

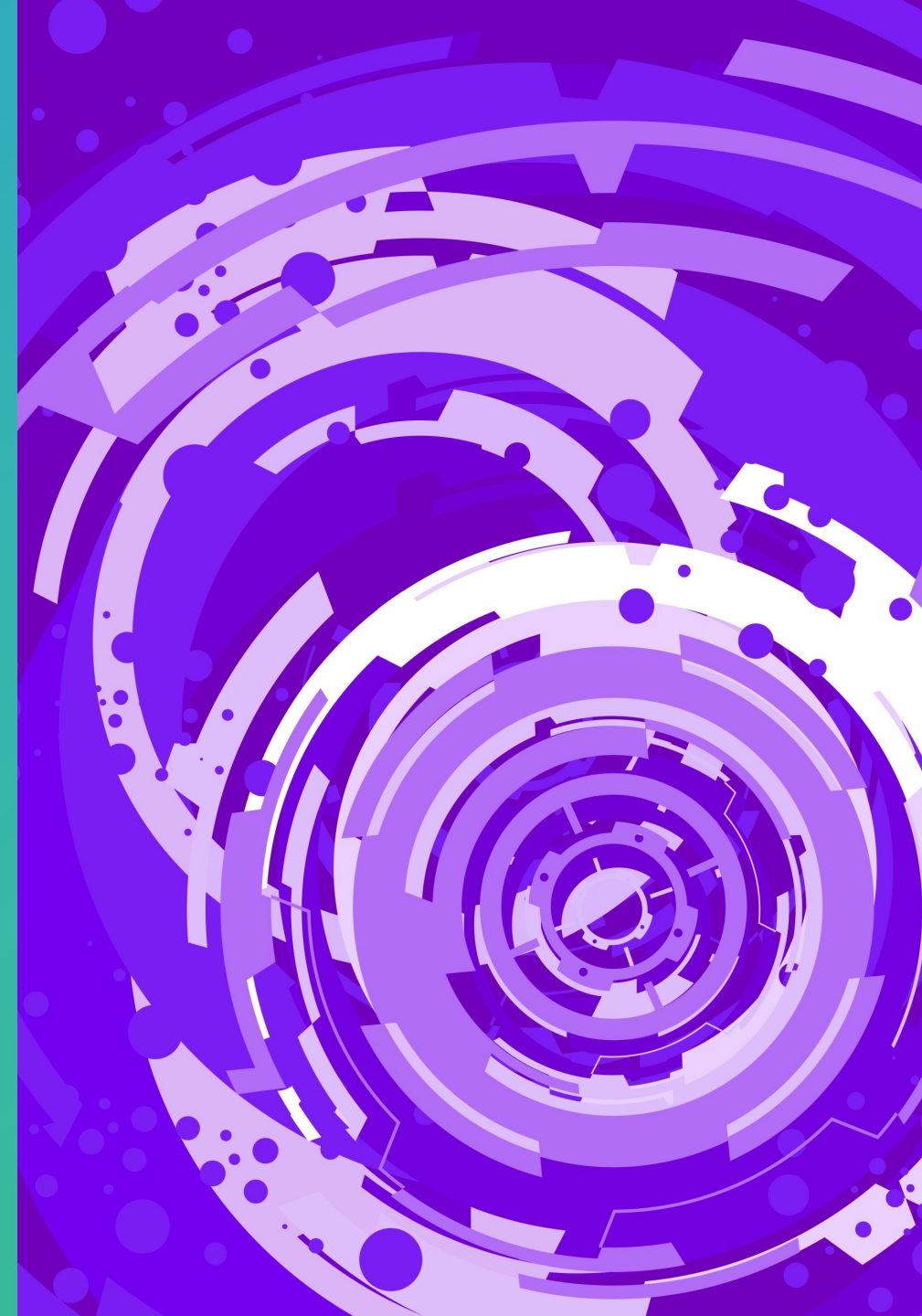
# URBAN GEOGRAPHIC INFORMATION SYSTEM



**Python Visualization**

**Chun-Hsiang Chan**

Department of Geography,  
National Taiwan Normal University





# Outline

- Matplotlib
- Seaborn
- Plotly
- Contextily



Pandas



# Visualization – Methods

- Several visualization functions were developed in built-in package, such as line, scatter, boxplot, and histogram.

Distribution			
Continuous Data	Discrete Data	Ordered/ Categorical Data	Proportional Data
Scatter Bubble Histogram Violin Plot Box Plot Heatmap Density Map	Scatter Bubble Histogram Violin Plot Box Plot Heatmap Density Map	Group/ Stacked Bar Pie	Group/ Stacked Bar Pie

# Data Science Mindset

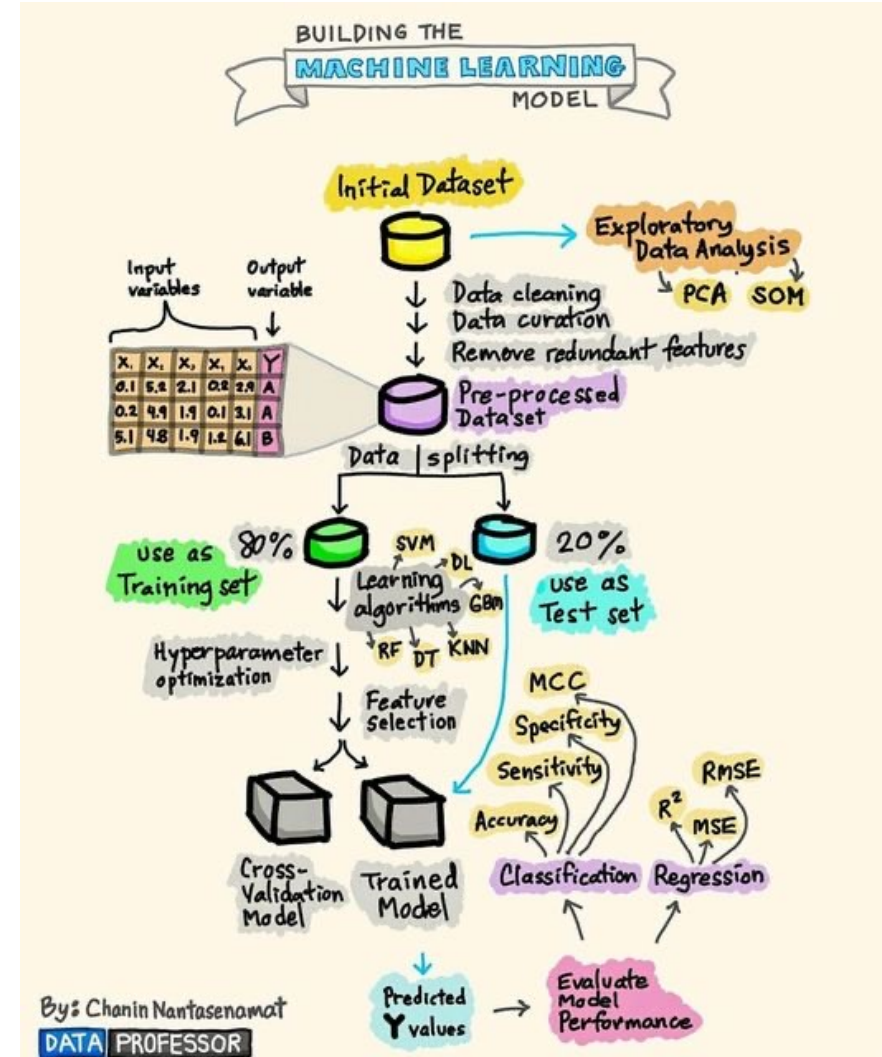
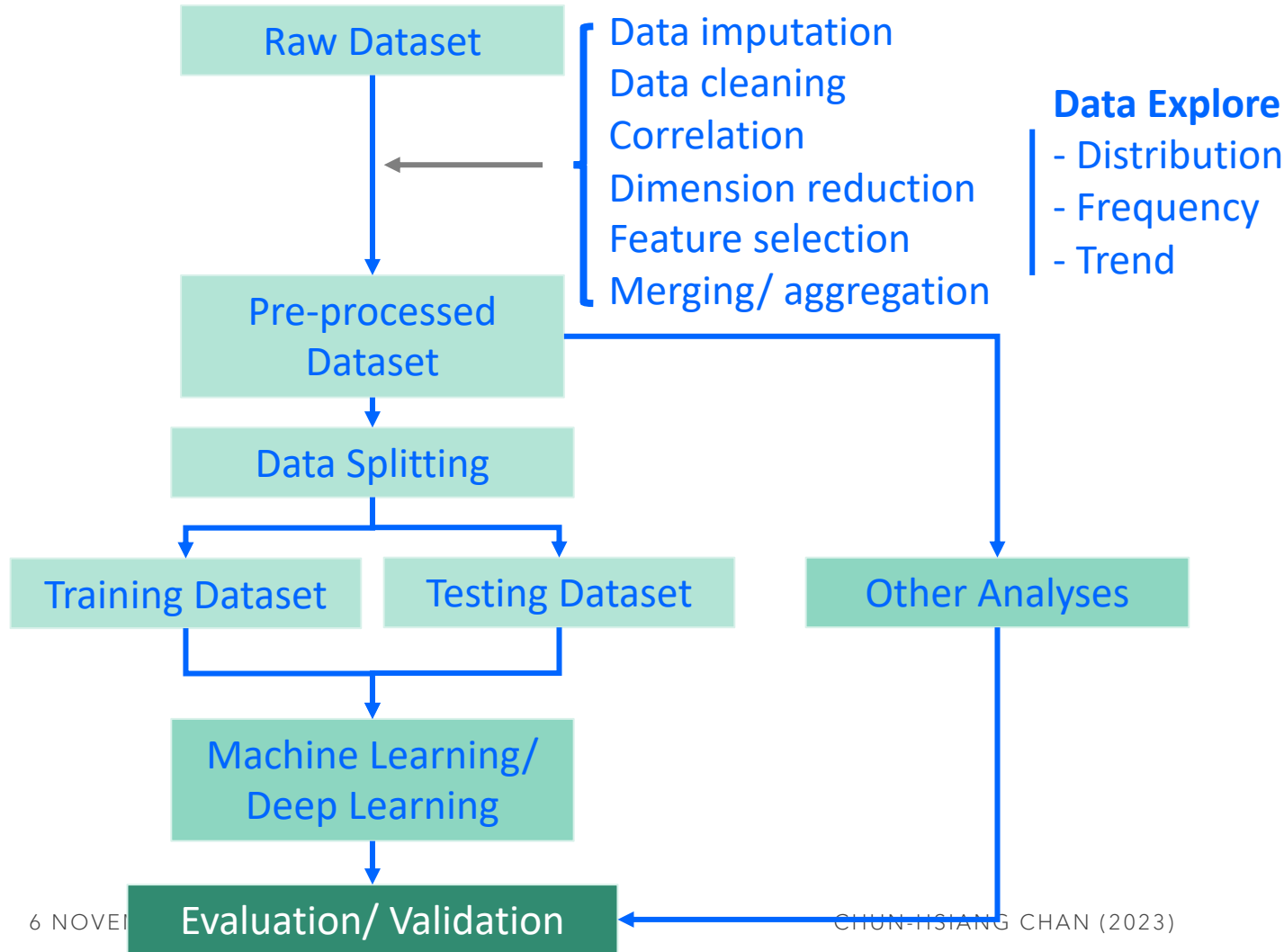
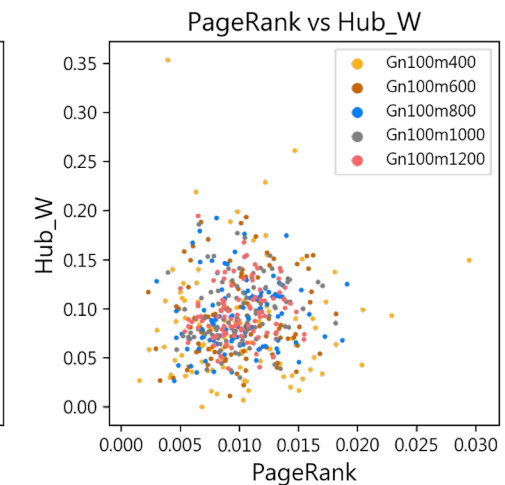
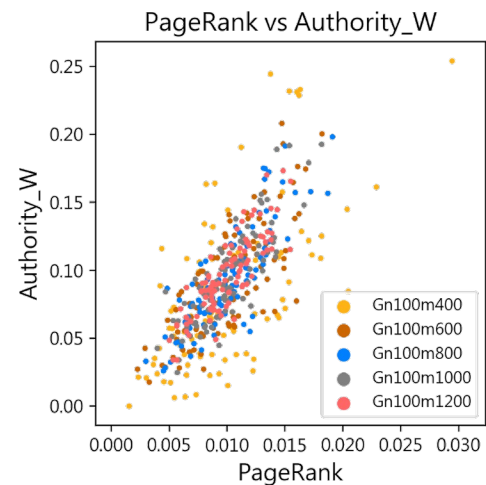
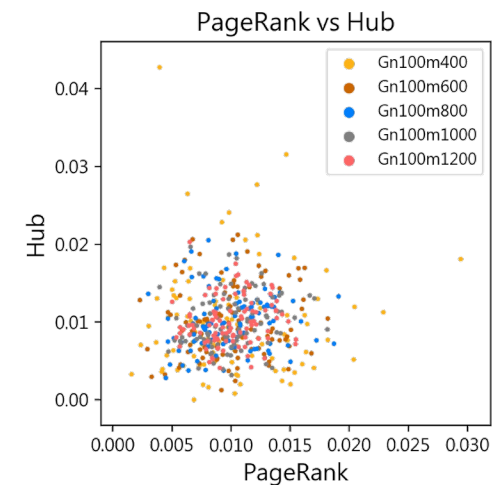
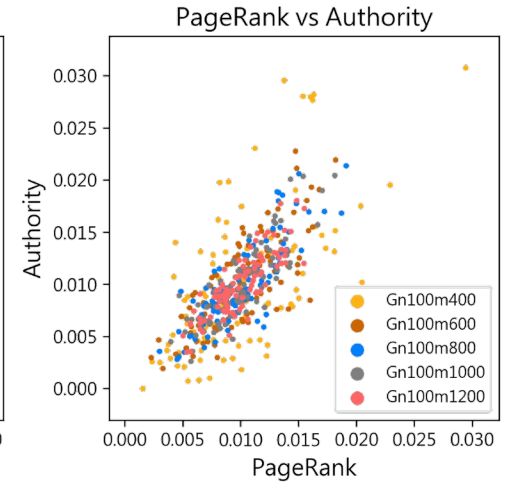
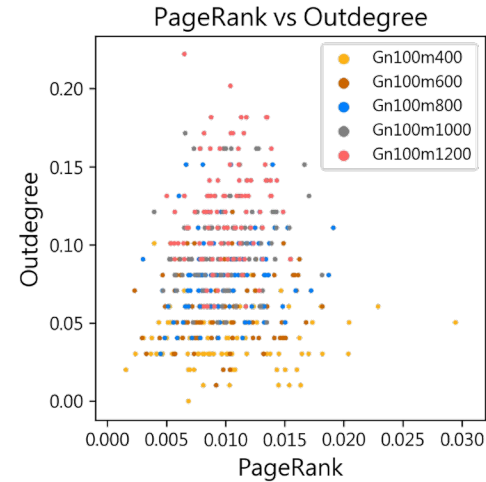
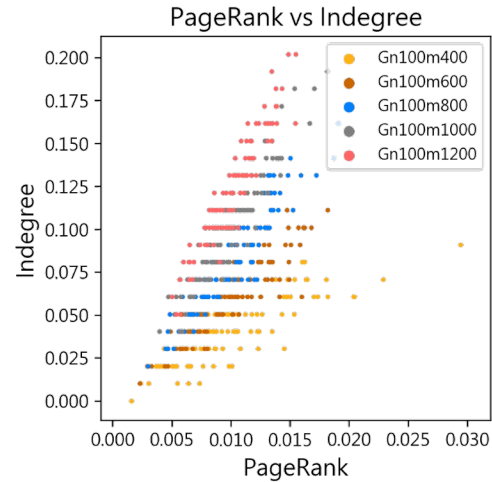
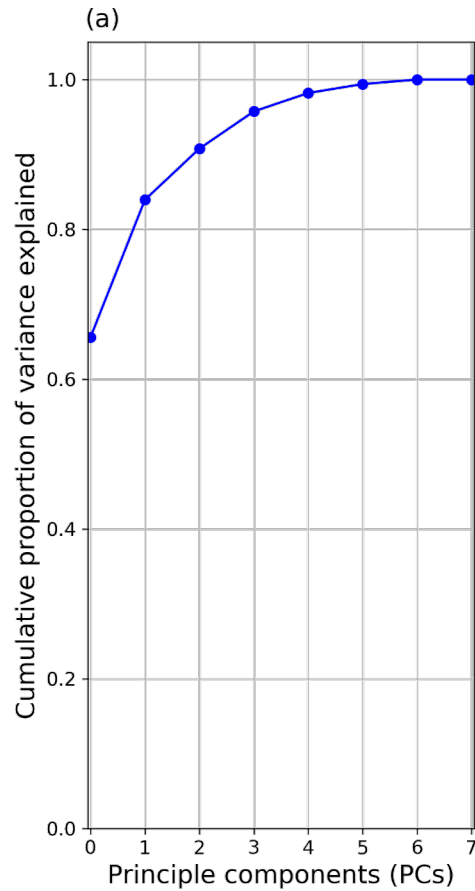
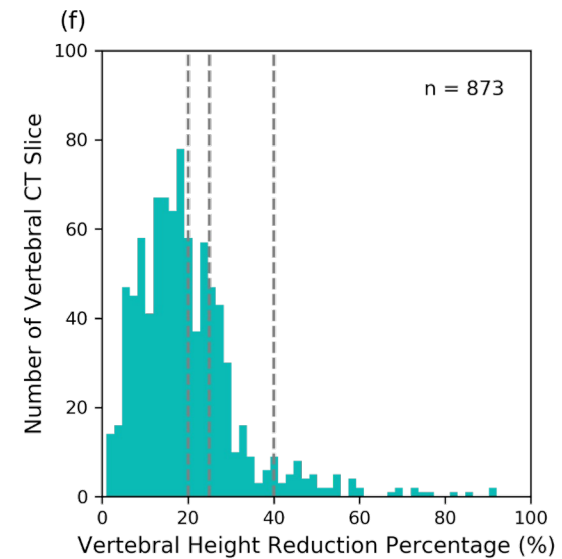
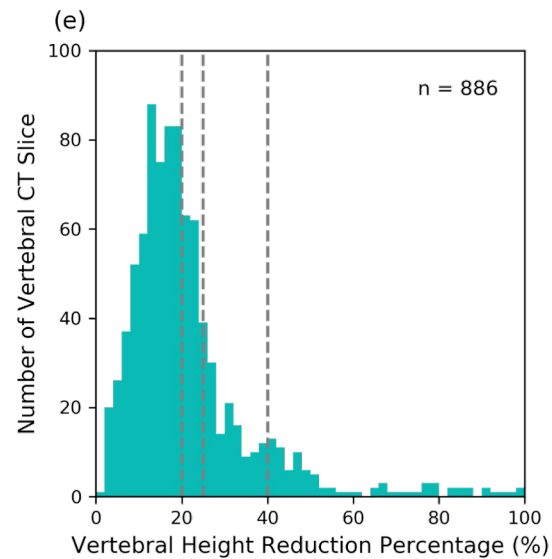
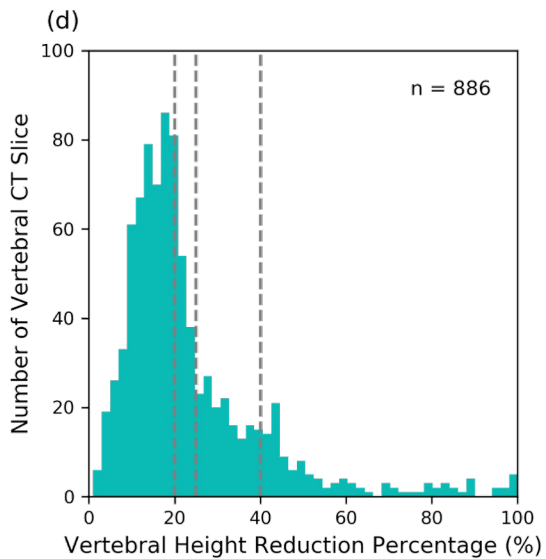
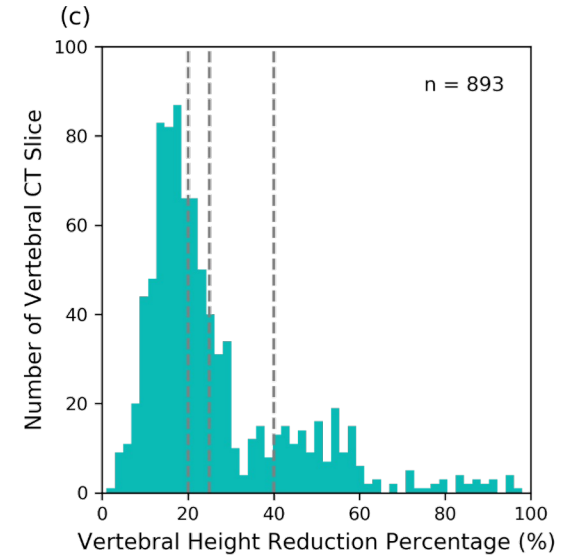
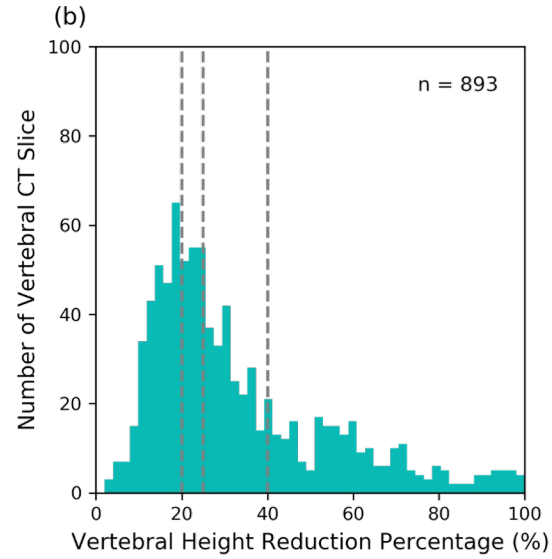
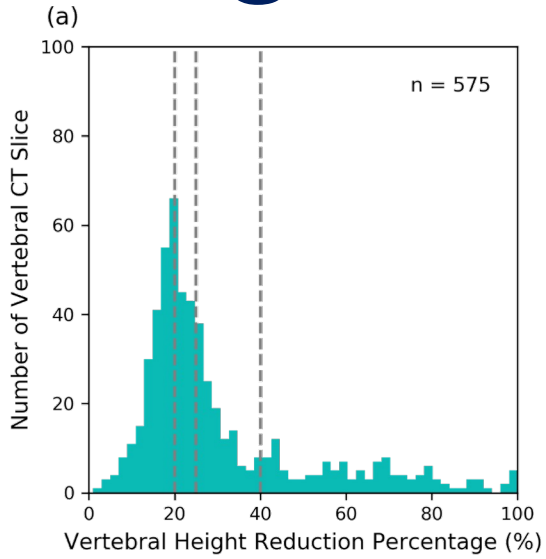


Figure source: <https://bit.ly/3BJd2d4>

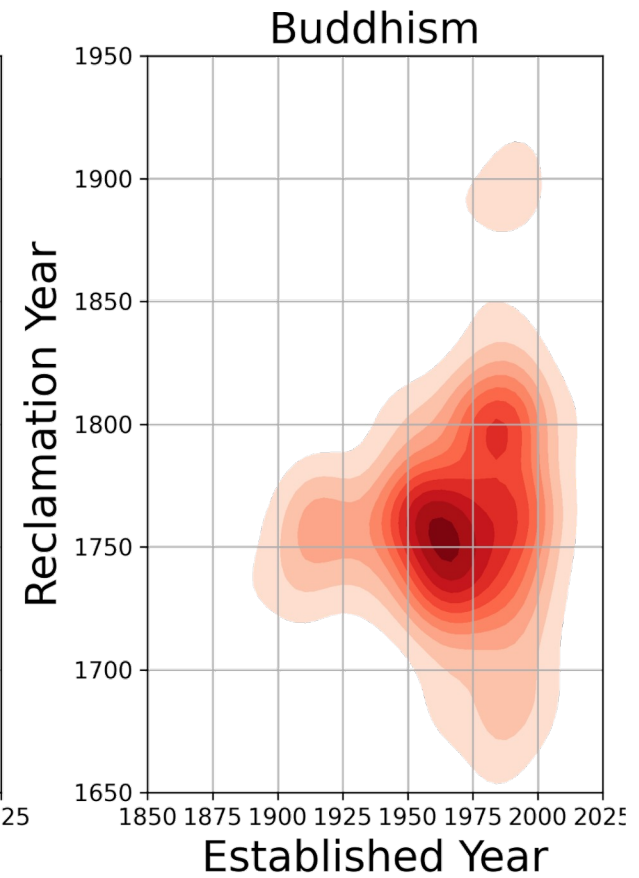
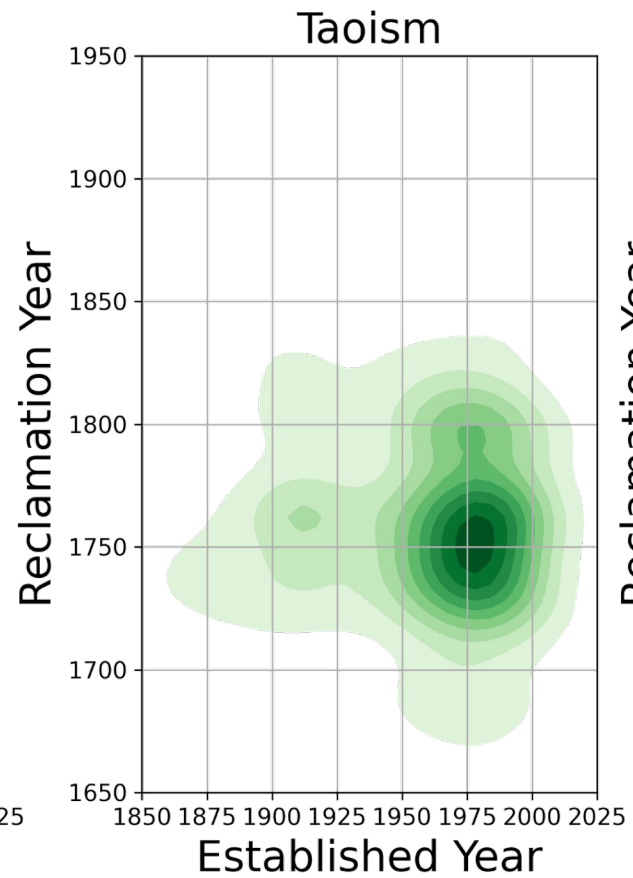
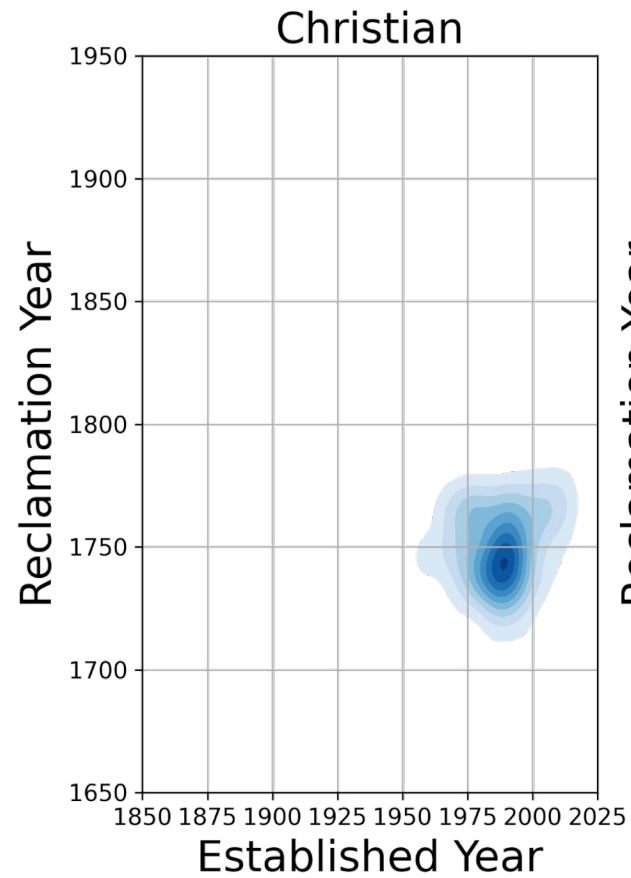
# Line Plot & Scatter Plot



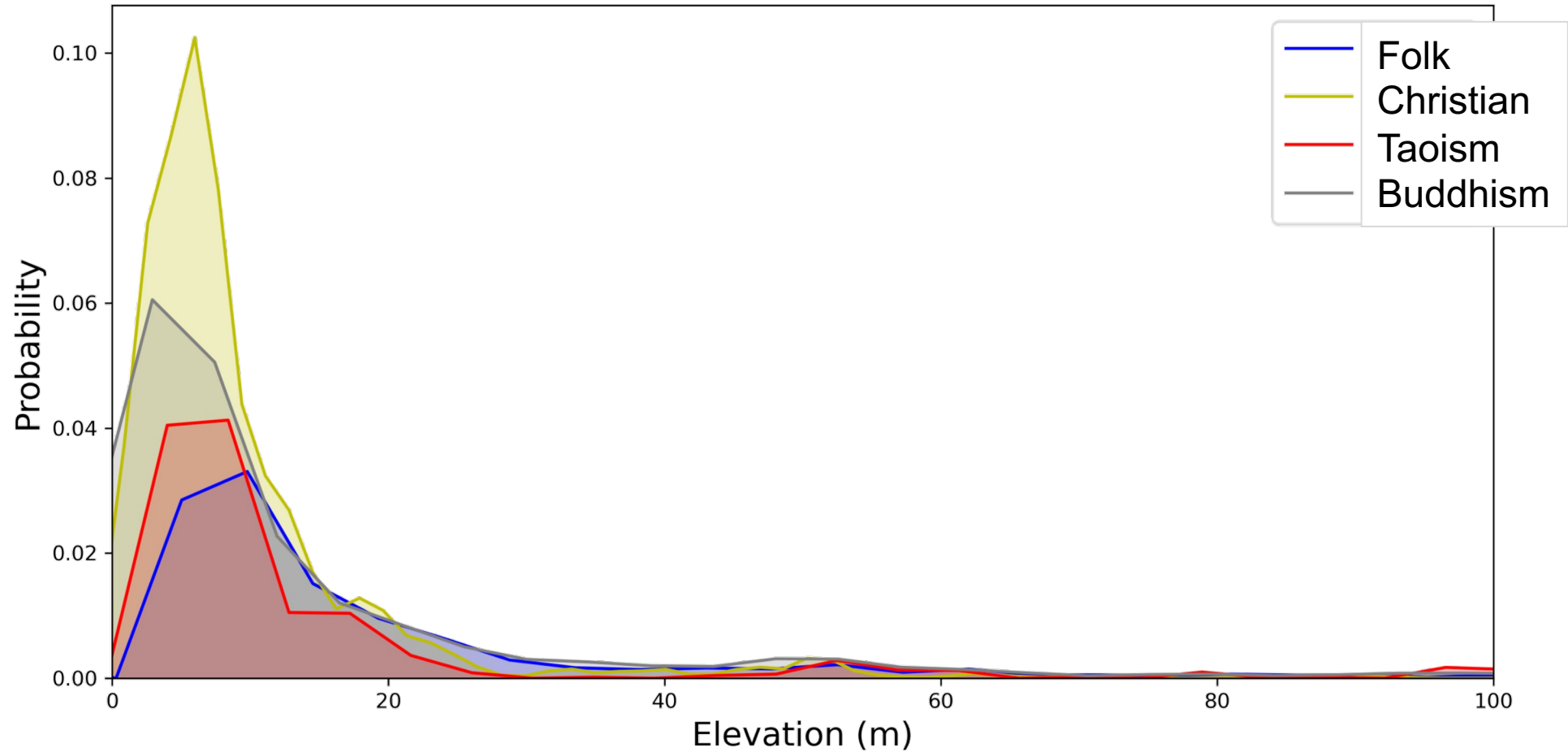
# 1D Histogram



# 2D Histogram

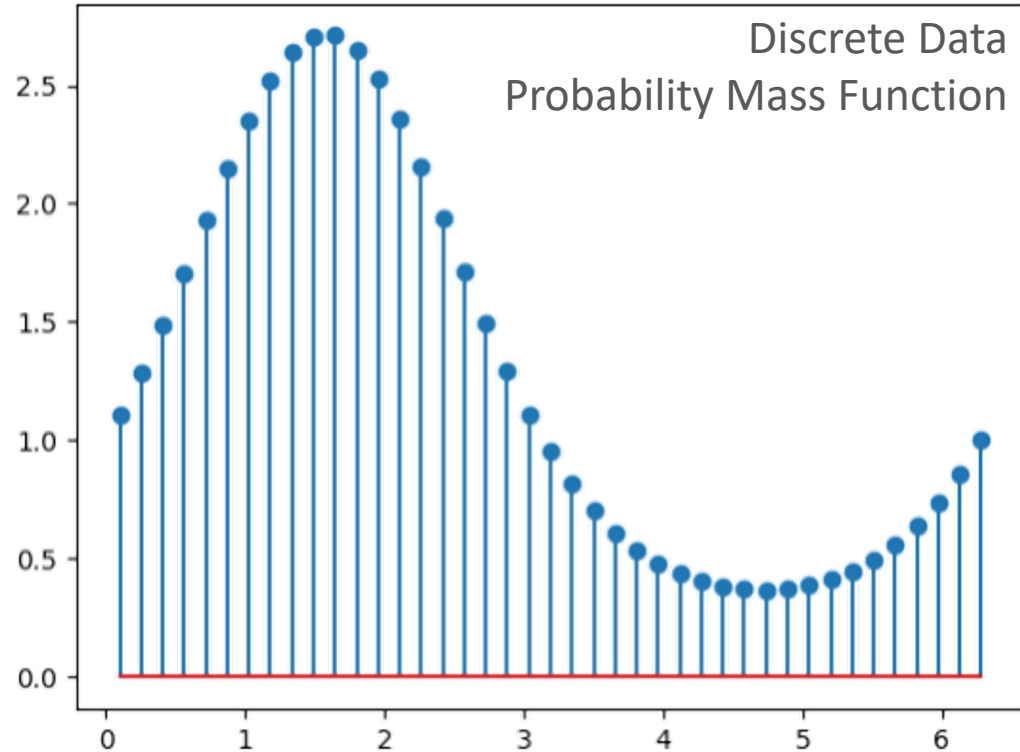


# Area Plot





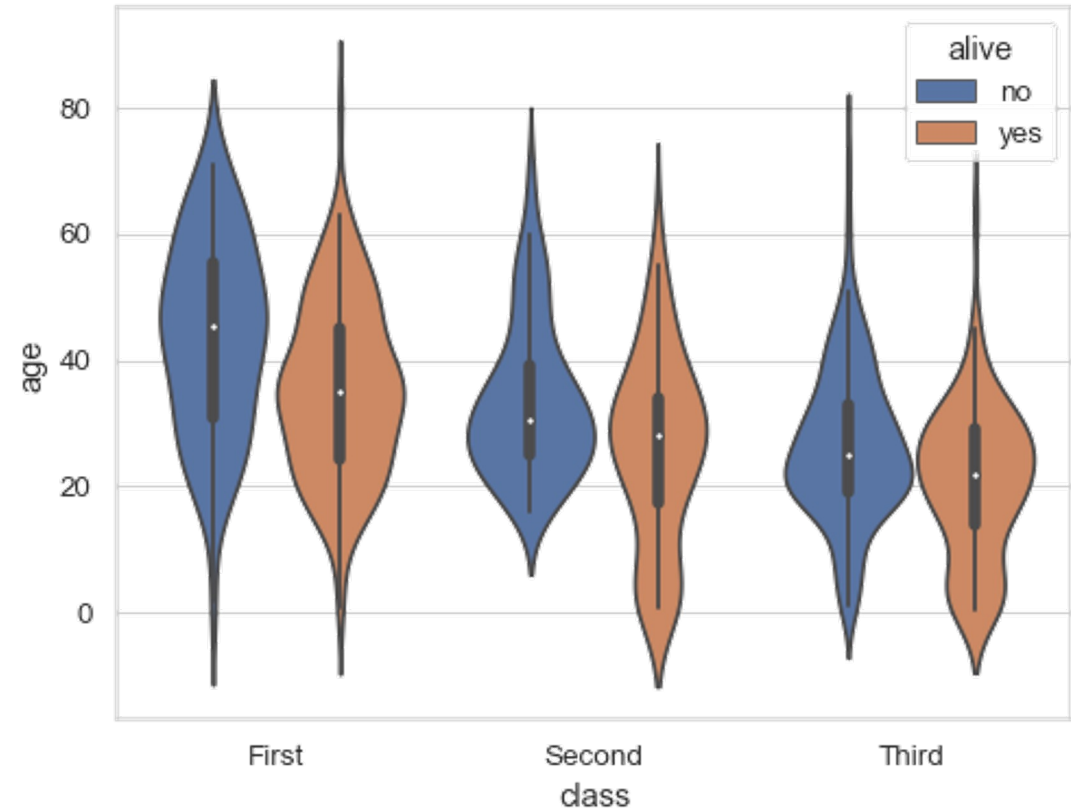
# Stem Plot & Violin Plot



Source:

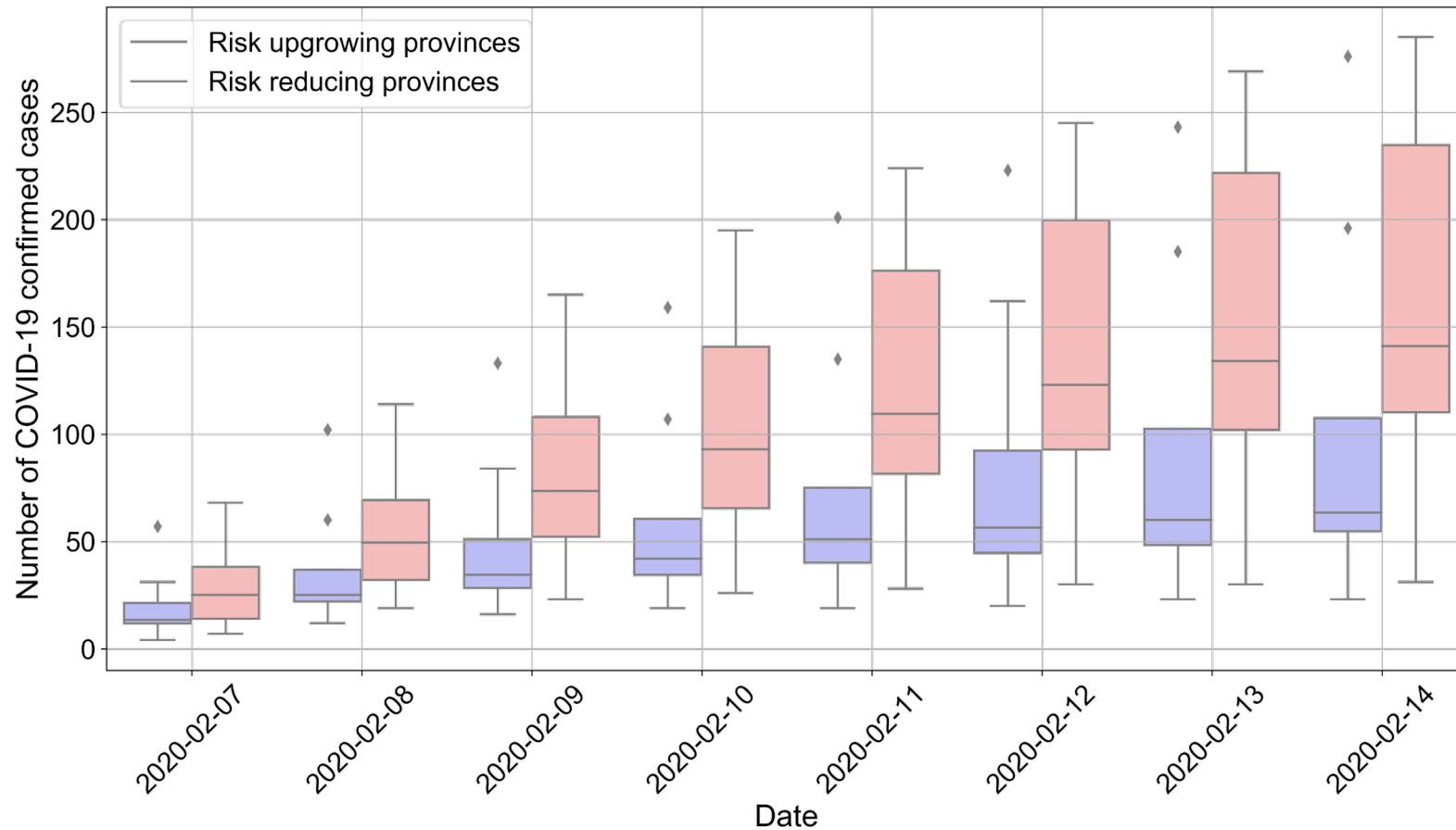
[https://matplotlib.org/stable/gallery/lines\\_bars\\_and\\_markers/stem\\_plot.html#sphx-glr-gallery-lines-bars-and-markers-stem-plot-py](https://matplotlib.org/stable/gallery/lines_bars_and_markers/stem_plot.html#sphx-glr-gallery-lines-bars-and-markers-stem-plot-py)

Continuous Data

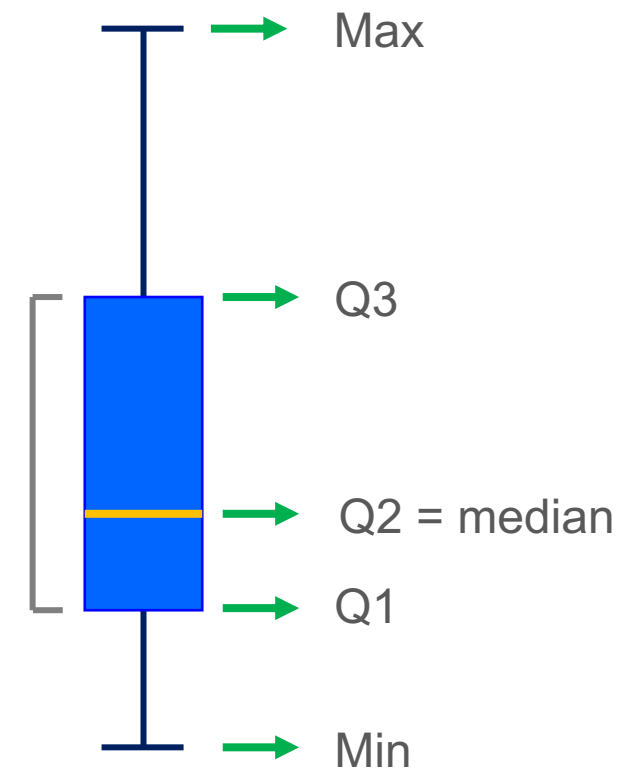


Source: <https://seaborn.pydata.org/generated/seaborn.violinplot.html>

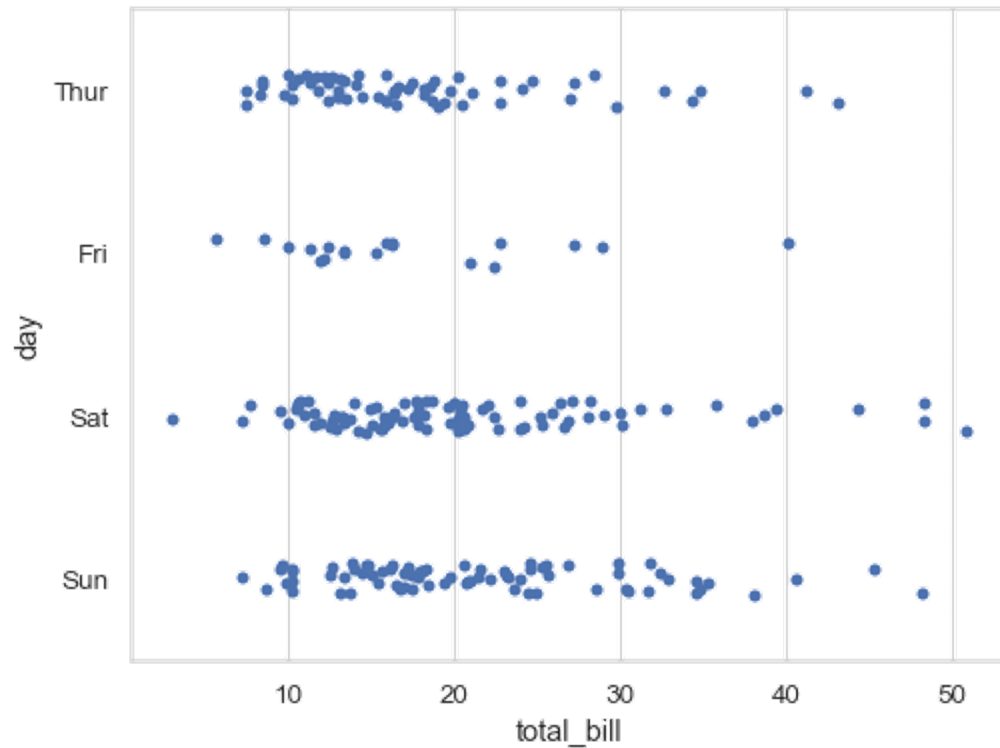
# Box Plot



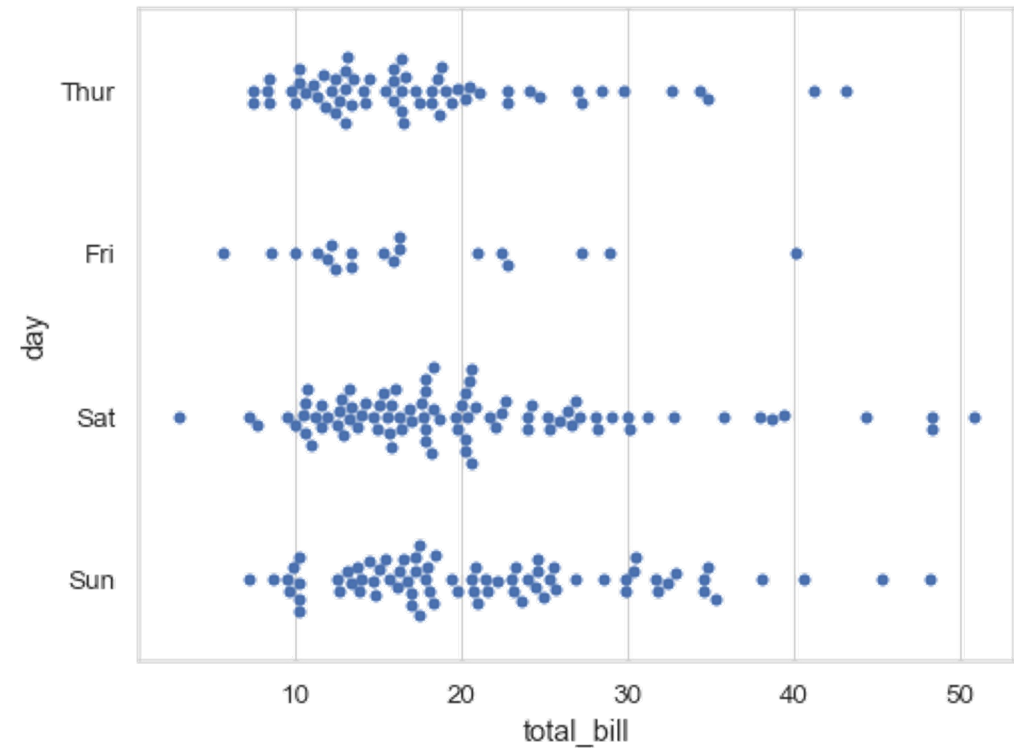
X  
\* → Outliers



# Strip Plot and Swarm Plot

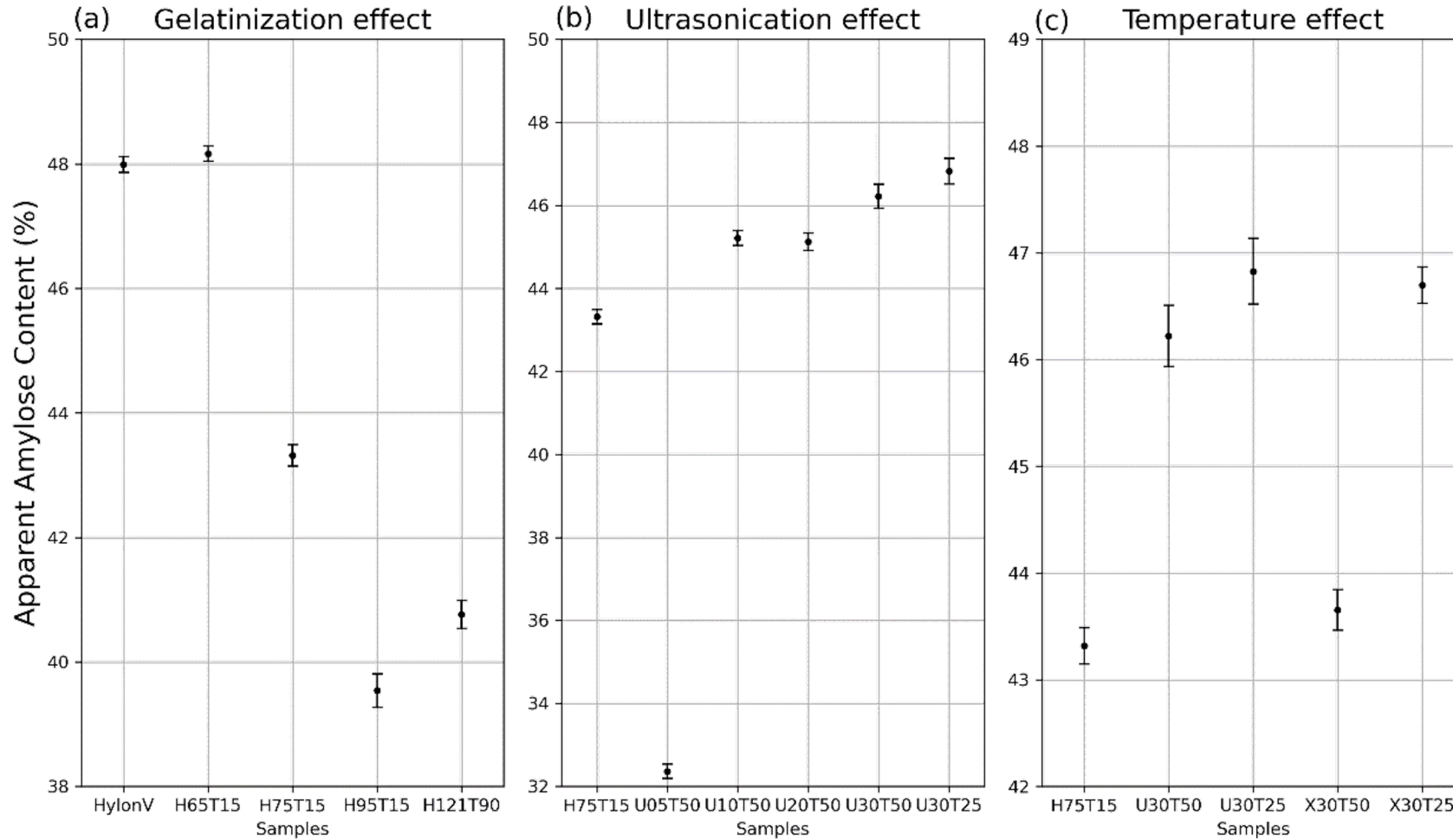


Source: <https://seaborn.pydata.org/generated/seaborn.stripplot.html>

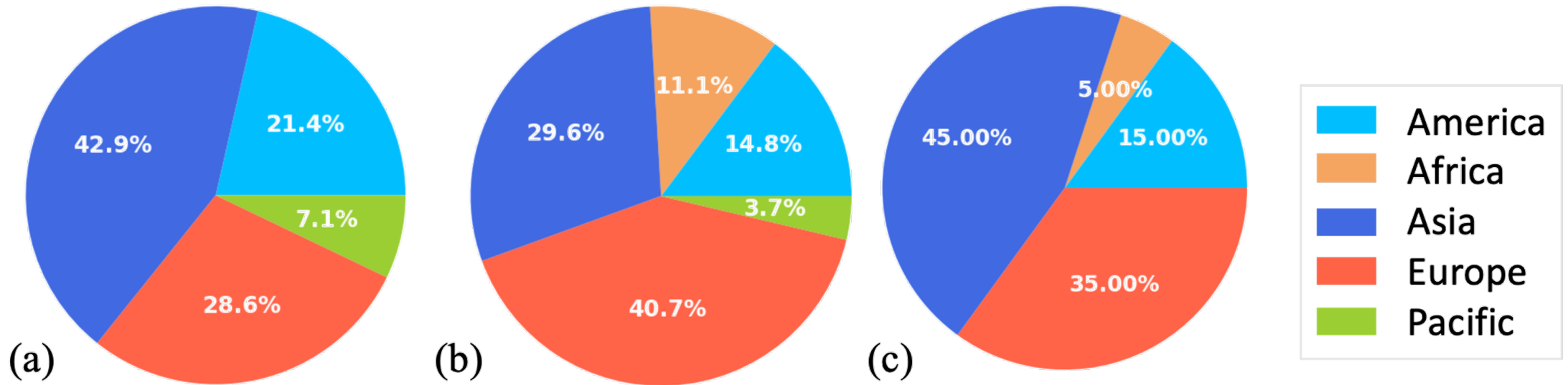


Source: <https://seaborn.pydata.org/generated/seaborn.swarmplot.html>

# Error Bar

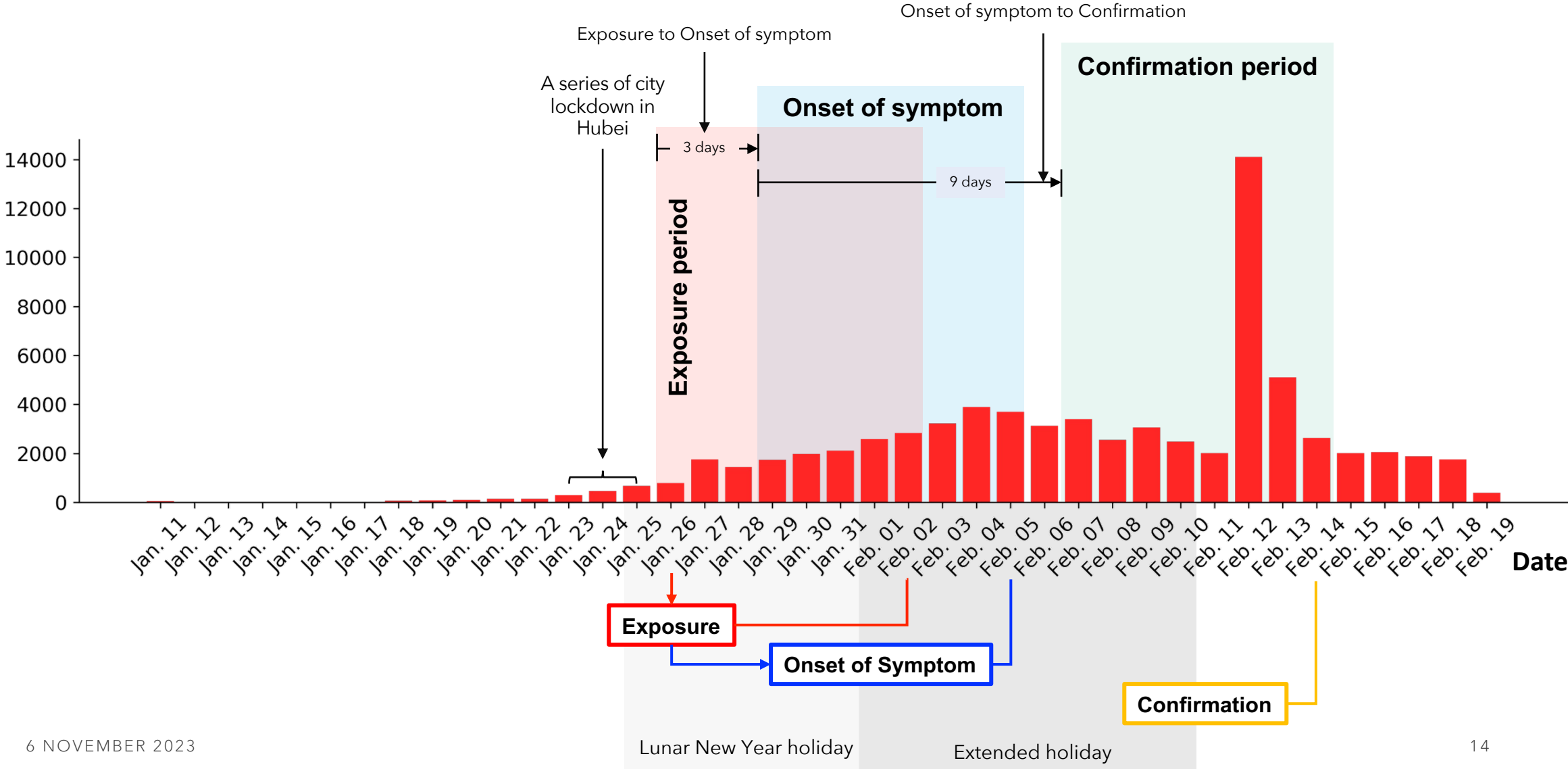


# Pie Chart

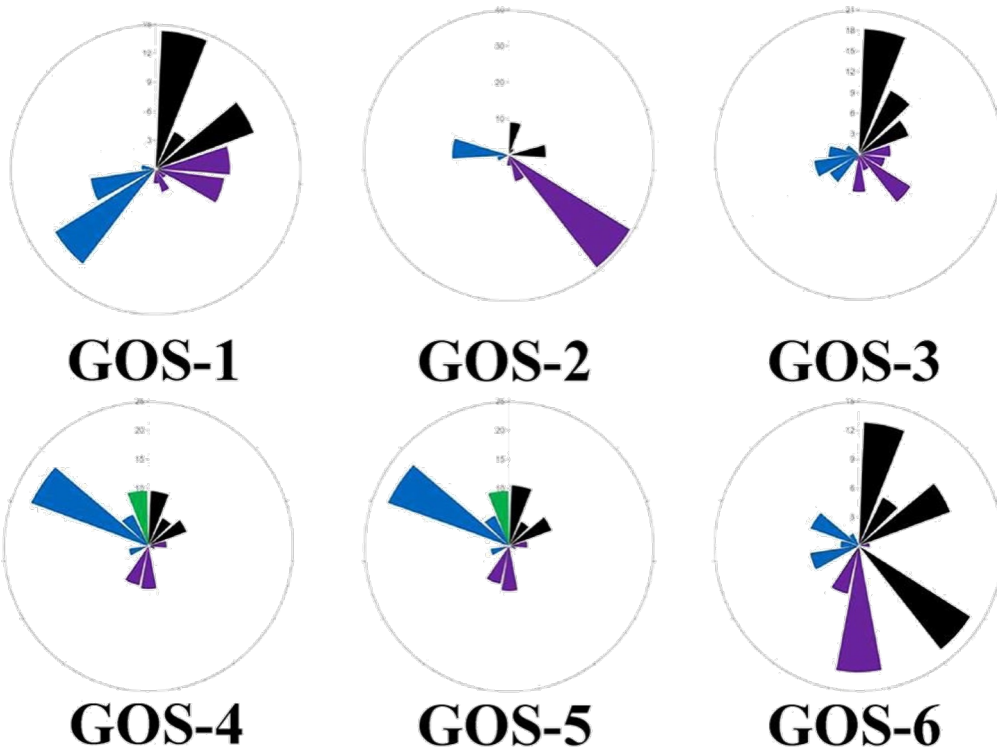


# Bar Chart

Number of COVID-19 confirmed cases



# Rose Plot & Radar Plot

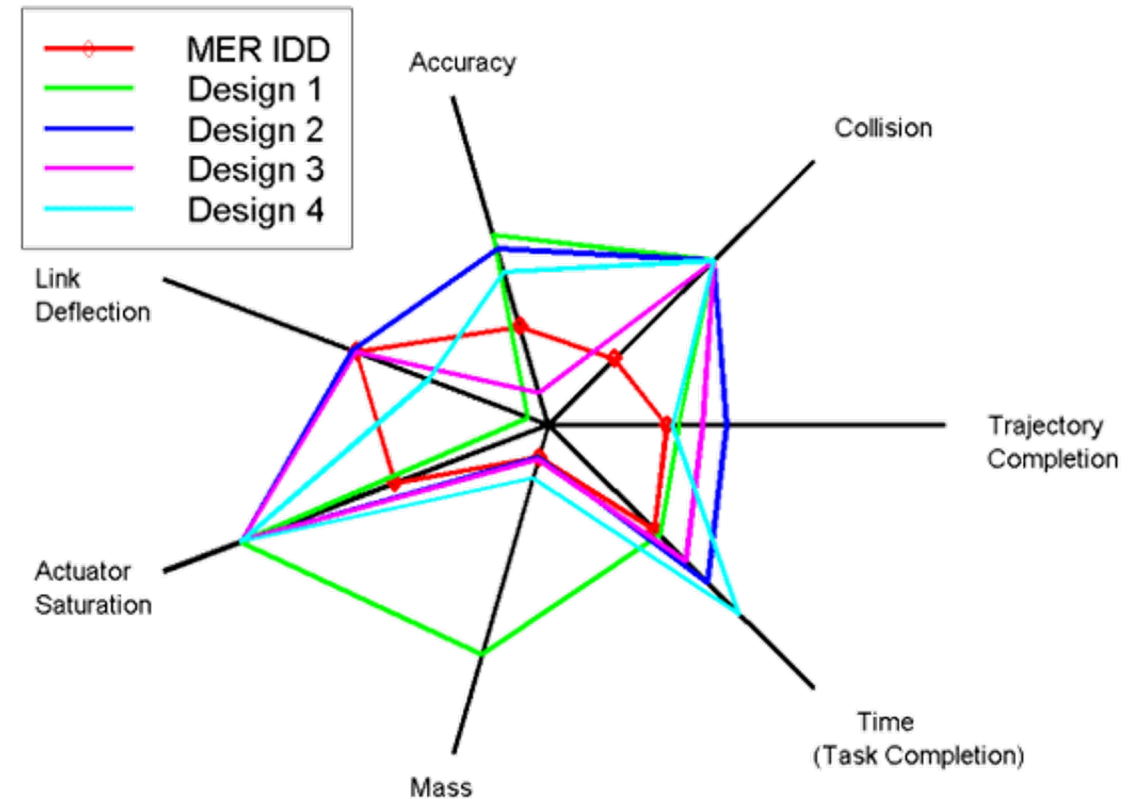


## Profile diversity in various GOS samples

Lin et al. (2022) Profile diversity of galacto-oligosaccharides from disaccharides to hexasaccharides by porous graphitic carbon liquid chromatography-orbitrap tandem mass spectrometry. Food Chem. Vol. 390. 133151.

6 NOVEMBER 2023

Star Plot of MER IDD and Automated Designs

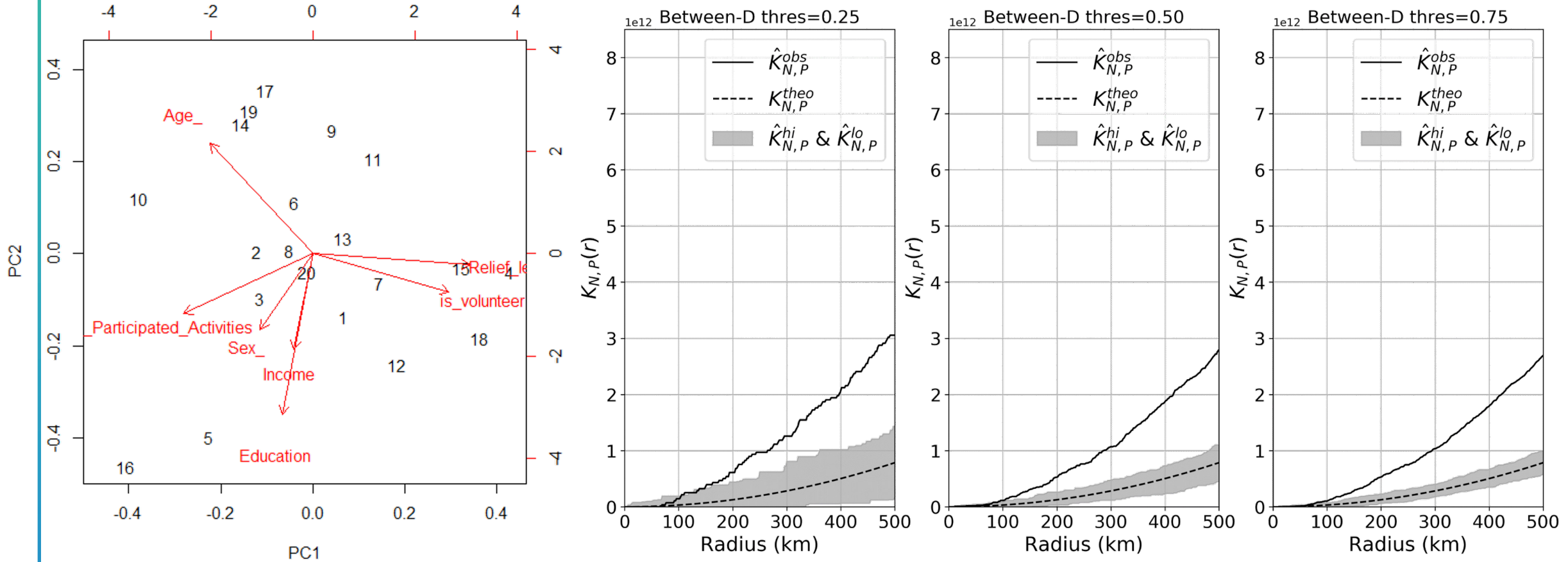


Source: [https://en.wikipedia.org/wiki/Radar\\_chart#/media/File:MER\\_Star\\_Plot.gif](https://en.wikipedia.org/wiki/Radar_chart#/media/File:MER_Star_Plot.gif)

CHUN-HSIANG CHAN (2023)

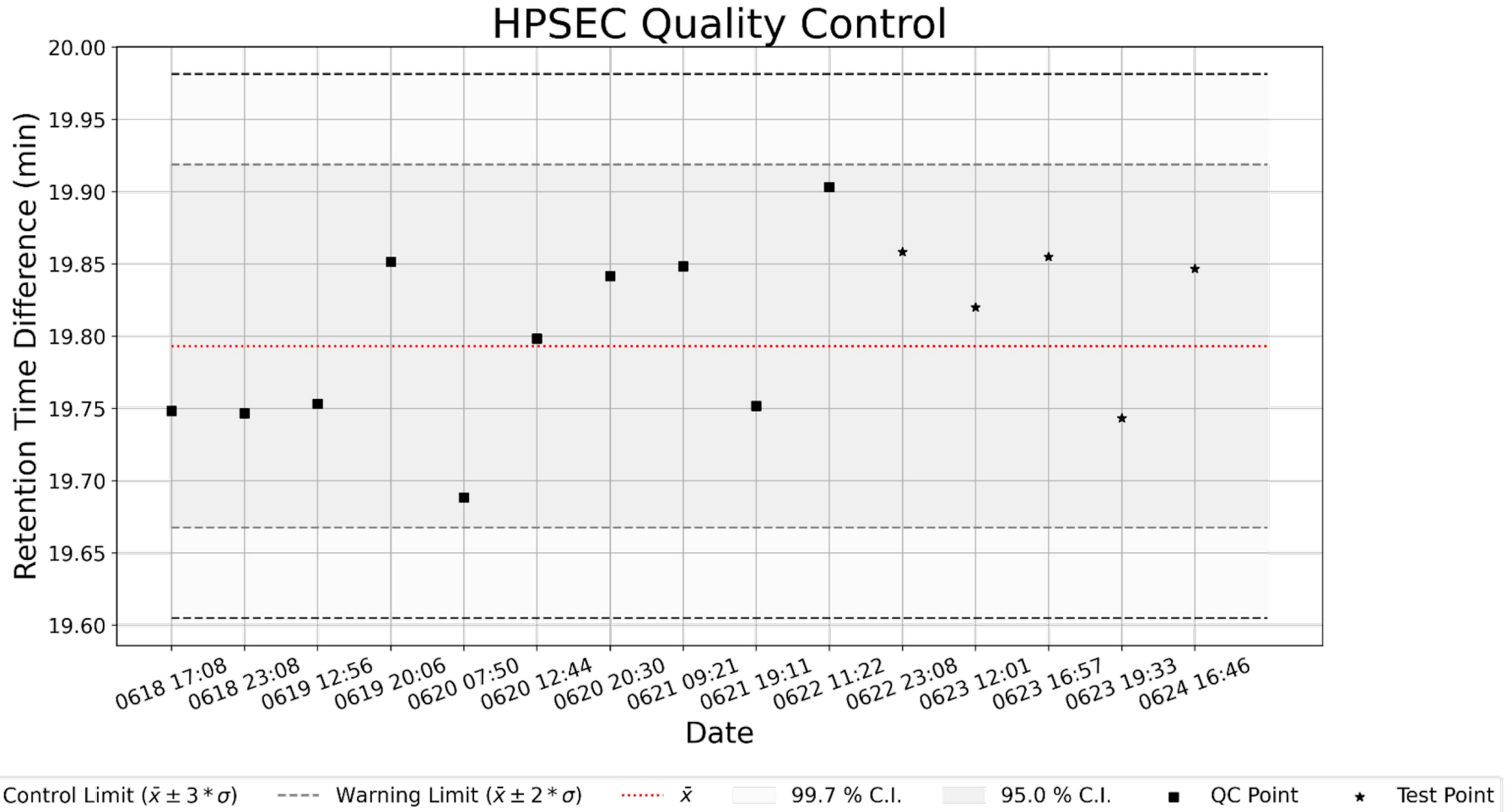
15

# Biplot & Control Chart (I)

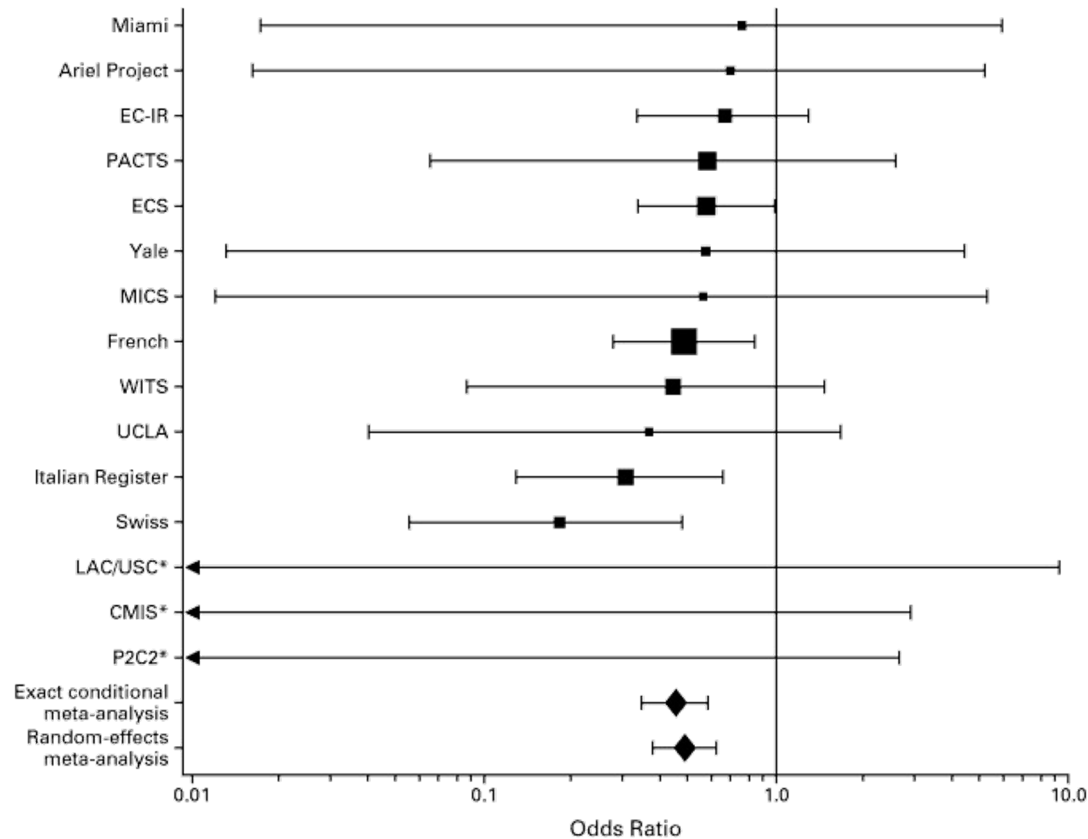




# Control Chart (II)



# Forest Plot



	Diseased	Healthy
Exposed	20	380
Not Exposed	10	490

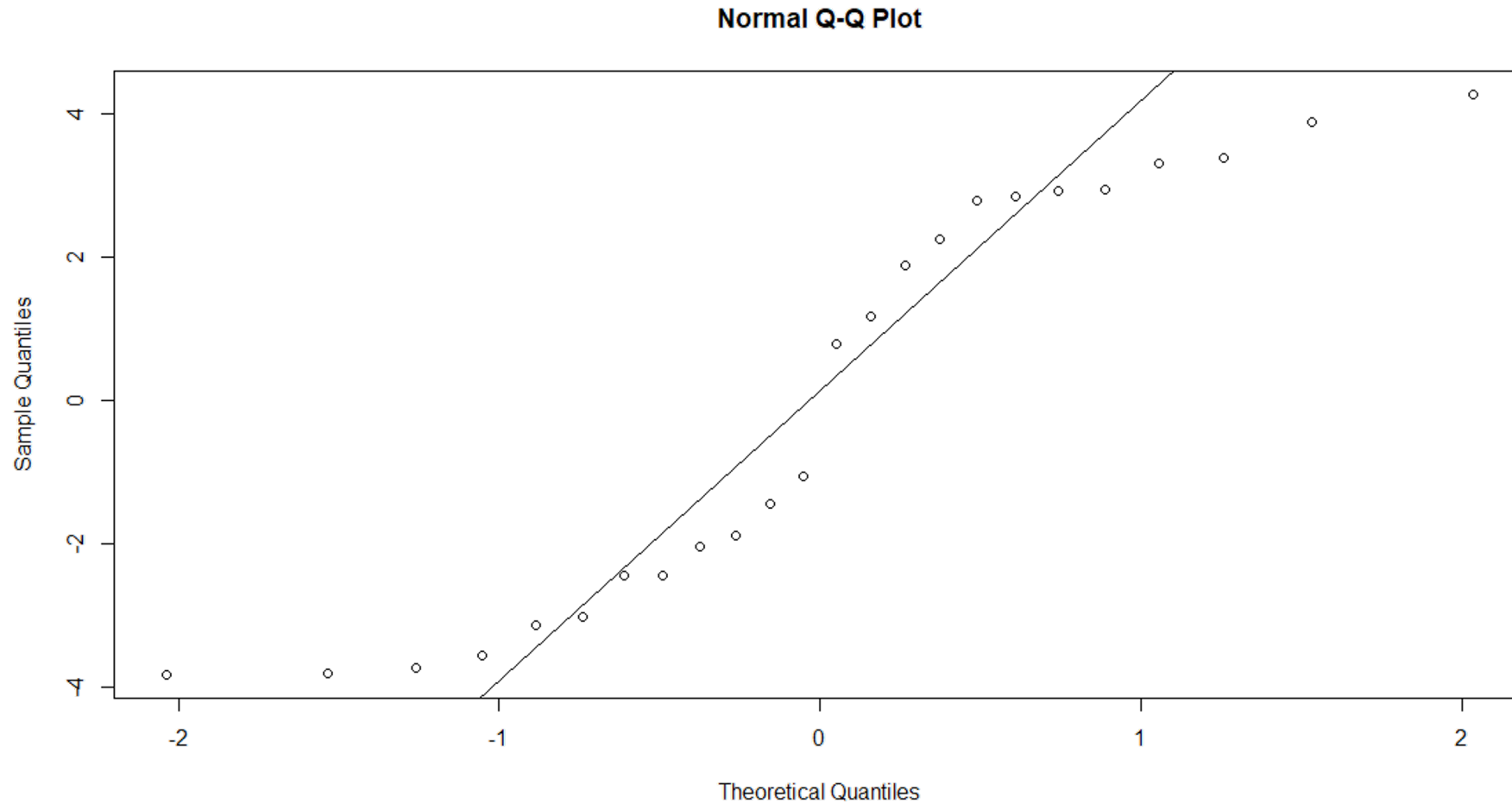
$$\text{risk of developing the disease given exposure} = \frac{DE}{VE} = \frac{20}{400}$$

$$\text{risk of developing the disease given non - exposure} = \frac{DN}{VN} = \frac{10}{500}$$

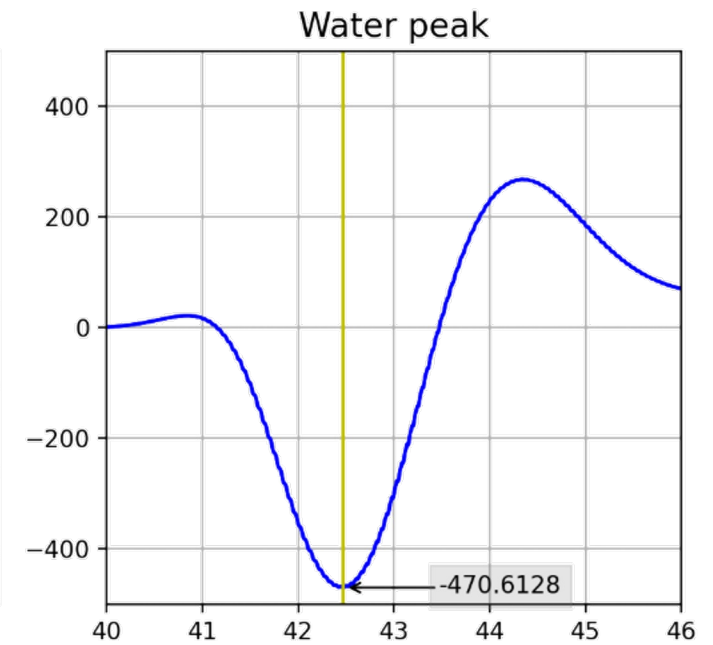
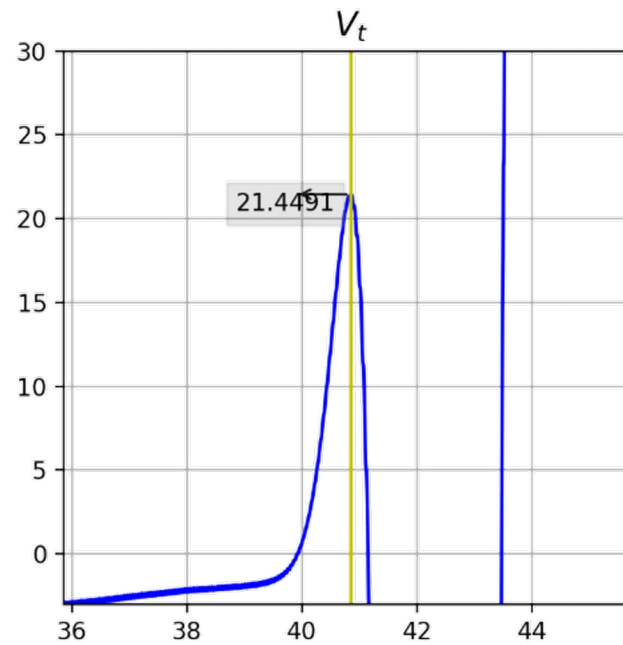
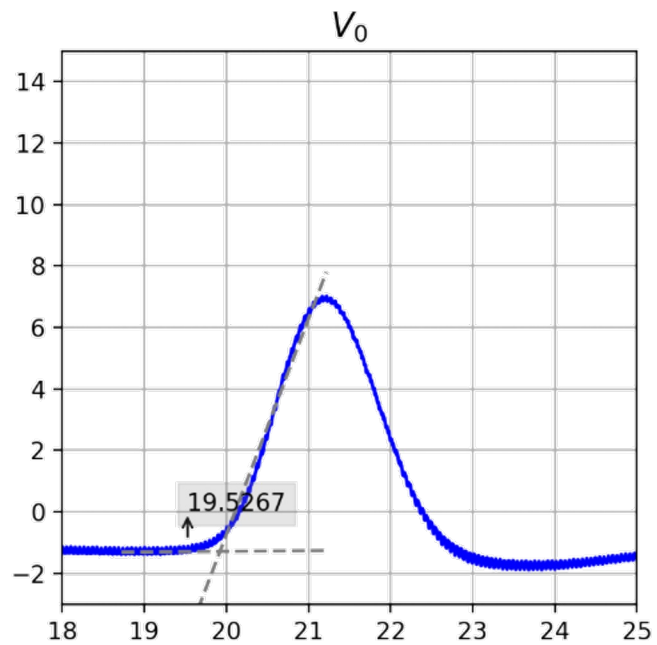
$$\text{relative risk} = \frac{\frac{DE}{VE}}{\frac{DN}{VN}} = \frac{DE/VE}{DN/VN} = \frac{20/400}{10/500}$$

$$\text{odds ratio} = \frac{DE/HE}{DN/HN} = \frac{20/380}{10/500}$$

# Quantile-quantile Plot (Q-Q Plot)



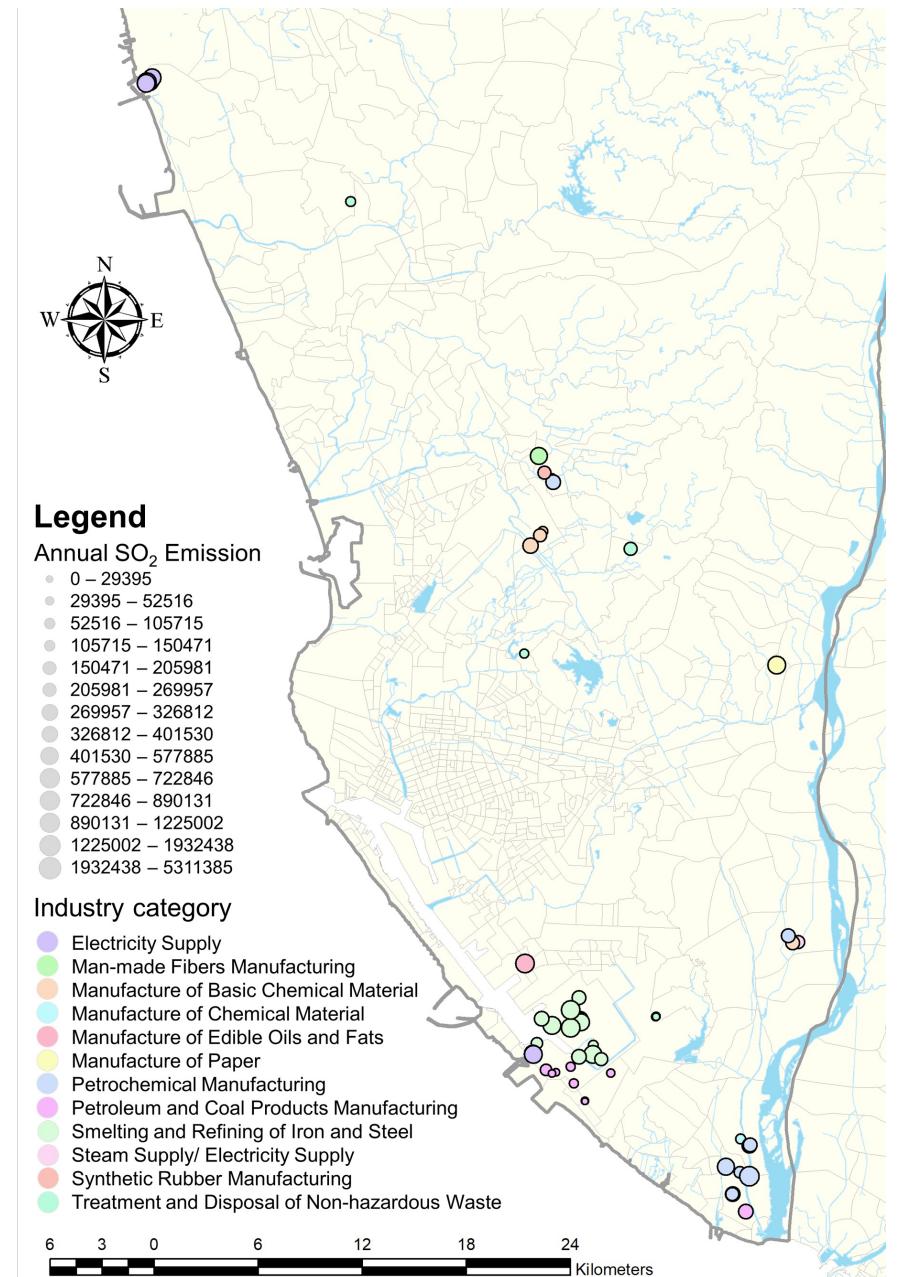
# Combination Chart



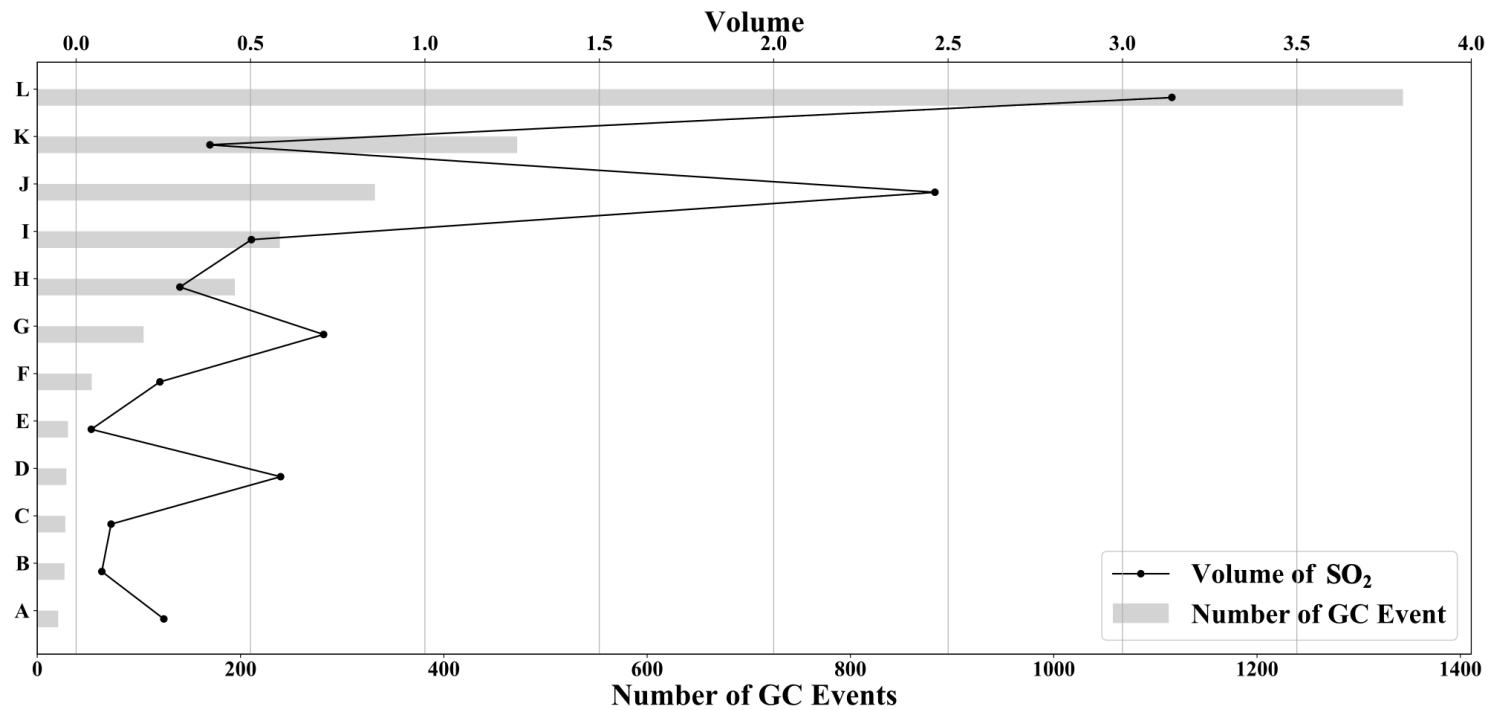
# Map #1

- Important elements in the figure.
  1. Title
  2. X/ Y tick label
  3. X/ Y label
  4. Legend (size, color, symbol)
  5. Grid (optional)
  6. Error bar (optional)
  7. Confidence interval (optional)
  8. Colormap (optional)
  9. Compass icon(optional)
  10. Scale bar(optional)

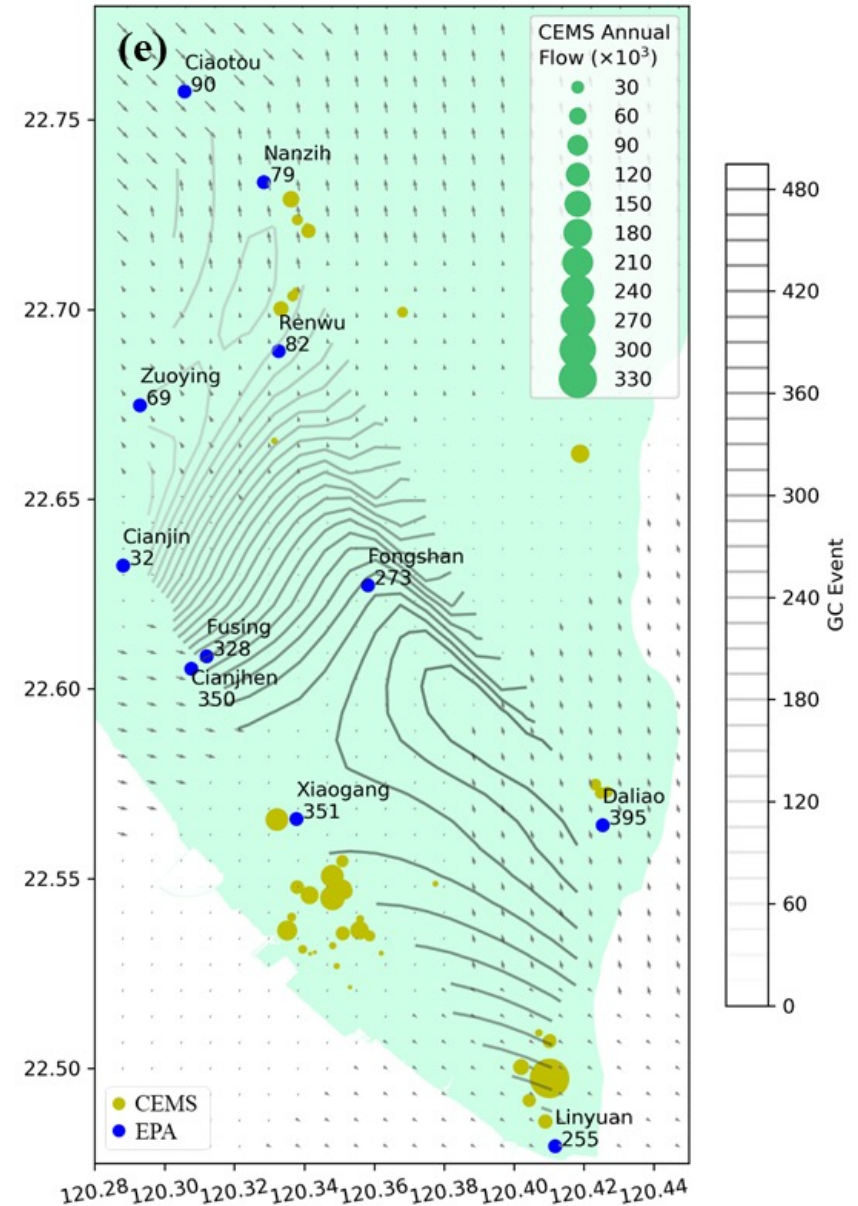
Figures are from Chan et al. (2022). A novel evaluation of air pollution impact from stationary emission sources to ambient air quality via time-series Granger causality. Earth Data Analytics for Planetary Health. Springer.



# Map #2

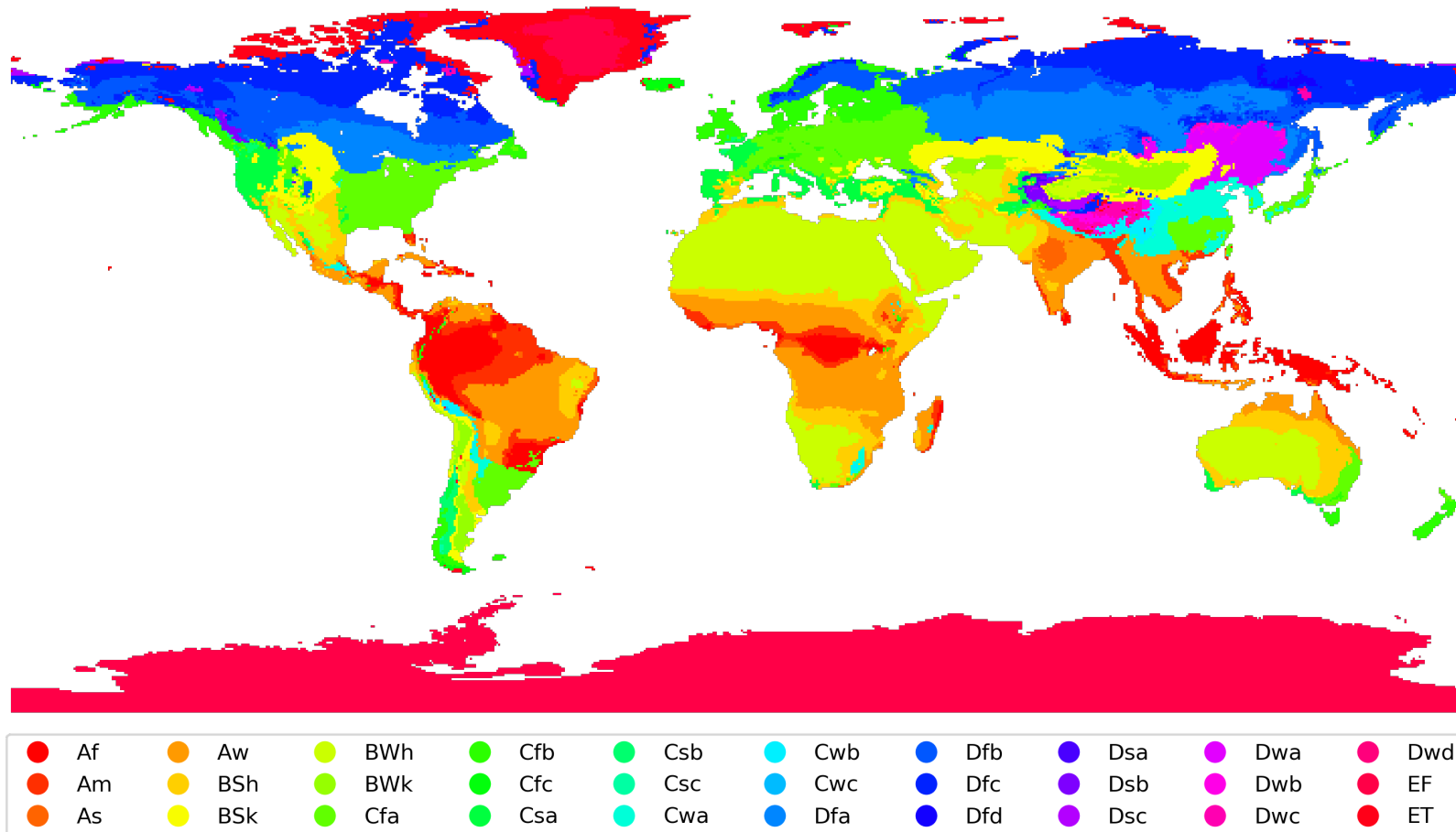


Figures are from Chan et al. (2022). A novel evaluation of air pollution impact from stationary emission sources to ambient air quality via time-series Granger causality. Earth Data Analytics for Planetary Health. Springer.

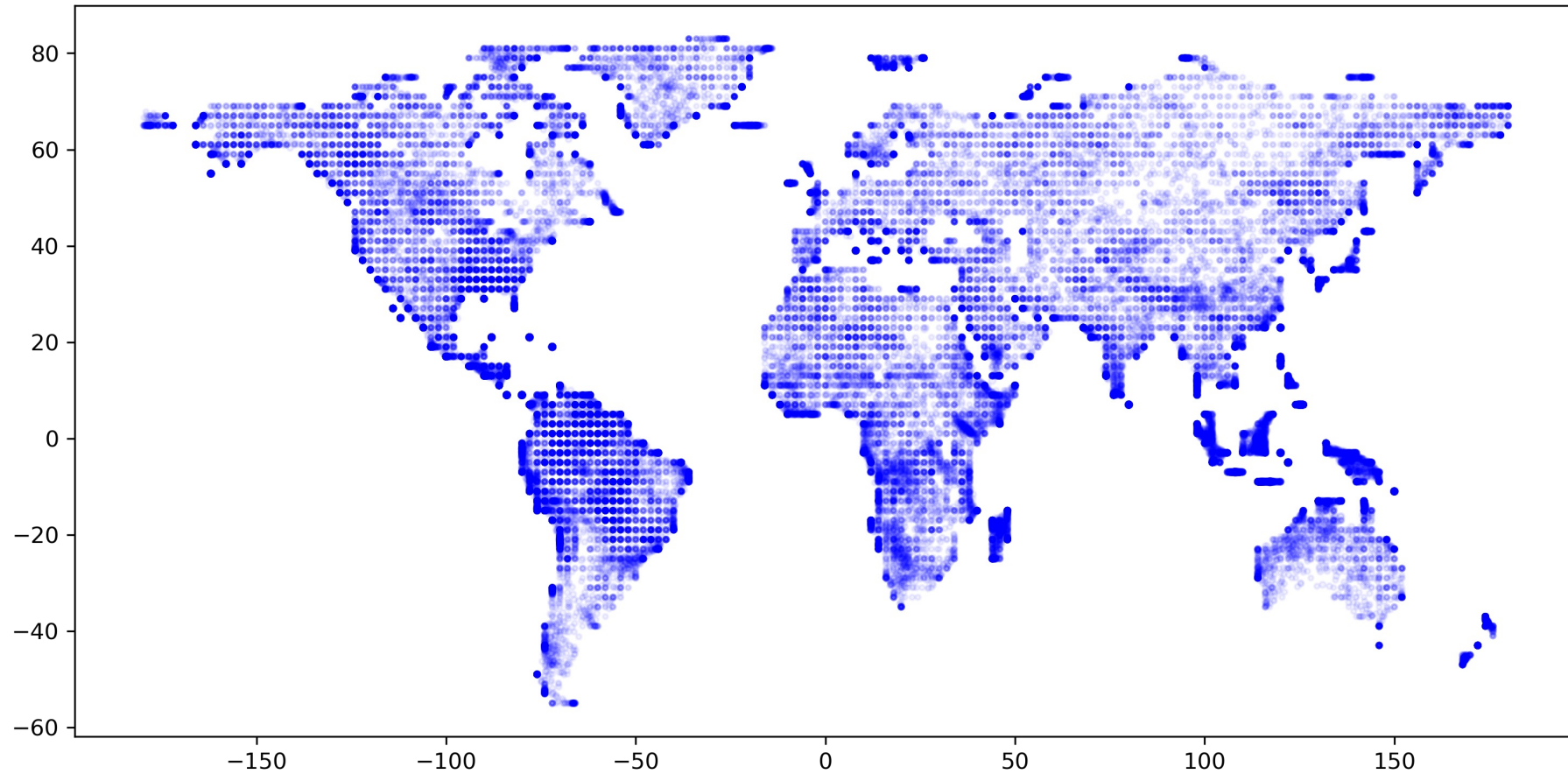


# Map #3

Köppen-Geiger Climate Classification: Climate

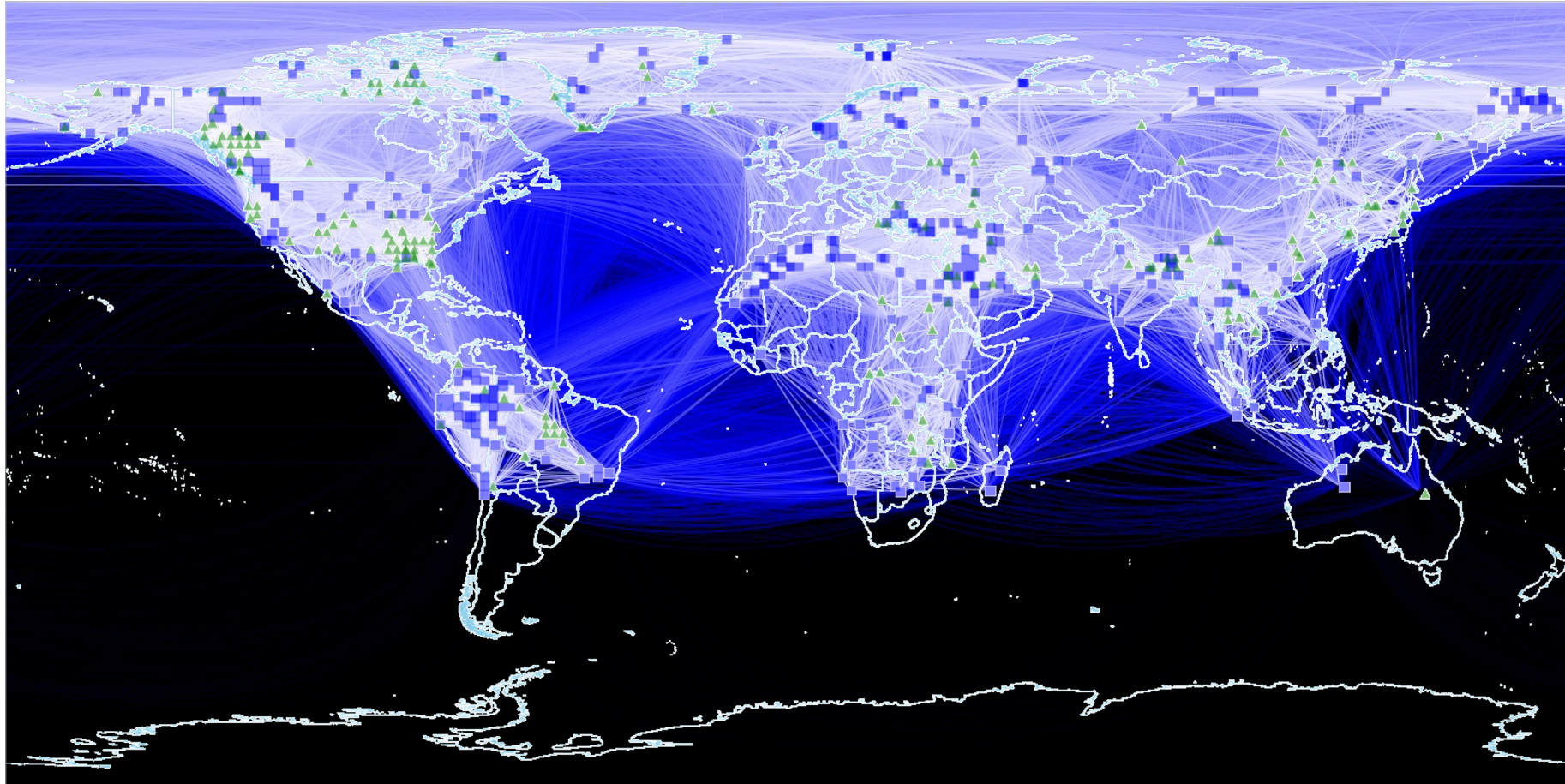


# Map #4





# Map #5

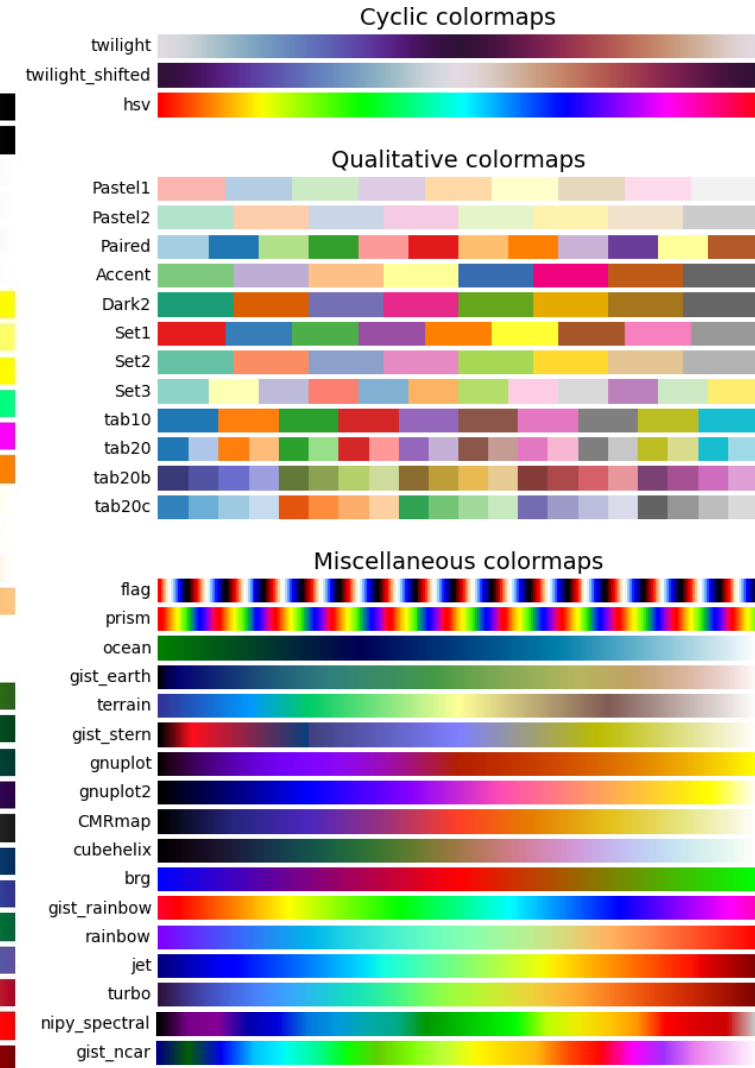
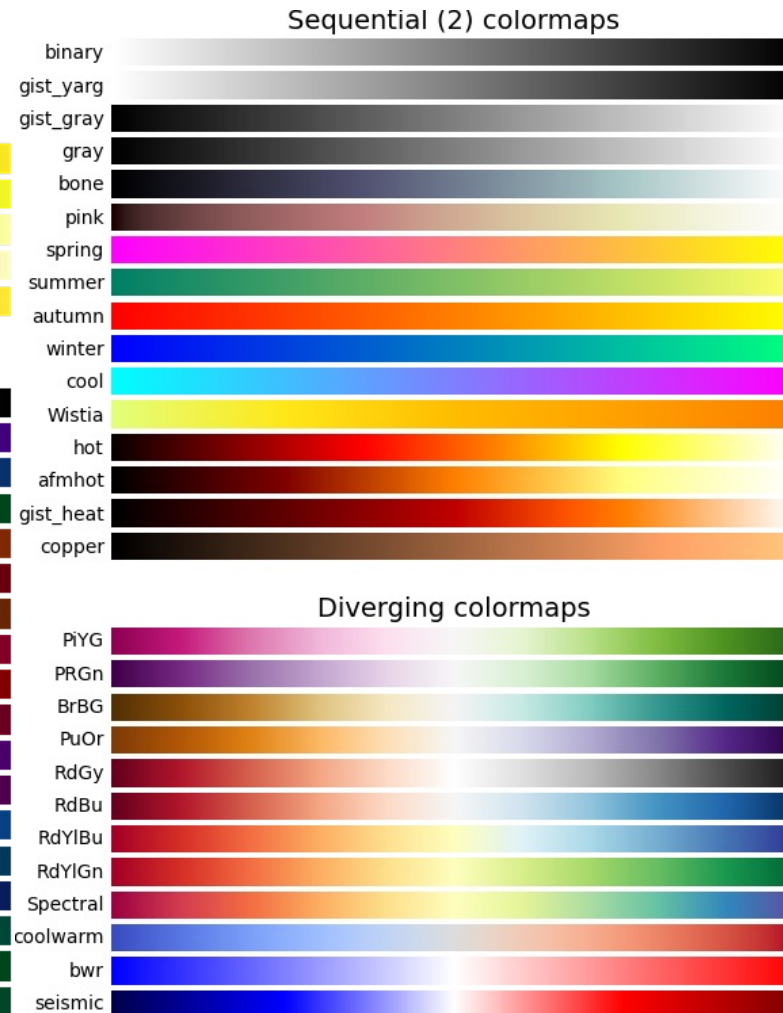
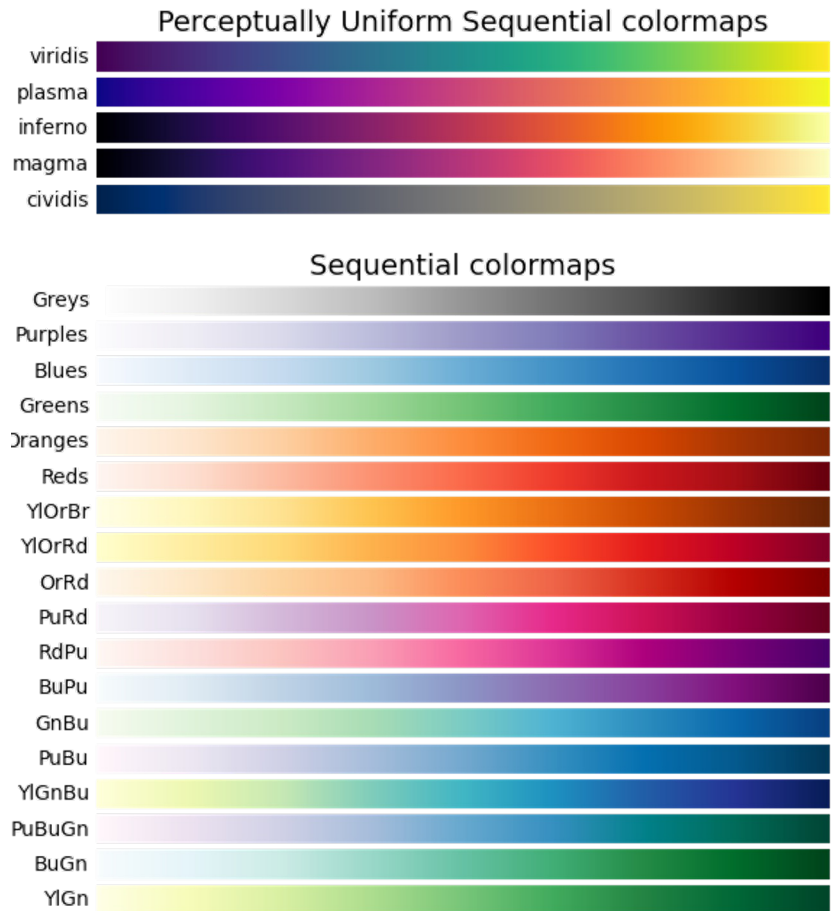


- #1
- #2

# Colormap

- Colormap selection

Figure source:  
[https://matplotlib.org/stable/gallery/color/colormap\\_reference.html#sphx-glr-gallery-color-colormap-reference-py](https://matplotlib.org/stable/gallery/color/colormap_reference.html#sphx-glr-gallery-color-colormap-reference-py)



# Colormap

- Colormap selection
  - Do not pick more than 8 colors from graduated colormap
  - Graduated colormaps are for continuous values
  - Discrete colormaps are for categorical values
  - ... (**think about it!**)
- To better the understanding of figures...
  - Use different sizes or symbols to represent different data
  - Plot different data into the same subplot/ figure
  - Use subplot with fixed x and y ranges

# Matplotlib

- Matplotlib is a useful package for visualization; however, we cannot demonstrate all functions in this class. But we still introduce the most useful functions.

```
# import python packages  
import matplotlib.pyplot as plt
```

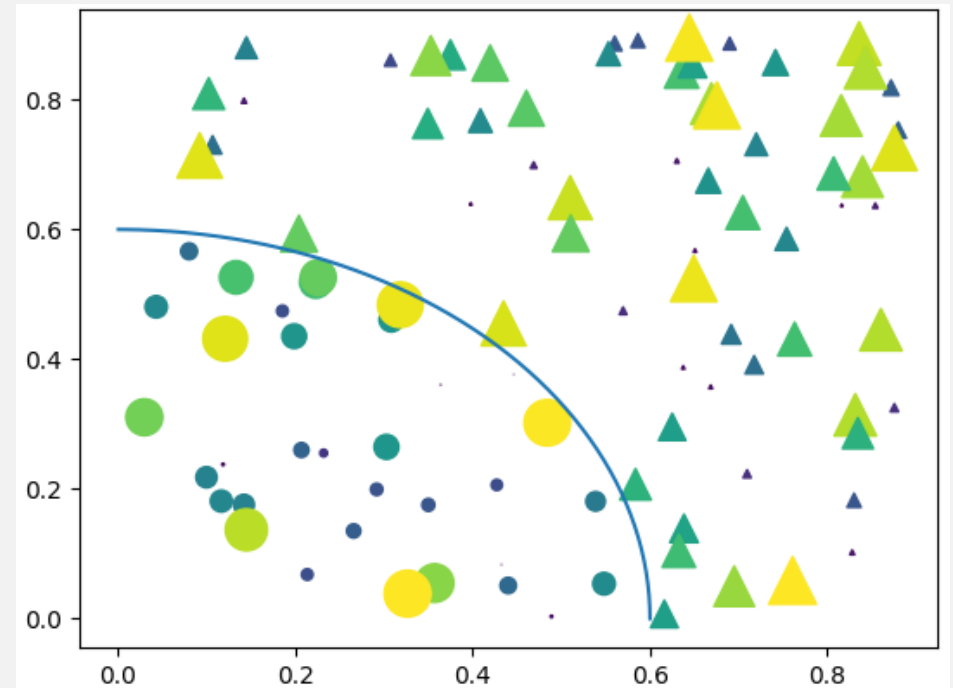
## matplotlib.pyplot.scatter

```
matplotlib.pyplot.scatter(x, y, s=None, c=None, marker=None, cmap=None,  
norm=None, vmin=None, vmax=None, alpha=None, linewidths=None, *,  
edgecolors=None, plotnonfinite=False, data=None, **kwargs) \[source\]
```

A scatter plot of  $y$  vs.  $x$  with varying marker size and/or color.

# Scatter and Line

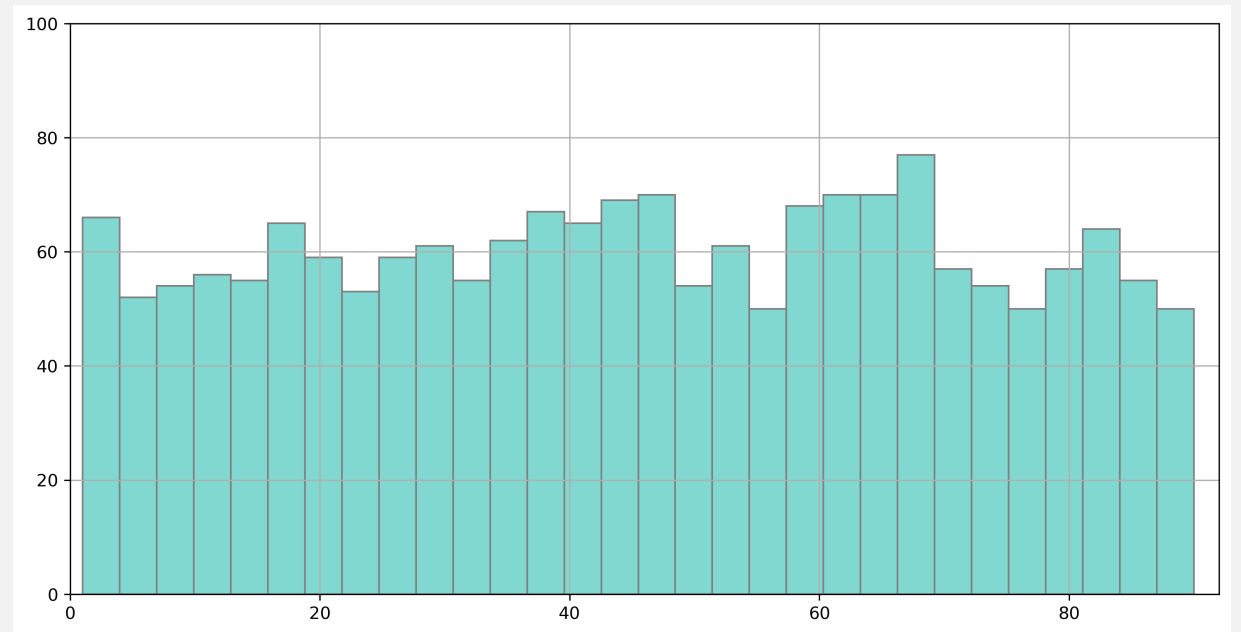
```
import matplotlib.pyplot as plt
import numpy as np
# Fixing random state for reproducibility
np.random.seed(19680801)
N = 100
r0 = 0.6
x = 0.9 * np.random.rand(N)
y = 0.9 * np.random.rand(N)
area = (20 * np.random.rand(N))**2 # 0 to 10 point radii
c = np.sqrt(area)
r = np.sqrt(x**2 + y**2)
area1 = np.ma.masked_where(r < r0, area)
area2 = np.ma.masked_where(r >= r0, area)
plt.scatter(x, y, s=area1, marker='^', c=c)
plt.scatter(x, y, s=area2, marker='o', c=c)
# Show the boundary between the regions:
theta = np.arange(0, np.pi / 2, 0.01)
plt.plot(r0 * np.cos(theta), r0 * np.sin(theta))
plt.show()
```



# Histogram

```
import matplotlib.pyplot as plt  
import numpy as np
```

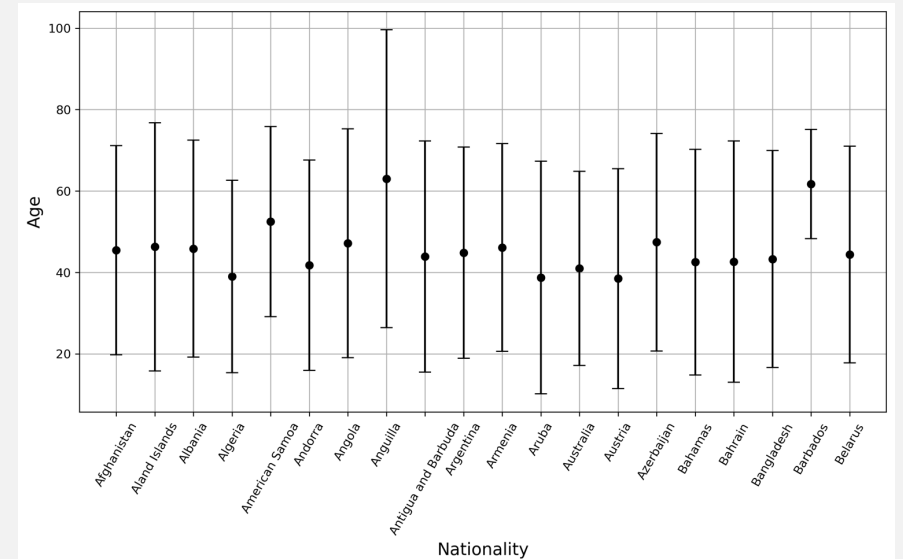
```
plt.figure(figsize=[12,6], dpi=300)  
plt.hist(jp['Age'], bins=30, facecolor='#81D8D0', edgecolor='gray')  
plt.axis([0,92,0,100])  
plt.grid(True)  
plt.show()
```



# Error Bar

```
import matplotlib.pyplot as plt
import numpy as np
```

```
plt.figure(figsize=[12,6], dpi=300)
plt.errorbar(np.arange(20), mean['Age'], yerr=std['Age'], capsiz=5, linestyle='',
color='k')
plt.scatter(np.arange(20), mean['Age'], c='k')
plt.xticks(np.arange(20), mean['Nationality'],
rotation=60)
plt.ylabel('Age', fontsize=14)
plt.xlabel('Nationality', fontsize=14)
plt.grid(True)
plt.show()
```



# Line

```
import matplotlib.pyplot as plt
import numpy as np
```

```
# Data for plotting
```

```
t = np.arange(0.0, 2.0, 0.01)
```

```
s = 1 + np.sin(2 * np.pi * t)
```

```
fig, ax = plt.subplots()
```

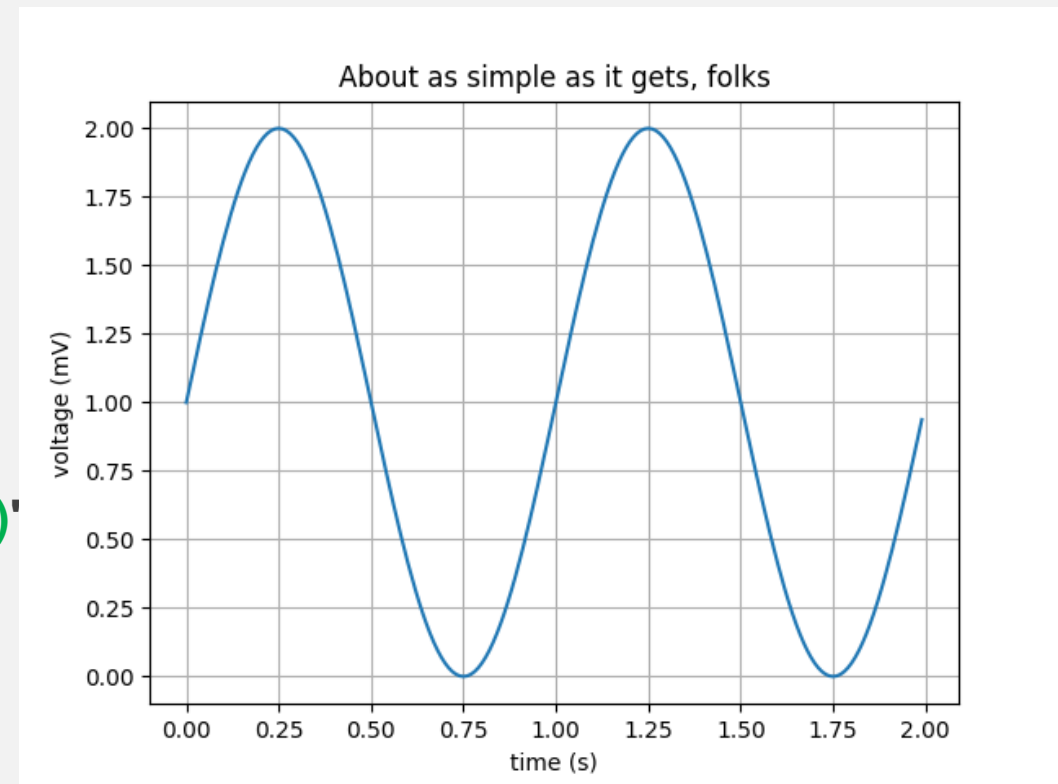
```
ax.plot(t, s)
```

```
ax.set(xlabel='time (s)', ylabel='voltage (mV)',
       title='About as simple as it gets, folks')
```

```
ax.grid()
```

```
fig.savefig("test.png")
```

```
plt.show()
```





# Step

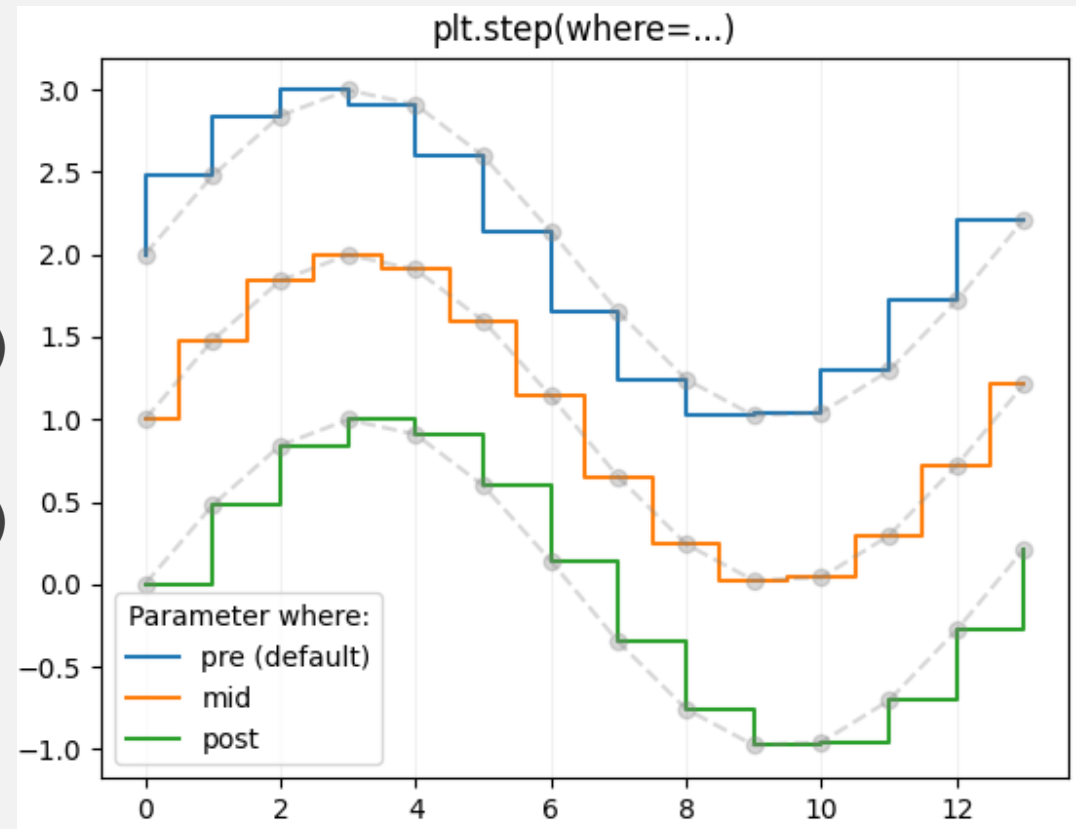
```
import matplotlib.pyplot as plt
import numpy as np
```

```
x = np.arange(14)
y = np.sin(x / 2)
```

```
plt.step(x, y + 2, label='pre (default)')
plt.plot(x, y + 2, 'o--', color='grey', alpha=0.3)
```

```
plt.step(x, y + 1, where='mid', label='mid')
plt.plot(x, y + 1, 'o--', color='grey', alpha=0.3)
```

```
plt.grid(axis='x', color='0.95')
plt.legend(title='Parameter where:')
plt.title('plt.step(where=...)')
plt.show()
```



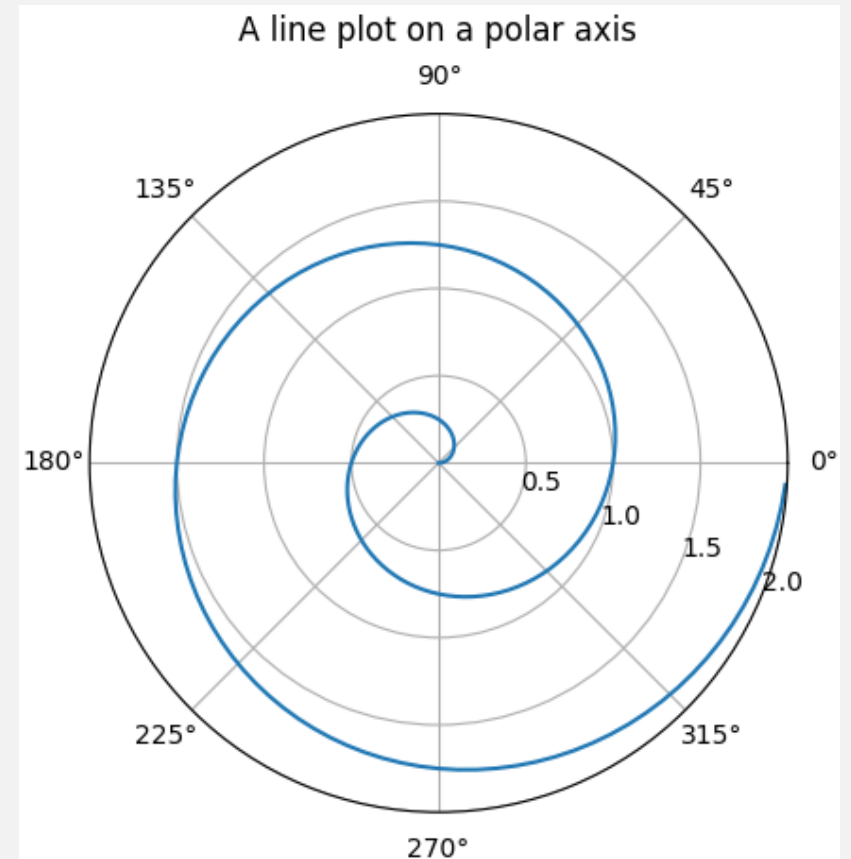
# Plot R Theta Phi

```
import matplotlib.pyplot as plt
import numpy as np
```

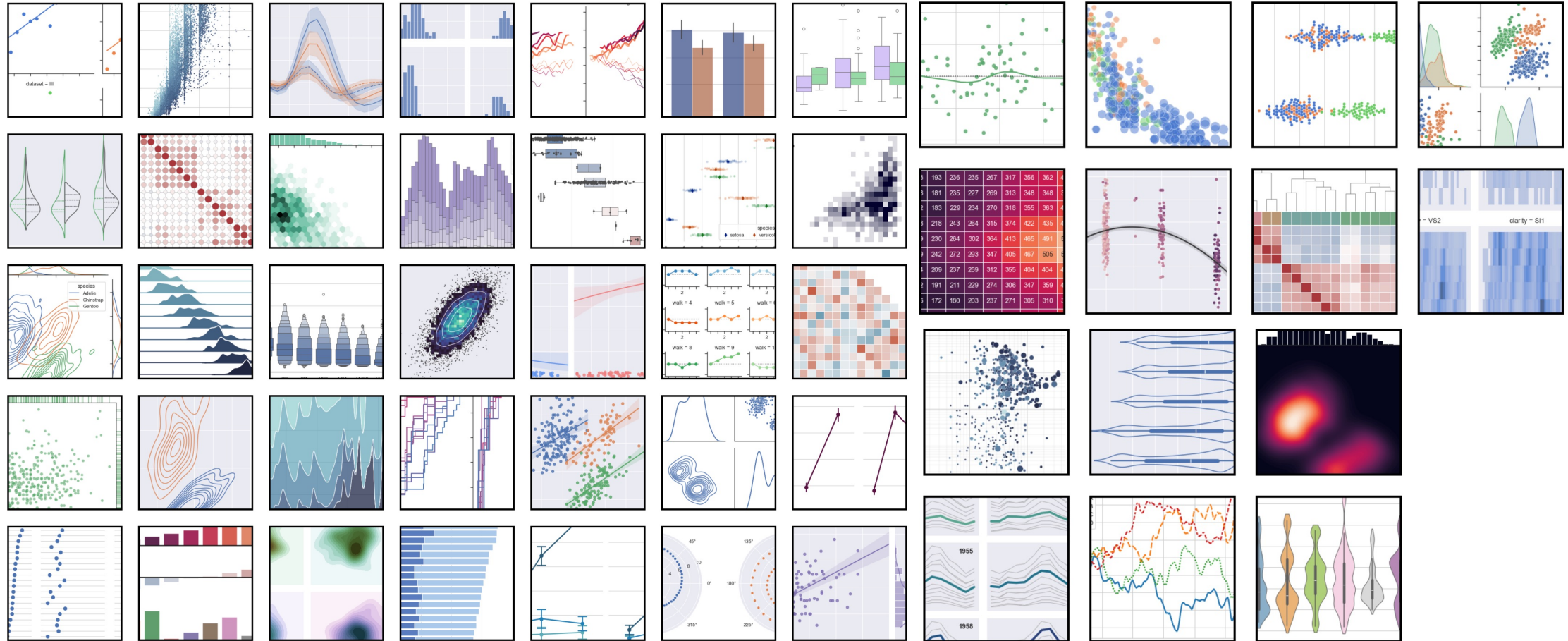
```
r = np.arange(0, 2, 0.01)
theta = 2 * np.pi * r
```

```
fig, ax = plt.subplots(subplot_kw={'projection': 'polar'})
ax.plot(theta, r)
ax.set_rmax(2)
ax.set_rticks([0.5, 1, 1.5, 2])
ax.set_rlabel_position(-22.5)
ax.grid(True)
```

```
ax.set_title("A line plot on a polar axis", va='bottom')
plt.show()
```

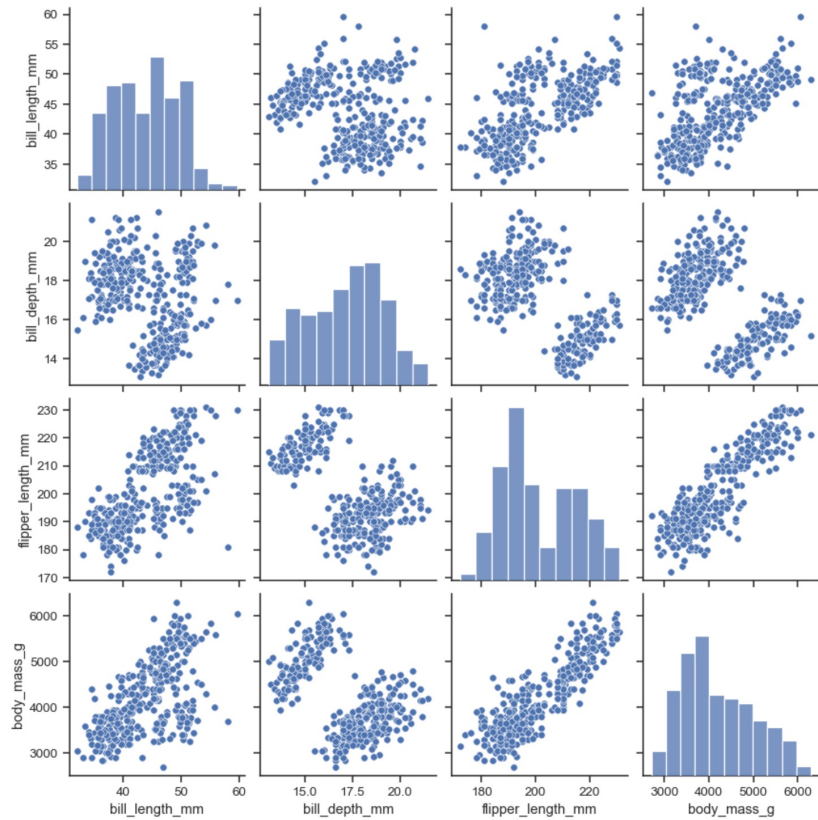


# Seaborn

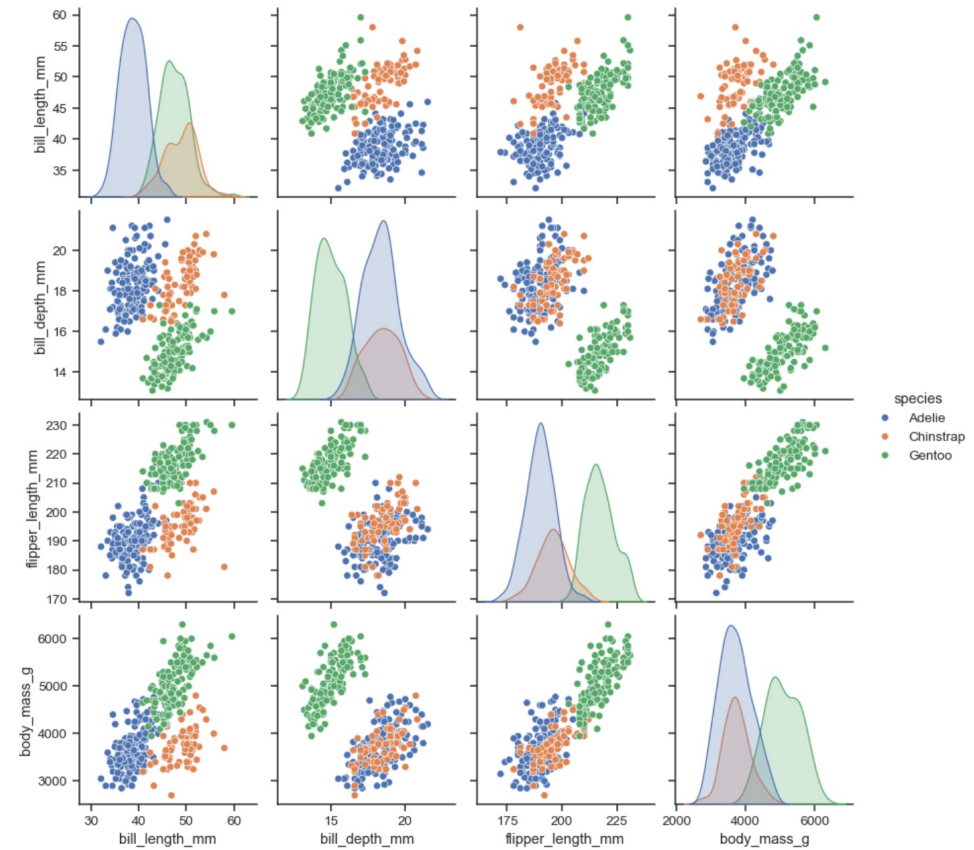


# Pairplot

```
penguins = sns.load_dataset("penguins")  
sns.pairplot(penguins)
```

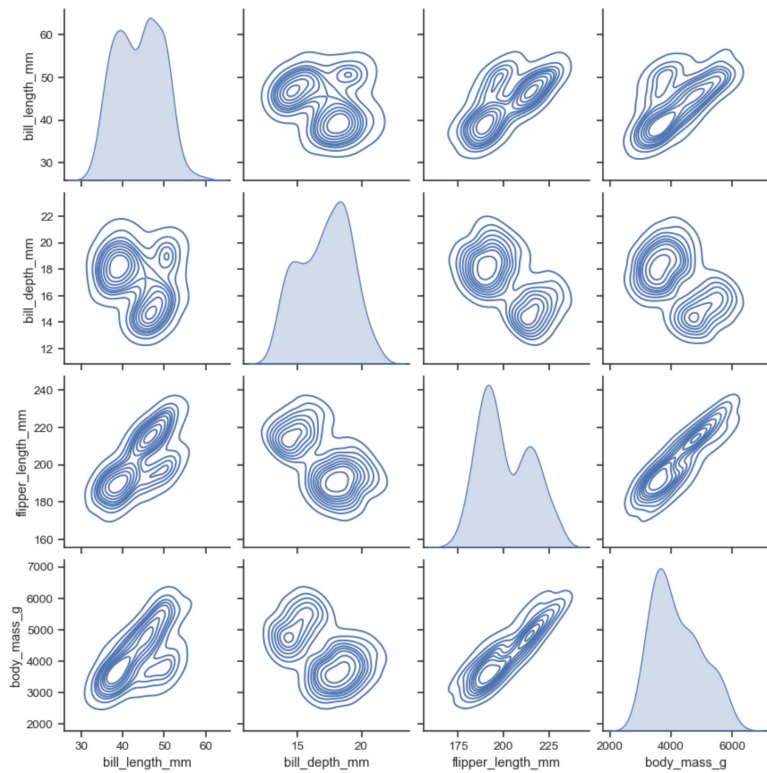


```
sns.pairplot(penguins, hue="species")
```

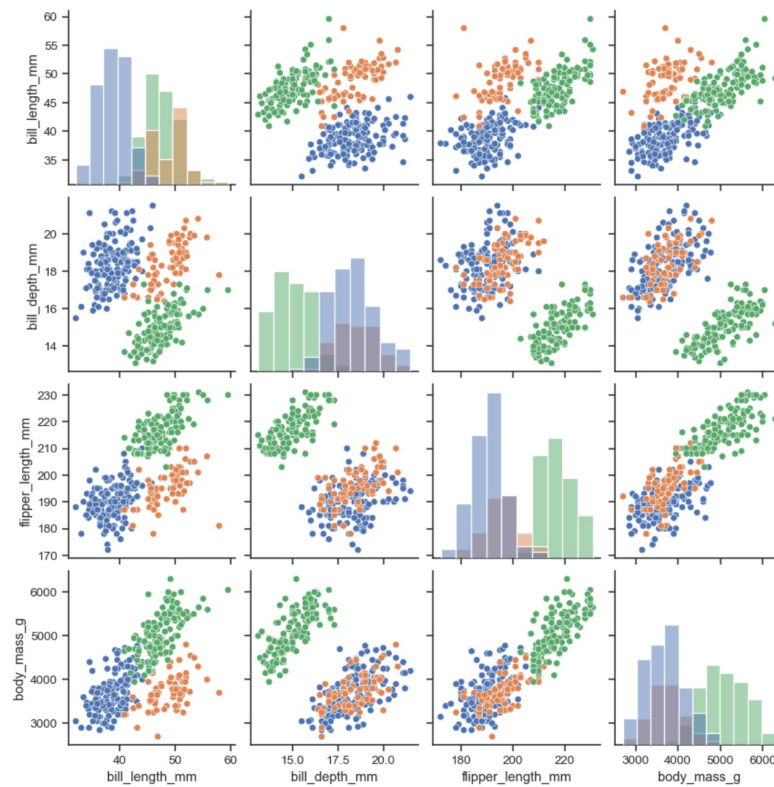


# Pairplot

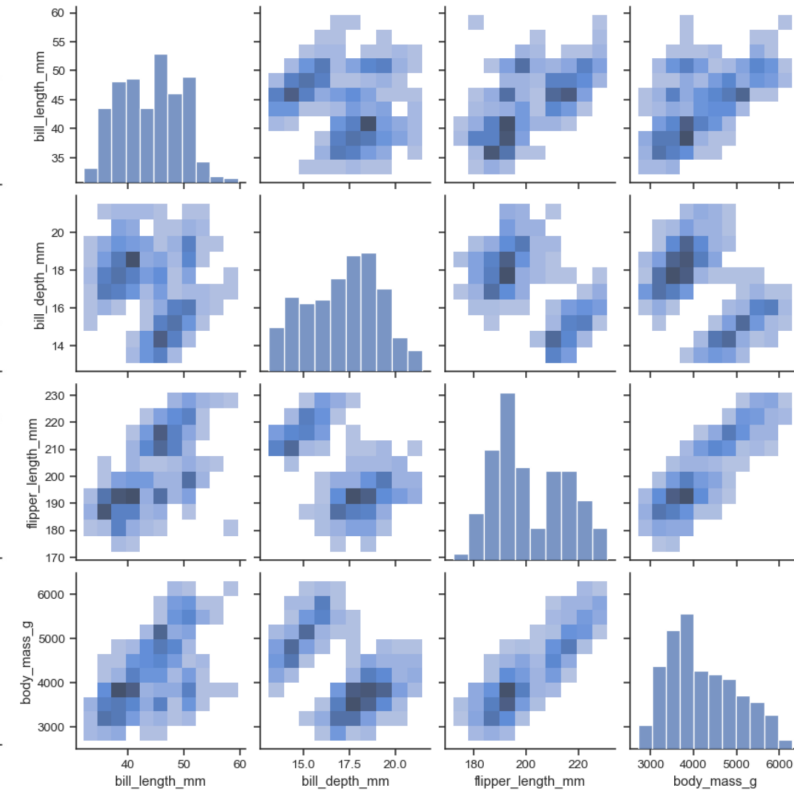
```
sns.pairplot(penguins, kind="kde")
```



```
sns.pairplot(penguins, hue="species", diag_kind="hist")
```



```
sns.pairplot(penguins, kind="hist")
```

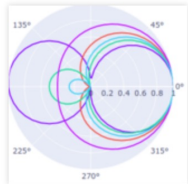


# Plotly

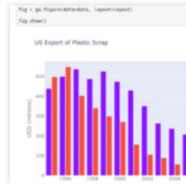
## Fundamentals



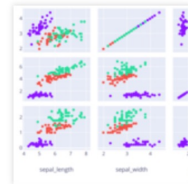
The Figure Data Structure



Creating and Updating Figures



Displaying Figures



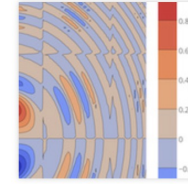
Plotly Express



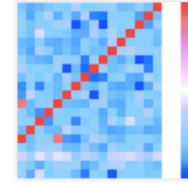
Analytical Apps with Dash

[More Fundamentals »](#)

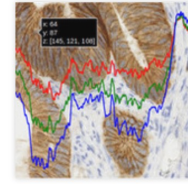
## Scientific Charts



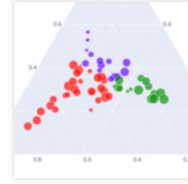
Contour Plots



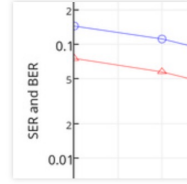
Heatmaps



Imshow



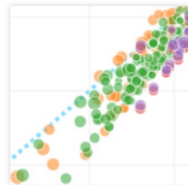
Ternary Plots



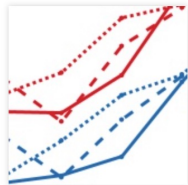
Log Plots

[More Scientific Charts »](#)

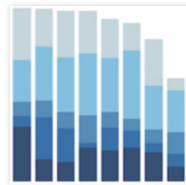
## Basic Charts



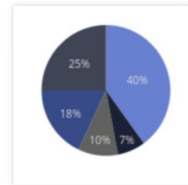
Scatter Plots



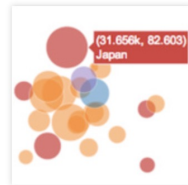
Line Charts



Bar Charts



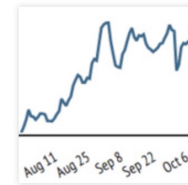
Pie Charts



Bubble Charts

[More Basic Charts »](#)

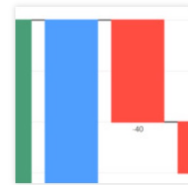
## Financial Charts



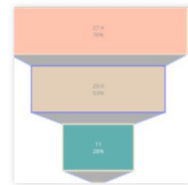
Time Series and Date Axes



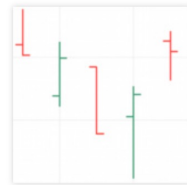
Candlestick Charts



Waterfall Charts



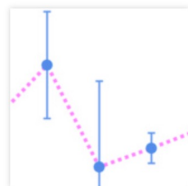
Funnel Chart



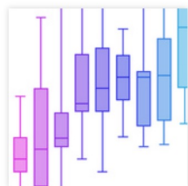
OHLC Charts

[More Financial Charts »](#)

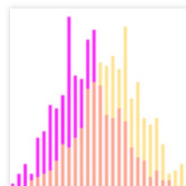
## Statistical Charts



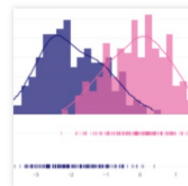
Error Bars



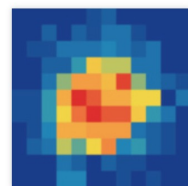
Box Plots



Histograms



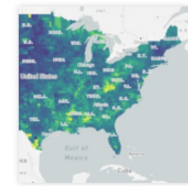
Distplots



2D Histograms

[More Statistical Charts »](#)

## Maps



Mapbox Choropleth Maps



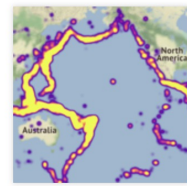
Lines on Mapbox



Filled Area on Maps



Bubble Maps



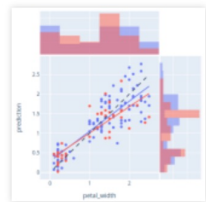
Mapbox Density Heatmap

[More Maps »](#)

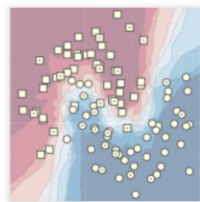
# Plotly

## Artificial Intelligence and Machine Learning

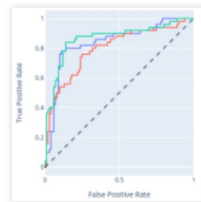
More AI and ML »



ML Regression



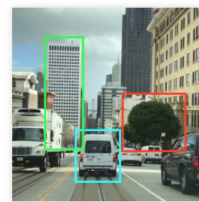
kNN Classification



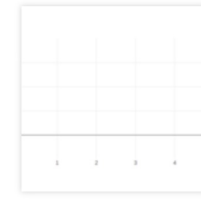
ROC and PR Curves



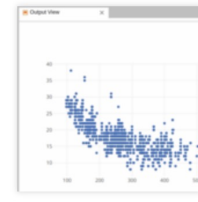
PCA Visualization



AI/ML Apps with Dash



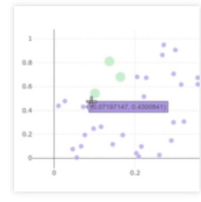
Plotly FigureWidget Overview



Jupyter Lab with FigureWidget



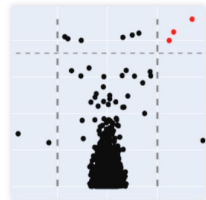
Interactive Data Analysis with FigureWidget ipywidgets



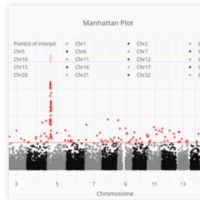
Click Events

## Bioinformatics

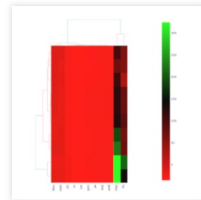
More Bioinformatics »



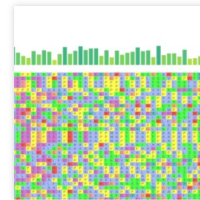
Volcano Plot



Manhattan Plot



Clustergram



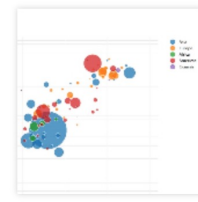
Alignment Chart

## Jupyter Widgets Interaction

## Transforms



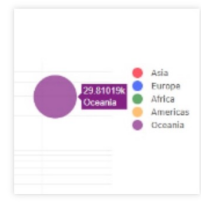
Filter



Group By



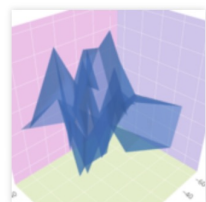
Aggregations



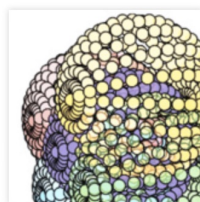
Multiple Transforms

## 3D Charts

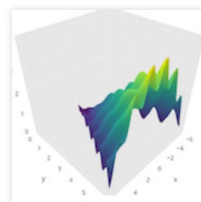
More 3D Charts »



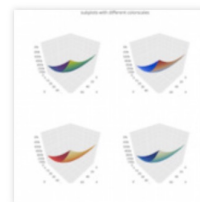
3D Axes



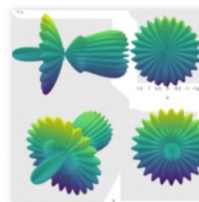
3D Scatter Plots



3D Surface Plots



3D Subplots

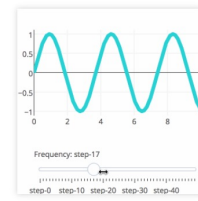


3D Camera Controls

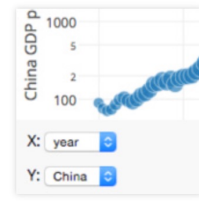
## Add Custom Controls



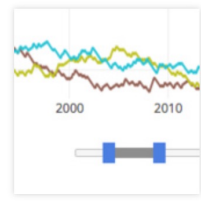
Custom Buttons



Sliders



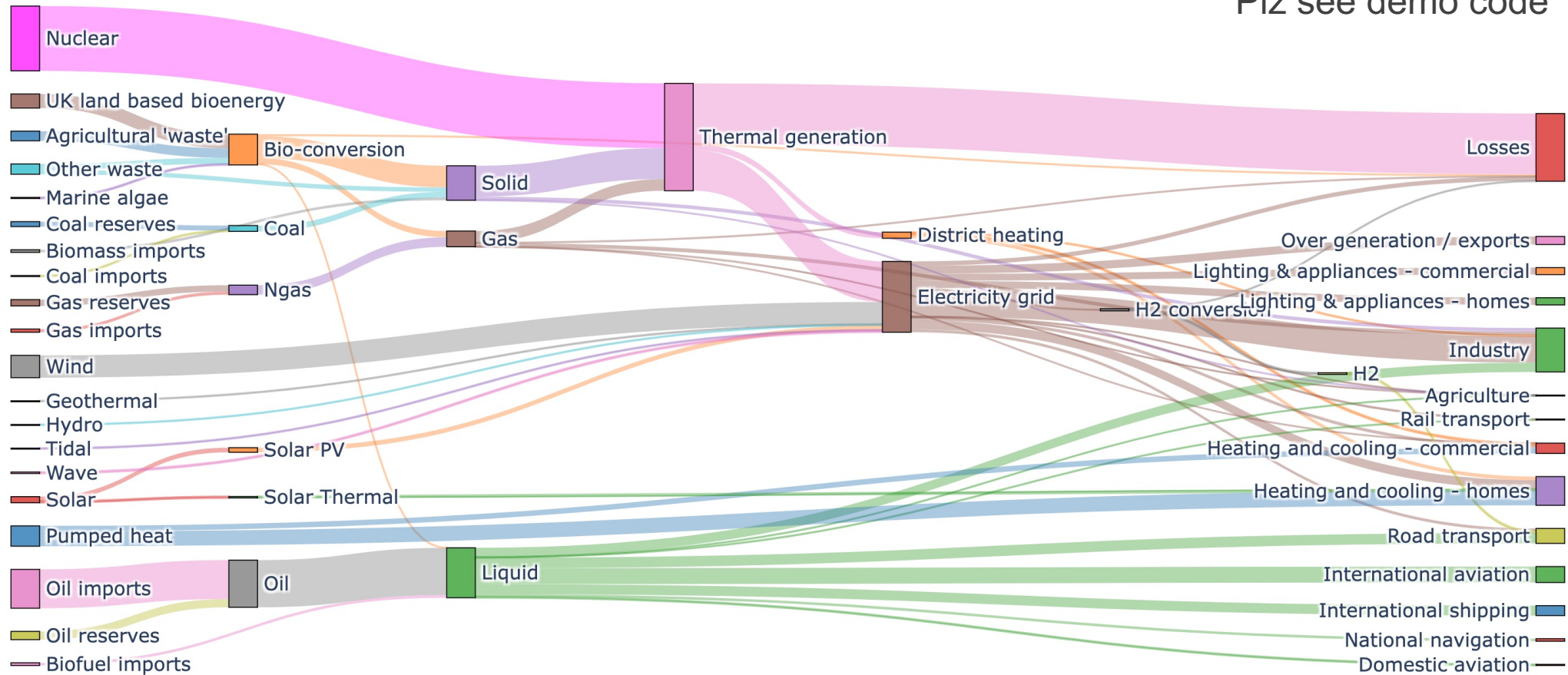
Dropdown Menus



Range Slider and Selector

# Sankey Diagram

Plz see demo code

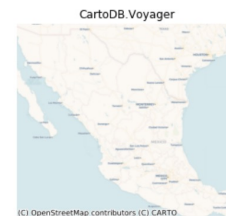
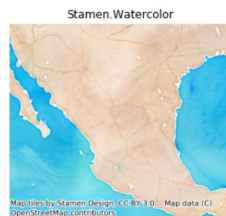




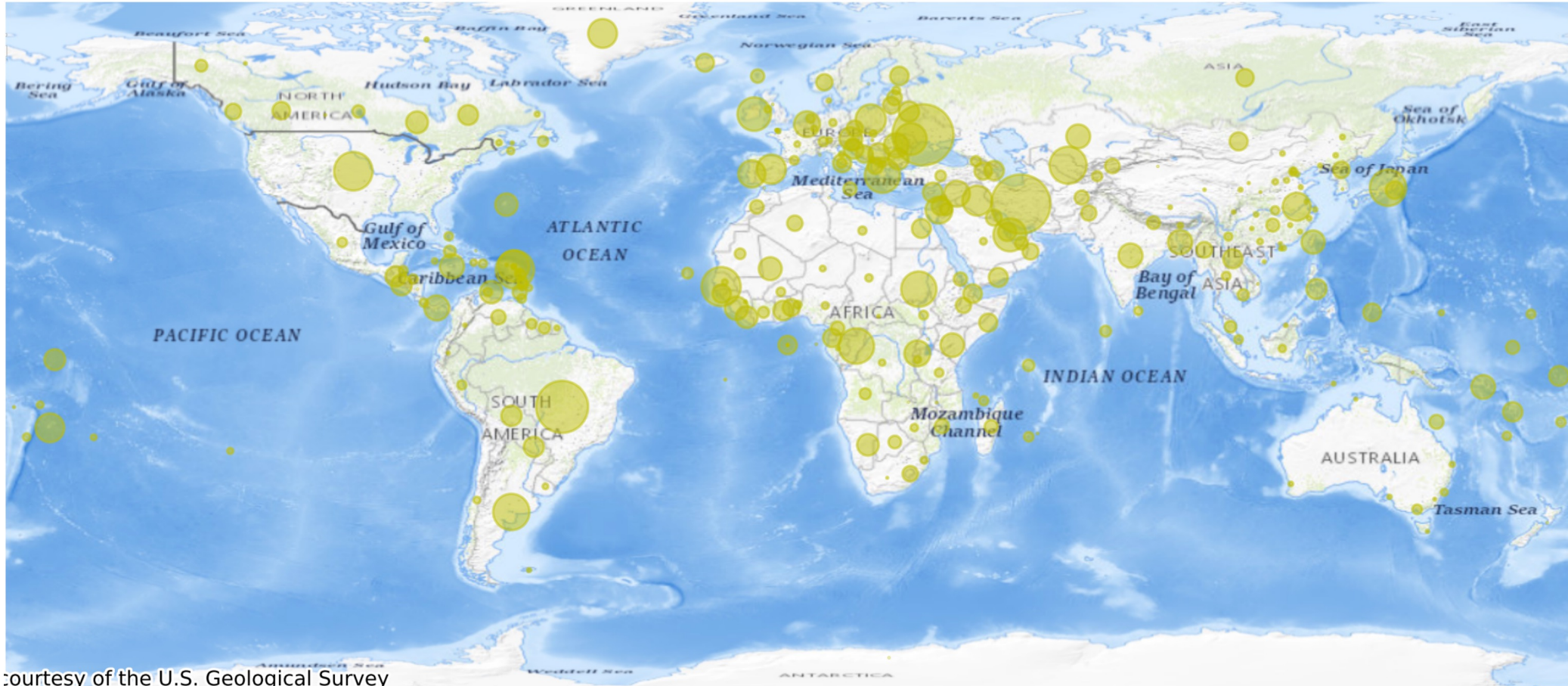
# Contextily

## contextily: context geo tiles in Python

contextily is a small Python 3 (3.7 and above) package to retrieve tile maps from the internet. It can add those tiles as basemap to matplotlib figures or write tile maps to disk into geospatial raster files. Bounding boxes can be passed in both WGS84 (EPSG: 4326) and Spheric Mercator (EPSG: 3857). See the notebook `contextily_guide.ipynb` for usage.

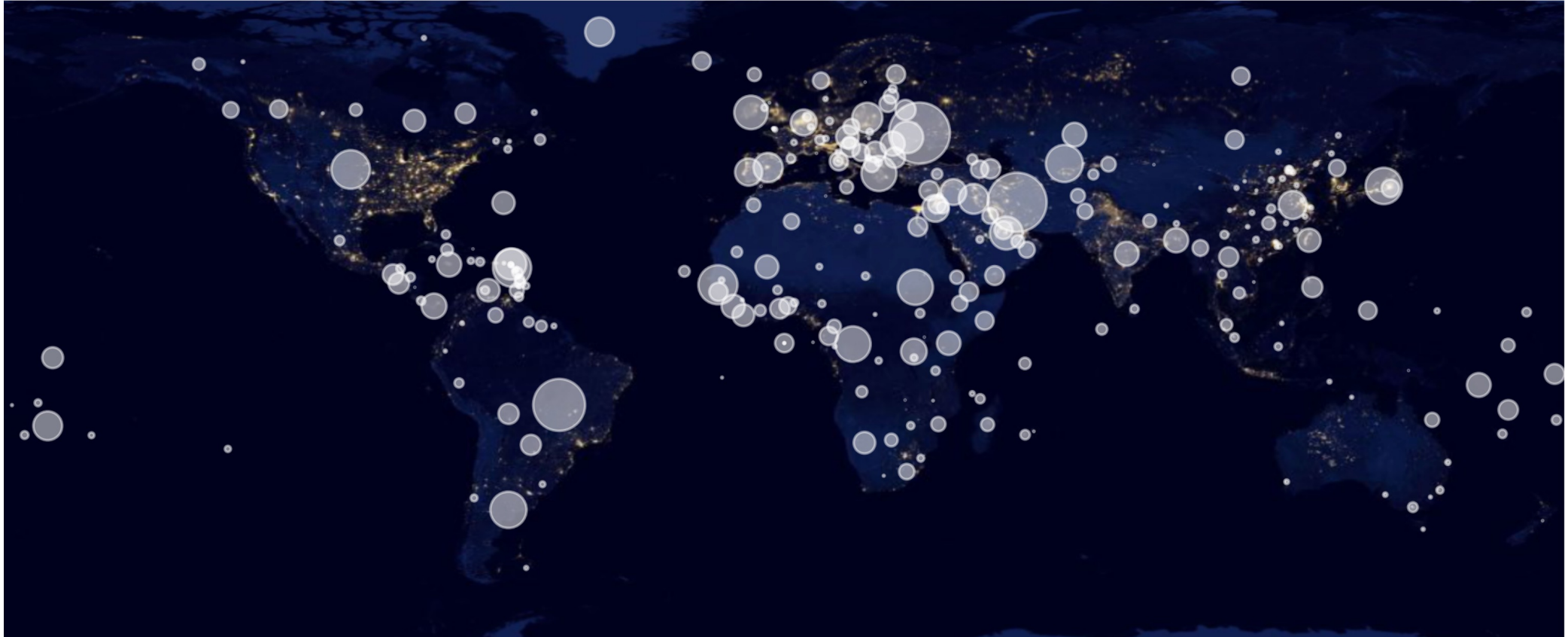


# Contextily



courtesy of the U.S. Geological Survey

# Contextily



Imagery provided by services from the Global Imagery Browse Services (GIBS), operated by the NASA/GSFC/Earth Science Data and Information System (ESDIS) with funding provided by NASA/HQ.

# Question Time

- **Assignment:**

- **Download today's lab practice and upload to moodle.**
- **Thx**



# The End

Thank you for your attention!

Email: [chchan@ntnu.edu.tw](mailto:chchan@ntnu.edu.tw)

Web: [toodou.github.io](https://toodou.github.io)

