

SDS 220 Final Project - Written Report

Evelyn Dinh & Sophie Biderman

Does Sleep Duration Influences Productivity Level of College Students?

Introduction

Imagine waking up after few hours of sleep, then dragging your tired body through hours of coursework, assignments, and even exams! Now imagine doing that mostly everyday, in a duration of months? According to University of Georgia Health Promotion (n.d.) and Wallis (2024), most college students only get 6-6.9 hours of sleep per day on average while the recommended amount for college students is 7-9 hours. Even though it is understandable that there are certain deadlines, exams, or just work generally that seems to be more important than few extra hours of sleep, this constant trade-off may lead to unexpected consequences to both their physical and mental health.

This project aims to investigate the relationship between sleep duration and one of the most crucial aspects of any college student's life: their productivity. Our research question is **“Does the amount of sleep a college student gets influence their productivity level?”**. As college students ourselves, our goal is to discover possible patterns of college students' sleep duration and whether it significantly accounts for our academic and work productivity throughout the week. Understanding such connection, we can devise our own solutions to improve our college life inside-out, both academically and personally.

The data for this study was collected through a survey on Google Form. Our target population is college students, and our sample included students from different colleges. We mainly used a convenience sampling method, gathering many of our survey responses from our friends and acquaintances who are college students. We are investigating whether the amount of sleep a college student gets influence their productivity using Two-Way Table Test of Independence with Chi-square Distribution.

Exploratory Data Analysis

Main Sample Questions

1. **How long do you sleep during weekdays, on average?**
 - a. Less than 5 hours
 - b. 5-7 hours
 - c. More than 7 hours
2. **How productive are you during weekdays, on average?** *Rate your productivity on the following scales: 1 - not productive, 2-4 - somewhat productive, 5 - very productive*
 - a. Not productive
 - b. Somewhat productive
 - c. Very productive

About the Data

Data Collection

Our target population is college students.

This data is collected through Google Form. We used convenience sampling with responses from our friends and their acquaintances from Smith College, UMASS Amherst, Amherst College, Brown University, MIT...(USA), National Economic University, Diplomatic Academy of Vietnam, Hanoi University of Science and Technology... (Vietnam). Since we did not request input regarding school name, we do not know the exact number of observations from each school.

Other than directly sending to our friends at Smith, we posted it on Smith Confession to seek certain diversity and independence in Smithies observations. Evelyn also had her Vietnamese friends posted it on Meta posts and stories to seek responses from their network of Vietnamese college students; her other friends in other USA colleges also requested their acquaintances to fill out the survey, which helps widen the scope of the survey observation to students from other colleges.

Dataset Introduction

- Number of observations: 90
- Number of variables: 6 in total, 2 in use
 - `weekday_sleep_average` (hours)
 - `weekday_productivity_level`

- Type of Variables: Ordinal Categorical

Data Wrangling

Since we used multiple choice and check-boxes for most of our questions, we do not have to re-code the variables for consistency. Our questions regarding sleep duration, productivity, and stress level are also required, so we don't have any missing values in our data sets. However, since the variables are first named by the questions with space and capitalization, we have to clean the names and rename them to make sure they are concise and effective. We created 1 subset of the data set - sleep and productivity level with 2 variables regarding sleep duration and productivity level.

Variable Distribution

Weekday Sleep Duration

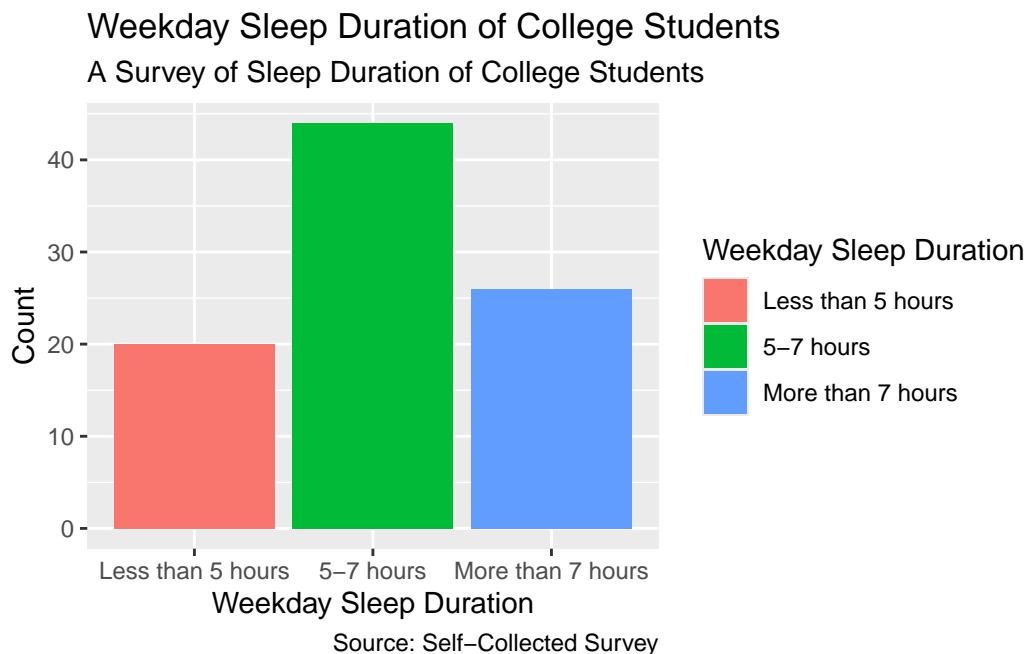


Figure 1: Weekday Sleep Duration of College Students

From Figure 1, it is noticeable that nearly half of observations, 44 out of 90 observations, sleep for 5-7 hours on average during weekdays. About 26 observations sleep for more than 7 hours on average during weekdays, while only 20 observations sleep for less than 5 hours on average during weekdays.

Weekday Productivity Level

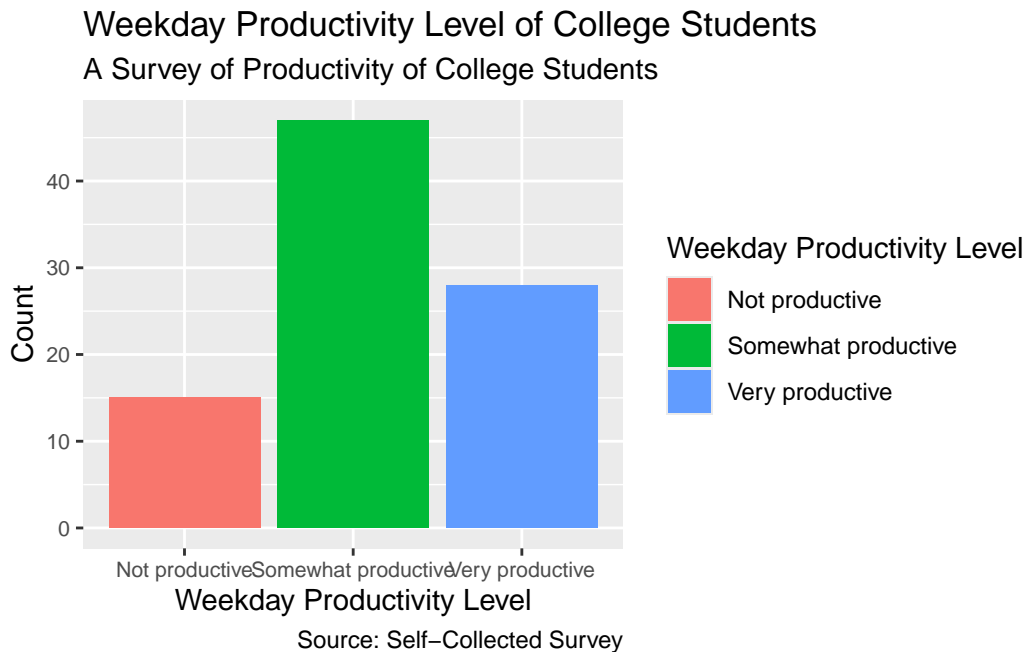


Figure 2: Weekday Productivity Level of College Students

From Figure 2, it can be seen that the majority, 47 out of 90, of observed college students feel somewhat productive on average during weekday. Nearly 1/3 of the observations feel very productive on average during weekday while only 15 out of 90 observations do not feel productive on average during weekday.

Sleep Duration vs. Productivity Level

Since `weekday_sleep_average` and `weekday_productivity_level` are both **categorical variables**, we are using a **contingency table** as well as **stacked bar plot** to visualize their distribution and potential association.

Table 1: Sleep Duration vs. Productivity Level of College Students

	Not productive	Somewhat productive	Very productive
Less than 5 hours	1	7	12
5-7 hours	7	29	8
More than 7 hours	7	11	8

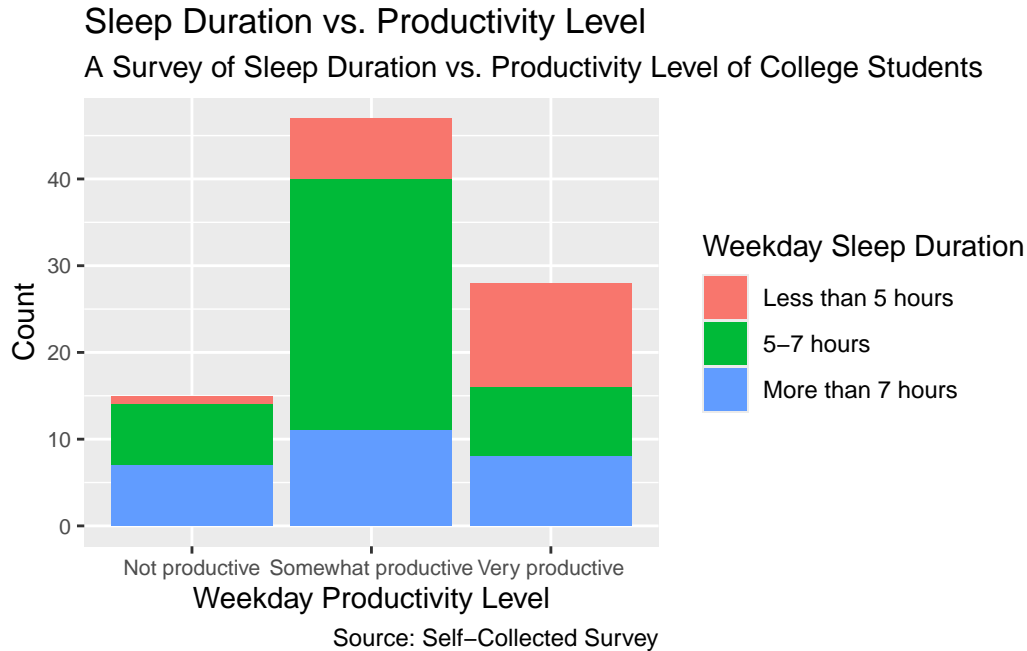


Figure 3: Sleep Duration vs. Productivity Level of College Students

Table 1 and the corresponding Figure 3 shows the distribution of the observed values of productivity levels across different sleep duration.

It is noticeable that individuals who sleep 5-7 hours make up the majority of “somewhat productive” group with 29 individuals while those who sleep less than 5 hours have the highest number of individuals in the “very productive” group with 12 individuals. For both the “not productive” and “very productive” group, the number of individuals sleeping 5-7 hours and more than 7 hours is the same. Surprisingly, in the “not productive” category, 7 individuals each reported sleeping 5-7 hours and more than 7 hours, both are significantly higher than the number of individuals sleeping less than 5 hours, which was only 1.

Results

Type of Test

Since `weekday_sleep_average` and `weekday_productivity_level` are both **categorical variables** with each of them have 3 categories, we use inference of two-way tables. Therefore we are using the **Two-Way Table Test of Independence** with **Chi-square Distribution** through the **Mathematical Model**.

Hypotheses

- H_0 : Sleep duration and productivity level are independent.
- H_A : Sleep duration and productivity level are related.

Conditions

The Conditions for Two-Way Table Test of Independence include **Independence** and **Large Sample**.

1. **Independence**: The data values were collected were from a random sample.

The use of convenience sampling method may introduce certain dependence among observations. For example, students from the same social circles or colleges may share common traits, behaviors, or habits. Thus, Independence condition for Two-Way Table Test of Independence not met.

2. **Large Sample**: $e_{i,j} \geq 5$ for each cell.

If `weekday_sleep_average` and `weekday_productivity_level` are truly independent under the null hypothesis H_0 of independence, our expected count values for all cells would be

Table 2: Sleep Duration vs. Productivity Level of College Students Expected Counts

	Not productive	Somewhat productive	Very productive
Less than 5 hours	3.33	10.44	6.22
5-7 hours	7.33	22.98	13.69
More than 7 hours	4.33	13.58	8.09

There are 2 expected counts that do not meet the criteria of $e_{i,j} \geq 5$ - $e_{2,1}$ and $e_{3,1}$ - as shown in Table 2. Thus, Large Sample condition for Two-Way Table Test of Independence not met.

Note: Because of both conditions not met, the test statistics χ^2 may not have a Chi-squared Distribution.

Chi-Square Testing

Test Statistics

Pearson's Chi-squared test

```
data:  sleep_productivity  
X-squared = 14.223, df = 4, p-value = 0.006615
```

Assuming that conditions for the Mathematical Model of the Two-Way Table Test of Independence are met and H_0 is true, our test statistic

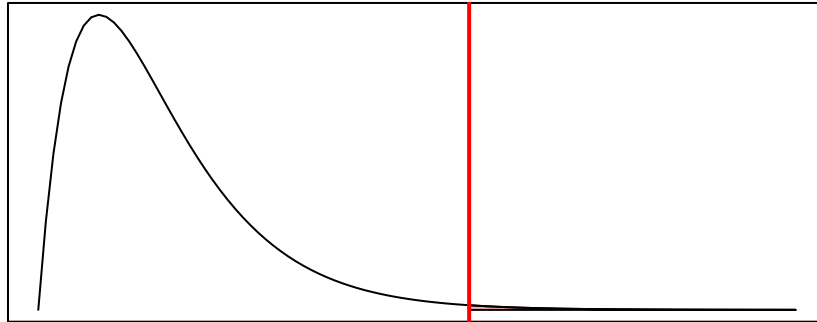
$$\chi^2 = 14.223,$$

which is a ratio of how the observed counts vary from the expected counts as compared to the expected counts, has a **Chi-squared Distribution** with the parameter

$$df = (R - 1)(C - 1) = (3 - 1)(3 - 1) = 4,$$

called **degrees of freedom**, which changes the shape of the Chi-squared distribution - the higher the degrees of freedom, the less skewed, more symmetric, more spread the distribution will be, and the further will the peak shift rightward.

p-value Mathematical Model Plot



Our null distribution (as shown above) is a **Chi-square Distribution** which is always right-skewed, only has positive values, and has a parameter of $df = 4$.

Given that we only take the shaded right tail area to calculate p-value, our $p - value = .006615$.

We choose our significance level $\alpha = .01$ to control the Type 1 error rate.

Conclusion

Our $p - value = .006615$ is smaller than $\alpha = .01$, therefore we reject the null hypothesis. We conclude that college students' sleep duration and productivity level are significantly related.

Interpretation

The data provides statistically significant evidence to support the claim that sleep duration is significantly related to productivity level at $\alpha = .01$ significance level. Therefore, it is reasonable to believe that the amount of sleep a college student gets influences their productivity level.

Discussion

The statistical analysis above set out to test the relationship between weekday average hours of sleep and productivity level in college students. Our analysis showed that there is statistically significant evidence that the amount of sleep a college student gets influences their productivity level, which answers our original research question. Our population of interest was all college students, but our sample is not accurately representative of the population of interest. Our data includes observations from students at multiple colleges, but which colleges we received data from is based on convenience, instead of any sort of randomized process. Thus, our results cannot be generalized to the entire population of interest.

Data was self-reported and was collected from college students using convenience sampling with a Google Form. We reached out to our peers who are also in college, and received responses from Smithies, as well as many individuals who attend colleges other than Smith. To assure consistency and ease of data analysis, the questions on the Google Form were answerable only by multiple choice options. There were three options for average amount of sleep on weekdays, dividing observations into: less than 5 hours, 5-7 hours, and more than 7 hours. This converted the data for hours, which are typically continuous numerical values, into a categorical variable. Survey participants indicated their self-evaluated productivity as "not productive", "somewhat productive", or "very productive". This resulted in a categorical and ordinal variable for the data regarding productivity. Figure 1 and Figure 2 show the proportions of survey respondents that indicated themselves as falling within our three divisions of hours of sleep and productivity, respectively. Table 1 and Figure 3 summarize the distribution

of both of our variables, displaying the counts of observations grouped by both hours of sleep and productivity. We determined that the appropriate statistical analysis to use in this context given that both of our variables are categorical is the Two-Way Table Test of Independence using a mathematical model.

A major limitation of our analysis is that it was conducted despite the data meeting neither the Independence nor the Large Sample conditions for our chosen hypothesis test. The Independence condition cannot be met given that we did not collect data using a random sample. The Large Sample condition requires that the expected counts for all cells in our contingency table are greater than 5. Expected count is a measure of the total for the row in which a given value is found multiplied by the column total for the same value, divided by the table total. As indicated in Table 2, two out of nine cells do not meet the Large Sample condition; the expected counts for these two cells is less than 5.

We conducted our analysis under the assumption that the conditions described above were met. The analysis concluded that the self-reported productivity level of college students varies based on the average amount of sleep they get during weekday.

Although our results can not be generalized to the population of interest, they are congruent with published research on similar topics. For example, Preetha et al. (2020) is an analysis of levels of awareness among dental students that getting insufficient sleep is detrimental to productivity. Similarly to our study, the data were collected by distributing online surveys. The study found that 74% of surveyed individuals are aware that inadequate sleep causes stress, and the same percentage responded that they were aware that insufficient sleep causes degeneration of cognitive functions. 77% of participants claimed to be aware that insufficient sleep can trigger irritability. The study's results include further analyses of dental student's knowledge of the negative effects of sleep deprivation, the ones most pertinent to the research we conducted are included here. Based on these results and parameters of Preetha et al. (2020), it seems probable that our result reflects a real correlation between shorter sleep duration and lower overall productivity level in college students.

This is reaffirmed by the results of another related analysis of medical students in Hassan et al. (2023). Variables collected include sleep quality, as measured by the Pittsburgh Sleep Quality Index, levels of depression and anxiety, as scored on the Hamilton Depression (or Anxiety) Rating Scales, respectively, and academic performance scores. Hassan et al. (2023) concluded that poor sleep quality is correlated with higher levels of depression and anxiety, which in turn correlates negatively with academic performance. Once again, the published literature reaffirms our finding that getting less sleep diminishes a student's ability to perform productively.

Many other analyses could be conducted with the data we gathered using this form. These other variables dictate the most feasible and convenient possible future extensions to this research project. Our Google Form collected a total of six variables, only two of which were used for the statistical analysis conducted above. The variables we did not use include class year, major division, whether the respondent considers themselves an early bird or a night owl,

and stress level (as a categorical variable formulated similarly to those used in the analysis carried out above). Based on these variables, we could consider examining whether stress (or productivity) levels vary based on major division or class year. We could also evaluate whether being an early bird or a night owl is correlated with higher or lower stress or productivity levels. Beyond the scope of the dataset we have collected, we could consider using random sampling to select colleges throughout the world from which to collect data, and then randomly sample students enrolled there in order to compile a larger and more robust data set. Statistical analyses of this dataset would yield results generalizable to the entire target population of college students.

Bibliography

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