Observations and Insights

- 1. Capomulin and Ramicane treatment regimens had the most mice in comparison to the other regimens, as seen in the bar graphs.
- 2. Looking at the box plot, Capomulin and Ramicane had the smallest tumors by volume.
- 3. The gender distribution was equal between male and female, however the role of gender in tumor growth and treatment remains unknown. I would look at the tumor volume per regimen grouped by gender. There may be a medication more suitable for one gender over the other, or each gender may process and react differently.
- 4. By examinging multiple randomly selected test subjects over the course of the the study, Capomulin was successful in shrinking the tumors. The drug began taking effect between day 5 and day 10 when the tumors started to decreased. However, it appears the treatment lost effectiveness around day 35 and the tumors started to increase in volume. Future studies should consider incremently increasing the dosage over time to ensure complete ablation of the tumors.
- 5. There is a positive correlation of 0.84 between the weight of the mouse and volume of the tumors as demostrated by the linear regression model. This correlation was expected since any increase in volume will influence the mass of the object, thus influencing the weight of the mouse. This is not indicative to the efficiency of the drug regimens.

```
In [432]: # Dependencies and Setup
          import matplotlib.pyplot as plt
          import pandas as pd
          import scipy.stats as st
          import numpy as np
          # Study data files
          mouse metadata path = "data/Mouse metadata.csv"
          study results path = "data/Study results.csv"
          # Read the mouse data and the study results
          mouse metadata = pd.read csv(mouse metadata path)
          study results = pd.read csv(study results path)
          # Combine the data into a single dataset
          combined df = pd.merge(mouse metadata, study results, on="Mouse ID", how="left")
          combined df.to csv("combined df.csv", index=False)
          # Display the data table for preview
          combined df.head()
```

Out[432]:

	Mouse ID	Drug Regimen	Sex	Age_months	Weight (g)	Timepoint	Tumor Volume (mm3)	Metastatic Sites
0	k403	Ramicane	Male	21	16	0	45.000000	0
1	k403	Ramicane	Male	21	16	5	38.825898	0
2	k403	Ramicane	Male	21	16	10	35.014271	1
3	k403	Ramicane	Male	21	16	15	34.223992	1
4	k403	Ramicane	Male	21	16	20	32.997729	1

```
In [433]: # Checking the number of mice.
mice=len(mouse_metadata["Mouse ID"].unique())
mice
```

Out[433]: 249

Issue: How do we know there's a duplicate in the first place when the instructions tell us 249 mice were used in the study and 249 mice are shown in the mouse_metadata and study_results. Simply looking at the number of mice won't work! The mice themselves aren't being duplicated nor was the same Mouse ID used for two mice since the weights and ages are the same. The data collection records is being duplicated. Thus, the number of timepoints used (10) and the value counts of each Mouse ID is needed. Then, anything over the max number of time_points would be a duplicate, that is if all the mice reached the 45 day mark, which some do not.

```
In [434]: | study record = study results["Mouse ID"].value counts()
          study_record
Out[434]:
          g989
                  13
          z795
                  10
          u196
                  10
          j755
                  10
          m957
                  10
          x226
                   1
          d133
                   1
          x336
                   1
          h428
                   1
          1872
          Name: Mouse ID, Length: 249, dtype: int64
          # Get the duplicate mice by ID number that shows up for Mouse ID and Timepoint.
In [435]:
          duplicates = study results.loc[study results.duplicated(subset=["Mouse ID", "Timepoint"]), "Mouse ID"].value
          counts()
          duplicates
Out[435]: g989
                  5
          Name: Mouse ID, dtype: int64
```

```
In [436]: # Optional: Get all the data for the duplicate mouse ID.
duplicated_mouse_data=combined_df.loc[combined_df["Mouse ID"] == "g989"]
duplicated_mouse_data
```

Out[436]:

	Mouse ID	Drug Regimen	Sex	Age_months	Weight (g)	Timepoint	Tumor Volume (mm3)	Metastatic Sites
908	g989	Propriva	Female	21	26	0	45.000000	0
909	g989	Propriva	Female	21	26	0	45.000000	0
910	g989	Propriva	Female	21	26	5	48.786801	0
911	g989	Propriva	Female	21	26	5	47.570392	0
912	g989	Propriva	Female	21	26	10	51.745156	0
913	g989	Propriva	Female	21	26	10	49.880528	0
914	g989	Propriva	Female	21	26	15	51.325852	1
915	g989	Propriva	Female	21	26	15	53.442020	0
916	g989	Propriva	Female	21	26	20	55.326122	1
917	g989	Propriva	Female	21	26	20	54.657650	1
918	g989	Propriva	Female	21	26	25	56.045564	1
919	g989	Propriva	Female	21	26	30	59.082294	1
920	g989	Propriva	Female	21	26	35	62.570880	2

```
In [437]: # Create a clean DataFrame by dropping the duplicate mouse by its ID.
    combined_df.drop(combined_df.loc[combined_df["Mouse ID"]== "g989"].index, inplace=True)
    combined_df.to_csv("cleaned_combined_df.csv", index=False)
    # Checking the number of mice in the clean DataFrame.
    mice_check = len(combined_df["Mouse ID"].unique())
    mice_check
```

Out[437]: 248

Summary Statistics

In [438]: # Generate a summary statistics table of mean, median, variance, standard deviation, and standard error of me an(SEM) of the tumor volume for each regimen. # This method is the most straighforward, creating multiple series and putting them all together at the end. mean = combined df.groupby("Drug Regimen").mean()["Tumor Volume (mm3)"] median = combined df.groupby("Drug Regimen").median()["Tumor Volume (mm3)"] variance = combined df.groupby("Drug Regimen").var()["Tumor Volume (mm3)"] std var = combined df.groupby("Drug Regimen").std()["Tumor Volume (mm3)"] sem = combined df.groupby("Drug Regimen").sem()["Tumor Volume (mm3)"] summary by series df = pd.DataFrame ({ "Mean": mean, "Median": median, "Variance": variance, "Standard Variation": std var, "SEM": sem}) summary by series df.style.format({ "Mean": "{:,.2f}", "Median": "{:,.2f}", "Variance": "{:,.2f}", "Standard Variation": "{:,.2f}", "SEM": "{:,.2f}"})

Out[438]:

	Mean	Median	Variance	Standard Variation	SEM
Drug Regimen					
Capomulin	40.68	41.56	24.95	4.99	0.33
Ceftamin	52.59	51.78	39.29	6.27	0.47
Infubinol	52.88	51.82	43.13	6.57	0.49
Ketapril	55.24	53.70	68.55	8.28	0.60
Naftisol	54.33	52.51	66.17	8.13	0.60
Placebo	54.03	52.29	61.17	7.82	0.58
Propriva	52.32	50.45	43.85	6.62	0.54
Ramicane	40.22	40.67	23.49	4.85	0.32
Stelasyn	54.23	52.43	59.45	7.71	0.57
Zoniferol	53.24	51.82	48.53	6.97	0.52

```
In [439]: # Generate a summary statistics table of mean, median, variance, standard deviation, and SEM of the tumor vol
    ume for each regimen.
# This method produces everything in a single groupby function
    group = combined_df.groupby("Drug Regimen")

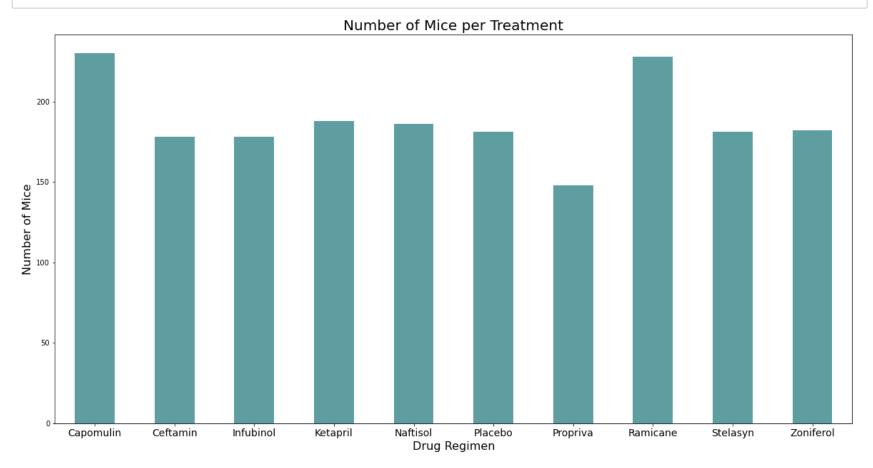
summary_single_group_df = pd.DataFrame(group.agg(["mean", "median", "var", "std", "sem"])["Tumor Volume (mm
    3)"])

stylish_summary = summary_single_group_df.style.format({
    "mean": "{:,.2f}",
    "war": "{:,.2f}",
    "std": "{:,.2f}",
    "sem": "{:,.2f}",
    "sem": "{:,.2f}",
    "sem": "{:,.2f}")
```

Out[439]:

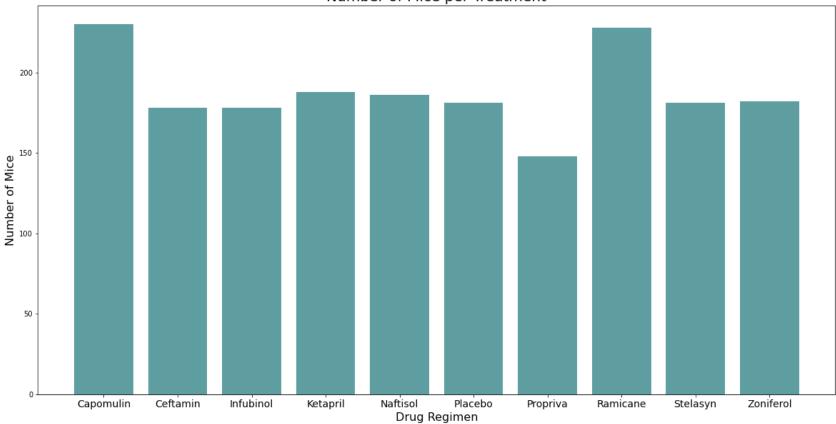
	mean	median	var	sta	sem
Drug Regimen					
Capomulin	40.68	41.56	24.95	4.99	0.33
Ceftamin	52.59	51.78	39.29	6.27	0.47
Infubinol	52.88	51.82	43.13	6.57	0.49
Ketapril	55.24	53.70	68.55	8.28	0.60
Naftisol	54.33	52.51	66.17	8.13	0.60
Placebo	54.03	52.29	61.17	7.82	0.58
Propriva	52.32	50.45	43.85	6.62	0.54
Ramicane	40.22	40.67	23.49	4.85	0.32
Stelasyn	54.23	52.43	59.45	7.71	0.57
Zoniferol	53.24	51.82	48.53	6.97	0.52

Bar and Pie Charts



<Figure size 432x288 with 0 Axes>

Number of Mice per Treatment

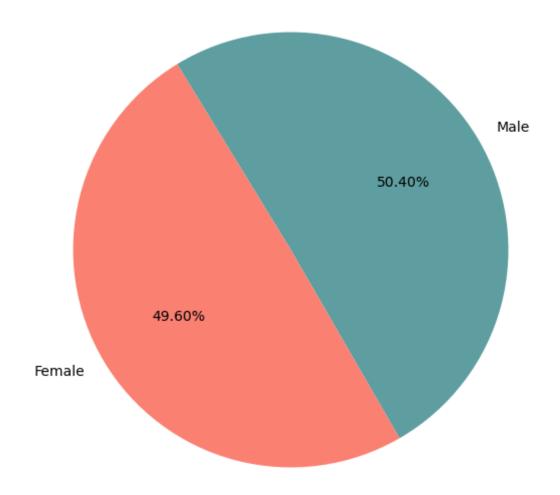


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```
In [442]: # Generate a pie plot showing the distribution of female versus male mice using pandas
          #Set up Dataframe for Gender of mice
          gender = pd.DataFrame(combined_df.groupby("Mouse ID" )["Sex"].unique())
          gender.reset_index(inplace = True)
          #Find values
          m v f = pd.DataFrame(gender["Sex"].value counts())
          m v f.reset index(inplace = True)
          #Change column headers to reflect data "axes"
          m v f.columns = ["Sex", "Mouse Count"]
          m v f["Sex"] = m v f["Sex"].str[0]
          panda_pie = m_v_f.plot(kind = "pie", y = "Mouse Count", autopct = '%.2f%%', labels = ["Male", "Female"], lege
          nd = False, startangle = 300,
          title = ("Distribution of Female vs. Male Mice"), shadow = False, figsize = (15, 10), colors = ["cadetblue",
          "salmon"], textprops= {"fontsize":14})
          panda pie.title.set size(20)
          panda pie.set ylabel(' ')
          panda pie
          plt.savefig("Pie plot[Pandas]--Gender Distribution of Test Subjects.png")
```

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Distribution of Female vs. Male Mice



```
In [443]: # Generate a pie plot showing the distribution of female versus male mice using pyplot

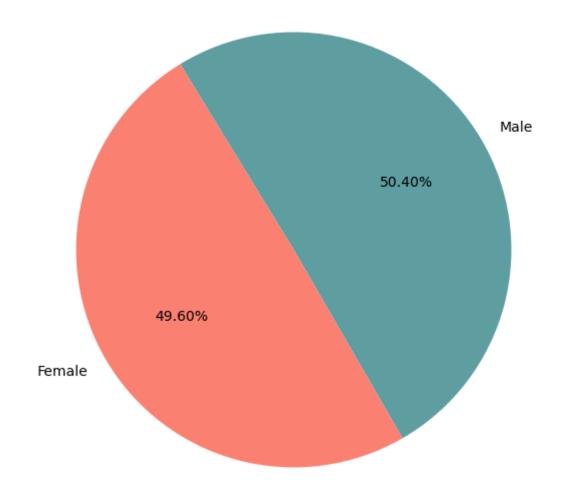
# Create Labels for the sections of the pie
gender_labels = m_v_f["Sex"]
gender_sizes = m_v_f["Mouse Count"]

#Create the pie chart based upon the values
plt.fig1, ax1 = plt.subplots(figsize = (15, 10))
plt.pie(gender_sizes, labels = gender_labels, colors = ["cadetblue", "salmon"], autopct = "%.2f%%", shadow=F
alse, startangle=300, textprops= {"fontsize":14})
plt.title("Gender Distribution of Test Subjects", fontsize = 20)
plt.show()

plt.savefig("Pie_plot[PyPlot]--Gender Distribution of Test Subjects")
```

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Gender Distribution of Test Subjects



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Quartiles, Outliers and Boxplots

Capomulin

```
In [445]: # Get Last (greatest) timepoint for each mouse
          Capomulin lastTP = Capomulin df.groupby("Mouse ID").max()["Timepoint"]
          # Calculate final tumor volume of each mouse:
          Capomulin final vol = pd.DataFrame(Capomulin lastTP)
          # Merge this grouped dataframef with the original dataframe to get tumor volume at the last timepoint
          Capomulin merge = pd.merge(Capomulin final vol, combined df, on=("Mouse ID", "Timepoint"), how="left")
          Capomulin tumors = Capomulin merge["Tumor Volume (mm3)"]
          # Ouartiles & Interguartile Range:
          quartiles = Capomulin tumors.quantile([0.25,0.5,0.75])
          lowerqr = round(quartiles[0.25], 2)
          median = round(quartiles[0.5], 2)
          uppergr = round(quartiles[0.75], 2)
          intergr = round(uppergr-lowergr, 2)
          # Outliers:
          lower bound = round(lowergr - (1.5 * intergr), 2)
          upper bound = round(upperqr + (1.5 * interqr), 2)
          # Output:
          print(f"The lower quartile for Capomulin tumors: {lowergr}")
          print(f"The upper quartile for Capomulin tumors: {uppergr}")
          print(f"The interquartile range for Capomulin tumors: {interqr}")
          print(f"The median for Capomulin tumors: {median} ")
          print(f"Values below {lower bound} could be outliers.")
          print(f"Values above {upper bound} could be outliers.")
          The lower quartile for Capomulin tumors: 32.38
          The upper quartile for Capomulin tumors: 40.16
          The interquartile range for Capomulin tumors: 7.78
          The median for Capomulin tumors: 38.13
          Values below 20.71 could be outliers.
```

Ramicane

Values above 51.83 could be outliers.

```
In [446]: # Get Last (greatest) timepoint for each mouse:
          Ramicane lastTP = Ramicane df.groupby("Mouse ID").max()["Timepoint"]
          # Calculate final tumor volume of each mouse:
          Ramicane final vol = pd.DataFrame(Ramicane lastTP)
          Ramicane merge = pd.merge(Ramicane final vol, combined df, on=("Mouse ID", "Timepoint"), how="left")
          Ramicane tumors = Ramicane merge["Tumor Volume (mm3)"]
          # Ouartiles & Interguartile Range:
          quartiles = Ramicane tumors.quantile([0.25,0.5,0.75])
          lowergr = round(quartiles[0.25], 2)
          median = round(quartiles[0.5], 2)
          upperqr = round(quartiles[0.75], 2)
          intergr = round(uppergr - lowergr, 2)
          #Outliers:
          lower bound = round(lowerqr - (1.5 * interqr), 2)
          upper bound = round(uppergr + (1.5 * intergr), 2)
          #Output:
          print(f"The lower quartile of Ramicane tumors is: {lowergr}")
          print(f"The upper quartile of Ramicane tumors is: {uppergr}")
          print(f"The interquartile range of Ramicane tumors is: {interqr}")
          print(f"The median of Ramicane tumors is: {median}")
          print(f"Values below {lower bound} could be outliers.")
          print(f"Values above {upper bound} could be outliers.")
          The lower quartile of Ramicane tumors is: 31.56
          The upper quartile of Ramicane tumors is: 40.66
          The interquartile range of Ramicane tumors is: 9.1
          The median of Ramicane tumors is: 36.56
          Values below 17.91 could be outliers.
```

Infubinal

Values above 54.31 could be outliers.

```
In [447]: # Get last (greatest) timepoint for each mouse:
          Infubinol lastTP = Infubinol df.groupby("Mouse ID").max()["Timepoint"]
          # Calculate final tumor volume of each mouse:
          Infubinol final vol = pd.DataFrame(Infubinol lastTP)
          Infubinol merge = pd.merge(Infubinol final vol, combined df, on=("Mouse ID", "Timepoint"), how="left")
          Infubinol tumors = Infubinol merge["Tumor Volume (mm3)"]
          # Ouartiles & Interguartile Range:
          quartiles = Infubinol_tumors.quantile([0.25,0.5,0.75])
          lowerqr = round(quartiles[0.25],2)
          median = round(quartiles[0.5], 2)
          upperqr = round(quartiles[0.75], 2)
          intergr = round(uppergr - lowergr, 2)
          # Outliers:
          lower bound = round(lowerqr - (1.5 * interqr), 2)
          upper bound = round(uppergr + (1.5 * intergr), 2)
          # Output:
          print(f"The lower quartile of Infubinol tumors is: {lowergr}")
          print(f"The upper quartile of Infubinol tumors is: {uppergr}")
          print(f"The interquartile range of Infubinol tumors is: {interqr}")
          print(f"The median of Infubinol tumors is: {median}")
          print(f"Values below {lower bound} could be outliers.")
          print(f"Values above {upper bound} could be outliers.")
          The lower quartile of Infubinol tumors is: 54.05
          The upper quartile of Infubinol tumors is: 65.53
          The interquartile range of Infubinol tumors is: 11.48
          The median of Infubinol tumors is: 60.17
          Values below 36.83 could be outliers.
```

Ceftamin

Values above 82.75 could be outliers.

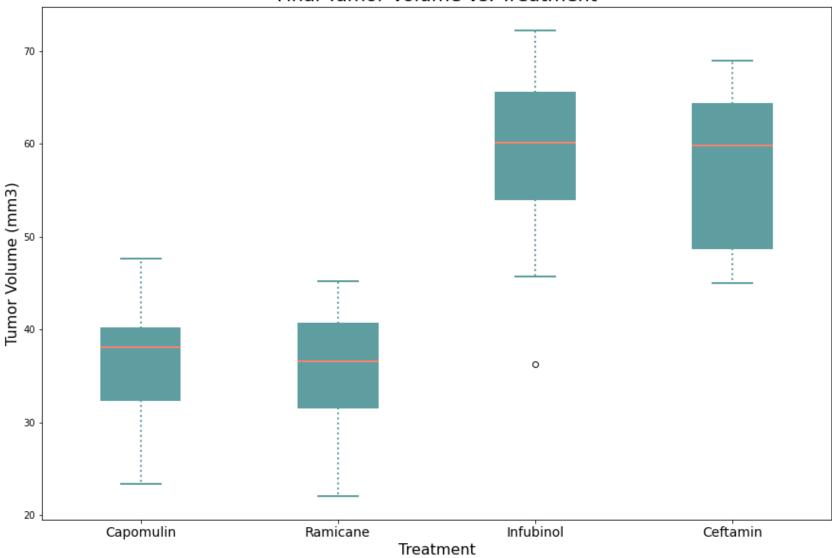
```
In [448]: # Get Last (greatest) timepoint for each mouse:
          Ceftamin lastTP = Ceftamin df.groupby("Mouse ID").max()["Timepoint"]
          # Calculate final tumor volume of each mouse:
          Ceftamin final vol = pd.DataFrame(Ceftamin lastTP)
          Ceftamin merge = pd.merge(Ceftamin final vol, combined df, on=("Mouse ID", "Timepoint"), how="left")
          Ceftamin tumors = Ceftamin merge["Tumor Volume (mm3)"]
          # Ouartiles & Interguartile Range:
          quartiles = Ceftamin tumors.quantile([0.25,0.5,0.75])
          lowergr = round(quartiles[0.25], 2)
          median = round(quartiles[0.25], 2)
          upperqr = round(quartiles[0.75], 2)
          interar = round((upperar - lowerar), 2)
          # Outliers:
          lower bound = round(lowerqr - (1.5 * interqr), 2)
          upper bound = round(uppergr + (1.5 * intergr), 2)
          #Output:
          print(f"The lower quartile of treatment is: {lowerqr}")
          print(f"The upper quartile of temperatures is: {upperqr}")
          print(f"The interquartile range of temperatures is: {interqr}")
          print(f"The the median of temperatures is: {median}")
          print(f"Values below {lower bound} could be outliers.")
          print(f"Values above {upper bound} could be outliers.")
          The lower quartile of treatment is: 48.72
```

```
The lower quartile of treatment is: 48.72
The upper quartile of temperatures is: 64.3
The interquartile range of temperatures is: 15.58
The the median of temperatures is: 48.72
Values below 25.35 could be outliers.
Values above 87.67 could be outliers.
```

Boxplot

```
In [450]: | # Put treatments into a list for for loop (and later for plot labels)
          treatment = ["Capomulin", "Ramicane", "Infubinol", "Ceftamin"]
          # Create empty list to fill with tumor vol data (for plotting)
          vol data = [Capomulin tumors, Ramicane tumors, Infubinol tumors, Ceftamin tumors]
          # Generate a box plot of the final tumor volume of each mouse across four regimens of interest
          fig1, ax1 = plt.subplots(figsize=(15, 10))
          ax1.set title("Final Tumor Volume vs. Treatment", fontsize = 20)
          ax1.set ylabel("Tumor Volume (mm3)", fontsize = 16)
          ax1.set xlabel("Treatment", fontsize = 16)
          bp=ax1.boxplot(vol data, labels = treatment, widths = 0.4, patch artist=True, vert=True)
          for box in bp["boxes"]:
              box.set(color="cadetblue", linewidth=2)
              box.set(facecolor = "cadetblue")
          for median in bp["medians"]:
              median.set(color ="salmon", linewidth = 2)
          for whisker in bp["whiskers"]:
              whisker.set(color ="cadetblue", linewidth = 2, linestyle =":")
          for cap in bp["caps"]:
              cap.set(color ="cadetblue", linewidth = 2)
          plt.xticks([1, 2, 3, 4], ["Capomulin", "Ramicane", "Infubinol", "Ceftamin"], fontsize = 14)
          plt.show()
          plt.savefig("Box plot--Final Tumor Volume vs. Treatment.png")
```





<Figure size 432x288 with 0 Axes>

Line and Scatter Plots

In [451]: # Generate a line plot of time point/x-axis and versus tumor volume/y-axis for a mouse treated with Capomulin #Randomly select mouse -- manually selecting a mouse would show bias towards mice exhibiting the greatest dec rease in tumor volume. #I have avoided such bias by randomly selecting a sample from the mice treated with Capomulin based on the Mo use ID. sample_selection = Capomulin_df.sample(n=1) random_mouse = sample_selection["Mouse ID"].values[0] print(f"Random sample selection: {random_mouse}") #Make Dataframe of "random mouse" data

Random sample selection: b742

sample mouse

Out[451]:

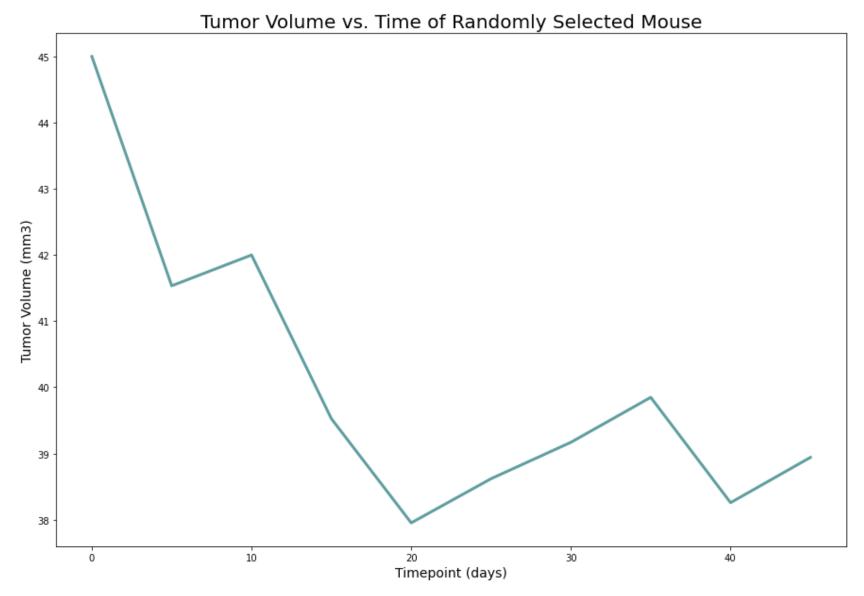
	Mouse ID	Drug Regimen	Sex	Age_months	Weight (g)	Timepoint	Tumor Volume (mm3)	Metastatic Sites
290	b742	Capomulin	Male	7	21	0	45.000000	0
291	b742	Capomulin	Male	7	21	5	41.534097	0
292	b742	Capomulin	Male	7	21	10	41.999228	0
293	b742	Capomulin	Male	7	21	15	39.524843	0
294	b742	Capomulin	Male	7	21	20	37.950355	0
295	b742	Capomulin	Male	7	21	25	38.617684	0
296	b742	Capomulin	Male	7	21	30	39.167949	0
297	b742	Capomulin	Male	7	21	35	39.847576	0
298	b742	Capomulin	Male	7	21	40	38.255627	0
299	b742	Capomulin	Male	7	21	45	38.939633	0

sample mouse = pd.DataFrame(Capomulin df.loc[Capomulin df["Mouse ID"] == random mouse,:])

```
In [452]: #line_plot
    x_axis = sample_mouse["Timepoint"]
    y_axis = sample_mouse["Tumor Volume (mm3)"]

fig1, ax1 = plt.subplots(figsize = (15, 10))
    plt.plot(x_axis, y_axis, linewidth = 3, color = "cadetblue")
    plt.title("Tumor Volume vs. Time of Randomly Selected Mouse", fontsize = 20)
    plt.xlabel("Timepoint (days)", fontsize = 14)
    plt.ylabel("Tumor Volume (mm3)", fontsize = 14)
    plt.show()

plt.savefig("Line_plot--Tumor Volumn vs. Time of Random Mouse.png")
```

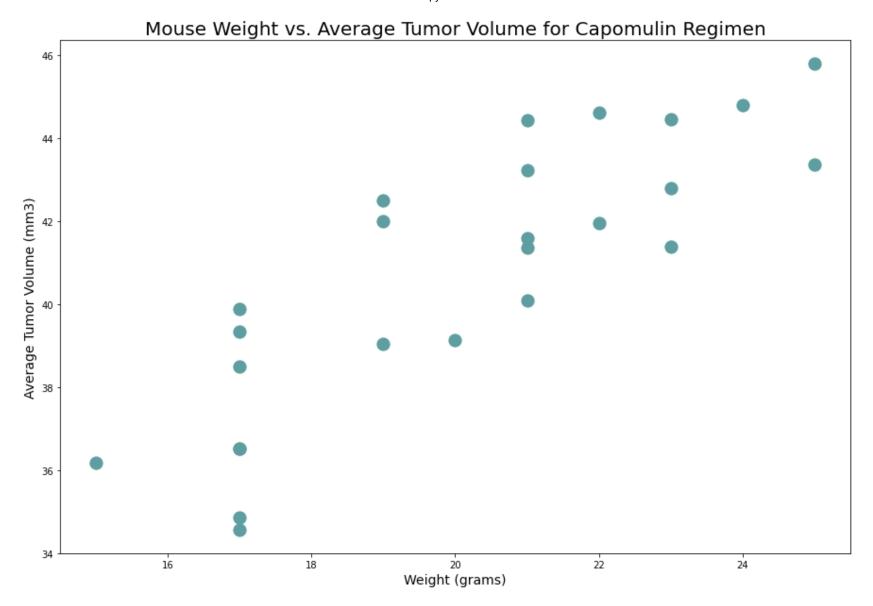


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```
In [453]: # Generate a scatter plot of mouse weight versus average tumor volume for the Capomulin regimen

fig1, ax1 = plt.subplots(figsize = (15, 10))
    scatter_plt = Capomulin_df.groupby(["Mouse ID"]).mean()
    plt.scatter(scatter_plt["Weight (g)"], scatter_plt["Tumor Volume (mm3)"], s = 175, color = "cadetblue")
    plt.title("Mouse Weight vs. Average Tumor Volume for Capomulin Regimen", fontsize = 20)
    plt.xlabel("Weight (grams)", fontsize = 14)
    plt.ylabel("Average Tumor Volume (mm3)", fontsize = 14)
    plt.show()

plt.savefig("Scatter_plot--Mouse Weight vs. Average Tumor Volume for Capomulin.png")
```

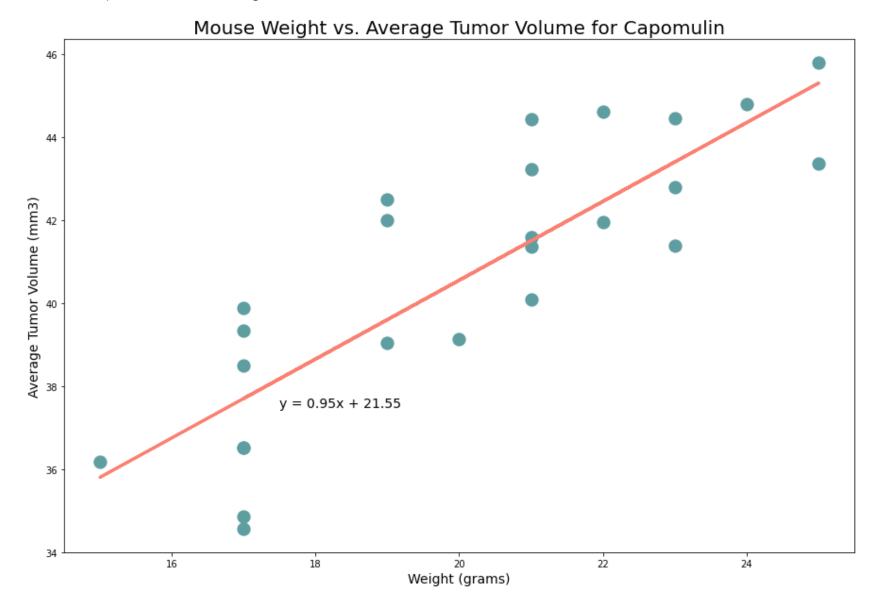


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Correlation and Regression

In [454]: # Calculate the correlation coefficient and linear regression model for mouse weight and average tumor volume for the Capomulin regimen #correlation coefficient corr co = round(st.pearsonr(scatter plt["Weight (g)"], scatter plt["Tumor Volume (mm3)"])[0],2) print(f"The correlation between the mouse weight and the average tumor volume is {corr co}") slope, intercept, r value, p value, std err = st.linregress(scatter plt['Weight (g)'], scatter plt['Tumor Vol ume (mm3)'1) plt slope = round(slope, 2) plt intercept = round(intercept, 2) print(f"The slope of the linear regression model is: {plt slope}") print(f"The intercept of the linear regression model is: {plt intercept}") fig1, ax1 = plt.subplots(figsize = (15, 10)) y values = scatter plt["Weight (g)"] * plt slope + plt intercept plt.scatter(scatter plt["Weight (g)"], scatter plt["Tumor Volume (mm3)"], s = 175, color = "cadetblue") plt.plot(scatter plt['Weight (g)'], y values, linewidth = 3, color = "salmon") plt.title("Mouse Weight vs. Average Tumor Volume for Capomulin", fontsize = 20) plt.xlabel("Weight (grams)", fontsize = 14) plt.ylabel("Average Tumor Volume (mm3)", fontsize = 14) equation = "y = " + str(plt_slope) + "x" " + " + str(plt_intercept) plt.text(17.5, 37.5, equation, fontsize = 14)plt.show() plt.savefig("Linear Regression Model.png")

The correlation between the mouse wieght and the average tumor volume is 0.84 The slope of the linear regression model is: 0.95 The intercept of the linear regression model is: 21.55



<Figure size 432x288 with 0 Axes>

Sources

- <a href="https://appdividend.com/2020/03/07/python-pandas-find-duplicate-rows-in-dataframe-based-on-all-or-selected-columns/#:~:text=duplicated()%20is%20an%20inbuilt,columns%2C%20then%20use%20the%20pandas (<a href="https://appdividend.com/2020/03/07/python-pandas-find-duplicate-rows-in-dataframe-based-on-all-or-selected-columns/#:~:text=duplicated()%20is%20an%20inbuilt,columns%2C%20then%20use%20the%20pandas).
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