
# Call tight_layout once after the loop
plt.tight_layout()

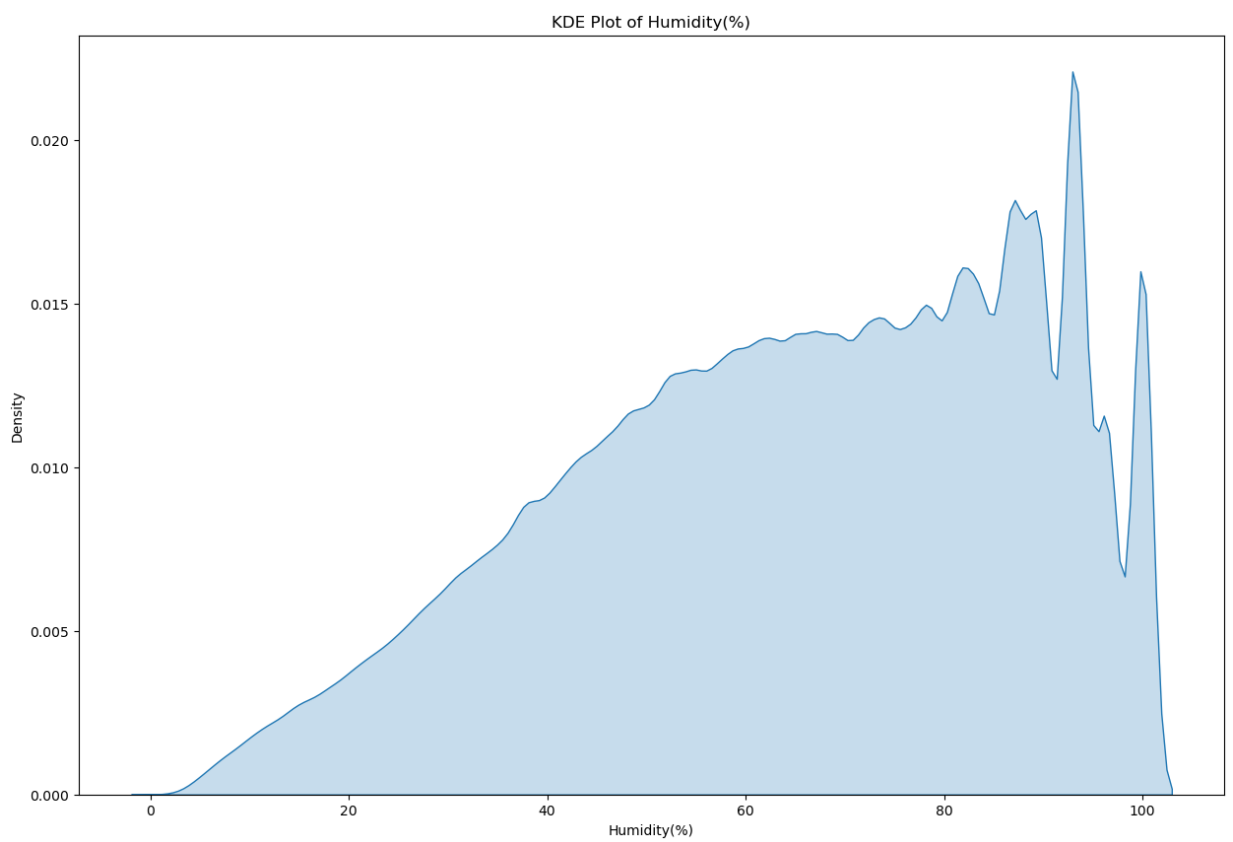
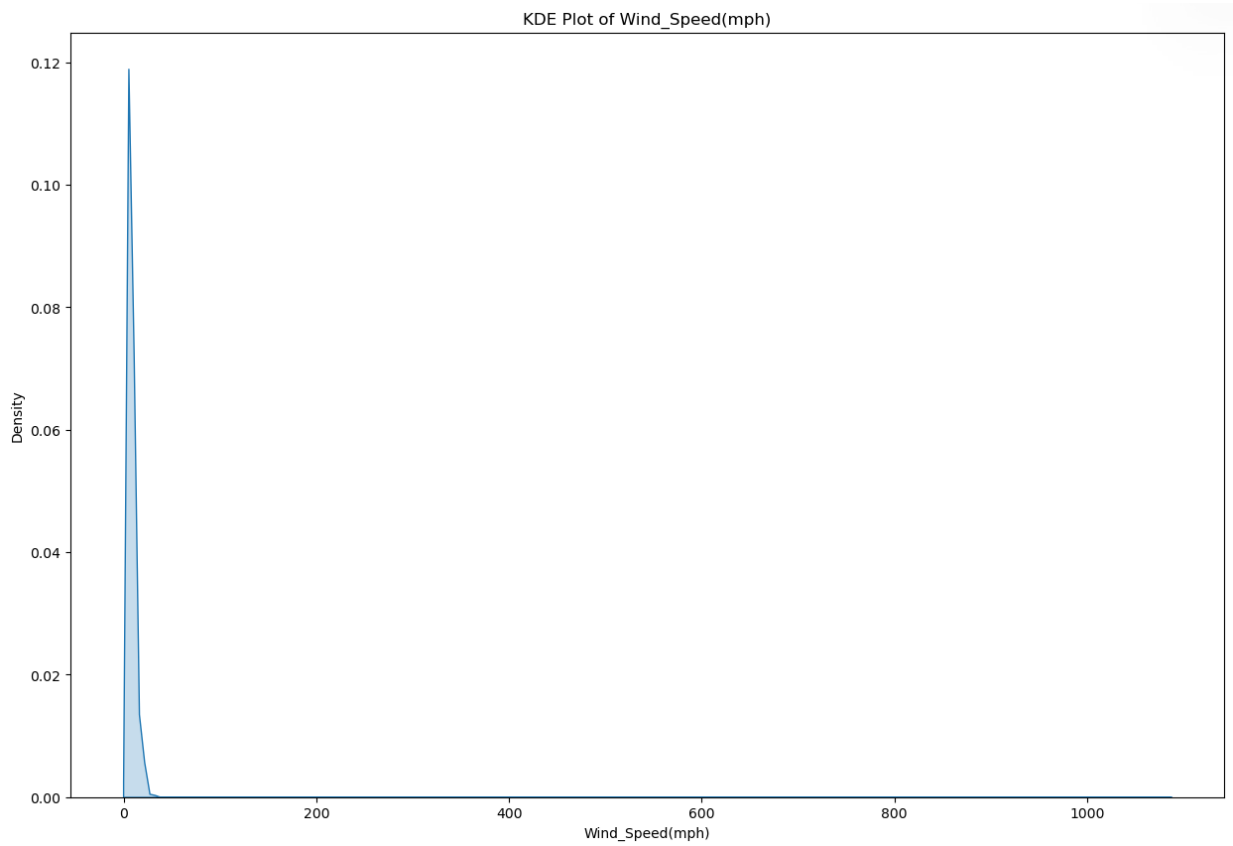
plt.show()
```



```
In [32]: numeric_columns = ['Distance(mi)', 'Temperature(F)', 'Wind_Speed(mph)', 'Humid
for column in numeric_columns:
    plt.figure(figsize=(15, 10))
    sns.kdeplot(df[column], fill=True)
    plt.title(f'KDE Plot of {column}')
    plt.show()
```







In []: