In [1]:	Observations and Insights #1.Percentages of male and female mice used for the study are almost same. #2.Tumor volume decreases significantly with time for mice treated with capomulin
In [2]:	#3. There is a positive correlation between mouse weight and average tumor volume. #4. Final Tumor Volumes for Capomulin and Ramicane regimens are lower than Infubinol and Ceftamin regimens. # Dependencies and Setup import matplotlib.pyplot as plt
	<pre>import pandas as pd import scipy.stats as sts import numpy as np # Study data files</pre>
	<pre>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)</pre>
Out[2]:	# Combine the data into a single dataset combined_df=pd.merge(mouse_metadata,study_results,on="Mouse ID",how="outer") # Display the data table for preview combined_df.head() 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 [3]: Out[3]:	<pre># Checking the number of mice. combined_df["Mouse ID"].nunique()</pre>
In [4]:	<pre># Getting the duplicate mice by ID number that shows up for Mouse ID and Timepoint. duplicate_df=combined_df[combined_df.duplicated(subset=["Mouse ID","Timepoint"], keep=False)] duplicated_mouse_ID=duplicate_df["Mouse ID"].unique() duplicated_mouse_ID</pre>
Out[4]: In [5]:	<pre>array(['g989'], dtype=object) # Optional: Get all the data for the duplicate mouse ID.</pre>
Out[5]:	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
To [c].	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
In [6]: Out[6]:	# Create a clean DataFrame by dropping the duplicate mouse by its ID. combined_df=combined_df.drop_duplicates(subset=["Mouse ID", "Timepoint"], keep="last").reset_index(drop=True) combined_df.head() 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 [7]: Out[7]:	<pre># Checking the number of mice in the clean DataFrame. combined_df["Mouse ID"].nunique()</pre>
In [8]:	Summary Statistics # Generate a summary statistics table of mean, median, variance, standard deviation, and SEM of the tumor volume for each regimen
	<pre># Use groupby and summary statistical methods to calculate the following properties of each drug regimen: regimen_group=combined_df.groupby("Drug Regimen") # mean, median, variance, standard deviation, and SEM of the tumor volume. mean_tumor_volume=regimen_group["Tumor Volume (mm3)"].mean() mean_tumor_volume.rename("Mean",inplace=True) median_tumor_volume=regimen_group["Tumor Volume (mm3)"].median()</pre>
	median_tumor_volume.rename("Median",inplace=True) variance_tumor_volume.rename("Variance",inplace=True) variance_tumor_volume.rename("Variance",inplace=True) sdv_tumor_volume=regimen_group["Tumor Volume (mm3)"].std() sdv_tumor_volume.rename("Standard Deviation",inplace=True)
	<pre>sem_tumor_volume=regimen_group["Tumor Volume (mm3)"].sem() sem_tumor_volume.rename("SEM",inplace=True) # Assemble the resulting series into a single summary dataframe. tumor_df=pd.concat([mean_tumor_volume,median_tumor_volume,variance_tumor_volume,sdv_tumor_volume],axis=1) tumor_df bood()</pre>
Out[8]:	tumor_df.head() Mean Median Variance Standard Deviation SEM Drug Regimen Capomulin 40.675741 41.557809 24.947764 4.994774 0.329346
	Ceftamin 52.591172 51.776157 39.290177 6.268188 0.469821 Infubinol 52.884795 51.820584 43.128684 6.567243 0.492236 Ketapril 55.235638 53.698743 68.553577 8.279709 0.603860 Naftisol 54.331565 52.509285 66.173479 8.134708 0.596466
In [9]:	# Generate a summary statistics table of mean, median, variance, standard deviation, and SEM of the tumor volume for each regimen # Using the aggregation method, produce the same summary statistics in a single line combined_df.groupby("Drug Regimen").agg({"Tumor Volume (mm3)":["mean","war","std","sem"]})
Out[9]:	Tumor Volume (mm3) mean median var std sem Drug Regimen Capomulin 40.675741 41.557809 24.947764 4.994774 0.329346
	Ceftamin 52.591172 51.776157 39.290177 6.268188 0.469821 Infubinol 52.884795 51.820584 43.128684 6.567243 0.492236 Ketapril 55.235638 53.698743 68.553577 8.279709 0.603860 Naftisol 54.331565 52.509285 66.173479 8.134708 0.596466
	Placebo 54.033581 52.288934 61.168083 7.821003 0.581331 Propriva 52.382993 50.783528 43.220205 6.574208 0.526358 Ramicane 40.216745 40.673236 23.486704 4.846308 0.320955 Stelasyn 54.233149 52.431737 59.450562 7.710419 0.573111
	zoniferol 53.236507 51.818479 48.533355 6.966589 0.516398 Bar and Pie Charts
In [10]: Out[10]:	# Generate a bar plot showing the total number of timepoints for all mice tested for each drug regimen using Pandas. bar_data=regimen_group["Timepoint"].count() bar_data Drug Regimen Capomulin 230
	Capomulin 230 Ceftamin 178 Infubinol 178 Ketapril 188 Naftisol 186 Placebo 181 Propriva 156 Ramicane 228
In [11]:	Stelasyn 181 Zoniferol 182 Name: Timepoint, dtype: int64 bar_plot1=bar_data.plot(kind="bar",figsize=(10,5),width=.5) bar_plot1.set_ylabel("No of timepoints tested")
	bar_plot1.set_title("number of timepoints for all mice tested") plt.xticks(rotation=30, ha="right") plt.tight_layout() plt.show() number of timepoints for all mice tested
	200 - Page 150 -
	No of time points test 150 - 50 -
	Caponulin Certamin Infubinol Ketapril Naftisol Placebo Propriva Ramicane Stelasyn Zoniferol Drug Regimen
In [12]:	# Generate a bar plot showing the total number of timepoints for all mice tested for each drug regimen using pyplot. x_data=np.arange(len(bar_data)) tick_labels=bar_data.keys() plt.figure(figsize=(10,5)) plt.bar(x_data,bar_data,width=.5)
	<pre>plt.xticks(ticks=x_data, labels=tick_labels, rotation=30, ha="right") plt.xlabel("Drug regimen") plt.ylabel("No of timepoints tested") plt.title("number of timepoints for all mice tested")</pre>
	plt.tight_layout() plt.show() number of timepoints for all mice tested
	200 - 1 150 - 100
	50
In [40]:	Capomulin Ceffamin Infubinol Retapril Naftisol Placebo Propriva Ramicane Stelasyn Zoniferol Drug regimen # Generate a pie plot showing the distribution of female versus male mice using Pandas
	<pre>gender_df=combined_df[["Mouse ID","Sex"]] gender_df=gender_df.drop_duplicates() gender_count=gender_df["Sex"].value_counts() print(gender_count)</pre>
	<pre>pie_plot=gender_count.plot(kind="pie", startangle=40, figsize=(4,4)) pie_plot.set_ylabel("Percentage of male and Female mice") pie_plot.set_title("distribution of female versus male mice") plt.tight_layout() plt.axis("equal") plt.show()</pre>
	Male 125 Female 124 Name: Sex, dtype: int64 distribution of female versus male mice
	Percentage of male and Female mice and Female
	Percentage of management of the control of the cont
In [39]:	# Generate a pie plot showing the distribution of female versus male mice using pyplot label=gender_count.keys() plt.figure(figsize=(4,4)) plt.pie(gender_count, labels=label, startangle=40)
	<pre>plt.ylabel("Percentage of male and Female mice") plt.title("distribution of female versus male mice") plt.axis("equal") plt.tight_layout() plt.show()</pre> distribution of female versus male mice
	Male
	Percentage of male and Female mice
	Quartiles, Outliers and Boxplots
In [15]:	<pre># Calculate the final tumor volume of each mouse across four of the treatment regimens: # Capomulin, Ramicane, Infubinol, and Ceftamin # Start by getting the last (greatest) timepoint for each mouse tumor_vol_df=combined_df[["Mouse ID","Timepoint","Tumor Volume (mm3)"]] tumor_vol_df.sort_values(by=["Mouse ID","Timepoint"]).reset_index(drop=True) final_tumor_vol_df=tumor_vol_df.drop_duplicates(subset=["Mouse ID"],keep="last")</pre>
	<pre># Merge this group df with the original dataframe to get the tumor volume at the last timepoint merged_df=pd.merge(combined_df,final_tumor_vol_df,on=["Mouse ID","Timepoint"]) merged_df.drop("Tumor Volume (mm3)_y",axis=1,inplace=True) merged_df.rename(columns={"Tumor Volume (mm3)_x":"final tumor volume"},inplace=True)</pre>
	<pre>treatments=["Capomulin", "Ramicane", "Infubinol", "Ceftamin"] tumor_data=merged_df[merged_df["Drug Regimen"].isin(treatments)] tumor_data=tumor_data.sort_values(by="Drug Regimen") tumor_data</pre>
Out[15]:	Mouse ID Drug Regimen Sex Age_months Weight (g) Timepoint final tumor volume Metastatic Sites 32 j246 Capomulin Female 21 21 35 38.753265 1 36 v923 Capomulin Female 19 21 45 40.658124 2 35 w150 Capomulin Male 23 23 10 39.952347 0
	34 j119 Capomulin Female 7 23 45 38.125164 1 39 I509 Capomulin Male 17 21 45 41.483008 3 46 r921 Ramicane Female 5 25 30 43.419381 1 47 w678 Ramicane Female 5 24 5 43.166373 0
	48 y449 Ramicane Male 19 24 15 44.183451 0 23 r811 Ramicane Male 9 19 45 37.225650 1 0 k403 Ramicane Male 21 16 45 22.050126 1 100 rows × 8 columns
In [37]:	<pre># Put treatments into a list for for loop (and later for plot labels) # Create empty list to fill with tumor vol data (for plotting) # Calculate the IQR and quantitatively determine if there are any potential outliers # Locate the rows which contain mice on each drug and get the tumor volumes # add subset</pre>
	<pre># Determine outliers using upper and lower bounds for treatment in treatments: filt=tumor_data["Drug Regimen"]==treatment final_tumor_vol_data=tumor_data.loc[filt,"final tumor volume"]</pre>
	<pre>quartiles=final_tumor_vol_data.quantile([.25,.5,.75]) upperq=quartiles[.75] lowerq=quartiles[.25] iqr=upperq-lowerq upper_bound=upperq+(1.5*iqr) lower_bound=lowerq-(1.5*iqr)</pre>
	<pre>outlier=[data for data in final_tumor_vol_data if (data>upper_bound)or(data<lower_bound)] 0<="" are="" drug="" for="" number="" of="" ourliers="" pre="" print(f"for="" regimen:capomulin,="" regimen:{treatment},="" upper_bound="51.83201549,lower_bound=20.70456164999999,iqr=7.781863460000004" {len(outlier)}")=""></lower_bound)]></pre>
	for drug regimen:Ramicane, upper_bound=54.30681135,lower_bound=17.912664470000003,iqr=9.098536719999998 for drug regimen:Ramicane, number of ourliers are 0 for drug regimen:Infubinol, upper_bound=82.74144559000001,lower_bound=36.83290494999999,iqr=11.477135160000003 for drug regimen:Infubinol, number of ourliers are 1 for drug regimen:Ceftamin, upper_bound=87.66645829999999,lower_bound=25.355449580000002,iqr=15.577752179999997 for drug regimen:Ceftamin, number of ourliers are 0
In []:	<pre># Generate a box plot of the final tumor volume of each mouse across four regimens of interest treatment_data=tumor_data[["Drug Regimen", "final tumor volume"]] plt.figure(figsize=(10,10)) treatment_data.boxplot(column="final tumor volume", by="Drug Regimen") plt.title("Boxplot for final tumor volume for each drug regiment")</pre>
	plt.title("Boxplot for final tumor volume for each drug regiment") plt.ylabel("Final Tumor Volume") plt.tight_layout() plt.show() Line and Scatter Plots
In [38]:	<pre># Generate a line plot of tumor volume vs. time point for a mouse treated with Capomulin filt=merged_df["Drug Regimen"]=="Capomulin" Capomulin_mouseID=merged_df.loc[filt,"Mouse ID"] print(list(Capomulin_mouseID))</pre>
	<pre>mouse_id="x401" filt=combined_df["Mouse ID"]==mouse_id mouse_data=combined_df.loc[filt,:] x_data=[x for x in mouse_data["Timepoint"]]</pre>
	<pre>plt.plot(x_data, mouse_data["Tumor Volume (mm3)"], marker="o") plt.xlim(4,46) plt.xlabel("Timepoint") plt.ylabel("Tumor Volume") plt.title(f"Data for mouseID:{mouse_id} treated with Capomulin") plt.grid(True) plt.tight_layout()</pre>
	plt.tlgiit_layout() plt.show() ['s185', 'x401', 'm601', 'f966', 'u364', 'y793', 'r554', 'm957', 't565', 'i738', 'w914', 'g288', 'l897', 'b742', 'b128', 'j246', 'j119', 'w150', 'v923', 'g316', 's71 0', 'l509', 'r944', 'i557', 'r157'] Data for mouseID:x401 treated with Capomulin 45.0
	42.5 40.0 40.0 50 50 50 50 50 50 50 50 50 5
	35.0 30.0 27.5 0 10 20 30 40 Timepoint
In [19]:	# Generate a scatter plot of average tumor volume vs. mouse weight for the Capomulin regimen Capomulin_df=regimen_group.get_group("Capomulin") plot_data=Capomulin_df.groupby("Mouse ID").agg({"Weight (g)":"first","Tumor Volume (mm3)":"mean"})
	<pre>vol_vs_weight_plot=plot_data.plot(kind="scatter", x="Weight (g)", y="Tumor Volume (mm3)", figsize=(6,5), grid="True") vol_vs_weight_plot.set_title("average tumor volume vs. mouse weight for the Capomulin regimen") plt.tight_layout() plt.show()</pre> average tumor volume vs. mouse weight for the Capomulin regimen 46
	44
	(Emm) 40 38
	36 - 34 - 34 - 36 - 36 - 36 - 36 - 36 -
In [20]:	# Calculate the correlation coefficient and linear regression model # for mouse weight and average tumor volume for the Capomulin regimen corr_coeff=sts.pearsonr(plot_data["Weight (g)"],plot_data["Tumor Volume (mm3)"])
	<pre>corr_coeff=sts.pearsonr(plot_data["Weight (g)"],plot_data["Tumor Volume (mm3)"]) print(f"correlation coefficient for mouse weight and average tumor volume for the Capomulin regimen is {round(corr_coeff[0],2)}") #regression line plot x_value=plot_data["Weight (g)"] y_value=plot_data["Tumor Volume (mm3)"] (slope,intercept,rvalue,pvalue,stderr)=sts.linregress(x_value,y_value) regress_values = slope * x_value + intercept</pre>
	<pre>line_eq="y="+str(round(slope,2))+"x+"+str(round(intercept,2)) plt.figure(figsize=(7,5)) plt.scatter(x_value,y_value) plt.plot(x_value,regress_values,"r") plt.annotate(line_eq,(20,36),fontsize=20,color="red")</pre>
	<pre>plt.title("average tumor volume vs. mouse weight for the Capomulin regimen") plt.xlabel("mouse weight") plt.ylabel("average tumor volume") plt.grid(True) plt.tight_layout() plt.show()</pre>
	correlation coefficient for mouse weight and average tumor volume for the Capomulin regimen is 0.84 average tumor volume vs. mouse weight for the Capomulin regimen 46 47 48
	44 40 40 40 40 40 40 40 40 40 40 40 40 4
	y=0.95x+21.55
In []:	34 16 18 20 22 24 mouse weight