Sleep Habits and Daily Productivity

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Probability & Statistics

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▶ Probability and Statistics:

For our project, we were asked with conducting a survey that delves into the connection between sleep habits and daily productivity, analyzing the responses of 100 participants. The aim is to explore how people's sleep patterns relate to their overall daily performance and efficiency.

> Form Link:

https://forms.gle/9KGkAewQWDMg7qrC6

> **Survey Snippets:**

The initial and pivotal phase involved the creation of survey forms. During this process, meticulous attention was given to crafting questions that were concise, engaging, and directly pertinent to our chosen topic. The survey forms were distributed, and fortunately, we received an exceptionally positive response. In total, we managed to gather 100 valuable responses.

Here are some preview of the questions and responses.

How many hours of sleep do you typically get per night? *
C Less than 5 hours
5-6 hours
O 6-7 hours
7-8 hours
8 hours or more
How many hours before bedtime do you typically use electronic devices (e.g., smartphones, computers)?
C Less than 1 hour
O 1-2 hours
2-3 hours
3-4 hours
More than 4 hours
More than 4 nours

How often do you engage in physical exercise in a week? *

O Never

1-2 times

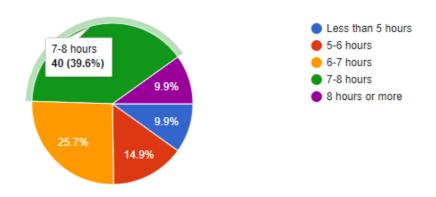
3-4 times

5-6 times

Every day

How many hours of sleep do you typically get per night?

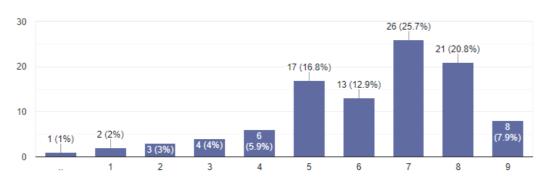
101 responses

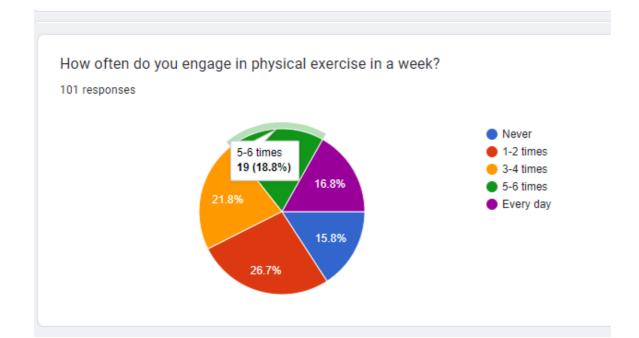


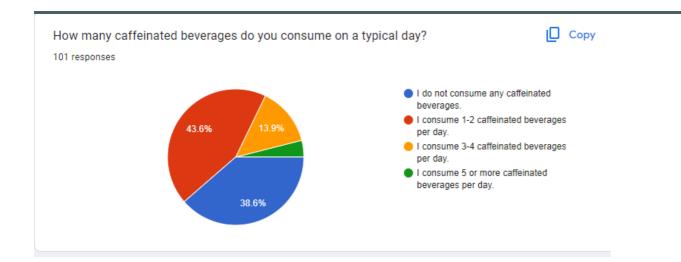
On a scale from 1 to 10, rate your daily productivity?

[Сору

101 responses







Statistical Analysis:

After gathering the whole data, the next step was to perform the statistical analysis on the data for this we have chosen the Python IDE which is the best among all in terms of data analysis because of Panda, Matplotlib libraries so we prefer to choose python IDE.

> View of csv file in python:

• Python code:

```
# Load the DataFrame
df = pd.read_csv(r'C:/Users/Hp/OneDrive/Desktop/Python project/Sleep Habits and Daily.csv')
```

• Csv view:

```
PS C:\Users\Hp\OneDrive\Desktop\Python project> python -u "c:\Users\Hp\OneDrive\Desktop\Python project\project.py"
How many hours of sleep do you typically get per night? ... How would you describe your bedtime routine?

7-8 hours ... Yes, I have a consistent bedtime routine.

Yes, I have a consistent bedtime routine.

Yes, I have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

Sometimes, I have a bedtime routine.

No, I do not have a consistent bedtime routine.

Sometimes, I have a bedtime routine.

Sometimes, I have a bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.

No, I do not have a consistent bedtime routine.
```

Shortening the column Names:

As for my Convenience we have shortened the name of every Column.

• Python code:

```
new_c_names = {\bigsquare\text{\text{\text{\text{Now many hours of sleep do you typically get per night}\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\text{\tex
```

• Result:

```
Sleep Hours Productivity Rating? Device Use Hrs Before Bed ... Last Meal Time Before Bed Sleep Quality
7-8 hours 8 1-2 hours ... 7-8 PM Excellent
                                                                                                                                              Yes, I have a consisten
                                                                                                                                              Yes, I have a consister
Yes, I have a consister
                                                                                                            9-10 PM
                                                           1-2 hours ...
More than 4 hours ...
             5-6 hours
                                                                                                             8-9 PM
                                                                                                                             Neutral
                                                                                                            9-10 PM
                                                                                                                                       No, I do not have a consister
    Less than 5 hours
                                                                                                                             Neutral
                                                                                                       After 10 PM
...
95
                                                                                                                                       No, I do not have a consiste
96
97
                                                                                                                                                    Sometimes, I have
             7-8 hours
                                                                                                            9-10 PM
                                                                                                                                Good No. I do not have a consister
                                                                     2-3 hours ...
                                                                                                                                                    Sometimes, I have
                                                                                                                                       No, I do not have a consisten
    Less than 5 hours
                                                            More than 4 hours
```

Statistical Trends:

To conduct statistical analysis, we required numerical data, but our existing dataset consisted of strings. To address this, we engaged in coding and developed scripts for various columns, such as the "sleep_quality" column. Through this coding process, a new column labeled "sleep_quality" was generated, representing the original column in numeric format. In the provided illustration, the numerical codes were assigned as follows: 1 for "very poor," 2 for "Poor," and 3 for "Neutral", 4 for "Good",5 for "Excellent".

• Python code:

```
# Define code mappings for all questions
mappings = {
     'sleep_hours': {
         'Less than 5 hours': 1,
         '5-6 hours': 2,
         '6-7 hours': 3,
         '7-8 hours': 4,
         '8 hours or more': 5
     'device_use_hrs_before_bed': {
         'Less than 1 hour': 1,
         '1-2 hours': 2,
         '2-3 hours': 3,
         '3-4 hours': 4,
         'More than 4 hours': 5
     'exercise_frequency': {
         'Never': 1,
'1-2 times': 2,
         '3-4 times': 3,
         '5-6 times': 4,
         'Every day': 5
     'stress_level': {
         'I experience no stress.': 1,
         'I experience low stress.': 2,
'I experience moderate stress.': 3,
         'I experience high stress.': 4,
         'I experience extreme stress': 5
     'caffeine_intake_per_day': {
         'I do not consume any caffeinated beverages.': 1,
'I consume 1-2 caffeinated beverages per day.': 2,
         'I consume 3-4 caffeinated beverages per day.': 3,
         'I consume 5 or more caffeinated beverages per day.': 4
```

• Output:

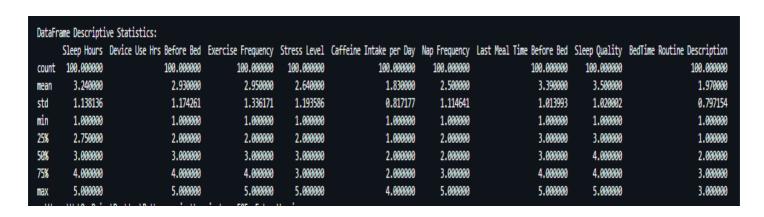
> Variable Info:

In the provided code, variable.info () is used to display information about the data Frame called variable. This method provides a concise summary of the data Frame, including information about the data types of each column, the number of non-null values, and memory usage.

#	Column	Non-Null Count	Dtype
0	Sleep Hours	100 non-null	int64
1	Productivity Rating?	100 non-null	int64
2	Device Use Hrs Before Bed	100 non-null	int64
3	Exercise Frequency	100 non-null	int64
4	Stress Level	100 non-null	int64
5	Caffeine Intake per Day	100 non-null	int64
6	Nap Frequency	100 non-null	int64
7	Last Meal Time Before Bed	100 non-null	int64
8	Sleep Quality	100 non-null	int64
9	BedTime Routine Description	100 non-null	int64
dtyp	es: int64(10)		
memo	ry usage: 7.9 KB		

❖ Descriptive Statistics:

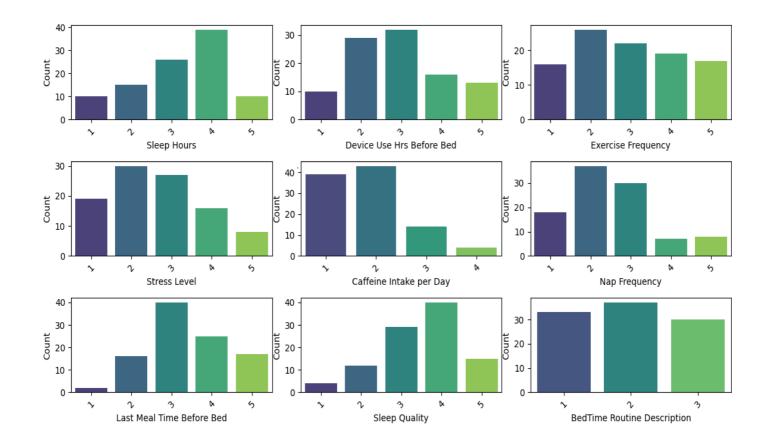
The describe () function in pandas is used to generate descriptive statistics of a datagram or Series.



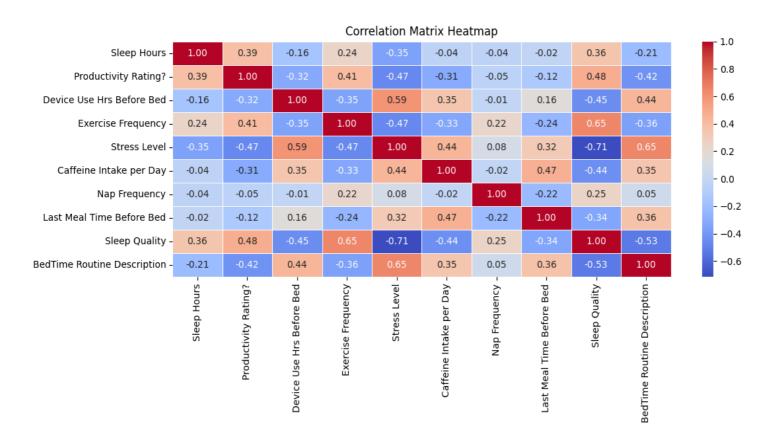
❖Statistical Graph:

Bar Charts:

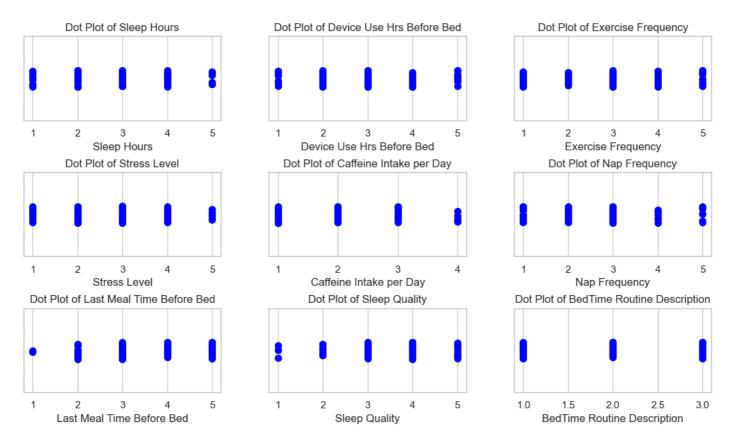
Bar charts are used to visually represent and compare categorical data, making it easy to discern patterns, trends, and variations among different groups or categories.



≻Correlation Diagram:



▶ Dot Charts:



> Frequency Distribution:

After looking at different graphs and charts, we then organized the data in a way that shows how often each value appears, giving us a clearer numerical understanding.

• Sleep hours:

```
Frequency distribution for Sleep Hours:
Sleep Hours
4 39
3 26
2 15
1 10
5 10
Name: count, dtype: int64
```

• Device Use Hrs Before Bed:

```
Frequency distribution for Device Use Hrs Before Bed:
Device Use Hrs Before Bed
3 32
2 29
4 16
5 13
1 10
Name: count, dtype: int64
```

• Exercise Frequency:

```
Frequency distribution for Exercise Frequency:
Exercise Frequency
2 26
3 22
4 19
5 17
1 16
Name: count, dtype: int64
```

• Stress Level:

```
Frequency distribution for Stress Level:
Stress Level
2  30
3  27
1  19
4  16
5  8
Name: count, dtype: int64
```

• Caffeine Intake per Day:

```
Frequency distribution for Caffeine Intake per Day:
Caffeine Intake per Day
2 43
1 39
3 14
4 4
Name: count, dtype: int64
```

• Nap Frequency:

```
Frequency distribution for Nap Frequency:
Nap Frequency
2 37
3 30
1 18
5 8
4 7
Name: count, dtype: int64
```

• Last Meal Time Before Bed:

```
Frequency distribution for Last Meal Time Before Bed:
Last Meal Time Before Bed
3    40
4    25
5    17
2    16
1    2
Name: count, dtype: int64
```

• Sleep Quality:

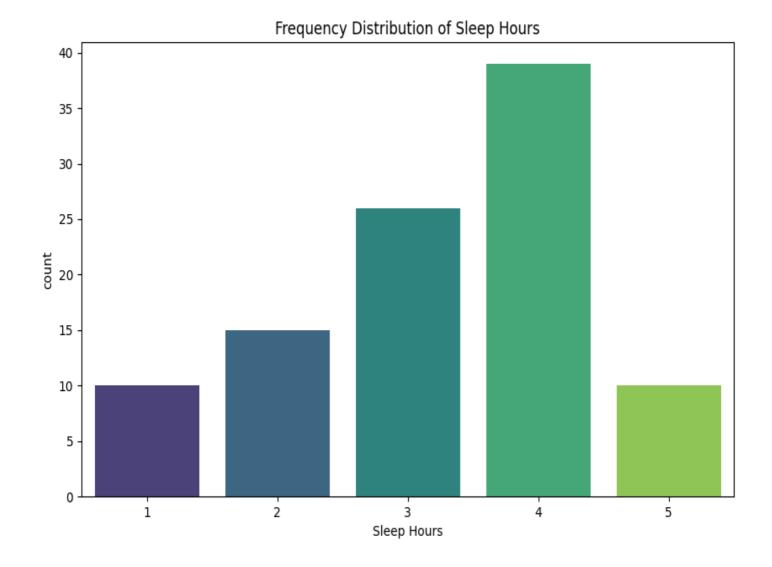
```
Frequency distribution for Sleep Quality:
Sleep Quality
4 40
3 29
5 15
2 12
1 4
Name: count, dtype: int64
```

• Bedtime Routine Description:

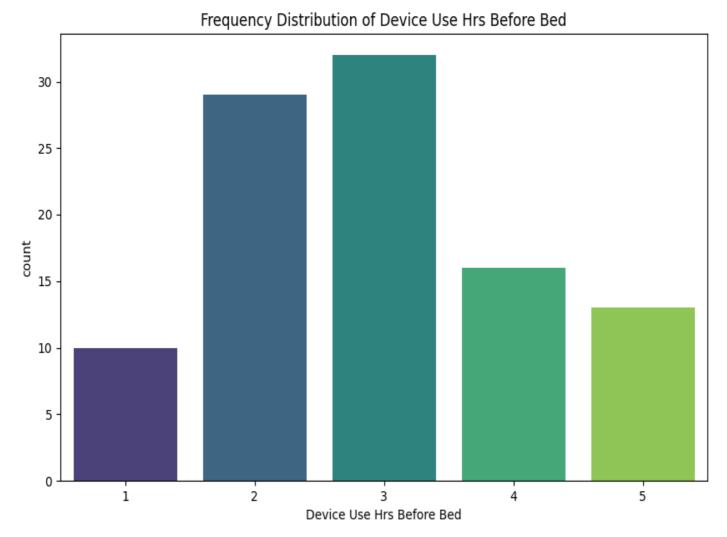
```
Frequency distribution for BedTime Routine Description:
BedTime Routine Description
37
1 33
3 30
Name: count, dtype: int64
```

Frequency Distribution Graphs:

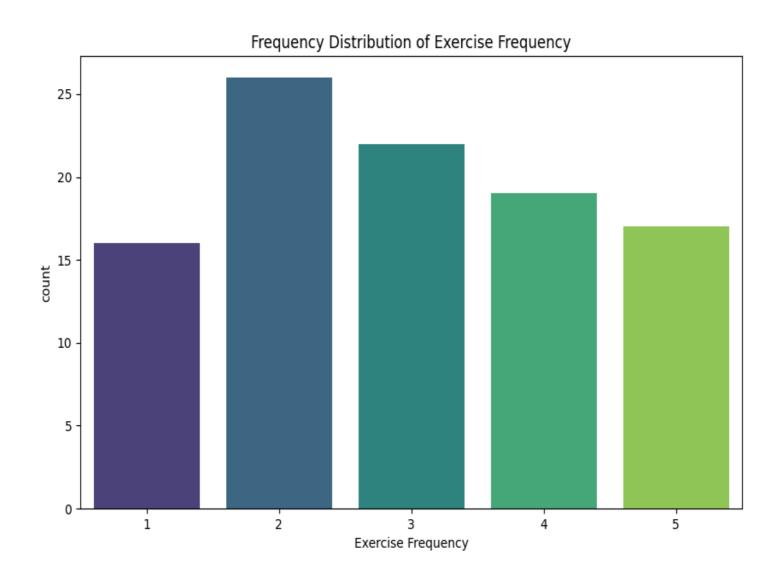
1) Sleep Hours:



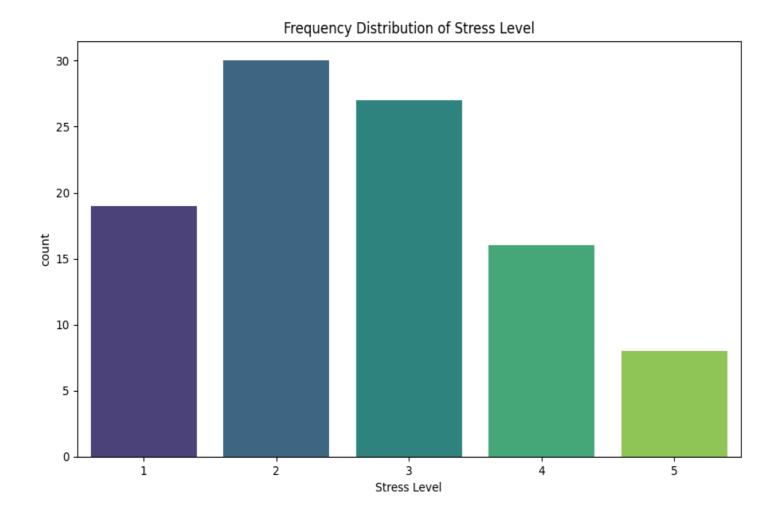
2) Device use hrs before bed:



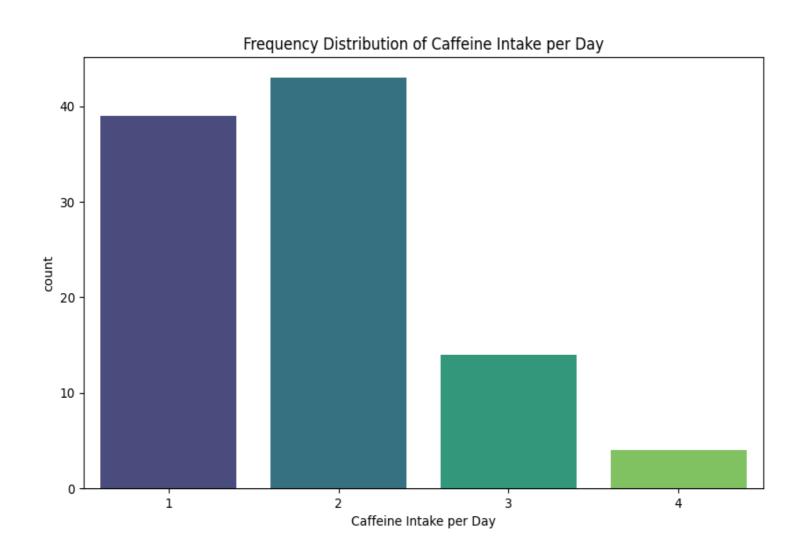
3) Exercise Frequency:



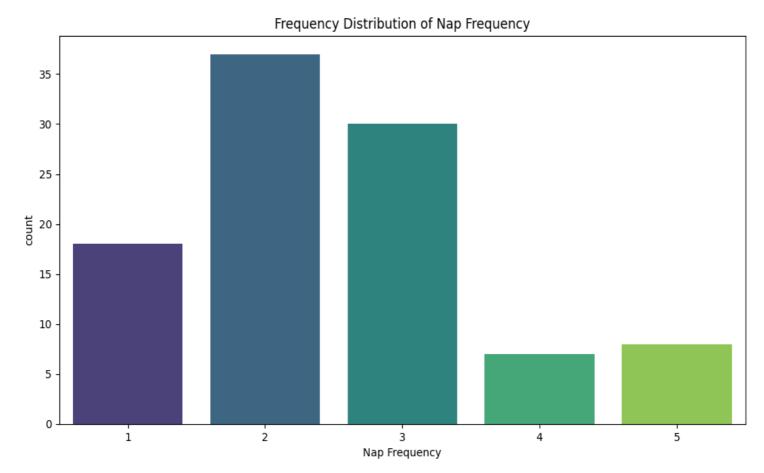
4) Stress level:



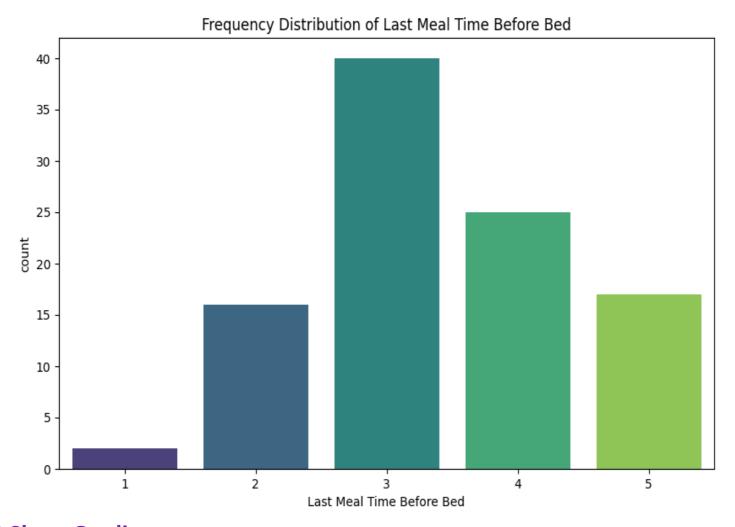
5) Caffeine intake per day:



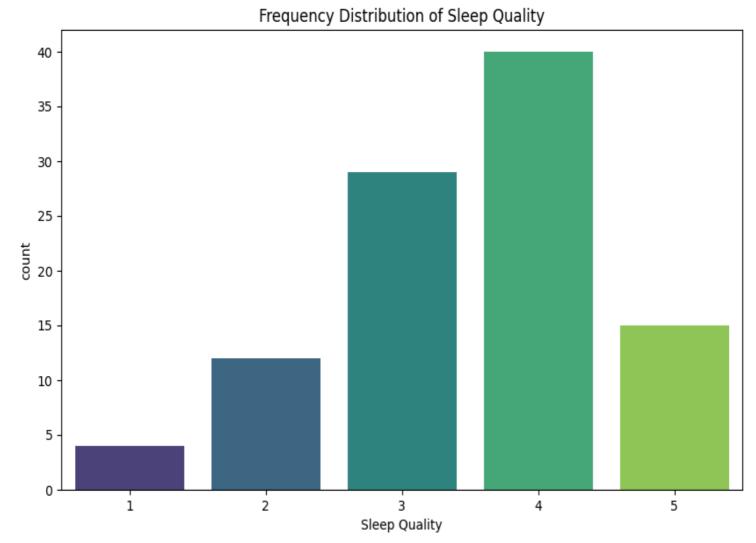
6) Nap Frequency:



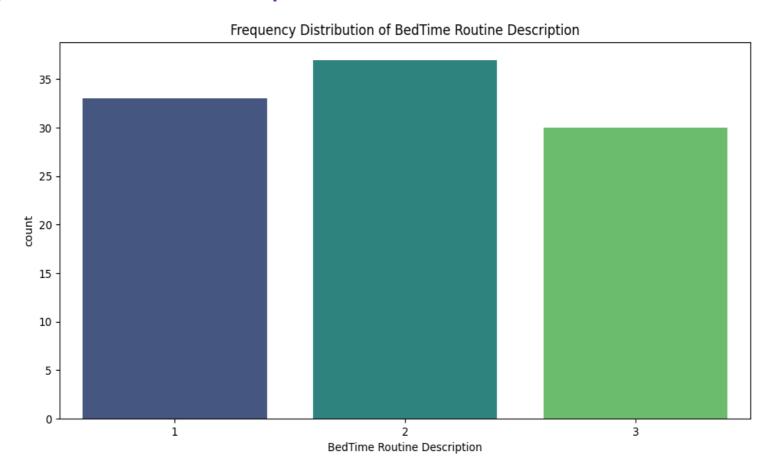
7) Last Meal Time before bed:



8) Sleep Quality:



9) Bedtime Routine description:



❖Linear regression analysis and Coclusion:

• Between Sleep hours and stress level:

The linear regression analysis indicates that there is a statistically significant negative relationship between sleep hours and stress level, suggesting that as sleep hours' decrease, stress level tends to increase.

Dep. Variable:		Stress Level	R-squar	red:		0.124
Model:				-squared:		0.115
Method:	1	Least Squares	F-stat	istic:		13.87
Date:	Mon	, 25 Dec 2023	Prob (F	F-statistic):		0.000327
Time:		00:54:50	Log-Li	kelihood:		-152.47
No. Observation	ıs:	100	AIC:			308.9
Df Residuals:		98	BIC:			314.1
Df Model:		1				
Covariance Type	::	nonrobust				
	coef	std err	t	P> t	[0.025	0.975]
				0.000		
Sleep Hours	-0.3693	0.099	-3.725	0.000	-0.566	-0.173
 mnibus:		8.456	Durbin-	 -Watson:		2.047
Prob(Omnibus):		0.015	Jarque-	-Bera (JB):		8.587
Skew:			Prob(JE			0.0137
Kurtosis:		3.114	Cond. I	No.		11.2

• Between Caffeine intake and productivity:

The below regression results suggest that there is a statistically significant negative relationship between caffeine intake per day and daily productivity ratings, indicating that higher caffeine intake is associated with lower productivity.

	OLS Regres					
Dep. Variable:	Productivity Rating?	R-squ	ared:		0.096	
Model:	OLS	_	R-squared:		0.087	
Method:	Least Squares	F-sta	tistic:		10.42	
Date:	Mon, 25 Dec 2023				0.00169	
Time:	01:04:44		ikelihood:		-199.28	
No. Observations:	100				402.6	
Df Residuals:	98				407.8	
Df Model:	1					
Covariance Type:	nonrobust					
	coef s	td err	t	P> t	[0.025	0.975]
const	7.5930	0.442	17.194	0.000	6.717	8.469
affeine Intake pe	r Day -0.7120	0.221	-3.229	0.002	-1.150	-0.274
Dmnibus:	6.650	Durbin-	Watson:		1.957	
Prob(Omnibus):	0.036	Jarque-	Bera (JB):		6.309	
kew:	-0.607	Prob(JE	3):		0.0427	
Kurtosis:	3.204	Cond. N	lo.		5.99	

• Between Device use hours before bed and sleep quality:

The regression results indicate that there is a statistically significant negative relationship between the number of hours spent using electronic devices before bedtime and the reported sleep quality. The coefficient for "Device Use Hrs. Before Bed" is -0.3919, suggesting that as the duration of device use increases, sleep quality tends to decrease.

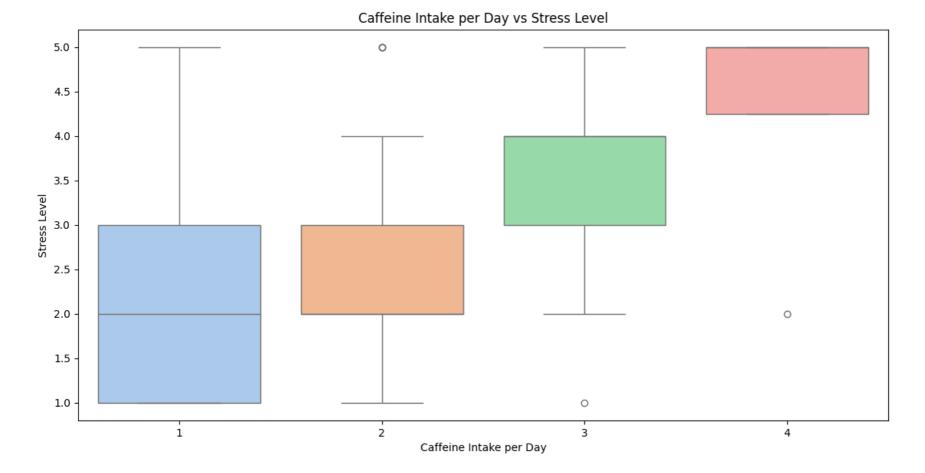
	OLS Regres	sion Result	s 				
Dep. Variable:	Sleep Quality	R-squared	:		0.204		
Model:	OLS	Adj. R-sq	uared:		0.195		
Method:	Least Squares	F-statist	ic:		25.05		
Date:	Mon, 25 Dec 2023	Prob (F-s	tatistic):	2.	46e-06		
Time:	01:10:15	Log-Likel	ihood:	-	131.99		
No. Observations:	100	AIC:			268.0		
Df Residuals:	98	BIC:			273.2		
Df Model:	1						
Covariance Type:	nonrobust						
	coef	std err	t	P> t	[0.025	0.975]	
const	4.6483	0.247	18.818	0.000	4.158	5.138	
Device Use Hrs Before	e Bed -0.3919	0.078	-5.005	0.000	-0.547	-0.237	
Omnibus:	2.281	Durbin-Wa	======= tson:		2.454		
Prob(Omnibus):	0.320	Jarque-Be	ra (JB):		2.304		
Skew:	-0.337				0.316		
Kurtosis:	2.688	Cond. No.			9.26		
				======	=====		
Notes:							
[1] Standard Errors	assume that the co	variance ma	trix of the	errors is c	orrectly spe	cified.	

• Between Nap Frequency and Sleep Quality:

The regression results suggest that there is a statistically significant positive relationship between the frequency of taking naps during the day ("Nap Frequency") and reported sleep quality. The coefficient for "Nap Frequency" is 0.2276, indicating that higher nap frequency is associated with better sleep quality.

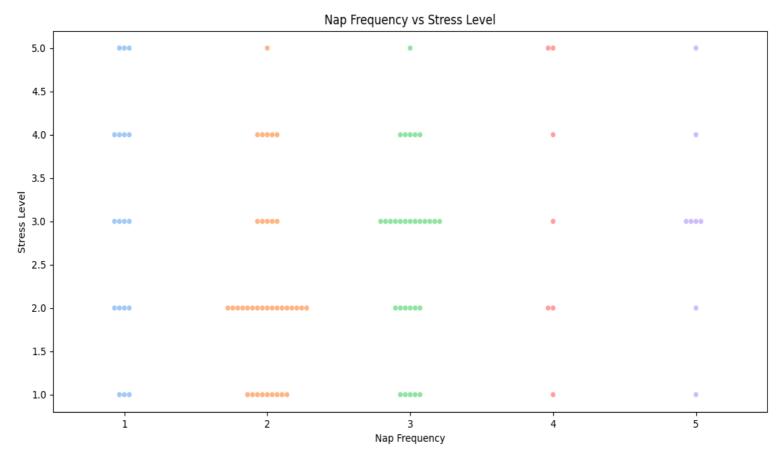
Dep. Variable:	S1	eep Quality	R-squared:			0.062
Model:		OLS	Adj. R-squa	ared:		0.052
Method:	Le	ast Squares	F-statisti	c:		6.465
Date:	Mon,	25 Dec 2023	Prob (F-sta	atistic):		0.0126
Time:		01:14:20	Log-Likeli	hood:		-140.18
No. Observations:		100	AIC:			284.4
Df Residuals:		98	BIC:			289.6
Df Model:		1				
Covariance Type:		nonrobust				
	coef	std err	t	P> t	[0.025	0.975]
const	2.9309	0.245	11.969	0.000	2.445	3.417
Nap Frequency	0.2276	0.090	2.543	0.013	0.050	0.405
Omnibus:		3.419	Durbin-Wat	====== son:		2.363
Prob(Omnibus):		0.181	Jarque-Bera	a (JB):		3.410
Skew:		-0.417	Prob(JB):			0.182
Kurtosis:		2.651	Cond. No.			7.51

❖Box plot Diagram:



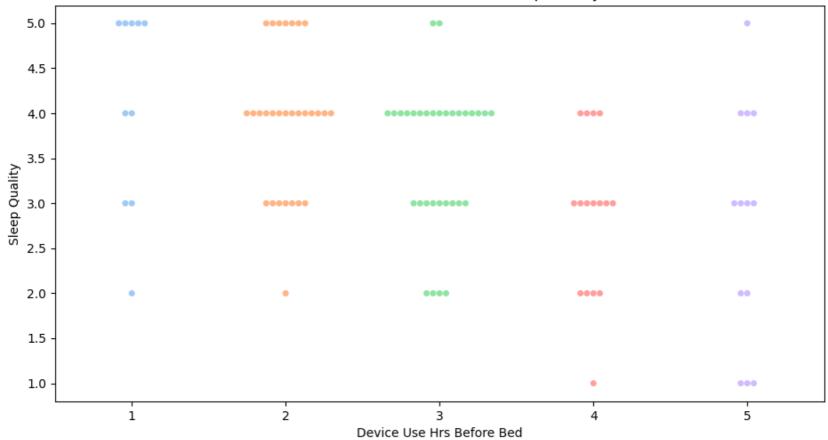
❖Swarm plot:

1) Between Nap Frequency and Stress Level:

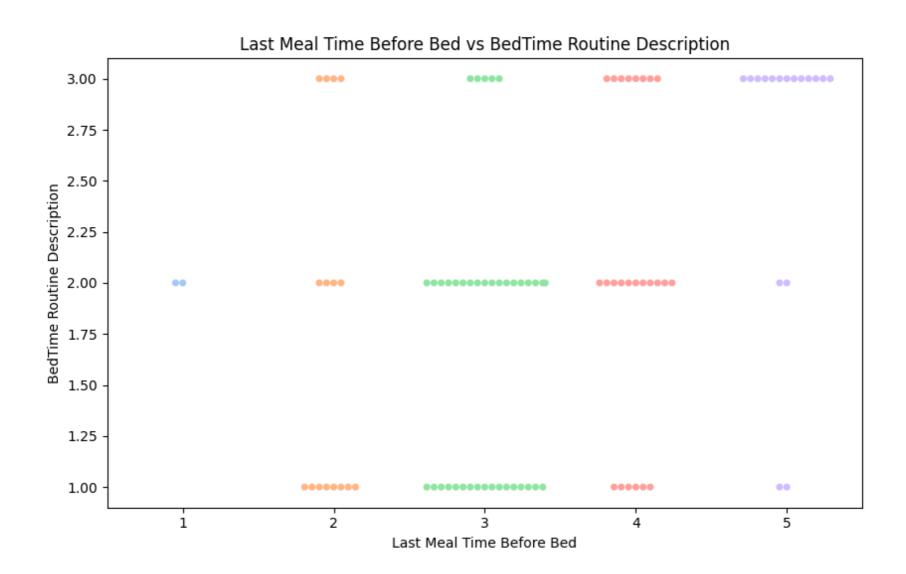


2) Between Device Use Hrs Before Bed and Sleep Quality:





3) Between Bed Routine and Meal before Bed time:



Hypothesis Testing:

❖Impact of less Hour of Sleep on the Stress Level

• Claim 1:

Having sleep of less than 4 hours increase Stress level.

• Opposite claim 1:

Having sleep of less than 4 hours increase Stress level.

• H0(Null Hypothesis):

Having a sleep duration of less than 4 hours does not significantly increase stress levels.

• H1(Alternative Hypothesis):

Having a sleep duration of less than 4 hours significantly increases stress levels.

• Python Code:

Here we have performed a t-test on the claim where we have the H0 and H1 and value of alpha (0.05) which is general if not g=given we assume.

```
# Perform a t-test for independent samples
t_statistic, p_value = stats.ttest_ind(less_than_4_hours, four_hours_or_more, equal_var=False)

# Define the significance level
alpha = 0.05

# Check the p-value against the significance level
if p_value < alpha:
    print(f'Reject the null hypothesis. There is enough evidence to suggest that having less than 4 hours of sleep increases stress levels.')
else:
    print('Fail to reject the null hypothesis. There is not enough evidence to suggest that having less than 4 hours of sleep increases stress levels.')</pre>
```

• Result:

Reject the null hypothesis. There is enough evidence to suggest that having less than 4 hours of sleep increases stress levels.

❖ Impact of napping on the quality of Sleep:

• Claim 2:

Having a nap of more than 2 hours increase the quality of sleep.

Opposite claim 2:

Having a nap of more than 2 hours donot increase the quality of sleep

• H0(Null Hypothesis):

Having a nap of more than 2 does increase the quality of sleep.

H1(Alternative Hypothesis):

Having a nap of more than 2 does not increase the quality of sleep.

• Python code:

*Result:

Fail to reject the null hypothesis. There is not enough evidence to suggest that having a nap of more than 2 increases the quality of sleep.

❖Impact of Caffeine Intake on Sleep Quality:

• H0(Null Hypothesis):

There is no difference in sleep quality between individuals who consume 1-2 caffeinated beverages per day and those who consume 5 or more.

• H1(Alternative Hypothesis):

There is a significant difference in sleep quality between individuals based on their daily caffeine intake.

• Python Code:

```
caffeine_1_2 = df[df['Caffeine Intake per Day'] == 'I consume 1-2 caffeinated beverages per day.']['Sleep Quality']
caffeine_5_more = df[df['Caffeine Intake per Day'] == 'I consume 5 or more caffeinated beverages per day.']['Sleep Quality']

# Perform t-test for independent samples
t_statistic, p_value = stats.ttest_ind(caffeine_1_2, caffeine_5_more, equal_var=False)

# Define the significance level
alpha = 0.05

# Check the p-value against the significance level
if p_value < alpha:
    print("Reject the null hypothesis. There is a significant difference in sleep quality between the two groups.")
else:
    print("Fail to reject the null hypothesis. There is no significant difference in sleep quality between the two groups.")</pre>
```

• Result:

Fail to reject the null hypothesis. There is no significant difference in sleep quality between the two groups.

• Conclusion:

It means that based on the statistical analysis, we do not have enough evidence to conclude that there is a significant difference in sleep quality between individuals who consume 1-2 caffeinated beverages per day and those who consume 5 or more.

*****Effect of Exercise on Stress Levels:

• H0(Null Hypothesis):

The mean stress level is the same for individuals who exercise regularly and those who never exercise

• H1(Alternative Hypothesis):

The mean stress level is different for individuals who exercise regularly compared to those who never exercise.

• Python Code:

```
stress_level_regular_exercise = df[df['Exercise Frequency'] == 4]['Stress Level']

# Perform a two-sample t-test
t_statistic, p_value = stats.ttest_ind(stress_level_regular_exercise, stress_level_never_exercise, equal_var=False)

# Define the significance level
alpha = 0.05

# Check the p-value against the significance level
if p_value < alpha:
    print('Reject the null hypothesis. There is a significant difference in mean stress levels between individuals who exercise regularly and those who never exercise.')
else:
    print('Fail to reject the null hypothesis. There is no significant difference in mean stress levels between individuals who exercise regularly and those who never exercise.')</pre>
```

Result:

Fail to reject the null hypothesis. There is no significant difference in mean stress levels between individuals who exercise regularly and those who never exercise

Productivity and Sleep Duration:

• H0(Null Hypothesis):

The mean productivity rating is not affected by the number of hours of sleep an individual gets per night.

• H1(Alternative Hypothesis):

The mean productivity rating is influenced by the number of hours of sleep an individual gets per night.

• Python code:

```
productivity_rating_sleep_fewer_than_4_hours = df[df['Sleep Hours'] == 1]['Productivity Rating?']

# Perform a two-sample t-test
t_statistic, p_value = stats.ttest_ind(productivity_rating_sleep_fewer_than_4_hours, productivity_rating_4_hours_or_more, equal_var=False)

# Define the significance level
alpha = 0.05

# Check the p-value against the significance level
if p_value < alpha:
    print('Reject the null hypothesis. There is a significant difference in mean productivity ratings between individuals who sleep fewer than 4 hours and those who sleep 4 hours or more.')
else:
    print('Fail to reject the null hypothesis. There is no significant difference in mean productivity ratings between individuals who sleep fewer than 4 hours and those who sleep 4 hours or more.')
```

• Result:

Reject the null hypothesis. There is a significant difference in mean productivity ratings between individuals who sleep fewer than 4 hours and those who sleep 4 hours or more.