Problem Set 6 - Waze Shiny Dashboard

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Statement of integrity: I used the slides on shiny app creation, chatgpt, and https://shiny.posit.co/py/docs/overv to guide me and troubleshoot/debug.

Steps to submit (10 points on PS6)

- 1. "This submission is my work alone and complies with the 30538 integrity policy." Add your initials to indicate your agreement: * CT *
- 2. "I have uploaded the names of anyone I worked with on the problem set here" (2 point)
- 3. Late coins used this pset: 1 Late coins left after submission: θ
- 4. Before starting the problem set, make sure to read and agree to the terms of data usage for the Waze data here.
- 5. Knit your ps6.qmd as a pdf document and name it ps6.pdf.
- 6. Push your ps6.qmd, ps6.pdf, requirements.txt, and all created folders (we will create three Shiny apps so you will have at least three additional folders) to your Github repo (5 points). It is fine to use Github Desktop.
- 7. Submit ps6.pdf and also link your Github repo via Gradescope (5 points)
- 8. Tag your submission in Gradescope. For the Code Style part (10 points) please tag the whole corresponding section for the code style rubric.

Notes: see the Quarto documentation (link) for directions on inserting images into your knitted document.

Background

Data Download and Exploration (20 points)

```
import zipfile
```

```
zip_file_path = r'C:\Users\clari\OneDrive\Documents\Python II\problem set
# Extract the ZIP file
with zipfile.ZipFile(zip_file_path, 'r') as zip_ref:
   zip ref.extractall(r'C:\Users\clari\OneDrive\Documents\Python II\problem

    set 6') # Ensure the path is valid

# Read the extracted sample CSV file
sample_csv_path = r'C:\Users\clari\OneDrive\Documents\Python II\problem set
waze_sample_df = pd.read_csv(sample_csv_path)
# Inspect the DataFrame
print(waze_sample_df.head())
  Unnamed: 0
                           confidence
                                      nThumbsUp
                     city
                                                       street
0
      584358 Chicago, IL
                                    0
                                            NaN
                                                          NaN
      472915 Chicago, IL
1
                                    0
                                                       I-90 E
                                            NaN
      550891 Chicago, IL
2
                                    0
                                            NaN
                                                       I-90 W
3
      770659
              Chicago, IL
                                    0
                                            NaN
                                                          NaN
      381054 Chicago, IL
                                                 N Pulaski Rd
                                            NaN
                                  uuid country
                                                      type \
 c9b88a12-79e8-44cb-aadd-a75855fc4bcb
                                           US
                                                       JAM
1 7c634c0a-099c-4262-b57f-e893bdebce73
                                           US
                                               ROAD CLOSED
2 7aa3c61a-f8dc-4fe8-bbb0-db6b9e0dc53b
                                           US
                                                    HAZARD
3 3b95dd2f-647c-46de-b4e1-8ebc73aa9221
                                           US
                                                    HAZARD
4 13a5e230-a28a-4bf4-b928-bc1dd38850e0
                                           US
                                                       JAM
                                 roadType reliability magvar \
                         subtype
0
                                       17
                                                     5
                                                           116
1
               ROAD_CLOSED_EVENT
                                        3
                                                     6
                                                           173
```

```
{\tt HAZARD\_ON\_SHOULDER\_CAR\_STOPPED}
2
                                           3
                                                         5
                                                               308
3
                                          20
                                                         5
                   HAZARD_ON_ROAD
                                                               155
4
                JAM_HEAVY_TRAFFIC
                                           7
                                                         5
                                                               178
                                                                    geo \
   reportRating
                                       ts
0
                 2024-07-02 18:27:40 UTC
                                            POINT(-87.64577 41.892743)
              5
1
                2024-06-16 10:13:19 UTC POINT(-87.646359 41.886295)
2
              5 2024-05-02 19:01:47 UTC
                                            POINT(-87.695982 41.93272)
3
              2 2024-03-25 18:53:24 UTC POINT(-87.669253 41.904497)
              2 2024-06-03 21:17:33 UTC POINT(-87.728322 41.978769)
4
                         geoWKT
0
   Point(-87.64577 41.892743)
  Point(-87.646359 41.886295)
   Point(-87.695982 41.93272)
3 Point(-87.669253 41.904497)
4 Point(-87.728322 41.978769)
```

These are the data types: - Unnamed: 0: Nominal - city: Nominal - confidence: Quantitative - nThumbsUp: Quantitative - street: Nominal - uuid: Nominal - country: Nominal - type: Nominal - subtype: Nominal - roadType: Quantitative - reliability: Quantitative - magvar: Quantitative - reportRating: Quantitative

```
# Create the stacked bar chart
chart = alt.Chart(long_data).mark_bar().encode(
    x=alt.X('Variable', sort=None, title='Variables'),
    y=alt.Y('Count', title='Number of Observations'),
    color=alt.Color('Status', scale=alt.Scale(scheme='category10'),
    title='Observation Status'),
    tooltip=['Variable', 'Status', 'Count']
).properties(
    title='Missing vs Non-Missing Observations by Variable',
    width=800,
    height=400
)
chart.show()
```

alt.Chart(...)



Figure 1: Null

I can observe NULL values for nThumbsUp, some in street, and some in subtype. The variable with the highest share of NULLs is nThumbsUp, which consists almost entirely of NULLs.

3. Taking a look at the values

types = waze data df['type']

```
subtypes = waze_data_df['subtype']
# Print unique values for type and subtype
print("Unique types:")
print(waze_data_df['type'].unique())
print("\nUnique subtypes:")
print(waze_data_df['subtype'].unique())
# Count types with NA subtypes
na_subtypes_count =

    waze_data_df[waze_data_df['subtype'].isna()]['type'].nunique()

print(f"\nNumber of types with NA subtypes: {na_subtypes_count}")
# Identify types with potential sub-subtypes
subtypes_for_types =

    waze_data_df[waze_data_df['subtype'].notna()].groupby('type')['subtype'].unique()

print("\nSubtypes for each type:")
print(subtypes_for_types)
Unique types:
['JAM' 'ACCIDENT' 'ROAD_CLOSED' 'HAZARD']
Unique subtypes:
[nan 'ACCIDENT_MAJOR' 'ACCIDENT_MINOR' 'HAZARD_ON_ROAD'
 'HAZARD_ON_ROAD_CAR_STOPPED' 'HAZARD_ON_ROAD_CONSTRUCTION'
 'HAZARD_ON_ROAD_EMERGENCY_VEHICLE' 'HAZARD_ON_ROAD_ICE'
 'HAZARD_ON_ROAD_OBJECT' 'HAZARD_ON_ROAD_POT_HOLE'
 'HAZARD_ON_ROAD_TRAFFIC_LIGHT_FAULT' 'HAZARD_ON_SHOULDER'
 'HAZARD_ON_SHOULDER_CAR_STOPPED' 'HAZARD_WEATHER' 'HAZARD_WEATHER FLOOD'
 'JAM_HEAVY_TRAFFIC' 'JAM_MODERATE_TRAFFIC' 'JAM_STAND_STILL_TRAFFIC'
 'ROAD CLOSED EVENT' 'HAZARD ON ROAD LANE CLOSED' 'HAZARD WEATHER FOG'
 'ROAD CLOSED CONSTRUCTION' 'HAZARD ON ROAD ROAD KILL'
 'HAZARD ON SHOULDER ANIMALS' 'HAZARD ON SHOULDER MISSING SIGN'
 'JAM_LIGHT_TRAFFIC' 'HAZARD_WEATHER_HEAVY_SNOW' 'ROAD_CLOSED_HAZARD'
 'HAZARD_WEATHER_HAIL']
Number of types with NA subtypes: 4
Subtypes for each type:
```

```
type

ACCIDENT [ACCIDENT_MAJOR, ACCIDENT_MINOR]

HAZARD [HAZARD_ON_ROAD, HAZARD_ON_ROAD_CAR_STOPPED, H...

JAM [JAM_HEAVY_TRAFFIC, JAM_MODERATE_TRAFFIC, JAM_...

ROAD_CLOSED [ROAD_CLOSED_EVENT, ROAD_CLOSED_CONSTRUCTION, ...

Name: subtype, dtype: object
```

a. All four main types have at least one instance of NA subtypes. There are multiple examples of 'sub-sub-types'. For example, the type Hazard specifies On Road, which can then further specify into what the exact hazard was.

Hierarcy * Jam * Traffic * Standstill * Heavy * Moderate * Light * Unclasified * Road Closed * Construction * Event * Accident * Unclasified * Accident * Major * Minor * Reported * Hazard * On Road * Specific HAzards * On Shoulder * Specific Hazars * Weather * Weather conditions * Note on Map * General * Point of Interest

I think we should keep the NA subtypes and code them as "Unclassified". This would mean that we keep all the information on reported events, which we could use in the future. Right now, we could find patterns or gaps in the reporting system, and maintains transparency about data limitations. NAs could, afterall, be due to incomplete reports from users in a hurry, ambiguous that don't fit neatly into existing categories, or technical issues in data processing.

```
waze_data_df['subtype'] = waze_data_df['subtype'].fillna('Unclassified')
```

4. 5.

```
# Get unique combinations of type and subtype
unique_combinations = waze_data_df[['type', 'subtype']].drop_duplicates()

# Create the crosswalk DataFrame
crosswalk_df = pd.DataFrame({
    'type': unique_combinations['type'],
    'subtype': unique_combinations['subtype'].fillna('Unclassified'),
    'updated_type': '',
    'updated_subtype': '',
    'updated_subtype': ''
})
```

```
def clean_name(name):
    """Cleans and formats a string by replacing underscores with spaces and

→ capitalizing each word."""

    return ' '.join(word.capitalize() for word in name.replace('_', '

¬ ').split())

def create_user_friendly_label(row):
    """Create a user-friendly label for the last column."""
    label parts = [row['updated type']]
    if row['updated_subsubtype'] != 'Unclassified':
        label parts.append(row['updated subsubtype'])
    if row['updated_subtype'] != 'Unclassified':
        label_parts.append(row['updated_subtype'])
    return ' - '.join(label_parts)
def map_to_hierarchy(row):
   # Extract original fields
   original_type = row['type']
   original_subtype = row['subtype']
   # Initialize new fields
   row['updated_type'] = ''
   row['updated_subtype'] = ''
   row['updated subsubtype'] = ''
    # Map types and subtypes to the hierarchy
    if 'JAM' in original_type:
        row['updated_type'] = 'Jam'
        row['updated_subtype'] = 'Traffic'
        if 'STAND_STILL' in original_subtype:
            row['updated_subsubtype'] = 'Stand Still'
        elif 'HEAVY' in original_subtype:
            row['updated_subsubtype'] = 'Heavy'
        elif 'MODERATE' in original_subtype:
           row['updated_subsubtype'] = 'Moderate'
        elif 'LIGHT' in original_subtype:
           row['updated_subsubtype'] = 'Light'
        else:
            row['updated_subsubtype'] = 'Unclassified'
    elif 'ROAD_CLOSED' in original_type:
        row['updated_type'] = 'Road Closed'
        if 'CONSTRUCTION' in original_subtype:
```

```
row['updated_subtype'] = 'Construction'
       elif 'EVENT' in original_subtype:
           row['updated_subtype'] = 'Event'
       elif 'HAZARD' in original_subtype:
           row['updated_subtype'] = 'Hazard'
       else:
           row['updated_subtype'] = 'Unclassified'
   elif 'ACCIDENT' in original_type:
       row['updated type'] = 'Accident'
       if 'MAJOR' in original_subtype:
           row['updated subtype'] = 'Major'
       elif 'MINOR' in original_subtype:
           row['updated subtype'] = 'Minor'
       else:
           row['updated_subtype'] = 'Reported'
   elif 'HAZARD' in original_type:
       row['updated_type'] = 'Hazard'
       if 'ON_ROAD' in original_subtype:
           row['updated_subtype'] = 'On Road'
           if original_subtype == 'HAZARD_ON_ROAD':
               row['updated_subsubtype'] = 'Unclassified'
           else:
               row['updated_subsubtype'] =

    clean name(original subtype.replace('HAZARD ON ROAD ', ''))

       elif 'ON_SHOULDER' in original_subtype:
           row['updated subtype'] = 'On Shoulder'
           if original_subtype == 'HAZARD_ON_SHOULDER':
               row['updated subsubtype'] = 'Unclassified'
           else:
               row['updated_subsubtype'] =
clean_name(original_subtype.replace('HAZARD_ON_SHOULDER_', ''))
       elif 'WEATHER' in original_subtype:
           row['updated_subtype'] = 'Weather'
           row['updated_subsubtype'] =
   clean_name(original_subtype.replace('HAZARD_WEATHER_', ''))
       else:
           row['updated_subtype'] = 'Unclassified'
   # Fallback for unclassified rows
   if not row['updated_type']:
       row['updated_type'] = clean_name(original_type)
   if not row['updated_subtype']:
```

```
row['updated_subtype'] = 'Unclassified'
    if not row['updated_subsubtype']:
        row['updated_subsubtype'] = 'Unclassified'
    # Create user-friendly label
    row['user_friendly_label'] = create_user_friendly_label(row)
   return row
# Apply the mapping function to each row
crosswalk_df = crosswalk_df.apply(map_to_hierarchy, axis=1)
# Rearrange columns: keep original type/subtype, then new columns, then the

    user-friendly label

columns_order = ['type', 'subtype', 'updated_type', 'updated_subtype',
                 'updated_subsubtype', 'user_friendly_label']
crosswalk_df = crosswalk_df[columns_order]
# Sort the DataFrame alphabetically by the user-friendly label
crosswalk_df = crosswalk_df.sort_values(['user_friendly_label'])
# Display the final DataFrame
```

\

•	updated_type	subtype	type	
	Accident	ACCIDENT_MAJOR	ACCIDENT	122
	Accident	ACCIDENT_MINOR	ACCIDENT	131
	Accident	Unclassified	ACCIDENT	1
	Hazard	Unclassified	HAZARD	26
	Hazard	HAZARD_ON_SHOULDER_ANIMALS	HAZARD	21447
	Hazard	HAZARD_ON_ROAD_CAR_STOPPED	HAZARD	190
	Hazard	HAZARD_ON_SHOULDER_CAR_STOPPED	HAZARD	485
	Hazard	HAZARD_ON_ROAD_CONSTRUCTION	HAZARD	240
	Hazard	HAZARD_ON_ROAD_EMERGENCY_VEHICLE	HAZARD	276
	Hazard	HAZARD_WEATHER_FLOOD	HAZARD	857
	Hazard	HAZARD_WEATHER_FOG	HAZARD	5557
	Hazard	HAZARD_WEATHER_HAIL	HAZARD	229005
	Hazard	HAZARD_WEATHER	HAZARD	854
	Hazard	HAZARD_WEATHER_HEAVY_SNOW	HAZARD	44216
	Hazard	HAZARD_ON_ROAD_ICE	HAZARD	302
	Hazard	HAZARD_ON_ROAD_LANE_CLOSED	HAZARD	1905
	Hazard	HAZARD_ON_SHOULDER_MISSING_SIGN	HAZARD	21940

print(crosswalk_df)

303	HAZARD	HAZARD_ON_ROAD_OBJECT	Hazard
148	HAZARD	HAZARD_ON_ROAD	Hazard
483	HAZARD	HAZARD_ON_SHOULDER	Hazard
355	HAZARD	HAZARD_ON_ROAD_POT_HOLE	Hazard
21443	HAZARD	HAZARD_ON_ROAD_ROAD_KILL	Hazard
478	HAZARD	HAZARD_ON_ROAD_TRAFFIC_LIGHT_FAULT	Hazard
858	JAM	JAM_HEAVY_TRAFFIC	Jam
38546	JAM	JAM_LIGHT_TRAFFIC	Jam
1122	JAM	JAM_MODERATE_TRAFFIC	Jam
1184	JAM	JAM_STAND_STILL_TRAFFIC	Jam
0	JAM	Unclassified	Jam
2	ROAD_CLOSED	Unclassified	Road Closed
7331	ROAD_CLOSED	ROAD_CLOSED_CONSTRUCTION	Road Closed
1335	ROAD_CLOSED	ROAD_CLOSED_EVENT	Road Closed
54556	ROAD_CLOSED	ROAD_CLOSED_HAZARD	Road Closed
	updated_subty;	pe updated_subsubtype \	

	updated_subtype	updated_subsubtype
122	Major	Unclassified
131	Minor	Unclassified
1	Reported	Unclassified
26	Unclassified	Unclassified
21447	On Shoulder	Animals
190	On Road	Car Stopped
485	On Shoulder	Car Stopped
240	On Road	Construction
276	On Road	Emergency Vehicle
857	Weather	Flood
5557	Weather	Fog
229005	Weather	Hail
854	Weather	Hazard Weather
44216	Weather	Heavy Snow
302	On Road	Ice
1905	On Road	Lane Closed
21940	On Shoulder	Missing Sign
303	On Road	Object
148	On Road	Unclassified
483	On Shoulder	Unclassified
355	On Road	Pot Hole
21443	On Road	Road Kill
478	On Road	Traffic Light Fault
858	Traffic	Heavy
38546	Traffic	Light
1122	Traffic	Moderate

1184 0 2 7331 1335	Traffic Traffic Unclassified Construction Event	Stand Still Unclassified Unclassified Unclassified Unclassified
54556	Hazard	Unclassified
		user_friendly_label
122		Accident - Major
131		Accident - Minor
1		Accident - Reported
26		Hazard
21447	Hazard -	Animals - On Shoulder
190	Hazard -	Car Stopped - On Road
485	Hazard - Car	Stopped - On Shoulder
240	Hazard - C	Construction - On Road
276	_	ency Vehicle - On Road
857		ard - Flood - Weather
5557		Mazard - Fog - Weather
229005	На	zard - Hail - Weather
854	Hazard - Haz	ard Weather - Weather
44216		Heavy Snow - Weather
302		Mazard - Ice - On Road
1905		Lane Closed - On Road
21940		ng Sign - On Shoulder
303	Haza	rd - Object - On Road
148		Hazard - On Road
483		Hazard - On Shoulder
355		l - Pot Hole - On Road
21443		- Road Kill - On Road
478	Hazard - Traffic	Light Fault - On Road
858		Jam - Heavy - Traffic
38546	-	Jam - Light - Traffic
1122		- Moderate - Traffic
1184	Jam -	Stand Still - Traffic
0		Jam - Traffic
_	Dood	Road Closed
7331 1335	коаа	Closed - Construction Road Closed - Event
54556		Road Closed - Event
0-1000		mad orosed - mazdru

Number of rows for Accident - Unclassified: 0

There are zero rows for which accident is unclassified.

4.

```
# Check if all type and subtype combinations in the merged dataset exist in
the crosswalk
merged_combinations = merged_df[['type', 'subtype']].drop_duplicates()
crosswalk_combinations = crosswalk_df[['type', 'subtype']]

are_equal = merged_combinations.equals(crosswalk_combinations)

print(f"Crosswalk and merged dataset have the same type and subtype
combinations: {are_equal}")

if not are_equal:
    print("Differences:")

print(merged_combinations[~merged_combinations.isin(crosswalk_combinations)].dropna()
```

Crosswalk and merged dataset have the same type and subtype combinations:

False

Differences:

Empty DataFrame

Columns: [type, subtype]

Index: []

App #1: Top Location by Alert Type Dashboard (30 points)

1. ChatGPT's response

a.

```
import re
pattern = r'POINT \setminus ((-?\d+\.\d+)\s(-?\d+\.\d+)\)'
# Extract latitude and longitude using the updated regex
waze_data_df[['longitude', 'latitude']] =

    waze_data_df['geo'].str.extract(pattern)

# Convert the extracted values to float
waze_data_df[['latitude', 'longitude']] = waze_data_df[['latitude',

    'longitude']].astype(float)

# Display the updated DataFrame with latitude and longitude
print(waze_data_df[['geo', 'latitude', 'longitude']])
                                 geo
                                      latitude longitude
0
        POINT(-87.676685 41.929692) 41.929692 -87.676685
1
        POINT(-87.624816 41.753358) 41.753358 -87.624816
```

```
POINT(-87.676685 41.929692) 41.929692 -87.676685

1 POINT(-87.624816 41.753358) 41.753358 -87.624816

2 POINT(-87.614122 41.889821) 41.889821 -87.614122

3 POINT(-87.680139 41.939093) 41.939093 -87.680139

4 POINT(-87.735235 41.91658) 41.916580 -87.735235

...

778089 POINT(-87.615862 41.887432) 41.887432 -87.615862

778090 POINT(-87.615882 41.887442) 41.887442 -87.615882

778091 POINT(-87.645584 41.884419) 41.884419 -87.645584

778092 POINT(-87.598843 41.692532) 41.692532 -87.598843

778093 POINT(-87.598843 41.692532) 41.692532 -87.598843

[778094 rows x 3 columns]

b.
```

```
# Bin latitude and longitude into bins with step size 0.01
waze_data_df['binned_latitude'] = (waze_data_df['latitude'] // 0.01) * 0.01
waze_data_df['binned_longitude'] = (waze_data_df['longitude'] // 0.01) * 0.01
```

```
# identify the binned latitude=longitude combination with the greatest number

of observations

max_binned = binned_counts.loc[binned_counts['count'].idxmax()]

result = f"({max_binned['binned_latitude']:.2f},

of max_binned['binned_longitude']:.2f})"

print(f"The binned latitude-longitude combination with the greatest number of

of observations is: {result}")

print(f"Number of observations: {max_binned['count']}")
```

The binned latitude-longitude combination with the greatest number of observations is: (41.96, -87.75)Number of observations: 26537.0

c.

```
import os as os
```

```
# Aggregate the data to count the number of alerts per binned latitude and
→ longitude
aggregated_data = filtered_data.groupby(
    ['binned_latitude',
'binned_longitude']).size().reset_index(name='alert_count')
# Sort the aggregated data by alert_count in descending order
sorted_data = aggregated_data.sort_values(by='alert_count', ascending=False)
# Ensure the directory exists
output_dir = r'C:\Users\clari\OneDrive\Documents\Python II\problem set

→ 6\top alerts map'

os.makedirs(output_dir, exist_ok=True)
# Save the resulting DataFrame as 'top_alerts_map.csv' in the specified
→ folder
output_path = os.path.join(output_dir, 'top_alerts_map.csv')
sorted_data.to_csv(output_path, index=False)
# Load the saved DataFrame to count the number of rows
saved_data = pd.read_csv(output_path)
# Count the number of rows in the saved DataFrame
num_rows = saved_data.shape[0]
# Level of aggregation
level_of_aggregation = "Binned latitude and longitude for chosen updated type

→ and subtype"

print(f"Level of aggregation: {level_of_aggregation}")
print(f"Number of rows in the DataFrame: {num_rows}")
print(saved_data)
# Additional information
print(f"\nChosen type: {chosen_type}")
print(f"Chosen subtype: {chosen_subtype}")
print(
    f"\nTotal alerts for {chosen_type} - {chosen_subtype}:
    print(f"Number of unique latitude-longitude bins:
```

Level of aggregation: Binned latitude and longitude for chosen updated type and subtype

Number of rows in the DataFrame: 676

	binned_latitude	binned_longitude	alert_count
0	41.89	-87.66	10866
1	41.87	-87.65	9034
2	41.88	-87.65	7950
3	41.90	-87.67	7072
4	41.96	-87.75	6750
671	41.96	-87.92	1
672	41.96	-87.93	1
673	41.67	-87.66	1
674	42.00	-87.91	1
675	41.96	-87.80	1

[676 rows x 3 columns]

Chosen type: Jam

Chosen subtype: Traffic

Total alerts for Jam - Traffic: 372485

Number of unique latitude-longitude bins: 676

 ${\tt C:\Users\clari\AppData\Local\Temp\ipykernel_26404\1671116365.py:15:}$

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-versu

C:\Users\clari\AppData\Local\Temp\ipykernel_26404\1671116365.py:16:
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:

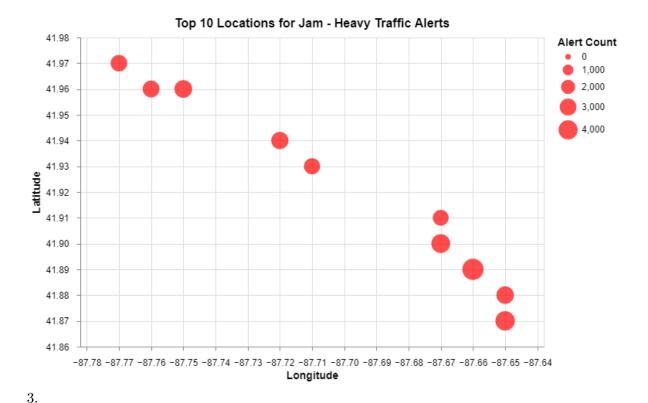
https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus

We observe 647 unique long-lat bins. We are aggregating by Jam and Traffic.

```
# Create the chart with the top 10 locations
# Calculate min and max for latitude and longitude to adjust axis range
min_lat, max_lat = top_10['binned_latitude'].min(
), top 10['binned latitude'].max()
min_lon, max_lon = top_10['binned_longitude'].min(
), top 10['binned longitude'].max()
# Add padding to the range for better visibility
lat_padding = (max_lat - min_lat) * 0.1
lon_padding = (max_lon - min_lon) * 0.1
top_10_chart = alt.Chart(top_10).mark_circle(color='red').encode(
    x=alt.X('binned_longitude:Q', title='Longitude', scale=alt.Scale(
        domain=[min_lon - lon_padding, max_lon + lon_padding])),
    y=alt.Y('binned_latitude:Q', title='Latitude', scale=alt.Scale(
        domain=[min_lat - lat_padding, max_lat + lat_padding])),
    size=alt.Size('alert_count:Q', scale=alt.Scale(
        range=[50, 750]), title='Alert Count'),
    tooltip=[
        alt.Tooltip('binned_latitude:Q', title='Latitude'),
        alt.Tooltip('binned_longitude:Q', title='Longitude'),
        alt.Tooltip('alert_count:Q', title='Alert Count')
```

```
]
).properties(
    title='Top 10 Locations for Jam - Heavy Traffic Alerts',
    width=600,
    height=400
).configure_axis(
    grid=True, # Disable grid lines
    labelFontSize=12, # Axis label font size
    titleFontSize=14, # Axis title font size
   titleFontWeight='bold', # Bold axis titles
    labelPadding=10 # Space between axis labels and the axis
).configure_title(
    fontSize=16, # Font size for chart title
    fontWeight='bold' # Bold chart title
).configure_legend(
    titleFontSize=14, # Font size for legend title
    labelFontSize=12, # Font size for legend labels
    symbolSize=100 # Adjust size of the legend symbols
)
# Display the chart
top_10_chart.show()
```

alt.Chart(...)



a.

```
# Specify the directory and file path
directory = r"C:\Users\clari\OneDrive\Documents\Python II\problem set 6"
file_path = os.path.join(directory, "chicago-boundaries.geojson")
with open(file_path) as f:
    chicago_geojson = json.load(f)
geo_data = alt.Data(values=chicago_geojson["features"])
```

b.

```
import requests
import json
```

```
# URL of the Chicago neighborhood boundaries GeoJSON
url =
    "https://data.cityofchicago.org/api/geospatial/bbvz-uum9?method=export&format=GeoJSON"
```

```
# Download the file
response = requests.get(url)
chicago_geojson = response.json()

# Create the directory if it doesn't exist
os.makedirs(directory, exist_ok=True)

# Save the file locally
with open(file_path, "w") as f:
    json.dump(chicago_geojson, f)

print(f"File saved to: {file_path}")
geo_data = alt.Data(values=chicago_geojson["features"])
```

File saved to: C:\Users\clari\OneDrive\Documents\Python II\problem set 6\chicago-boundaries.geojson

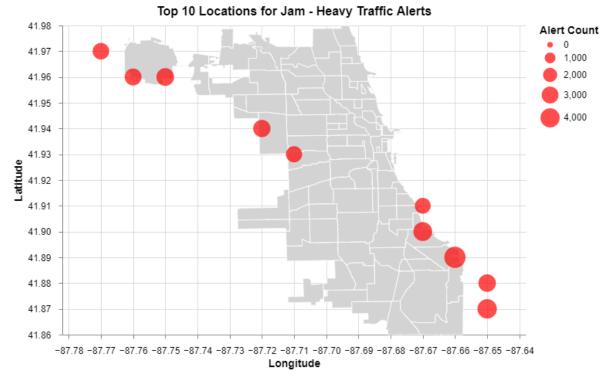
```
if "features" in chicago_geojson and chicago_geojson["features"]:
    geo_data = alt.Data(values=chicago_geojson["features"])
else:
    print("GeoJSON 'features' key is missing or empty")
```

```
# Apply equirectangular projection to map
base = alt.Chart(geo_data).mark_geoshape(
    fill='lightgray',
    stroke='white'
).properties(
    width=600,
    height=400
).project(
    type='equirectangular',
)

# If the map shows up correctly, continue with the points layer
top_10_chart = alt.Chart(top_10).mark_circle(color='red').encode(
    x=alt.X('binned_longitude:Q', title='Longitude', scale=alt.Scale(
    domain=[min_lon - lon_padding, max_lon + lon_padding])),
    y=alt.Y('binned_latitude:Q', title='Latitude', scale=alt.Scale(
```

```
domain=[min_lat - lat_padding, max_lat + lat_padding])),
    size=alt.Size('alert_count:Q', scale=alt.Scale(
        range=[50, 750]), title='Alert Count'),
    tooltip=[
        alt.Tooltip('binned_latitude:Q', title='Latitude'),
        alt.Tooltip('binned_longitude:Q', title='Longitude'),
        alt.Tooltip('alert_count:Q', title='Alert Count')
   ]
)
# Combine the base map and points layer using alt.layer
jam_chart = alt.layer(base, top_10_chart).properties(
    title='Top 10 Locations for Jam - Heavy Traffic Alerts',
   width=600,
   height=400
# Apply configurations to the combined chart (outside of alt.layer)
jam_chart = jam_chart.configure_view(
    strokeWidth=0 # Remove border around the chart
).configure_axis(
   grid=True, # Add grid lines
   labelFontSize=12,
   titleFontSize=14, # Axis title font size
   titleFontWeight='bold', # Bold axis titles
   labelPadding=10 # Padding for axis labels
).configure_title(
   fontSize=16, # Font size for chart title
    fontWeight='bold' # Bold chart title
).configure_legend(
   titleFontSize=14, # Font size for legend title
    labelFontSize=12, # Font size for legend labels
    symbolSize=100 # Adjust size of the legend symbols
# Save the chart as an interactive HTML file
jam_chart.save('jam_chart.html')
jam_chart.show()
```

```
alt.LayerChart(...)
```



a. Total number of type-subtype combinations: 11

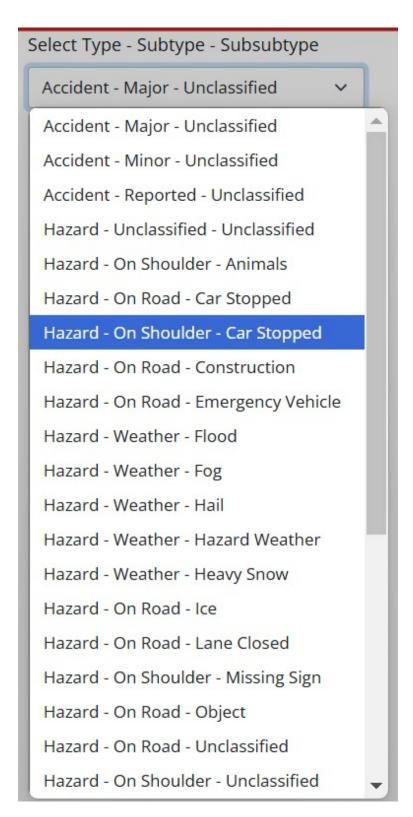


Figure 2: Dropdown menu

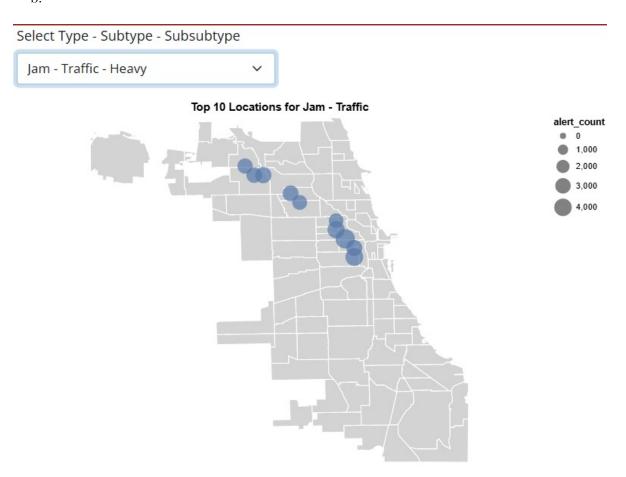


Figure 3: Jam- Heavy Traffic

c. Road closures due to an event seem to be most common at the North-West side of Chicago. Unfortunately, I don't have the long-lat because it won't load properly if I add it in, so I can't give the location.

Road Closed - Event - Unclassified 🔻

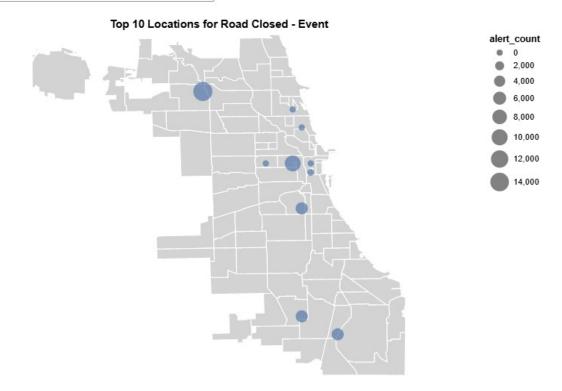


Figure 4: Road CLosure- Events

d. Where can we expect there to be the most number of major traffic accidents?

We can expect most of the major traffic accidents to be around the upper- middle part of Chicago. Unfortunately, I don't have the long-lat because it won't load properly if I add it in, so I can't give the location.

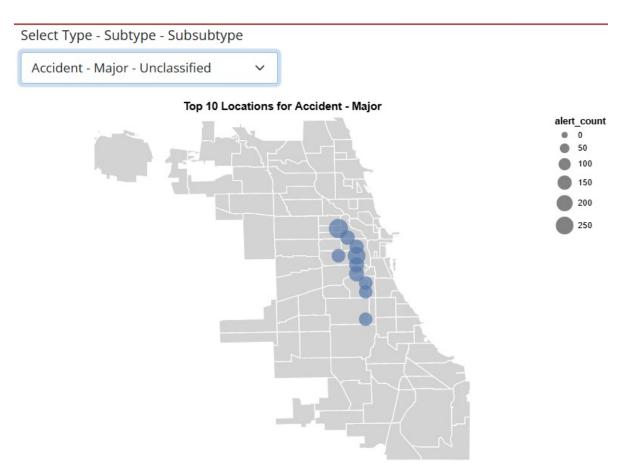


Figure 5: Major Traffic Accidents

e. Can you suggest adding another column to the dashboard to enhance our analysis?

The dashboard could benefit from more information about the time of day in which these accidents occur, along with more specific information as to where they occur. Currently, our dashboard displays this data in coordinates relative to a city map, which is helpful if you're already familiar with the area. For an outsider, more details about specific streets and highways would be quite helpful.

App #2: Top Location by Alert Type and Hour Dashboard (20 points)

1.

a. Yes, I think it's a good idea, especially if we aim to analyze alerts by hour of the day (as suggested in the query), collapsing the data by ts into hourly bins makes sense. This

would allow you to identify patterns or trends in alerts based on the time of day. Reducing Data Size: If the dataset is very large, collapsing by ts can reduce its size, especially if you're aggregating alerts into hourly or daily bins. Time-Based Analysis: Collapsing by ts enables temporal analysis, such as understanding peak traffic hours, accident-prone times, or hazard trends.

b.

```
# Bin latitude and longitude into bins with step size 0.01
merged_df['binned_latitude'] = (merged_df['latitude'] // 0.01) * 0.01
merged_df['binned_longitude'] = (merged_df['longitude'] // 0.01) * 0.01

# Check how many rows the dataset has
row_count = merged_df.shape[0]
print(f"The dataset contains {row_count} rows.")
```

The dataset contains 778094 rows.

```
if merged_df['ts'].dtype != 'datetime64[ns]':
    # Convert 'ts' to datetime format
    merged_df['ts'] = pd.to_datetime(
        merged_df['ts'].str.replace("UTC", ""), errors='coerce')

# Extract the hour (floor to the start of the hour) from the 'ts' column
merged_df['hour'] = merged_df['ts'].dt.floor('H')
```

C:\Users\clari\AppData\Local\Temp\ipykernel_26404\1751780735.py:7:
FutureWarning:

'H' is deprecated and will be removed in a future version, please use 'h' instead.

```
# Group and aggregate by hour, binned latitude, and longitude
aggregated_data = (
    merged_df.groupby(['hour', 'binned_latitude', 'binned_longitude'])
    .size()
    .reset_index(name='alert_count')
# Rank and filter top 10 alerts per hour
aggregated_data['rank'] = aggregated_data.groupby(
    'hour')['alert_count'].rank(ascending=False, method='first')
top_10_per_hour = aggregated_data[aggregated_data['rank'] <= 10].drop(</pre>
    columns='rank')
# Save the collapsed dataset
output_folder = r'C:\Users\clari\OneDrive\Documents\Python II\problem set

→ 6\top_alerts_map_byhour'

os.makedirs(output_folder, exist_ok=True)
output_path = os.path.join(output_folder, 'top_alerts_map_byhour.csv')
top_10_per_hour.to_csv(output_path, index=False)
print(f"Number of rows in the dataset: {len(top 10 per hour)}")
```

Number of rows in the dataset: 65826

c.

```
import random
```

```
data_path = r'C:\Users\clari\OneDrive\Documents\Python II\problem set

    6\top_alerts_map_byhour\top_alerts_map_byhour.csv'
top_alerts_df = pd.read_csv(data_path)

# Remove timezone information from 'hour' column
top_alerts_df['hour'] = pd.to_datetime(
    top_alerts_df['hour']).dt.tz_localize(None)
```

```
# Specify the 3 specific hours you want to focus on
# Modify this list to the specific hours you want
specific_hours = ['08:00', '12:00', '18:00']
print(f"Selected specific hours: {specific_hours}")
# Load GeoJSON data for Chicago boundaries
geojson_path = r'C:\Users\clari\OneDrive\Documents\Python II\problem set
with open(geojson_path) as f:
    chicago_geojson = json.load(f)
geo_data = alt.Data(values=chicago_geojson["features"])
# Initialize an empty list to store charts
jam_hour_charts = []
for hour in specific_hours:
    # Filter data for the specific hour
    hourly_data = top_alerts_df[top_alerts_df['hour'].dt.strftime(
        '%H:%M') == hour]
    # Sort by alert_count and select the top 10 rows
    hourly_data_top_10 = hourly_data.sort_values(
        by='alert_count', ascending=False).head(10)
    # Debugging: Print filtered data
    print(f"\nData for hour {hour}:")
    print(hourly_data_top_10)
    if hourly_data_top_10.empty:
        print(f"No data available for hour {hour}. Skipping...")
        continue
    # Create map layer (base map)
    base_map = alt.Chart(geo_data).mark_geoshape(
        fill='lightgray',
        stroke='white'
    ).properties(
        width=600,
        height=400
    )
```

```
# Add points layer for top locations
    points_layer = alt.Chart(hourly_data_top_10).mark_circle().encode(
        longitude='binned_longitude:Q',
        latitude='binned_latitude:Q',
        size=alt.Size('alert_count:Q', scale=alt.Scale(range=[10, 100])),
        color=alt.value('red'),
        tooltip=['binned_longitude', 'binned_latitude', 'alert_count']
    )
    # Combine base map and points layer
    jam_hour_chart = alt.layer(base_map, points_layer).project(
        type='mercator',
        scale=50000,
        center=[-87.65, 41.88] # Approximate center of Chicago
    ).properties(
        title=f"Top 10 Locations for Alerts at {hour}"
    )
    # Append chart to list of charts
    jam_hour_charts.append((jam_hour_chart, hour))
Selected specific hours: ['08:00', '12:00', '18:00']
Data for hour 08:00:
                     hour binned_latitude binned_longitude alert_count
45090 2024-07-16 08:00:00
                                     41.87
                                                       -87.67
                                                                        19
32449 2024-05-24 08:00:00
                                     41.96
                                                      -87.75
                                                                        14
36281 2024-06-09 08:00:00
                                     41.96
                                                      -87.75
                                                                        13
38431 2024-06-18 08:00:00
                                     41.96
                                                      -87.75
                                                                        13
31015 2024-05-18 08:00:00
                                     41.96
                                                      -87.75
                                                                        13
28381 2024-05-07 08:00:00
                                     41.96
                                                      -87.75
                                                                        13
30539 2024-05-16 08:00:00
                                     41.96
                                                      -87.75
                                                                        13
33404 2024-05-28 08:00:00
                                     41.96
                                                      -87.75
                                                                        12
29819 2024-05-13 08:00:00
                                     41.96
                                                      -87.75
                                                                        12
32929 2024-05-26 08:00:00
                                     41.96
                                                      -87.75
                                                                        12
Data for hour 12:00:
                     hour binned latitude binned longitude alert count
52675 2024-08-17 12:00:00
                                     41.88
                                                      -87.68
52672 2024-08-17 12:00:00
                                     41.87
                                                      -87.68
                                                                        38
28661 2024-05-08 12:00:00
                                     41.96
                                                      -87.75
                                                                        29
32251 2024-05-23 12:00:00
                                     41.96
                                                      -87.75
                                                                        23
```

```
34879 2024-06-03 12:00:00
                                     41.96
                                                       -87.75
                                                                        21
33920 2024-05-30 12:00:00
                                     41.96
                                                       -87.75
                                                                        20
31772 2024-05-21 12:00:00
                                     41.96
                                                       -87.75
                                                                        20
27223 2024-05-02 12:00:00
                                     41.96
                                                       -87.75
                                                                        20
40150 2024-06-25 12:00:00
                                     41.96
                                                       -87.75
                                                                        20
35362 2024-06-05 12:00:00
                                     41.96
                                                       -87.75
                                                                        19
Data for hour 18:00:
                     hour binned_latitude binned_longitude alert_count
29199 2024-05-10 18:00:00
                                     41.96
                                                       -87.75
30872 2024-05-17 18:00:00
                                     41.88
                                                       -87.65
                                                                        20
35898 2024-06-07 18:00:00
                                                       -87.65
                                     41.88
                                                                        19
30637 2024-05-16 18:00:00
                                     41.88
                                                       -87.65
                                                                        19
29438 2024-05-11 18:00:00
                                     41.96
                                                       -87.75
                                                                        19
32068 2024-05-22 18:00:00
                                     41.88
                                                       -87.65
                                                                        18
37329 2024-06-13 18:00:00
                                     41.88
                                                       -87.65
                                                                        18
31595 2024-05-20 18:00:00
                                     41.96
                                                       -87.75
                                                                        18
28958 2024-05-09 18:00:00
                                     41.96
                                                       -87.75
                                                                        17
37811 2024-06-15 18:00:00
                                     41.96
                                                       -87.75
                                                                        17
# Save each chart as an HTML file if needed
output_folder = r'C:\Users\clari\OneDrive\Documents\Python II\problem set 6'
os.makedirs(output_folder, exist_ok=True)
for i, (chart, hour) in enumerate(jam_hour_charts):
    output_path = os.path.join(
        output_folder, f'jam_hour_chart_{hour.replace(":", "-")}.html')
    chart.save(output_path)
    print(f"Chart saved to: {output_path}")
```

```
Chart saved to: C:\Users\clari\OneDrive\Documents\Python II\problem set 6\jam_hour_chart_08-00.html
```

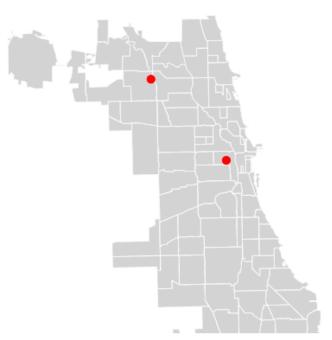
Chart saved to: C:\Users\clari\OneDrive\Documents\Python II\problem set 6\jam_hour_chart_12-00.html

Chart saved to: C:\Users\clari\OneDrive\Documents\Python II\problem set 6\jam_hour_chart_18-00.html

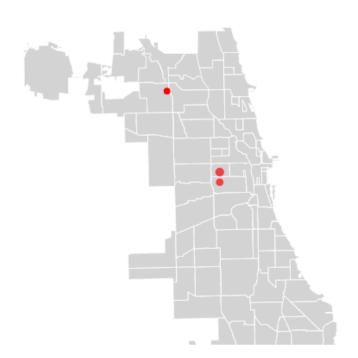
```
jam_hour_chart.show()
```

alt.LayerChart(...)

Top 10 Locations for Alerts at 18:00



Top 10 Locations for Alerts at 12:00







Top 10 Locations for Alerts at 08:00



```
def print_file_contents(file_path):
    """Print contents of a file."""
    try:
        with open(file_path, 'r') as f:
            content = f.read()
            print("```python")
            print(content)
            print("``")
    except FileNotFoundError:
        print("```python")
        print(f"Error: File '{file_path}' not found")
        print("``")
    except Exception as e:
        print("```python")
        print(f"Error reading file: {e}")
        print("``")
# Printing the contents of your app2.py file
print_file_contents(
```

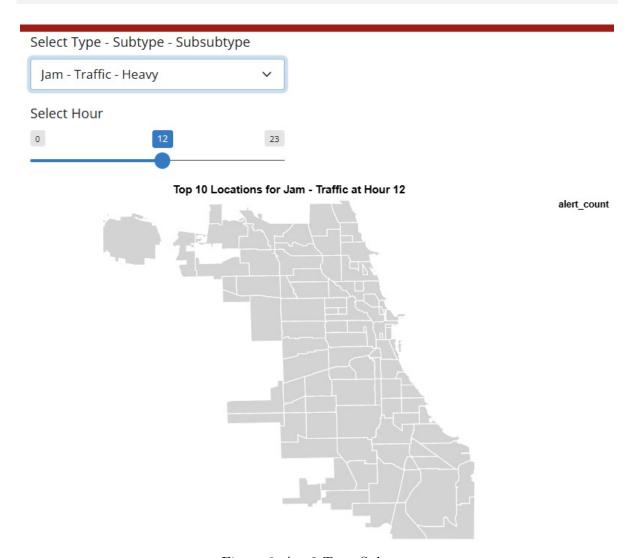


Figure 6: App2 Type-Subtype

a.

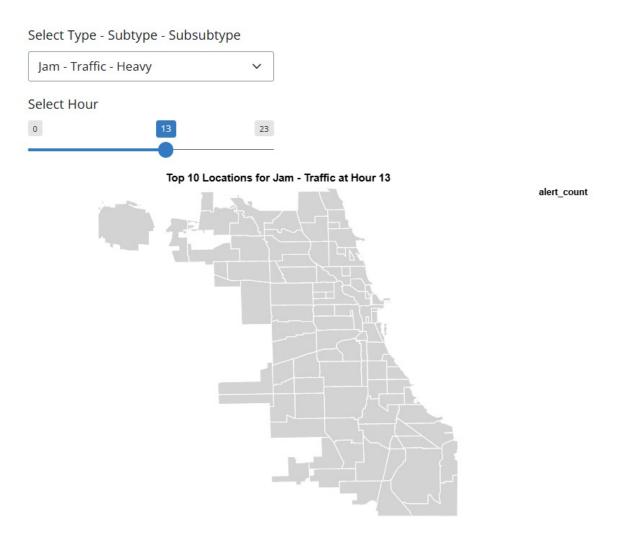


Figure 7: App2 Type-Subtype

b.

c. Unfortunately, although my app was working successfully before, after returning to it the following day, I couldn't recreate the points on the graph despite using the exact same code. This means I'm unable to provide screenshots (i.e. regardless of what time I choose, the map is empty), though based on when the app was running, I was able to gather than closures to to construction are much more common at night than they are during the morning. This makes sense, as late into the night is when they would be ideally be the least disruptive to commuters.

App #3: Top Location by Alert Type and Hour Dashboard (20 points)

1.

a. Though collapsing the data was useful earlier and easier for shiny to handle, it presents a problem if we're allowing users to select their own range of hours. If we collapse the data to pre-arrange it into certain time ranges, we remove user's ability to choose the windows of time for themselves. By not collapsing, we allow the data to dynamically adjust to whatever hours specified.

b.

```
data_path = r'C:\Users\clari\OneDrive\Documents\Python II\problem set
 top_alerts_df = pd.read_csv(data_path)
# Remove timezone information from 'hour' column
top_alerts_df['hour'] = pd.to_datetime(
    top_alerts_df['hour']).dt.tz_localize(None)
# Specify the 3 specific hours you want to focus on (between 6AM-9AM)
# Modify this list to the specific hours you want
specific_hours = ['06:00', '07:00', '08:00', '09:00']
print(f"Selected specific hours: {specific_hours}")
# Load GeoJSON data for Chicago boundaries
geojson path = r'C:\Users\clari\OneDrive\Documents\Python II\problem set

→ 6\chicago-boundaries.geojson'

with open(geojson_path) as f:
    chicago_geojson = json.load(f)
geo_data = alt.Data(values=chicago_geojson["features"])
# Initialize an empty list to store charts
jam_hour_charts = []
for hour in specific_hours:
    # Filter data for the specific hour
   hourly_data = top_alerts_df[top_alerts_df['hour'].dt.strftime(
        '%H:%M') == hour]
```

```
# Sort by alert_count and select the top 10 rows
hourly_data_top_10 = hourly_data.sort_values(
    by='alert_count', ascending=False).head(10)
# Debugging: Print filtered data
print(f"\nData for hour {hour}:")
print(hourly_data_top_10)
if hourly_data_top_10.empty:
    print(f"No data available for hour {hour}. Skipping...")
    continue
# Create map layer (base map) using the Chicago GeoJSON
base_map = alt.Chart(geo_data).mark_geoshape(
    fill='lightgray',
    stroke='white'
).properties(
    width=600,
    height=400
# Add points layer for top locations (alerts)
points_layer = alt.Chart(hourly_data_top_10).mark_circle().encode(
    longitude='binned longitude:Q',
    latitude='binned_latitude:Q',
    size=alt.Size('alert count:Q', scale=alt.Scale(range=[10, 100])),
    color=alt.value('red'),
    tooltip=['binned_longitude', 'binned_latitude', 'alert_count']
)
# Combine base map and points layer for the final chart
jam_hour_chart = alt.layer(base_map, points_layer).project(
    type='mercator',
    scale=50000,
    center=[-87.65, 41.88] # Approximate center of Chicago
).properties(
    title=f"Top 10 Locations for Alerts at {hour}",
    width=600,
    height=400
)
# Append the chart to the list
```

```
jam_hour_charts.append((jam_hour_chart, hour))
# Save each chart as a PNG file using kaleido
output_folder = r'C:\Users\clari\OneDrive\Documents\Python II\problem set 6'
os.makedirs(output_folder, exist_ok=True)
for i, (chart, hour) in enumerate(jam_hour_charts):
    output_path = os.path.join(
        output folder, f'top alerts map byhour sliderrange {hour.replace(":",
   "-")}.png')
    # Using kaleido to save as PNG
    chart.save(output_path, renderer='kaleido', scale=2.0)
    print(f"Chart saved to: {output_path}")
Selected specific hours: ['06:00', '07:00', '08:00', '09:00']
Data for hour 06:00:
                     hour binned_latitude binned_longitude alert_count
54942 2024-08-27 06:00:00
                                     41.80
                                                       -87.64
                                                                        15
28124 2024-05-06 06:00:00
                                     41.96
                                                       -87.75
                                                                        13
28364 2024-05-07 06:00:00
                                     41.96
                                                       -87.75
                                                                        13
30757 2024-05-17 06:00:00
                                     41.88
                                                                        12
                                                       -87.65
37691 2024-06-15 06:00:00
                                     41.96
                                                       -87.75
                                                                        12
                                     41.96
30278 2024-05-15 06:00:00
                                                       -87.75
                                                                        12
38411 2024-06-18 06:00:00
                                     41.96
                                                       -87.75
                                                                        12
39851 2024-06-24 06:00:00
                                     41.96
                                                       -87.75
                                                                        12
30038 2024-05-14 06:00:00
                                     41.96
                                                       -87.75
                                                                        12
27644 2024-05-04 06:00:00
                                     41.96
                                                       -87.75
                                                                        12
Data for hour 07:00:
                     hour binned_latitude binned_longitude alert_count
53792 2024-08-22 07:00:00
                                     41.88
                                                       -87.68
                                                                        25
48400 2024-07-30 07:00:00
                                     41.87
                                                       -87.67
                                                                        20
48395 2024-07-30 07:00:00
                                     41.80
                                                       -87.64
                                                                        19
25302 2024-04-24 07:00:00
                                     41.86
                                                       -87.65
                                                                        19
                                     41.88
29568 2024-05-12 07:00:00
                                                       -87.65
                                                                        16
                                     41.96
36272 2024-06-09 07:00:00
                                                       -87.75
                                                                        13
34352 2024-06-01 07:00:00
                                     41.96
                                                       -87.75
                                                                        13
34111 2024-05-31 07:00:00
                                     41.96
                                                       -87.75
                                                                        13
35312 2024-06-05 07:00:00
                                     41.96
                                                       -87.75
                                                                        12
36752 2024-06-11 07:00:00
                                     41.96
                                                       -87.75
                                                                        12
```

Data	for	hour	08:	00:

		hour	binned_latitude	binned_longitude	alert_count
45090	2024-07-16	00:00:80	41.87	-87.67	19
32449	2024-05-24	08:00:00	41.96	-87.75	14
36281	2024-06-09	00:00:80	41.96	-87.75	13
38431	2024-06-18	00:00:80	41.96	-87.75	13
31015	2024-05-18	08:00:00	41.96	-87.75	13
28381	2024-05-07	08:00:00	41.96	-87.75	13
30539	2024-05-16	00:00:80	41.96	-87.75	13
33404	2024-05-28	00:00:80	41.96	-87.75	12
29819	2024-05-13	00:00:80	41.96	-87.75	12
32929	2024-05-26	00:00:80	41.96	-87.75	12

Data for hour 09:00:

		hour	binned_latitude	binned_longitude	alert_count
36769	2024-06-11	09:00:00	41.82	-87.64	17
30785	2024-05-17	09:00:00	41.96	-87.75	14
34852	2024-06-03	09:00:00	41.96	-87.75	13
34132	2024-05-31	09:00:00	41.96	-87.75	13
34612	2024-06-02	09:00:00	41.96	-87.75	13
38200	2024-06-17	09:00:00	41.96	-87.75	13
32223	2024-05-23	09:00:00	41.96	-87.75	13
30069	2024-05-14	09:00:00	41.96	-87.75	13
33179	2024-05-27	09:00:00	41.96	-87.75	13
35572	2024-06-06	09:00:00	41.96	-87.75	13

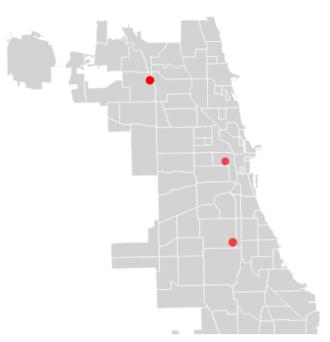
Chart saved to: C:\Users\clari\OneDrive\Documents\Python II\problem set 6\top_alerts_map_byhour_sliderrange_06-00.png

Chart saved to: C:\Users\clari\OneDrive\Documents\Python II\problem set 6\top_alerts_map_byhour_sliderrange_07-00.png

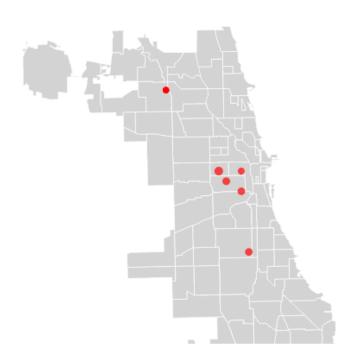
Chart saved to: C:\Users\clari\OneDrive\Documents\Python II\problem set 6\top_alerts_map_byhour_sliderrange_08-00.png

Chart saved to: C:\Users\clari\OneDrive\Documents\Python II\problem set $6 \times _{paper}$

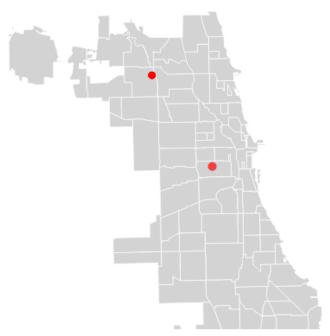
Top 10 Locations for Alerts at 06:00



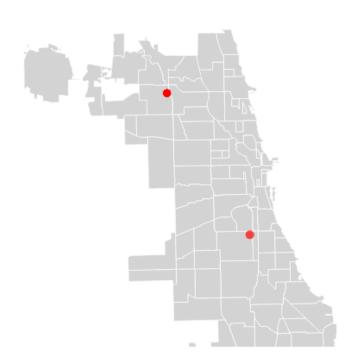
Top 10 Locations for Alerts at 07:00



Top 10 Locations for Alerts at 08:00



Top 10 Locations for Alerts at 09:00



alert_count

• 0 • 5 • 10 • 15

2.

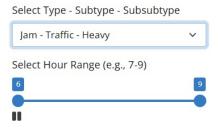


Top 10 Locations for Alerts between 6:00 and 9:00

• 0 • 5 • 10 • 15 • 20



a. See image



Top 10 Locations for Alerts between 6:00 and 9:00

alert_count

- b. See image
- 3.
- a. According to the link, when using a switch button, we can assign a value of True, indicating the input.switch_button is turned on (switching to a range of hours, for example), or False, when the switch is turned off (switching to just one specific hour).

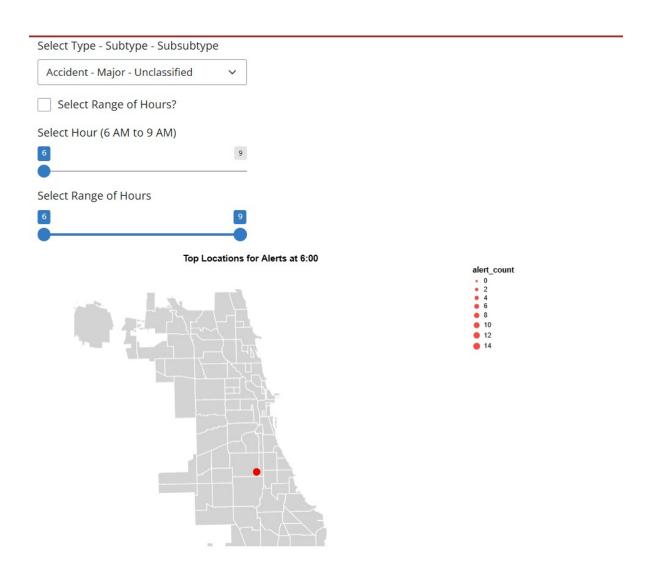
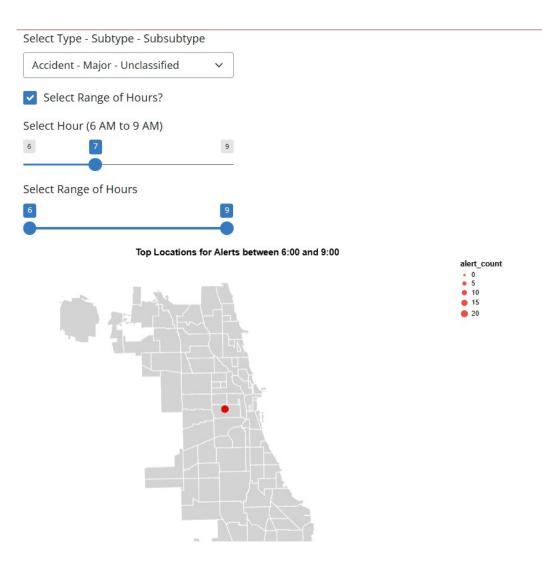


Figure 8: App3-Range



b. See images

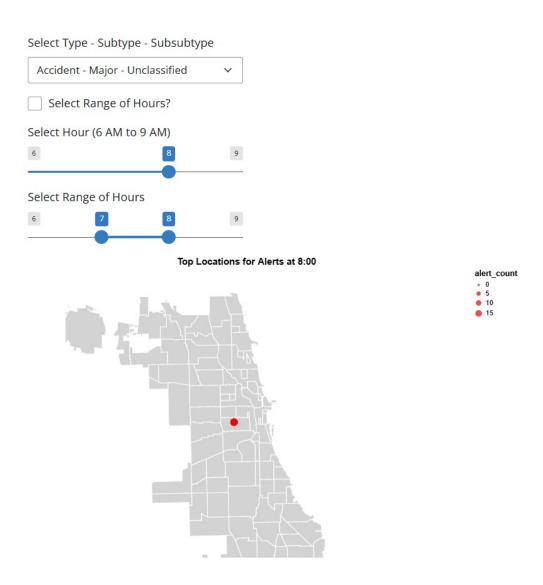


Figure 9: App3-Switch

c. See images (use the variations)

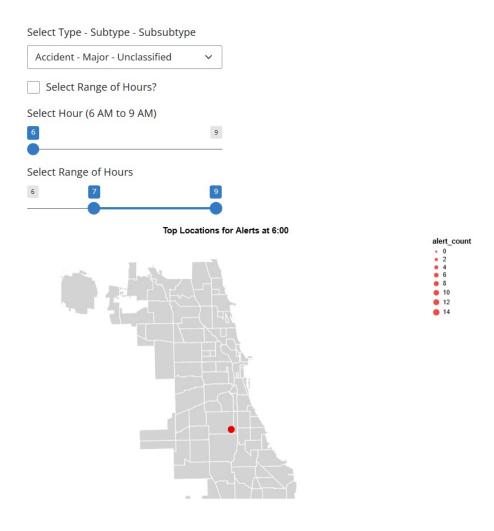


Figure 10: App3-Function

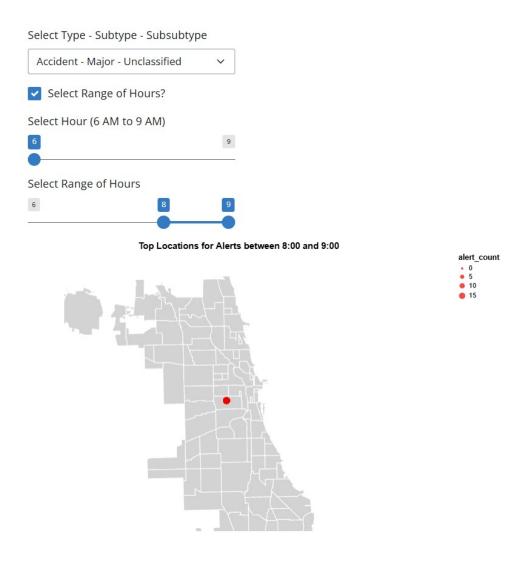


Figure 11: App3-Function

d. The plot seems to divide the data between morning and afternoon times and displays them both simultaneously. To do this, I'd assume our first step is to subset the data between the points that are in the morning (let's say all A.M. times) and another subset for the afternoon (we'll go with all P.M. times until midnight). We'd label the a.m. subset with an extra column indicating 'morning' and a similar 'afternoon' column. In the same way we had a button that toggles between one specific hour and a range, we can imagine a similar button which turns the display of morning points on or off, and another for afternoon points. When only one is on, we can focus solely on these points. If they're both on, they'll display much like what we see in this example plot.