

Visual Data Analysis Using ALTAIR

Problem statement :

- The city of Mistford and the Boonsong Lekagul Wildlife Preserve are facing a significant decline in the nesting pairs of the Rose-Crested Blue Pipit, a beloved local bird species. Previous investigations have suggested a potential link between the decline and activities at Kasios Office Furniture, a manufacturing firm in Mistford. However, no concrete evidence has been found to establish this link.
- To address this issue, we need to analyze several years of water sensor readings from rivers and streams in the preserve to identify any potential correlations or patterns between chemical measurements and the decline in bird population.

Audience Details :

- City Officials: City officials from Mistford who are responsible for environmental conservation and wildlife protection.
- Environmental Agencies: Representatives from environmental agencies tasked with monitoring and regulating pollution levels in the area.
- Manufacturing Companies: Representatives from manufacturing companies operating in Mistford, including Kasios Office Furniture, who may be implicated in the investigation.
- Wildlife Conservationists: Experts and researchers focused on preserving the biodiversity of the Boonsong Lekagul Wildlife Preserve and mitigating threats to endangered species.

Business Questions :

- What does the site map look like?
- Are there any significant trends or patterns in the water sensor readings from rivers and streams in the preserve?
- Which sites and chemicals are showing irregular trends?

Available Data :

- Dataset type: Tabular
- Data type: Items and attributes
- Attribute type:
 - Id (Nominal): Unique identifier of the observation
 - Value (Ratio): Value of chemical readings
 - Location (Nominal): Name of the sites of water sensor readings
 - Sample date (Nominal): Timestamp of the reading
 - Measure (Nominal): Name of the chemical
 - Route (Nominal): Route marking of the sites
 - X (Ratio): X coordinates of the sites
 - Y (Ratio): Y coordinates of the sites
 - Distance from dumping site (Ratio): Distance of each site from the dumping site

Assumptions :

- The wildlife preserve is in the United Kingdom.
- If the readings of a chemical are not available, we assume that reading was not taken.
- Readings with value=0 were included in the analysis for in-depth trend analysis.
- The sites on the same river routes were marked together. Post this selection we had 4 routes with the bifurcation as
 - Route 1: Boonsri, Kohsoom, Busarakhan, Chai, Kannika.
 - Route 2: Somchair, Achara, Sakda.
 - Route 3: Tansanee.
 - Route 4: Decha.
- After the route marking and distance calculation, Route 1 was found nearest to the dumping site and route 4 is the farthest.
- Kohsoom is nearest to the dumping site with a distance of 1.55 units and Decha is the farthest with 8.21 units of distance.
- Since the exact manufacturing process of the furniture manufacturing company 'Kasios Office Furniture' is unknown, therefore it is assumed that all the chemicals listed in the dataset are emitted as a byproduct of the manufacturing activities.

Pre-Processing :

- 'Sample date' was converted to date type format.
- Additional information on the sites' coordinates and their distance from the dumping site were added in a separate dataset named 'location_coordinates'. This helped us in creating a dummy map for site locations.

Report structure:

This report is divided into three tasks as follows-

- Task 1 focuses on thoroughly examining the dataset to uncover key insights and trends.
- Task 2 involves a detailed investigation into specific locations and chemicals of interest built upon insights from task 1.

- Task 3 involves designing a comprehensive dashboard that encapsulates the findings from the previous tasks, suitable for presentation to stakeholders.

Data Visualization- Task 1 :

The aim of task 1 is to explore the dataset and get valuable insights.

Visualization 1 :

General :

- **Aim of the visualization** : To discover and identify the missing values, outliers, or change in collection frequency location wise. The target was understanding trends and outliers in the entire dataset.
- **Findings:** Both anomaly and pattern
 - Data points for all sites of Route 1 (Boonsri, Kohsoom, Busarakhan, Chai, Kannika) were available from 1998 to 2016 (i.e. for all 19 years).
 - Data points for only 2 sites on Route 2 (Somchair, Sakda) were available from 1998 to 2016
 - Data points for all other sites – Route 2 (Achara), Tansanee (Route 3), and Decha (Route 4) were available from 2009 to 2016 (i.e. for 8 years)
 - Kohsoom has shown the highest average of measures in 2003. Kohsoom is the nearest site to the dumping site.
 - Majority of the sites fall in the green to blue zones.
 - The year 2003 observed the average value of measures from mediocre to high levels. It could be because of the heat wave which hit the UK this year.
 - Tansanee (Route 3) has always been in the blue to purple zone (mediocre levels of chemicals).
 - Except in the year 2009, Achara (Route 2) has always been in a green zone (low levels of chemicals).
- **How the finding can be seen from the visualization:**
 - Mark: Bar
 - Channels:
 - Color and hue: For intensity of the average value of measures.
 - Position: To identify the location and year.
 - Tooltip: To share information on the average value.
 - The presence of marks across every location show that the data for a particular year and location were collected.
 - The channel color and hue depict that intensity of the average value of chemicals present in that particular site. For e.g. for the year 2003 and site Kohsoom, the cell is bright red depicting that the average value of the chemicals is the highest.
- **How the visualization design supports the analysis, i.e. what the data and analysis tasks are and how the visualization is designed to match and support them.**
 - The visualization design matches the analysis task by providing a clear representation of the dataset's spatial and temporal dimensions. It enables stakeholders to quickly identify trends and outliers in chemical measurements across different sites, aiding in the identification of potential correlations with the decline in bird populations.
- **Any advanced Altair visualization features used, such as multi-layer, chart concatenation, and interaction.**
 - Size of the chart was customized to make it readable.
 - Tooltip was added to show extra information on average value.
 - The title of the legend was changed.
 - The orientation of the legend was changed to left.
 - Legend was made in the form of a scale and color range was explicitly mentioned.

Effectiveness of the visual :

- **Why is the chart type most appropriate for the analysis?**
 - A heatmap is most suitable for analysis since it effectively uses color intensity to describe data values while displaying huge datasets in a grid format. It is possible to quickly spot trends, missing values, correlations, and patterns in the data using this visualization technique.
- **Why is the choice of mark and channel the most effective?**
 - Using color and hue alongside the heatmap effectively communicates data intensity, while positioning arranges it according to location and year. Tooltips further enrich this by offering detailed insights when needed, thus making this method efficient for swiftly recognizing patterns and comparing data across various dimensions.
- **Is there any additional feature, such as sorting/filtering, dashboard or interactions, is used to improve the visualization ?**
 - Tooltips were added for interactivity.



Visualization 2 :

A similar analysis was done for 'Measure' vs 'Location' and below are the observations.

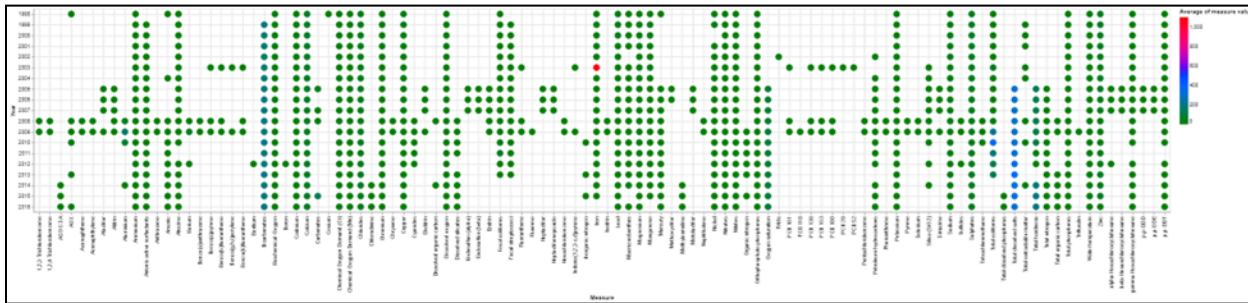
General :

- **Aim of the visualization** : The objective was to detect missing values, outliers, or alterations in the frequency of data collection based on metrics of the chemicals location wise. The aim was to comprehend trends and anomalies present within the complete dataset.
- **Findings:** Both anomaly and pattern
 - The average value of all locations for every measure falls in the green zone.
 - The average value of 'Total coliforms' was in the red zone for Achara.
 - There are missing values as we can see from the white spaces. The readings for location for a particular measure was not done even once in the span of 19 years of observations.
 - Chemicals which were observed for all the locations - 'Ammonium', 'Anionic active surfactants', 'Arsenic', 'Atrazine', 'Bicarbonates', 'Biochemical Oxygen', 'Cadmium', 'Calcium', 'Chemical Oxygen Demand (Cr)', 'Chemical Oxygen Demand (Mn)', 'Chlorides', 'Chromium', 'Copper', 'Dissolved oxygen', 'Dissolved silicates', 'Iron', 'Lead', 'Macrozoobenthos', 'Magnesium', 'Manganese', 'Mercury', 'Nickel', 'Nitrates', 'Nitrites', 'Orthophosphate-phosphorus', 'Oxygen saturation', 'Petroleum hydrocarbons', 'Potassium', 'Sodium', 'Sulphates', 'Total dissolved salts', 'Total hardness', 'Total nitrogen', 'Total phosphorus', 'Water temperature', 'Zinc', 'gamma-Hexachlorocyclohexane', 'p,p-DDT'.
- **How the finding can be seen from the visualization:**
 - Mark: Bar
 - Channels:
 - Color and hue: To represent the average value of measures' intensity.
 - Position: To pinpoint the position and time frame.
 - Tooltip: To inform about the average value.
 - The existence of marks in each location indicates that data for a specific year and place were gathered.
 - The color and hue of the channel illustrate the average intensity of chemicals found at that specific location.. For e.g. for the site Achara, the cell is bright red depicting that the average value of the Total Coliforms is the highest.
- **How the visualization design supports the analysis, i.e. what the data and analysis tasks are and how the visualization is designed to match and support them.**
 - The visualization used matches the task at hand by presenting a clear image of the locations and time periods that the dataset covers .It enables us to quickly spot patterns and unusual things in chemical measurements at different places, which might be linked to the drop in bird numbers.
- **Any advanced Altair visualization features used, such as multi-layer, chart concatenation, and interaction.**

- **Aim of the visualization :** To uncover and detect missing values, outliers, or shifts in data collection frequency related to measures year wise. The aim was to grasp trends and anomalies across the entire dataset.
- **Findings:** Both anomaly and pattern
 - There is inconsistency in the frequency of data collection e.g. Beryllium, PCB 28, PCB 118, PAHs, Boron, Cesium, PCB 52, Trifluralin, Fluorene were collected only once from 1998 to 2016.
 - Total dissolved salts and bicarbonates have always been in the blue zone i.e. mediocre average value
 - Average value of iron was in the red zone in 2003.
- **How the finding can be seen from the visualization:**
 - Mark: Point
 - Channels:
 - Color and hue: For intensity of the average value of measures
 - Position: To recognise the location and year
 - Marks are present for every measure, indicating data collection for a specific year and chemical.
 - Color and hue show the intensity of average chemical values; for instance, in 2003, Iron had a high average value, depicted in red.
- **How the visualization design supports the analysis, i.e. what the data and analysis tasks are and how the visualization is designed to match and support them.**
 - The visualization design facilitates intuitive comparison of chemical measurements over time. It uses color and position to convey intensity and identify trends or outliers. Marks for each measure and year ensure comprehensive data coverage.
- **Any advanced Altair visualization features used, such as multi-layer, chart concatenation, and interaction.**
 - Marker was filled with appropriate color
 - Grid was made for better location of the points
 - The x-axis was sorted in ascending order to easily locate the measure name
 - Legend was made in the form of a scale and color range was explicitly mentioned

Effectiveness of the visual

- **Why is the chart type most appropriate for the analysis?**
 - The aim was to plot measures against year (two categorical variables) and color of the circle on the basis of average value of the measure (quantitative). Therefore the best choice was a dot plot.
- **Why is the choice of mark and channel the most effective?**
 - The choice of a point mark and channels such as color and position is effective because it allows for clear visualization of individual data points while conveying key information about the intensity of average values and their distribution over time. This combination facilitates easy identification of trends and outliers in the dataset.
- **Is there any additional feature, such as sorting/filtering, dashboard or interactions, is used to improve the visualization?**
 - Sorting of the measure names was done in ascending order
 - Grid lines were made for easy location of dots.



```
alt.X('measure:N', title='Measure', sort='ascending'),
```

```
).configure_axis(  
    grid=True  
)
```

Visualization 4 :

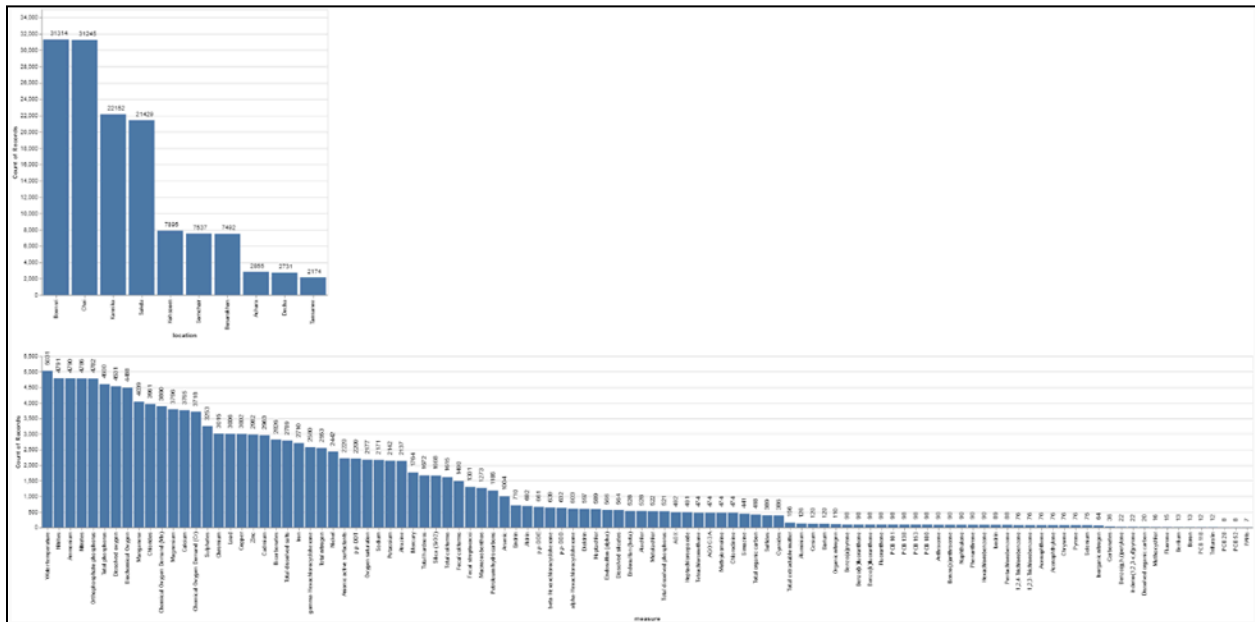
General :

- **Aim of the visualization :** To discover and compare the frequencies of collection across locations, and measures. The target was attributes of location and measures and we wanted to find the location and measures with maximum number of counts of observations.
- **Findings: Both anomaly and pattern**
 - Boonsri and Chai had a maximum number of observations done for measures with values 31314 and 31245 respectively.
 - Achara, Decha and Tansanee have the lowest number of observations.
 - Water temperature was recorded the maximum number of times across years and across locations with 5031 records.
- **How the finding can be seen from the visualization:**
 - Mark: Bar, Text
 - Channels:
 - Position: Used to identify the counts of records across locations and measures.
- **How the visualization design supports the analysis, i.e. what the data and analysis tasks are and how the visualization is designed to match and support them.**
 - The visualization design effectively supports the analysis task by providing a clear representation of the frequencies of data collection across locations and measures. It allows for easy comparison and identification of the locations and measures with the highest number of observations, thereby facilitating data-driven insights and decision-making.
- **Any advanced Altair visualization features used, such as multi-layer, chart concatenation, and interaction.**
 - The graph was sorted on the basis of count of measures.
 - Chart layering was done (bar graph + text).
 - The text was aligned at the center and x and y offsets were set.
 - Vertical concatenation of graphs (for location and measures's count) was done.

Effectiveness of the visual :

- **Why is the chart type most appropriate for the analysis?**
 - Bar chart is efficient for comparison as we aimed to compare the counts of measures location and measure wise.

- We have location (or measures) and counts of observations which are qualitative and quantitative respectively.
- **Why is the choice of mark and channel the most effective?**
 - Bar & Text: for easy comparisons and visually easy for the viewers to perceive and compare the values.
 - Position: Position encoding along the y-axis accurately represents the quantitative aspect of the data.
- **Is there any additional feature, such as sorting/filtering, dashboard or interactions, is used to improve the visualization?**
 - The graph was arranged according to the number of measurements.
 - Layering of the chart was performed (combining bar graph with text).
 - The text was centered and adjustments were made to its position along the x and y axes.
 - The graphs for location and measure count were stacked vertically.



```
alt.X('location', sort='-y'),
```

```
chart1=base_bar_location.mark_bar() + base_bar_location.mark_text(align='left', dx=-10, dy=-10)
```

```
concatenated_chart = chart1 & chart2
concatenated_chart
```

Visualization 5 :

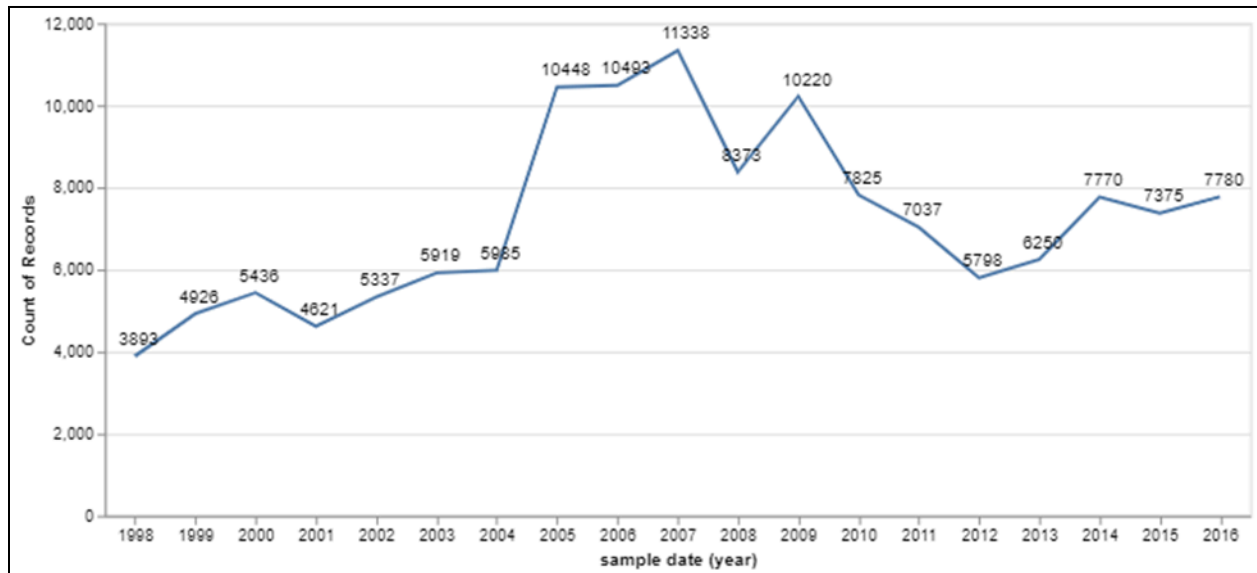
General :

- **Aim of the visualization :** The aim was to see the trend of collection frequency over the span of 19 years.
- **Findings:** Pattern/Trend
 - From 1998 to 2007, the trend of collection frequency was increasing.
 - The collection frequency is highest in the year 2007 with 11338 records.
- **How the finding can be seen from the visualization:**
 - Mark: Line, Text
 - Channels:
 - Position: Collection frequency for a particular year.
 - Slope: Increase or decrease in the collection frequency.
- **How the visualization design supports the analysis, i.e. what the data and analysis tasks are and how the visualization is designed to match and support them.**
 - The visualization's line chart effectively displays the trend of collection frequency over 19 years, with text annotations highlighting key findings like the peak in 2007. By employing position and slope channels, it enables easy interpretation of temporal patterns, supporting the analysis of data trends.
- **Any advanced Altair visualization features used, such as multi-layer, chart concatenation, and interaction.**
 - Layering of the line and text markers was done.

Effectiveness of the visual :

- **Why is the chart type most appropriate for the analysis?**

- The aim was to understand the changes over time of collection frequency for which line chart is the most appropriate.
- **Why is the choice of mark and channel the most effective?**
 - The selection of line marks enables clear visualization of temporal trends, while text annotations highlight key findings succinctly.
 - Position and slope channels facilitate intuitive interpretation by representing collection frequency over time and indicating the direction and magnitude of changes, respectively, resulting in an effective portrayal of the dataset's temporal dynamics.
- **Is there any additional feature, such as sorting/filtering, dashboard or interactions, is used to improve the visualization?**
 - The line and text markers were combined in layers.



```
base_count_years.mark_line() + base_count_years.mark_text(align='left', dx=-10, dy=-10)
```

Data Visualization- Task 2 :

To maintain and avoid any inconsistency in the data and ensure that the analysis is efficient, we considered the sites and chemicals for which observations are present from 1998 to 2016.

Following the observations from Task 1, for deeper analysis we consider:

1. Sites: Route 1 (Boonsri, Kohsoom, Busarakhan, Chai, Kannika) and Route 2 (Somchair, Sakda) were available from 1998 to 2016 as the data is available from 1998 to 2016.
2. Chemicals which were observed for all the locations from 1998 to 2016 are - 'Ammonium', 'Biochemical Oxygen', 'Cadmium', 'Calcium', 'Chemical Oxygen Demand (Cr)', 'Chemical Oxygen Demand (Mn)', 'Chlorides', 'Chromium', 'Copper', 'Dissolved oxygen', 'Lead', 'Magnesium', 'Nitrates', 'Nitrites', 'Orthophosphate-phosphorus', 'Potassium', 'Sodium', 'Sulphates', 'Total phosphorus', 'Water temperature'.

Visualization 6 :

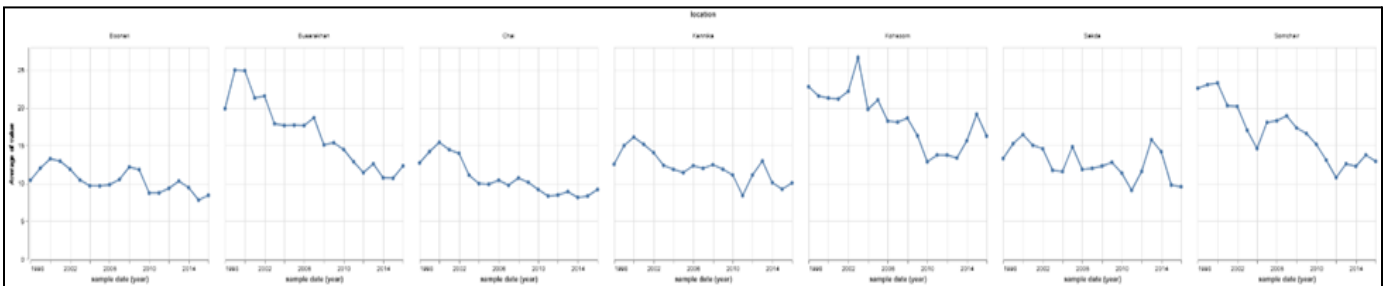
General :

- **Aim of the visualization** : The aim of the visualization is to show the average values of different measures over time at different locations. The faceted line charts display data that is filtered by the user by choosing a specific measure from a dropdown menu. Each faceted line chart represents a different location.
- **Findings: Pattern**
 - Across all locations, it has been noted that the average value of measures has exhibited a declining trend over a 19-year period, although the start was at high levels.
- **How the finding can be seen from the visualization:**
 - Mark: Line , Point
 - Channels:
 - Position: To identify the average value of measures year-wise for each location
 - Slope: To show if the value is increasing or decreasing.

- **How the visualization design supports the analysis, i.e. what the data and analysis tasks are and how the visualization is designed to match and support them.**
 - This visualization design supports the task by making it simple to compare trends or outliers between locations by enabling comparison across several geographic or categorical areas. The chart becomes more versatile and focuses on user-defined interests when measures are chosen interactively through a dropdown menu. For displaying the evolution of values over time, which is an essential feature of many time-series data analysis, the line chart format works well.
- **Any advanced Altair visualization features used, such as multi-layer, chart concatenation, and interaction.**
 - Making faceted chart with columns as locations
 - Creating a dropdown filter on measures
 - Changing the layout of the chart based on filter

Effectiveness of the visual :

- **Why is the chart type most appropriate for the analysis?**
 - When illustrating changes over time, line charts work well because they make it simple to identify patterns, growth, or declines. The faceted structure makes it possible to compare directly between different locations.
- **Why is the choice of mark and channel the most effective?**
 - The use of lines and points together makes it easier to calculate the exact value of each measure annually and to connect the points to create a visually appealing trend visualization. The location-based faceting and interactive selection methods offer a well-defined and focused structure for analysis.
- **Is there any additional feature, such as sorting/filtering, dashboard or interactions, is used to improve the visualization?**
 - The measure selection interactive dropdown menu gives users more choice over what they see, which improves the visualization. More in-depth interaction with the data and more personalized insights may result from this interaction.



Choose the Measures **All**



```
measure_labels = ["All"] + measures
measure_dropdown = alt.binding_select(options=measure_labels, name="Choose the Measures")
measure_select = alt.selection_point(fields=['measure'], bind=measure_dropdown)

base_chart=alt.Chart(df_filtered).mark_line(point=True).encode(
    column='location', #Maklig a faceted chart
    x='year(sample date)',
```

```
).add_params(
    measure_select
).transform_filter(
    measure_select
)
```

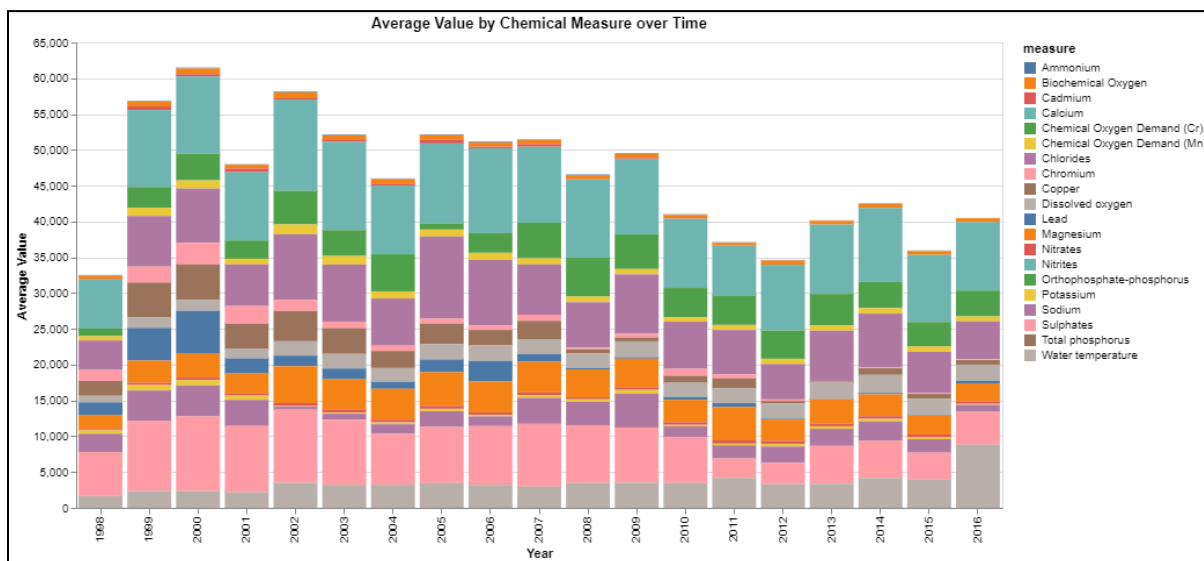

Visualization 7 :

General :

- **Aim of the visualization** : The visualization aims to show the cumulative value of different chemicals over a given period of time, from 1998 to 2016. It gives a summary of the average amount of each chemical each year and helps us locate the predominant chemical in that particular year.
- **Findings:**
 - During the course of the 19 years of monitoring, calcium, chlorides, and sulphates have continuously shown larger amounts than other chemicals.
 - Nitrate has consistently shown the lowest levels of all chemicals throughout the entire 19 years.
- **How the finding can be seen from the visualization:**
 - Mark: Bar
 - Channels:
 - Position: Use to identify the average value of chemicals over the years for the filtered locations
 - Colors: Every chemical has a distinct hue defined to it. It is easier to track a particular chemical's trend across the chart considering this provides differentiation, which aids in visually separating the data for each chemical.
- **How the visualization design supports the analysis, i.e. what the data and analysis tasks are and how the visualization is designed to match and support them.**
 - The visualization design facilitates that when comparing the total values of different chemicals for every year from 1998 to 2016 for which a stacked bar chart is a great choice.
- **Any advanced Altair visualization features used, such as multi-layer, chart concatenation, and interaction.**
 - Tooltip is added in order to provide additional data on hover, which improves interaction without overloading the visual representation.

Effectiveness of the visual :

- **Why is the chart type most appropriate for the analysis?**
 - A stacked bar chart is a useful tool for displaying the share of various chemicals every year, offering an understandable and straightforward depiction of variations and contrasts.
- **Why is the choice of mark and channel the most effective?**
 - Comparison of total values across many chemicals and time periods can be done efficiently by using bars as markings.
 - The relevant variables (time, total value, and chemical) are efficiently encoded using positional and color channels, which facilitates easy interpretation and analysis of the visualization.
- **Is there any additional feature, such as sorting/filtering, dashboard or interactions, is used to improve the visualization?**
 - Tooltips are a helpful element that gives the static representation more depth and lets users interact with the data.



```

bar_chart = alt.Chart(total_values1).mark_bar().encode(
  x=alt.X('sample date:0', axis=alt.Axis(title='Year')), # Updated x-axis field
  y=alt.Y('average(value):Q', axis=alt.Axis(title='Average Value')), # Updated y-axis field
  color='measure:N',
  tooltip=['measure', 'sample date', 'average(value)'] # Specify tooltip encoding here
).properties(
  title='Average Value by Chemical Measure over Time',
  width=800,
  height=400
)

```

Dashboard :

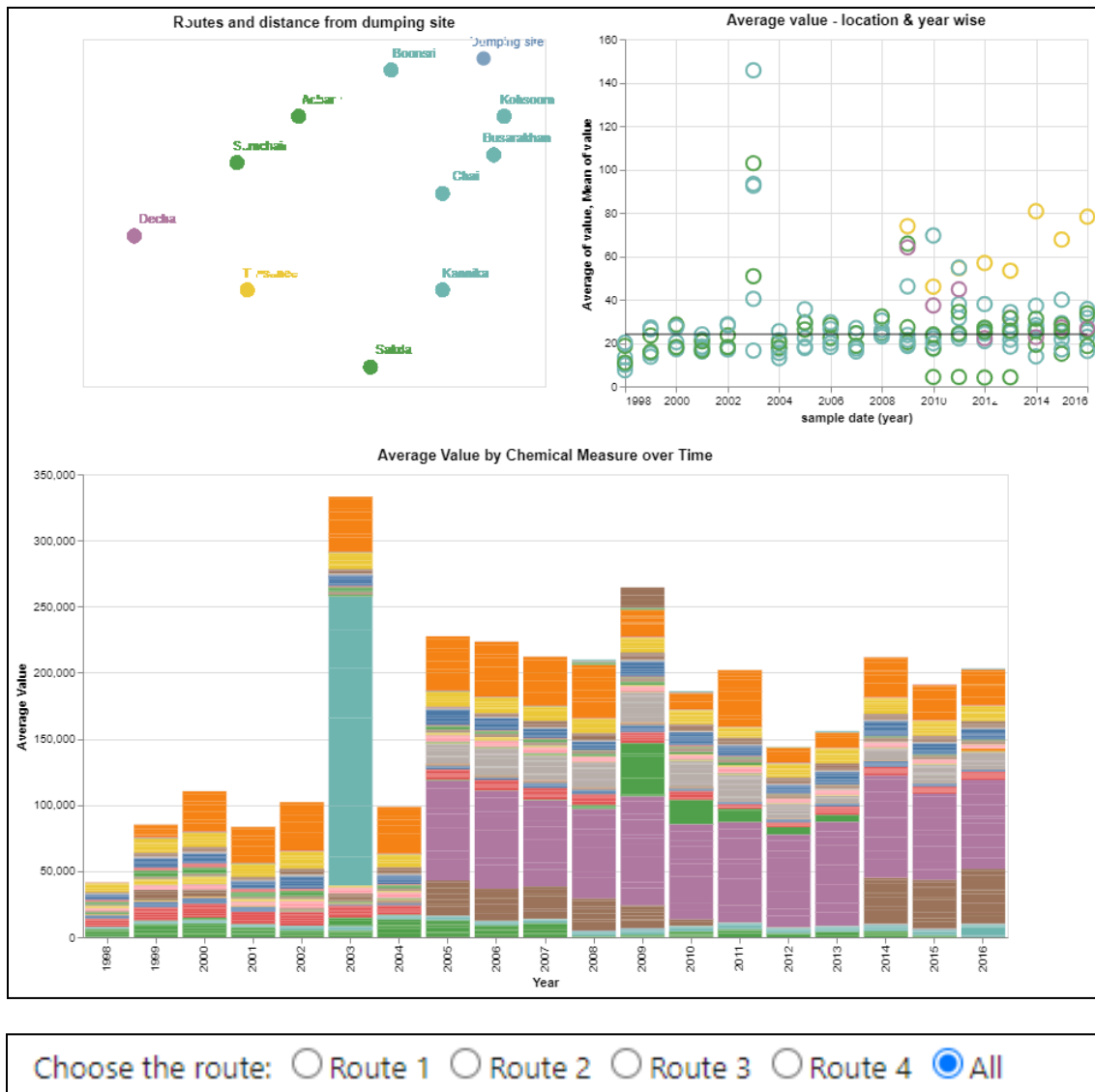
General :

- **Aim of the visualization:** The aim of this dashboard is to analyze and display the distribution of chemical values at various locations over time, separated by routes and distance from a dumping site. It aims to explain how different routes and distances from a central point affect the spatial and temporal patterns of chemical distribution.
- **Interaction of the dashboard:** The dashboard contains 3 graphs namely: 'Route map' which shows the route mapping and distance of each route/location from the dumping site.
 - 'Bubble chart' to show the trend of the average value of chemicals in the selected route/location.
 - 'Stacked bar chart' to show the distribution of chemicals in the selected route/location.
 - To ensure that these 3 graphs interact with each other 2 types of filters were used1.
 - 'Radio filters': The user can click on the radio buttons at the bottom of the dashboard to filter the graphs on the basis of routes. The Route map will highlight the locations on the selected route and the Bubble chart will show the trend of average values of chemicals in the selected route.
 - 'Point selection': The user can choose a specific location in any route by clicking on the location point in the 'Route map'. The Bubble chart will then show the trend of average value of chemicals in that particular location and the Stacked bar chart will show the portion of each chemical for every year for the selected location.
- **How the finding can be seen from the visualization:**
 - Chart 1 (Map):
 - Mark: Circle, Text
 - Channels:
 - Position: To identify the geographical coordinates
 - Color: Colors distinguish routes according to selection; if a route is unselected, they turn gray.
 - Chart 2 (Bubble):
 - Mark: Point, Rule
 - Channels:
 - Position: To identify the average value over the years
 - Color: Based on the filters Routes/ Locations are shown by colors.
 - Chart 3 (Bar):
 - Mark: Bar
 - Channels:
 - Position: Use to identify the average value of chemicals over the years
 - Color: Every chemical has a distinct hue defined to it. It is easier to track a particular chemical's trend across the chart considering this provides differentiation, which aids in visually separating the data for each chemical.
- **How the visualisation design supports the analysis, i.e. what the data and analysis task are and how the visualisation is designed to match and support them.**
 - The visualization matches the analysis by showing detailed comparisons of chemical values across many spatial and temporal dimensions by integrating location data and offering filters to choose paths.
 - Point maps, stacked bar charts, and bubble charts work together to create an in-depth view that combines geographical data with the quantitative measurements over the time interval.
- **Any advanced Altair visualisation features used, such as multi-layer, chart concatenation, and interaction.**
 - Making radio buttons for filtering
 - Making a point filter
 - Making a dynamic average line
 - Layering of charts (base and text)
 - Vertical and horizontal concatenation of the charts
 - Tooltip is added in order to provide additional data on hover, which improves interaction without overloading the visual representation.

Effectiveness of the visual

- **Why is the chart type most appropriate for the analysis?**
 - Using geographical mappings, the map provides an intuitive way to see spatial data.
 - The bubble chart is a great tool for visualizing time-series data because it effectively displays changes over time. It also provides information on the missing data.
 - The rule mark gives an accurate indication of the general average and serves as a standard for evaluating individual values.
 - A stacked bar chart is a useful tool for displaying the cumulative values of various chemicals over time, offering an understandable and straightforward depiction of variations and contrasts.
- **Why are the choice of mark and channel the most effective?**
 - Discrete data points are effectively represented by circles and point marks, which are easily understood.
 - The charts are connected by color, which strengthens the relationship between the data that is shown.
 - Position on charts makes it easier to read temporal patterns and geographical positioning.
 - Comparison of total values across many chemicals and time periods can be done efficiently by using bars as markings.
 - The relevant variables (time, average value, and chemical) are efficiently encoded using positional and color channels, which facilitates easy interpretation and analysis of the visualization.

- Is there any additional feature, such as sorting/filtering, dashboard or interactions, is used to improve the visualisation?
 - The usefulness of the visualization is significantly improved by interactive components like point selection and radio buttons, which let users customize the display to fit their own interests or concerns.
 - Filtering makes the analysis sensitive to user inputs by dynamically adjusting not just what data is displayed but also how statistics like averages are computed.



```
average_line = alt.Chart(df_com).mark_rule().encode(
  alt.Y('mean(value):Q'), # Calculate the mean dy
  size=alt.value(1.5),
  strokeOpacity=alt.value(0.6)
).transform_filter(
  multi_map
).transform_filter(
  multi_map_1
)
```

```

multi_map = alt.selection_point(fields=['location'])#, bind='legend', nearest=True)

options = ['Route 1','Route 2','Route 3','Route 4']
labels = [option + ' ' for option in options]

input_radio = alt.binding_radio(
    # Add the empty selection which shows all when clicked
    options=options + [None],
    labels=labels + ['All'],
    name='Choose the route: '
)
multi_map_1 = alt.selection_point(
    fields=['Route'],
    bind=input_radio,
)

```

```

# Concatenating the charts
X = alt.hconcat(chart_map, combined_chart)
X
alt.vconcat(X, bar_chart)

```

CONCLUSION :

Based on the findings from Task 1 and Task 2, it is inferred that the bird population could potentially be affected by the concentration of chemicals in the various locations. However, a definitive conclusion can only be reached with additional information regarding factors such as the quantity of pollutants emitted by the furniture company, the establishment date of the company, acceptable thresholds for each chemical, and so forth.