

Central Limit Theorem and Its Applications in Determining Shoe Sizes of University Students

Mbuba Morris Mwiti¹, Samson W. Wanyonyi^{2*} and Davis Mwenda Marangu¹

¹Department of Mathematics, Kibabii University, Box 1699-50200, Bungoma, Kenya.

²Department of Mathematics, University of Eldoret, Box 1125-30100, Eldoret, Kenya.

Authors' contributions

This work was carried out in collaboration between all authors. All authors read and approved the final manuscript.

Article Information

DOI: 10.9734/AJPAS/2019/v3i130082

Editor(s):

(1) Dr. Halim Zeghdoudi, Department of Mathematics, Badji-Mokhtar University, Algeria.

Reviewers:

(1) José A. C. González, Universidad de Playa Ancha, Valparaíso, Chile.

(2) Olajun Olusegun Adeyemi, Federal polytechnic Ilaro, Nigeria.

(3) Alessandro Selvitella, University of Ottawa, Canada.

Complete Peer review History: <http://www.sdiarticle3.com/review-history/45037>

Original Research Article

Received: 07 November 2018

Accepted: 21 January 2019

Published: 20 February 2019

Abstract

The Central limit theorem is a very powerful tool in statistical inference and Mathematics in general, since it has numerous applications such as in topology and many other areas. For the case of probability theory, it states that, "given certain conditions, the sample mean of a sufficiently large number or iterates of independent random variables, each with a well-defined mean and well-defined variance, will be approximately normally distributed". In the research paper, three different statements of our theorem (CLT) are given. This research paper has data regarding the shoe size and the gender of the of the university students. The paper is aimed at finding if the shoe sizes converges to a normal distribution as well as find the modal shoe size of university students and to apply the results of the central limit theorem to test the hypothesis if most university students put on shoe size seven. The Shoe sizes are typically treated as discretely distributed random variables, allowing the calculation of mean value and the standard deviation of the shoe sizes. The sample data which is used in this research paper belonged to different areas of Kibabii University which was divided into five strata. From two strata, a sample size of 74 respondents was drawn and from the remaining three strata, a sample of 73 students per stratum was drawn at random which totaled to a sample size of 367 respondents. By analyzing the data, using SPSS and Microsoft Excel, it was vivid that the shoe sizes are normally distributed with a well-defined mean and standard deviation. We also proved that most university students put on shoe size seven by testing our

*Corresponding author: E-mail: samsonwangila@gmail.com;

hypothesis using the p-value. The modal shoe size for university students was found to be seven since it had the highest frequency (97/367). This research was aimed at enlightening shoe investors, whose main market is the university students, on the shoe sizes that are on high demand among university students.

Keywords: Central limit theorem; moment generating function; characteristics function; confidence level.

1 Introduction

1.1 Background to the study

Different researchers have done different researches about shoe sizes in different areas and regions. Chaiwanichsiri et al. [1] did a study to find the proper sizes of shoes for the elderly in Thailand. Since the old always have a challenge in getting the right shoe sizes, the research had to be done. They used the following methods; correlations, gender difference and Side-to-side of sample foot measurements. The results showed that approximately 34% of the men and 50% of women used narrow shoes most probably this can be due to foot pain. They then came up with a formula for finding foot width and length for both genders. In the year 1992, Finestone et al. [2] also did a study to determine the effect of using the right shoe and train shoe to avoid injuries for young recruits in the military. They found out that it was very necessary to have triple shoe widths for every shoe size to accommodate all the recruits' needs. This helped the recruits to have the right shoe sizes in the time they needed it. The use right size of shoes was seen to reduce overuse injuries. A. Gede and Chantelau E [3] did a study on the dimensions of foot for the elderly with and without diabetes mellitus. Footwear has continued to cause injuries for the elderly. This Is due to the usage of wrong shoe size for those with diabetes polyneuropathy and mellitus. They discovered that most of the feet were larger than the shoes available in the market. They also discovered a high correlation between foot length and breadth. They concluded that the elderly people with diabetes did fit the available casual footwear. In 1988 William A. and Rossi [4] also did a study to determine the perfect shoe sizes of people. They discussed that no way can two feet of pair are really the same hence resulting in shoe misfit. They concluded that complexities of shoes are affected by the following obstacles; absence of uniformity in sizes of shoe, prevailing design of shoe that lasts, the role of footwear fashions, limited extent of training and skills to shoe makers. In 2007 Harrison, S. J et al. [5] did a study to determine whether patients living with diabetes wear shoes of correct size. The study was aimed at assessing footwear and feet of patients with diabetes in determining whether they wear correct shoe sizes. The results showed that a third of the diabetic people wear the correct shoe sizes and the rest used incorrect shoe sizes.

All these studies did not make use of the central limit theorem and that's why we carried the study to determine its effectiveness.

1.2 Theoretical review

The Central Limit Theorem has been around for over 280 years and many researchers in the field of mathematics have proved it in many different cases since it has many different versions according to different researchers in different areas of applications such as in probability theory and other areas. Its origin can be traced to The Doctrine of Chances by Abraham de Moivre 1738 as discussed by Dunbar and Steven R [6]. In his book, he provided techniques for solving gambling problems, and also provided a statement of the

Central Limit Theorem for Bernoulli trials as well as gave a proof for $\sigma = \frac{1}{\sqrt{n}}$. This was a very crucial invention during those early days which motivated many other researchers' years later to look at his work and they continued to ascertain it for further cases. Many researchers had made several studies on the sums of independent random variables for much different error distribution before 1810 which had mostly led to very complicated formulas when Laplace released his first paper about the CLT. In 1812, Pierre Simon Laplace [7] published his own book titled *Theorie Analytique des Probabilités*, where he generalized the theorem for

$p \neq \frac{1}{2}$. He also gave a proof, although not arduous one, for his finding. Methers [8] published a paper on how Siméon Denis Poisson published two articles (1824 and 1829) where he discussed the CLT with an idea that all procedures in the physical world are governed by distinct mathematical laws where he was trying to provide a more reliable mathematical analysis to Laplace's theorem. He provided a more rigorous proof for a continuous variable and also discussed the validity of the central limit theorem, mainly by providing a few counterexamples but he was unable to prove his general formula because he examined its validity for the special case of $n = 1$. Probability theory was first considered as "pure" mathematics by Cauchy which was discussed in Hogg, Robert V., and Allen T. Craig [9] paper later in 1995. He proved the CLT by first finding an upper bound to the difference between the exact value and the approximation and then specified conditions for this bound to tend to zero. Cauchy gives his proof for independent identically distributed variables $y_1, \dots, y_n$ with a symmetric density $f(y)$, finite support $[-a, a]$, variance $\sigma^2 > 0$ and a characteristic function $\psi(\theta)$. This proof finished the so called the first period of the central limit theorem (1810-1853) where the proofs presented in this period were not satisfactory in three respects namely, The theorem was not proved for distributions with infinite support, There were no explicit conditions, in terms of the moments, under which the theorem would hold, The rate of convergence for the theorem was not studied. These glitches were eventually solved by Chebyshev, Markov and Liapounov; the so-called "St. Petersburg School" between 1870 and 1910. Chebyshev's [10] paper in 1887 is generally considered the beginning of rigorous proofs for the central limit theorem. In his paper, he considered a sequence of independent random variables each described by probability densities where he used the "method of moments", that he had earlier developed which he left incomplete. Markov later simplified and completed Chebyshev's proof of the CLT. Liapounov's proof, published in 1901, is considered the first "real" rigorous proof of the CLT where he considered a sequence of random variables with mean 0 and variance 1. At around 1901-1902 the Central Limit Theorem became more generalized and a complete proof was given by Aleksandr Lyapunov [11]. In 1922 Lindeberg gave a more generalized statement of CLT which states that, "the sequence of random variables need not be identically distributed, instead the random variables only need zero means with individual variances small compared to their sum" as discussed by Linnik, Ju V [12]. Numerous contributions to the statement of the Central Limit Theorem and different ways to prove the theorem began to appear around 1935, when both Levy and Feller published their own independent papers regarding the Central Limit Theorem, discussed by Filmus, Yuval [13]. Feller's paper of 1935 gives the necessary and sufficient conditions for the CLT, but the result was somewhat restricted which made it not to be the rigorous proof of the CLT. Feller considered an infinite sequence x_i of independent random variables. In 1935, Lévy proved several things related to the central limit theorem i) He gave necessary and sufficient conditions for the convergence of normed sums of independent and identically distributed random variables to a normal distribution ii) Lévy also gave the sufficient and necessary conditions for the general case of independent summands iii) He also tried to give the necessary and sufficient conditions for dependent variables, martingales. Lévy's proofs also were not satisfactory for the martingale case and therefore it did not stand a test of rigorosity since it relied on a hypothetical lemma. In 1936, Cramér proved the lemma as a theorem and the matter of both Lévy' and Feller was settled as explained by Grinstead et al. in 2012 [14]. In 1937 they returned and refined their proofs using Cramér's result and thus, CLT was proved with both necessary and sufficient conditions. The Central Limit Theorem had unlimited impact and continues to have the same in the field of mathematics because the theorem is being used in topology, and other fields in mathematics and not limited to probability theory only.

1.3 Statement of the problem

The Central Limit Theorem is the dominating theorem in statistical inference. It permits us to make assumptions about a population and states that a normal distribution will occur regardless of what the initial distribution looks like for a sufficiently large sample size n . This theorem is used to make sound assumptions regarding the population since it is difficult to make such assumptions when the population isn't normally distributed and the shape of the distribution is unknown. The goal of this research project is to focus on the Central Limit Theorem and its applications in statistical inference, as well as to know the importance of central limit theorem, how to prove it and how to apply the theorem in shoe sizes data of Kibabii University students.

1.4 Significance of the study

The analysis of the shoe size data of Kibabii University students will help the shoe investors around the University with the knowledge of the shoe size to stock more because of the high demand and as a result improve their sales and profit.

2 Methodology

2.1 Sample size

Statistical inference refers to the process of making inference about the population characteristics of interest using a sample from the population. It is normally difficult, time consuming and costly to obtain information from the entire population of interest. Therefore, researchers collect samples which are subsets of the population in order to make inference on certain parameters of scientific interest. This makes sampling an important feature of statistical study. However, deciding on the size of the sample that will represent the population well is a challenge. In this work, a formula recommended by Creswell [15] was used;

$$n = \frac{Z^2 pq N}{e^2 (N - 1) + Z^2 pq}$$

Where: n is the sample size, N is the population, and p is the proportion in the target population estimated to have the characteristics being measured (confidence level). In our case, we have estimated our $p = 0.5$. Z is 1.96 at a significance level of 0.05 and e is the standard error of 5%.

Therefore;

$$n = \frac{Z^2 pq N}{e^2 (N - 1) + Z^2 pq} = \frac{1.96^2 \times 0.5 \times 0.5 \times 8000}{0.05^2 (8000 - 1) + 1.96^2 \times 0.5 \times 0.5} = 366.6 \approx 367$$

2.2 Data

This study was conducted through a closed and open-ended questionnaire where 3 questions were related to the personal data and 3 questions related to the subject study totaling to 6 questions. This researcher selected 367 Kibabii University students which formed the required sample size.

The shoe size, height, body weights, gender, year of study and age data for students was collected in the following areas of Kibabii University.

Area number	Area name
1	Tuuti
2	Booster
3	Lavington
4	Butieli
5	Institution Area

2.3 Statements of the central limit theorem

Since many researchers have done research works on the Central Limit Theorem, they have come up with many proofs which are all accepted. Let's first state Abraham de Moivre-Laplace Theorem which states as follows.

Theorem 2.3.1 [1] Consider a sequence of Bernoulli trials with probability p of success, where $0 < p < 1$. Let S_n denote the number of successes in the first n trials, $n \geq 1$. For any $a, b \in \mathbb{R} \cup \{\pm\infty\}$ with $a < b$.

$$\lim_{n \rightarrow \infty} \left(a \leq \frac{S_n - np}{\sqrt{np(1-p)}} \leq b \right) = \frac{1}{\sqrt{2\pi}} \int_a^b \exp\left(-\frac{z^2}{2}\right) dz.$$

Thereafter Lyapunov gave the second statement of the Central Limit Theorem as:

Theorem 2.3.2

Suppose X_n are independent random variables with mean 0 and $\sum_{k=1}^n \frac{|X_k|^\delta}{S_n^\delta}$ for some $\delta > 2$ then $\frac{S_n}{S_n} \xrightarrow{distr} N(0,1)$, where $S_n = X_1 + X_2 + \dots + X_n$,

$S_n = \sum_{k=1}^n E(X_k^2)$, $n \geq 1$ and $\xrightarrow{distr}$ represents convergence in distribution.

An independent and identically distributed random variable is defined as follows:

Definition 2.0. A sequence of random variables is said to be **independent and identically distributed** if all random variables are mutually independent, and if each random variable has the same probability distribution. Now, the third and final statement of the central limit theorem states that:

Theorem 2.3.3

Suppose that $X_1, \dots, X_n$ are independent and identically distributed with mean μ and variance $\sigma^2 > 0$. Then, $\frac{S_n - n\mu}{\sqrt{n\sigma^2}} \xrightarrow{distr} N(0,1)$, where $S_n = X_1 + X_2 + \dots + X_n$, $n \geq 1$ and $\xrightarrow{distr}$ represents convergence in distribution. Our research will make use of the central limit theorem method.

3 Results and Discussion

Here, we discuss the results that we have found from our analysis as well as the significance of our research work. These results will help in devising the appropriate conclusion and the recommendations. Before we start our analysis, let's first say something about our theorem; Central Limit Theorem is one of the most great and worthwhile ideas in all of Statistics and there are two alternative forms of the theorem, and both describe the center, spread and shape of a certain sampling distribution. We have considered the two cases in our analysis. We define the sampling distribution of a statistic as the distribution of values of that statistic when all possible samples of the same size are taken from the same population. Sampling distributions form the foundation for almost all methods in inferential statistics, and the Central Limit Theorem allows us to explicitly describe the sampling distribution for a sample mean $\bar{x}$.

3.1 Sampling distribution and modal shoe size

We have provided the results and the discussion of the sampling distribution.

From Fig. 1, we can see that the sampling distribution for the of shoe sizes converges perfectly to the normal distribution. This is because the condition of drawing a reasonably large sample size was observed making the distribution to be symmetrical. So, this clearly indicates that most of the university students put on shoe size 7, with less people putting on shoe sizes 4 and 10. This distribution also shows a well-defined mean of 7.09 and a standard deviation of 1.511. This can also be seen in Table 1 and Fig. 2. Table 1, shows that 26.4 percent of the respondents put on shoe size 7 and 4.9 percent put on shoe size 4.

Table 1. Shoe size frequencies and percentages

		Shoe size of the respondent			
		Frequency	Percent	Valid percent	Cumulative percent
Valid	4	18	4.9	4.9	4.9
	5	38	10.4	10.4	15.3
	6	70	19.1	19.1	34.3
	7	97	26.4	26.4	60.8
	8	79	21.5	21.5	82.3
	9	42	11.4	11.4	93.7
	10	23	6.3	6.3	100.0
	Total	367	100.0	100.0	

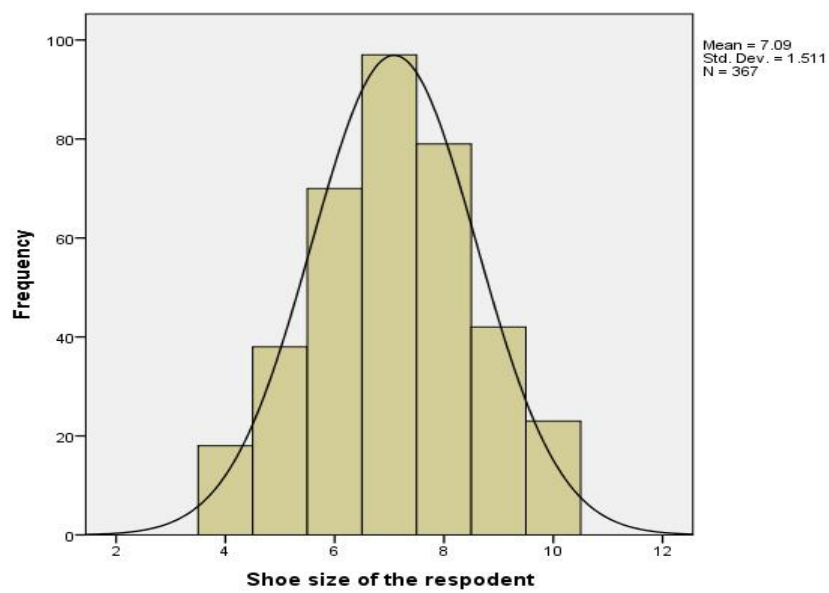


Fig. 1. Sampling distribution for the shoe sizes



Fig. 2. Pie chart for the shoe sizes

3.2 Distribution of shoe sizes according to the gender of the respondents

This graph compares shoe sizes and the gender of the respondents which indicates that shoe sizes differ with the gender of the respondent.

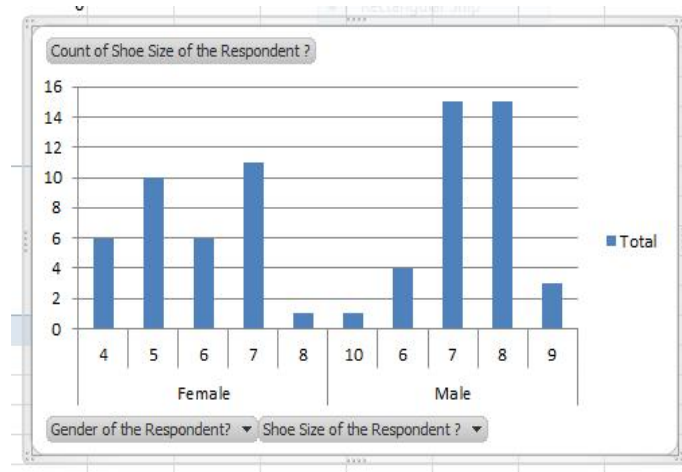


Fig. 3. Distribution of shoe sizes according to the gender of the respondents

It is clear that most ladies put on small shoes i.e. shoe size 5 and 7 with the minority of ladies putting on shoe 4, 6 and 8. For the case of men, most respondents had shoe sizes 7 and 8 and a few had shoe sizes 10, 6, and 9. This apparently shows that most men put on big shoe size as compared to the case of ladies which also means that most ladies put on small shoe sizes as compared to men.

Since Central Limit Theorem has many applications in probability theory and statistical inference, we have limited our research paper on hypothesis testing using shoe size data of Kibabii University students. Before we begin to compute if most people put on shoe size seven, we must first satisfy four conditions;

- Independence condition (assumption). This condition for our case states that, each respondent's shoe size that the researcher is going to meet is independent of the shoe size of the next respondents.
- (Random condition) Since we have many students in Kibabii University totaling to almost 8,000, taking just 367 students to observe the data will account for our randomization condition.
- (10% condition) In this condition, the sample size n should be less than 10% of the population size. For our case, our sample size $n = 367$ which is less than 10% of the total population which is 800. Therefore $367 < 800$ and so our sample holds true the 10% condition.
- (Success/Failure) This simply states that; the population size multiplied by our proportion in our hypothesis, must be greater than 10. Since our proportion $p = 0.5$, we can prove the condition by multiplying the two. i.e. $np = 8,000 * 0.5 = 4,000$. So, the success/failure condition also holds true because $4,000 > 10$.

3.3 Testing the hypothesis

The method below was used to test the hypothesis.

3.3.1 The P-value

The p -value approach was used to test hypothesis and the findings are shown in Table 2.

Table 2. One sample statistics

One-sample statistics				
	N	Mean	Std. deviation	Std. error mean
Shoe size of the respondent	367	7.09	1.511	.079

Table 3. One-Sample test

One-sample test						
	T	Df	Sig. (2-tailed)	Test Value = 7		
				Mean difference	95% confidence interval of the difference	
					Lower	Upper
Shoe size of the respondent	1.106	366	.270	.087	-.07	.24

This corresponds to a p value of 0.270. Since $0.27 > 0.05$ we cannot reject H_0 in favor of our alternative hypothesis because we have enough evidence from our data to support that most university students put on shoe size seven. Therefore, using the p -value, it's clear that most university students put on shoe size seven since we have not rejected the null hypothesis due to presence of enough evidence from the data.

4 Conclusions

It is now clear from our data that the shoe sizes of university students converge to a normal distribution using the proof of the central limit theorem by considering the moment generating functions as well as the characteristic functions. Using the shoe sizes data so collected, the study was able to prove that most students put on shoe size 7 by testing our hypothesis using the p -value. This is because, we have enough evidence from the data to show that most students put on shoe size seven. By finding the mode also, the study found out that most university students put on shoe size seven because it had the highest frequency. Most ladies put on small shoes i.e. shoe size 5 and 7 with the minority of ladies putting on shoe 4, 6 and 8. For the case of men, most respondents had shoe sizes 7 and 8 and a few had shoe sizes 10, 6, and 9. This apparently shows that most men put on big shoe size as compared to the case of ladies which also means that most ladies put on small shoe sizes as compared to men. Finally, the study concludes that the Central limit theorem was the appropriate method for this study.

5 Recommendations

1. Since most university students put on shoe size seven, we recommend shoe investors around the institutions of higher learning to be stocking more of shoe size seven because it's the shoe size with majority of the students. Followed by shoe sizes 5, 6 and 8 and doing so, they will curb the big problem of so much dead stock that they face day in day out.
2. In future, it may be interesting to use my applications on other areas such as sports, finding the distribution of the change people carry in their pockets, although we must make sure that we have a sufficiently large sample size to have accurate results of a smooth convergence in normal distribution since some of the distributions are heavily skewed as well as when testing the hypothesis. Other applications of the Central Limit Theorem, as well as other properties such as convergence rates may also be interesting areas of study for the future.

Competing Interests

Authors have declared that no competing interests exist.

References

- [1] Chaiwanichsiri, Dootchai, Natthiya Tantisiriwat, Siriporn Janchai. Proper shoe sizes for Thai elderly. *The Foot*. 2008;18(4):186-191.
- [2] Finestone, Aaron, et al. A prospective study of the effect of the appropriateness of foot-shoe fit and training shoe type on the incidence of overuse injuries among infantry recruits. *Military Medicine*. 1992;157(9):489-490.
- [3] Chantelau E, Gede A. Foot dimensions of elderly people with and without diabetes mellitus—a data basis for shoe design. *Gerontology*. 2002;48(4):241-244.
- [4] Rossi, William A. The futile search for the perfect shoe fit. *Journal of Testing and Evaluation*. 1988;16(4):393-403.
- [5] Harrison SJ, et al. Do patients with diabetes wear shoes of the correct size? *International Journal of Clinical Practice*. 2007;61(11):1900-1904.
- [6] Dunbar, Steven R. The de Moivre-Laplace Central Limit Theorem.
- [7] Laplace, Pierre-Simon. Pierre-Simon Laplace philosophical essay on probabilities: Translated from the fifth French edition of 1825 With Notes by the Translator. Springer Science & Business Media. 2012;13.
- [8] Mether, Max. The history of the central limit theorem. *Sovelletun Matematiikan Erikoistyöt*. 2003;2(1):08.
- [9] Hogg, Robert V, Allen T. Craig. Introduction to mathematical statistics, (5th Edition). Upper Saddle River, New Jersey: Prentice Hall; 1995.
- [10] Chebyshev PL. Complete collected works. Moscov-Leningrad. 1947;II.
- [11] Lyapunov, Aleksandr M. Collected works. 1956;IV.
- [12] Linnik, Ju V. An information-theoretic proof of the central limit theorem with Lindeberg conditions. *Theory of Probability & Its Applications*. 1959;4(3):288-299.
- [13] Filmus, Yuval. Two proofs of the central limit theorem; 2010.
Available:<http://www.cs.toronto.edu/yuvalf/CLT.pdf>
- [14] Grinstead, Charles Miller, James Laurie Snell. Introduction to probability. American Mathematical Soc.; 2012.
- [15] Creswell JW. Research design: Qualitative, quantitative and mixed methods approaches. (4th Ed.). Lincoln, NE: SAGE Publications, Inc; 2013.

© 2019 Mwiti et al.; This is an Open Access article distributed under the terms of the Creative Commons Attribution License (<http://creativecommons.org/licenses/by/4.0>), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

Peer-review history:

The peer review history for this paper can be accessed here (Please copy paste the total link in your browser address bar)

<http://www.sdiarticle3.com/review-history/45037>