

# Gaussian (Z-Score) percentiles of ponderal index (pi) in Pakistani children and adults: a quantitative approach to human growth analysis

## Abstract

The construction of growth charts is one of the essential procedures used for defining normal patterns of human growth and evaluating trends in quantitative terms in the pediatric field. This research also helps to present a detailed growth chart of PI for Pakistani adults with aggregated data of 9906 people of Multan and Bahawalpur (cities of Pakistan). The PI as an indicator of growth and development is a dimensionless measure of BMI adjusted for height. It is found that the PI mean value is  $14.80 \pm 3.57$  (mean  $\pm$  SD) which shows a moderate increase in PI values from the age of 5 years with a plateau at the age of 15 years. According to the Gaussian percentiles, it can be pointed out that the construction of growth charts for various physiological and pathological states is essential. Empirical PI Gaussian (Z-score) Percentiles can be used as discrete estimates of population Gaussian (Z-score) Percentiles. This is possible since the use of the Z-score approach makes it easier to develop smoother and more accurate PI Z-score percentiles concerning specific ages. With this methodology, one can develop growth reference curves for various physiological and medical disorders that affect children and adolescents. This will allow practitioners to comprehend normal growth and establish some reference points against which to consider abnormal growth.

In medical terms, this paper will be useful for the field of pediatric medicine where it will contribute a detailed growth chart of PI in adults of the Pakistani population. The findings affirm the necessity for generating growth charts by different physiological and pathological circumstances, pointing to empirical PI Gaussian (Z-score) Percentiles as appropriating discrete measures of population Gaussian (Z-score) Percentiles. According to the Z-score approach, more accurate and continuous PI Z-score curves against the given ages may be established so that various deviations from normal growth may be distinguished.

**Keywords:** ponderal index, quantitative approach, obesity, gaussian (z-score) percentiles, growth charts

Volume 9 Issue 3 - 2024

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**Received:** December 11, 2024 | **Published:** December 31, 2024

## Introduction

### Background

The study of human growth and development is a crucial aspect of medicine, as it provides insights into the physical and biological changes that occur throughout an individual's life. One of the most widely used indices of growth and development is the PI, which is a dimensionless measure of BMI adjusted for height. The PI is calculated by dividing the weight of an individual in kilograms by the cube of their height in meters ( $\text{kg}/\text{m}^3$ ). This index has been widely used to assess growth and development in children and adults, as it provides a more accurate representation of body composition than BMI alone.<sup>1</sup> The PI has been shown to be a reliable indicator of overall health and nutritional status, with values below 18.5 indicating underweight, between 18.5 and 24.9 indicating normal weight, and above 24.9 indicating overweight or obesity.<sup>2</sup> The PI has also been criticized for its limitations, including its sensitivity to errors in measurement and its inability to account for changes in body composition over time.<sup>3</sup>

A person's leanness is measured using the Corpulence Index (CI) or PI, which is based on their mass and height. It is sometimes referred to as Rohrer's Index since Swiss Physician Fritz Rohrer proposed it as the "Corpulence measure" in 1921. The only difference between it and the BMI is that the third power of body height is used to normalize the

mass rather than the second. Over a century after Rohrer first proposed PI, Sultan Babar showed that it did not require modification for height over puberty.<sup>4</sup> The BMI has difficulty since it doesn't generate reliable findings for persons who are extremely short or extremely tall. For instance, a person 200 cm tall will have a BMI of 24.84, which is extremely near to the "overweight" criterion of 25, and a PI of 12.4, whereas a person 150 cm tall will have an optimal height-adjusted body weight of 20.7 and a PI of 13.6, respectively. It is most typically utilized in pediatrics because of its feature. Because of their shorter legs, new-borns have typical values that are almost twice as high as adults. After puberty, it does not need to be modified for age. It has also been demonstrated that it has a decreased false positive rate in athletes.<sup>5</sup>

One way to overcome these limitations is by using Gaussian percentiles, which provide a more nuanced understanding of growth and development by allowing for the calculation of Z-scores. Z-scores are a measure of how many standard deviations an individual's value is above or below the mean value of a population.<sup>6</sup> By using Gaussian percentiles, researchers can determine whether an individual's PI is above or below the expected range for their age and sex. In Pakistan, where malnutrition and stunting are major public health concerns, understanding human growth and development is particularly important. Stunting, which is defined as a height-for-age Z-score below -2, is estimated to affect over 40% of children under the age

of five in Pakistan.<sup>7</sup> Malnutrition, which can have long-term effects on physical and cognitive development, is also a significant problem in Pakistan.<sup>8</sup>

There is limited research on human growth and development in Pakistan. Most studies have focused on the prevalence of malnutrition and stunting in Pakistani children, rather than examining the patterns and trends of growth and development over time.<sup>9</sup> There is a lack of research on the use of Gaussian percentiles in Pakistani populations. Similar study has been done by Hussain et al., (2021) for BSSI using Quantile Regression Percentiles.<sup>10</sup> This study aims to address these knowledge gaps by examining the Gaussian percentiles of PI in Pakistani children and adults. Using a large sample of data from Pakistan, this study will provide a comprehensive analysis of growth and development patterns in Pakistani populations. The findings will provide valuable insights into the patterns and trends of growth and development in Pakistani children and adults, as well as identify potential areas for intervention to improve nutritional status and reduce the prevalence of malnutrition and stunting.

### Objective of study

This research study's goal is to use the Gaussian (Z-Score) technique to analyze the estimated quantiles of PI, with a particular emphasis on looking at the PI gap for Pakistan's population. By examining the PI quantiles, this study seeks to add to the body of material already in existence that has been disregarded in earlier research that has concentrated on other obesity markers.

## Methodology

### Research design and participant selection

This study used a cross-sectional research technique to choose 9906 participants, ages 2 to 60, from a variety of Pakistani public spaces. The study employed convenience sampling, and individuals were selected from parks, markets, hospitals, and transit hubs.<sup>11</sup> In the study, easy sampling is used to gather data for preschoolers aged 0–3, whereas labor-intensive and convenient sampling is used to collect data for school-age children aged 4–19. Permission from the appropriate school administrations was secured to collect data from the selected schools, which included both public and private institutions.

Convenience sampling was used in the study to gather samples of people in public places, with ages ranging from 20 to 60. Teams of two male and one female enumerators were employed to visit homes and collect data by posing pre-formulated queries.<sup>12</sup> Gender disparity was a significant influence in the study's conclusions. So, different questionnaires were constructed for individuals who identified as male and female. The information acquired provides important insights into the population's socioeconomic, health, and demographic features.

### Study population

Those who were at least two years old made up the study's target population. The research did not include any pregnant participants.<sup>13</sup> Both boys and females were included in the sample, and great care was made to collect data from the Pakistani provinces of Bahawalpur and Multan.

### Variables of interest

The study aimed to determine a number of characteristics in order to meet the research's stated aims. The primary dependent variable was the anthropometric measure known as PI. According to Chen

and co-authors' methodology, age was one of the exploratory factors in their investigation,<sup>14</sup> and categorical variables involved gender, marital status, monthly income, and residential area.<sup>15</sup> These variables included both the numerical and non-numerical data derived from a wide group of participants.

### Collection of data

Doctors and dietitians in the neighborhood helped both of the two groups of three persons collect the data. From July to December 2023, a period of six months, was used for the study's investigation. Primary data was collected using a two-part, tailored questionnaire that was self-administered. In the first section, basic biographical data (gender and age, rounded to the nearest year) was collected from school enrollment records or, for children under five, with parental permission. In the second section, specifics on the anthropometric measurements were provided.

### Patient and community engagement

As the analysis below demonstrates, despite the research team's best efforts, a number of issues arose during the study's execution and data gathering. The participant's height and weight were measured by self-completion, ensuring that the data was collected objectively.

### Data reliability assessment

Regarding internal consistency, the reliability of the collected data was determined by Cronbach's Alpha, which had a value of 0.8405 that was found within the normal range of 0.70-0.90.<sup>16</sup> This means that the collected data is correct and valid for statistical analysis since it conforms with the hypothesized distribution.

### Minimizing bias

To reduce bias, observations that were deemed outliers or did not align with the study topic were excluded throughout the data editing and cleaning procedure.<sup>17</sup> It was necessary to ensure that the collected data was correct and did not contain any errors to identify the findings of the study as true.

### Informed consent statement

Each respondent gave their informed consent in writing.

### Sample size determination

We determine the sample size for our study by using the following

$$\text{formula:}^{18} \quad n = \frac{N}{(1 + Ne^2)}$$

where

$n$  is the Sample Size

$N$  is the size of the population

$e$  = Precision Level

Now,

$$N = 1872000, \quad e = 0.01$$

$$n = \frac{1872000}{(1 + 1872000(0.01)^2)}$$

$n = 9906$

As a result, 9906 people and children are removed from Multan and Bahawalpur, two Pakistani cities.

### Statistical analysis techniques

The mathematical expression for the computation of PI is given below:

$$PI = \frac{Mass_{kg}}{Height_m^3}$$

### Gaussian (Z-Score) Percentiles

To evaluate an individual's nutritional status and growth, such as undernutrition (such as underweight, stunting, and wasting) and over nutrition, percentiles, and Z-scores in various metrics have been frequently utilized (i.e., overweight and obesity). Percentiles (such as the 5th, 85th, 95th, 97th, and 99th percentiles) and Z-scores (like -2 and +2), as well as sex-age-specific metrics, are widely used to categorize a variety of health issues. Tables and smoothed curves on growth charts both give cut points (based on percentiles or Z-scores). Despite the need to address a rise in obesity during the past 20 years in many countries, the WHO's global growth goals have generally focused more on problems connected to undernutrition, such as wasting, stunting, and being underweight. In contrast to earlier versions of WHO growth benchmarks, which were based on US data, the new WHO Growth Standards for preschool-aged children were created in 2006 and are based on data obtained from numerous nations.<sup>19</sup> Pediatric growth charts have been used extensively worldwide by researchers, physicians, nurses, and parents to evaluate children's development and nutritional condition, although frequently users are unaware of the limitations of these charts.<sup>20</sup> For instance, growth charts were not intended to serve as the only diagnostic tool. Instead, they help create a clinical sense of the youngster being measured as a whole.<sup>21</sup> Furthermore, due to the interchange ability of the phrases "growth reference" and "growth standard," many users are unaware of the distinctions between the two. In this chapter, the fundamentals, applications, and benefits of percentiles and Z-scores in anthropometry are first covered. The next two major issues that must be resolved are the selection of anthropometric measure cut points and statistical methods for growth curve fitting and smoothing. In some of these references, anthropometric data that correlate to certain Z-scores and percentiles are provided.

### Use of Gaussian (Z-Score) Percentiles for PI

Gaussian percentiles, also known as Z-scores, are a powerful tool in the analysis of PI data. PI is a widely used index of growth and development, and Gaussian percentiles provide a more nuanced understanding of an individual's PI by allowing for the calculation of Z-scores.<sup>22</sup> Z-scores are a measure of how many standard deviations an individual's value is above or below the mean value of a population.<sup>23</sup> One of the primary uses of Gaussian percentiles for PI is in the assessment of growth and development patterns in children and adults. By calculating Z-scores for PI values, researchers can determine whether an individual's PI is above or below the expected range for their age and sex.<sup>24</sup> This information can be used to identify individuals who may be at risk for malnutrition or stunting, and to develop targeted interventions to improve nutritional status and reduce the prevalence of these conditions.

Gaussian percentiles for PI can also be used to evaluate the effectiveness of nutritional interventions. For example, researchers can use Z-scores to assess changes in PI values over time in response to nutrition education programs or supplementation trials.<sup>25</sup> This information can be used to evaluate the effectiveness of these interventions and to identify areas for improvement.

Another important application of Gaussian percentiles for PI is in the diagnosis of certain medical conditions. For example, PI values that are significantly below the mean may indicate a diagnosis of malnutrition or stunting, while values that are significantly above the mean may indicate a diagnosis of obesity or overweight.<sup>26</sup> By using Gaussian percentiles for PI, healthcare providers can quickly and easily identify individuals who may require further evaluation and treatment. Gaussian percentiles for PI can also be used in epidemiological studies to identify risk factors for certain health outcomes. For example, researchers may use Z-scores to examine the relationship between PI values and the risk of developing chronic diseases such as diabetes or cardiovascular disease.<sup>3</sup> This information can be used to develop targeted prevention strategies and to improve public health outcomes.

Gaussian percentiles for PI can be used in clinical trials to evaluate the safety and efficacy of new treatments. For example, researchers may use Z-scores to assess changes in PI values over time in response to new medications or therapies.<sup>27</sup> This information can be used to evaluate the effectiveness of these treatments and to identify potential side effects. Gaussian percentiles for PI can be used in research studies to explore the relationships between PI values and other health outcomes. For example, researchers may use Z-scores to examine the relationship between PI values and measures of cognitive function or mental health.<sup>28</sup> This information can be used to develop a better understanding of the complex relationships between growth and development, nutrition, and health outcomes.

Gaussian percentiles for PI are a valuable tool in the analysis of growth and development patterns. By providing a more nuanced understanding of an individual's PI, Z-scores can be used to assess growth and development patterns, evaluate the effectiveness of nutritional interventions, diagnose certain medical conditions, identify risk factors for certain health outcomes, evaluate the safety and efficacy of new treatments, and explore the relationships between PI values and other health outcomes.

## Results

### Participants

In this study, we have taken a sample of 9906 participants of which the majority are of male gender although women are also included. Among them the breakdown is as follows: 5524 are men, which account for 55 percent, and 4382 are women which is equivalent to 44 percent. The gender distribution is almost equal in the study sample, however, men form a slightly larger proportion as compared to women. It is necessary to recognize the fact that gender distribution might influence the results of the research as well as the conclusions that are drawn from the results. The physical sizes of males and females vary, which may affect the reliability and relevance of our findings. It's also critical to acknowledge that, due to the small sample size, there are far fewer female participants than male ones. The results cannot be generalized to a large sample of female participants. Therefore, more people especially women may need to be included in future studies to guarantee that the samples are more representative. The current database can be a useful starting point for characterizing the size, shape, and age connections among the people in this community.

### Descriptive analysis

The following descriptive analysis is given with respect to each variable. The below table represents descriptive statistics of PI for all age groups, gender wise PI comparison, marital status wise PI comparison, residential wise PI comparison and monthly income or wage distribution wise PI comparison. The estimated p-value for the gender-based comparison is (p-value<0.001), indicating that there is a significant difference between the PI of males and PI of females. The

p-value is determined to indicate that there is a significant difference between the PI of urban and rural inhabitants (p-value<0.001) when residential area is compared. The p-value is calculated for the comparison of respondents' marital status, and it comes out to (p-value<0.001), indicating that there is a significant difference between respondents who are single and those who are married. The p-value, determined as (p-value<0.001), indicates that there is a significant difference between the various levels of income for PI when comparing monthly income or salary distribution wise. Table 1.

**Table 1** Descriptive Statistics of PI for All Age Groups

| Category                                     | N    | Mean  | Median | Min  | Max   | S.E   | Var   | S.D  | P-value |
|--|------|-------|--------|------|-------|-------|-------|------|---------|
| Overall                                      | 9906 | 14.80 | 14.23  | 6.93 | 40.56 | 0.036 | 12.76 | 3.57 |         |
| <b>By Gender</b>                             |      |       |        |      |       |       |       |      |         |
| Male   | 5524 | 14.32 | 13.85  | 7.33 | 40.56 | 0.044 | 10.81 | 3.29 | <0.001  |
| Female                                       | 4382 | 15.40 | 14.73  | 6.93 | 38.54 | 0.058 | 14.59 | 3.82 |         |
| <b>By Residential Area</b>                   |      |       |        |      |       |       |       |      |         |
| Urban  | 4459 | 14.82 | 14.24  | 6.93 | 35.46 | 0.054 | 12.78 | 3.58 | <0.001  |
| Rural  | 5447 | 14.78 | 14.22  | 6.93 | 40.56 | 0.048 | 12.75 | 3.57 |         |
| <b>By Marital Status</b>                     |      |       |        |      |       |       |       |      |         |
| Single                                       | 5913 | 14.13 | 14.43  | 6.93 | 40.56 | 0.046 | 6.93  | 3.53 | <0.001  |
| Married                                      | 3993 | 15.78 | 15.47  | 8.57 | 27.64 | 0.054 | 8.57  | 3.41 |         |
| <b>By Monthly Income (Wage Distribution)</b> |      |       |        |      |       |       |       |      |         |
| 0-9999                                       | 2090 | 14.75 | 13.92  | 7.92 | 35.46 | 0.079 | 13.03 | 3.61 | <0.001  |
| 10000-19999                                  | 3688 | 14.57 | 14.04  | 6.93 | 35.75 | 0.059 | 12.62 | 3.55 |         |
| 20000-29999                                  | 1895 | 14.78 | 14.32  | 7.33 | 40.56 | 0.083 | 13.13 | 3.62 |         |
| 30000-39999                                  | 863  | 15.39 | 15.11  | 7.80 | 34.17 | 0.119 | 12.30 | 3.51 |         |
| 40000-49999                                  | 694  | 15.25 | 14.69  | 8.01 | 30.37 | 0.133 | 12.22 | 3.49 |         |
| >50000                                       | 676  | 15.02 | 14.44  | 8.30 | 33.87 | 0.133 | 11.96 | 3.45 |         |

The below table represents descriptive statistics of PI for age groups 2 to 5 and gender wise PI comparison, and Residential area wise PI comparison. The estimated p-value for the gender-based comparison is (p-value<0.001), indicating that there is a significant

difference between the PI of males and PI of females. The p-value is determined to indicate that there is a significant difference between the PI of urban and rural inhabitants (p-value<0.001) when residential area is compared Table 2.

**Table 2** Descriptive statistics of PI for 2 to 5 age groups

| Category                   | N   | Mean  | Median | Min   | Max   | S.E M | Var   | S.D  | P-value |
|----------------------------|-----|-------|--------|-------|-------|-------|-------|------|---------|
| Overall                    | 537 | 18.75 | 18.56  | 10.61 | 40.45 | 0.229 | 28.09 | 5.30 |         |
| <b>By Gender</b>           |     |       |        |       |       |       |       |      |         |
| Male                       | 262 | 18.01 | 17.78  | 10.61 | 40.56 | 0.340 | 30.21 | 5.49 | <0.001  |
| Female                     | 275 | 19.46 | 19.56  | 10.61 | 38.54 | 0.302 | 25.15 | 5.01 |         |
| <b>By Residential Area</b> |     |       |        |       |       |       |       |      |         |
| Urban                      | 241 | 18.87 | 18.77  | 10.61 | 35.46 | 0.332 | 26.51 | 5.15 | <0.001  |
| Rural                      | 296 | 18.65 | 18.55  | 10.61 | 40.56 | 0.315 | 29.45 | 5.43 |         |

The below table represents descriptive statistics of PI for age groups 5 to 14 and gender wise PI comparison, residential area wise PI comparison and family income or wage distribution wise PI comparison. The estimated p-value for the gender-based comparison is (p-value <0.001), indicating that there is a significant difference between the PI of males and PI of females. The p-value is determined

to indicate that there is a significant difference between the PI of urban and rural inhabitants (p-value<0.001) when residential area is compared. The p-value, determined as (p-value<0.001), indicates that there is a significant difference between the various levels of income for PI when comparing monthly income or salary distribution wise Table 3.

**Table 3** Descriptive statistics of PI for 5 to 14 age groups

| Category                                     | N    | Mean  | Median | Min  | Max   | S.E   | Var   | S.D  | P-value |
|--|------|-------|--------|------|-------|-------|-------|------|---------|
| Overall                                      | 1944 | 14.60 | 14.24  | 6.93 | 26.94 | 0.075 | 10.92 | 3.31 |         |
| <b>By Gender</b>                             |      |       |        |      |       |       |       |      |         |
| Male   | 1162 | 14.40 | 14.17  | 7.33 | 24.73 | 0.096 | 10.75 | 3.28 | < 0.001 |
| Female                                       | 782  | 14.90 | 14.43  | 6.93 | 26.94 | 0.119 | 11.05 | 3.33 |         |
| <b>By Residential Area</b>                   |      |       |        |      |       |       |       |      |         |
| Urban  | 900  | 14.51 | 14.17  | 6.93 | 25.31 | 0.111 | 11.01 | 3.32 | <0.001  |
| Rural  | 1044 | 14.68 | 14.28  | 6.93 | 26.94 | 0.102 | 10.85 | 3.29 |         |
| <b>By Monthly Income (Wage Distribution)</b> |      |       |        |      |       |       |       |      |         |
| 0-9999                                       | 368  | 14.91 | 14.66  | 8.59 | 23.91 | 0.175 | 11.27 | 3.36 | <0.001  |
| 10000-19999                                  | 758  | 14.37 | 14.17  | 6.93 | 24.73 | 0.115 | 10.03 | 3.16 |         |
| 20000-29999                                  | 354  | 14.54 | 14.17  | 9.03 | 22.62 | 0.168 | 10.04 | 3.17 |         |
| 30000-39999                                  | 178  | 14.21 | 13.78  | 7.80 | 23.92 | 0.241 | 10.38 | 3.22 |         |
| 40000-49999                                  | 174  | 15.01 | 14.69  | 8.31 | 26.94 | 0.265 | 12.25 | 3.50 |         |
| >50000                                       | 112  | 15.31 | 14.50  | 8.30 | 22.23 | 0.381 | 16.29 | 4.04 |         |

The below table represents descriptive statistics of PI for 14 and above age groups, gender wise PI comparison, Marital Status wise PI comparison, residential area wise PI comparison and monthly income or wage distribution wise PI comparison. The estimated p-value for the gender-based comparison is (p-value<0.001), indicating that there is a significant difference between the PI of males and PI of females. The p-value is calculated for the comparison of Marital Status, and it comes out to (p-value=<0.001), indicating that there is a significant

difference between the PI of married and unmarried people. The p-value is determined to indicate that there is a significant difference between the PI of urban and rural inhabitants (p-value<0.001) for residential area comparison. The p-value, determined as (p-value<0.001), indicates that there is a significant difference between the various levels of income for PI when comparing monthly income or wage distribution wise Table 4.

**Table 4** Descriptive statistics of PI for 14 and above age groups

| Category                                     | N    | Mean  | Median | Min   | Max   | S.E   | Var   | S.D  | P-value |
|--|------|-------|--------|-------|-------|-------|-------|------|---------|
| Overall                                      | 7425 | 14.56 | 14.02  | 7.33  | 27.64 | 0.038 | 10.95 | 3.31 |         |
| <b>By Gender</b>                             |      |       |        |       |       |       |       |      |         |
| Male   | 4100 | 14.06 | 13.67  | 7.33  | 24.78 | 0.046 | 8.65  | 2.94 | <0.001  |
| Female                                       | 3325 | 15.18 | 14.55  | 7.92  | 27.64 | 0.063 | 13.09 | 3.62 |         |
| <b>By Residential Area</b>                   |      |       |        |       |       |       |       |      |         |
| Urban  | 3318 | 14.61 | 14.09  | 7.33  | 27.64 | 0.058 | 11.01 | 3.32 | <0.001  |
| Rural  | 4107 | 14.52 | 13.99  | 7.33  | 27.33 | 0.052 | 10.89 | 3.30 |         |
| <b>By Marital Status</b>                     |      |       |        |       |       |       |       |      |         |
| Single                                       | 3438 | 13.14 | 12.77  | 11.37 | 23.00 | 0.043 | 6.46  | 2.54 | <0.001  |
| Married                                      | 3987 | 15.79 | 15.49  | 13.30 | 27.64 | 0.054 | 11.58 | 3.40 |         |
| <b>By Monthly Income (Wage Distribution)</b> |      |       |        |       |       |       |       |      |         |
| 0-9999                                       | 1547 | 14.39 | 13.62  | 7.92  | 27.64 | 0.087 | 11.65 | 3.41 | <0.001  |
| 10000-19999                                  | 2766 | 14.38 | 13.80  | 8.14  | 27.33 | 0.064 | 11.45 | 3.38 |         |
| 20000-29999                                  | 1462 | 14.51 | 14.10  | 7.33  | 23.00 | 0.083 | 10.11 | 3.18 |         |
| 30000-39999                                  | 618  | 14.41 | 15.18  | 9.70  | 23.92 | 0.131 | 10.56 | 3.25 |         |
| 40000-49999                                  | 486  | 15.07 | 14.65  | 8.01  | 22.50 | 0.144 | 10.13 | 3.18 |         |
| >50000                                       | 546  | 14.72 | 14.37  | 8.57  | 24.55 | 0.125 | 8.59  | 2.93 |         |

## Inferential analysis

### Gaussian percentiles from PI

It is thought that the PI Gaussian percentile growth charts are useful for determining the trajectory of body composition.<sup>21</sup> These charts help compare PI measures because they employ standardized Z-scores, which allow a kid to be measured against other children in different age ranges or population sets.<sup>29</sup> The resulting Z-score values are derived using regression models that forecast the PI measurements' mean and standard deviation (SD). The growth charts for PI using

Z-Scores or Gaussian Percentiles are shown below. Along with the regression equations in the original unit, seven curves showing the Z-score values of -3, -2, -1, 0, 1, and 3 are provided for the PI measurements. Standardized Z-scores have a mean of 0 and an SD of 1, therefore Z = 0 represents the estimated mean, and Z = -3, -2, -1, 1, 2, 3 represents the estimated regression line's SD, which is represented by Z = -3, -2, -1, 1, 2, 3 (estimated means). 68% of the population would be categorized as lying within a normal distribution's mean -1, 1 SD, 95.4% would be within a mean -2, 2 SD, and 99.7% would be within a mean -3, 3 SD.

### PI Gaussian percentiles growth chart for complete data

The complete PI data with Z-scores are displayed in the image below. The Z-scores are shown by the curved lines on the illustration. The median ( $z=0$ ), which is typically referred to as the average, is shown by the line with the number 0. The other curving lines are Z-score lines, which represent deviations from the average and are denoted by  $z=-1, -2, -3, 1, 2,$  and  $3$ . The figure's median and Z-score lines are based on PI measurements. Positively (1, 2, 3) and negatively (-1,-2,-3) numbered Z-Score lines are shown in the illustration. A growth issue is shown by the displayed points that are distant from the median ( $z=0$ ) in either direction (i.e., near to the -3 or 3 Z-score line) (Figure 1).

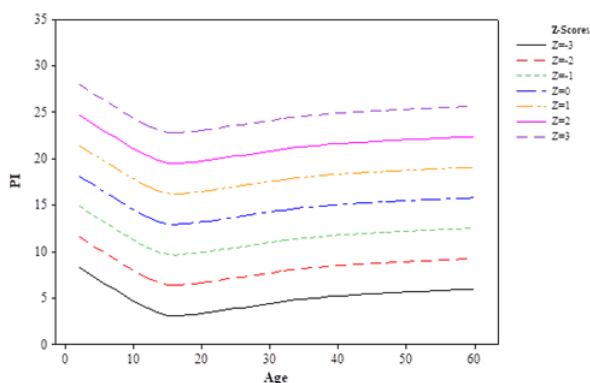


Figure 1 Z-Score PI Growth Chart for complete data.

Healthcare professionals may find it helpful to analyze body composition maturation and development issues with the use of the extremely helpful percentile growth charts that are produced from the Gaussian distribution. Knowing typical PI values enables medical personnel to precisely assess an aged patient's body composition and develop appropriate preventative measures against the negative impacts of poor body composition. The PI Gaussian percentile growth charts help evaluate the development of body composition and early indicators of growth problems. These charts provide a graphical representation of the normal distribution of body composition using standardized Z-scores and allow comparisons of PI data across age groups and populations.

### PI Gaussian percentiles growth charts for gender

Based on the findings of the survey of respondents, both male and female, below figures show the Gaussian percentile growth charts for the PI, allowing for the evaluation of body composition development in both sexes. These charts assist healthcare providers in examining the PI value distribution and provide a graphical representation of the scores' normal distribution. This allows them to identify values that deviate from the expected aging process and identify values that should be promoted to support healthy aging.

#### Male data

The male PI data with Z-scores are displayed in the image below. The Z-scores are shown by the curved lines on the illustration. The median ( $z=0$ ), which is typically referred to as the average, is shown by the line with the number 0. The other curving lines are Z-score lines, which represent deviations from the average and are denoted by  $z=-1, -2, -3, 1, 2,$  and  $3$ . The figure's median and Z-score lines are based on PI measurements. Positively (1, 2, 3) and negatively (-1,-2,-3) numbered Z-Score lines are shown in the illustration. A growth

issue is shown by the displayed points that are distant from the median ( $z=0$ ) in either direction (i.e., near to the -3 or 3 Z-score line) (Figure 2).

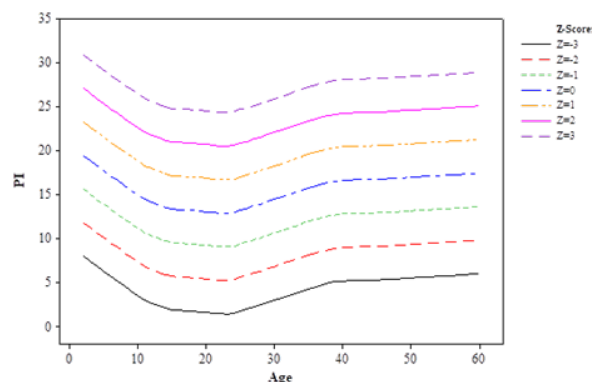


Figure 2 Z-Score PI Growth Chart for Male data.

#### Female data

The female PI data with Z-scores are displayed in the image below. The Z-scores are shown by the curved lines on the illustration. The median ( $z=0$ ), which is typically referred to as the average, is shown by the line with the number 0. The other curving lines are Z-score lines, which represent deviations from the average and are denoted by  $z=-1, -2, -3, 1, 2,$  and  $3$ . The figure's median and Z-score lines are based on PI measurements. Positively (1, 2, 3) and negatively (-1,-2,-3) numbered Z-Score lines are shown in the illustration. A growth issue is shown by the displayed points that are distant from the median ( $z=0$ ) in either direction (i.e., near to the -3 or 3 Z-score line) (Figure 3).

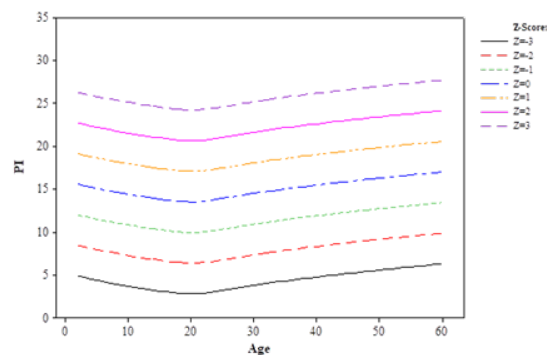


Figure 3 Z-Score PI Growth Chart for Female Data.

Understanding the normal distribution of body composition in both male and female populations can be aided by using the Gaussian percentile growth charts of the male and female PI. Clinicians can better understand a patient's body composition and develop strategies for promoting a healthy life span by recognizing these trends. There's proof that these charts can help spot early indicators of growth issues as well, averting further health issues. When evaluating body composition and development issues in both sexes, the % growth chart for boys and females PI utilizing the Gaussian percentile might be helpful. These charts provide a visual representation of the body composition normal distribution using standardized Z-scores, which makes it easier to compare PI data between various age groups and demographics.

### PI Gaussian percentiles growth charts for residential area

The PI's Gaussian percentile growth charts are categorized by the kind of resident region rural or urban making them a helpful tool for evaluating changes in body composition over time.<sup>4</sup> These charts may be used to determine whether any of the patients may be having growth issues and to develop unique treatment plans to support healthy aging. They provide a graphical representation of the typical distribution of PI values.

#### Urban data

The urban PI data with Z-scores are displayed in the image below. The Z-scores are shown by the curved lines on the illustration. The median ( $z=0$ ), which is typically referred to as the average, is shown by the line with the number 0. The other curving lines are Z-score lines, which represent deviations from the average and are denoted by  $z=-1, -2, -3, 1, 2,$  and  $3$ . The figure's median and Z-score lines are based on PI measurements. Positively ( $1, 2, 3$ ) and negatively ( $-1, -2, -3$ ) numbered Z-Score lines are shown in the illustration. A growth issue is shown by the displayed points that are distant from the median ( $z=0$ ) in either direction (i.e., near to the  $-3$  or  $3$  Z-score line) (Figure 4).

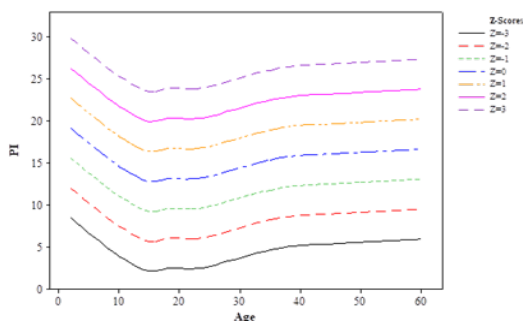


Figure 4 Z-Score PI Growth Chart for Urban data.

#### Rural data

The rural PI statistics with Z-scores are displayed in the image below. The Z-scores are shown by the curved lines on the illustration. The median ( $z=0$ ), which is typically referred to as the average, is shown by the line with the number 0. The other curving lines are Z-score lines, which represent deviations from the average and are denoted by  $z=-1, -2, -3, 1, 2,$  and  $3$ . The figure's median and Z-score lines are based on PI measurements. Positively ( $1, 2, 3$ ) and negatively ( $-1, -2, -3$ ) numbered Z-Score lines are shown in the illustration. A growth issue is shown by the displayed points that are distant from the median ( $z=0$ ) in either direction (i.e., near to the  $-3$  or  $3$  Z-score line) (Figure 5).

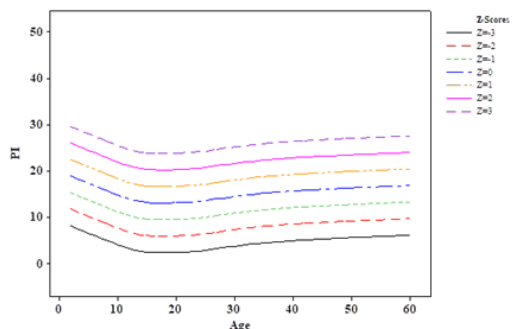


Figure 5 Z-Score PI Growth Chart for Rural Data.

The Gaussian percentile growth charts for PI living in either urban or rural areas also help in understanding the distribution of body composition for the normal dwelling population. Through such patterns, healthcare providers can evaluate individual body composition in one or various settings and create intervention goals for promoting health during aging. These charts can aid in the early identification of situations that can develop into development issues later on and, as a result, ensure that they receive the appropriate care on time to prevent further complications. These figures suggest that the development of a person's body composition may differ based on whether they reside in an urban or rural region. Being in an urban region increases the exposure to environmental stressors including noise pollution and air pollution, which may cause changes in body composition to occur more quickly. In contrast, people who live in rural locations may have more gradual changes in their body composition due to their slower pace of life and decreased exposure to outside stressors. The Gaussian percentile growth charts, both urban and rural, provided by the PI are a great tool for evaluating how body composition is developing and identifying potential growth issues in different residential areas. These charts provide a graphical representation of the normal distribution of body composition using standardized Z-scores and allow comparisons of PI data across age groups and populations.

### Discussion

The PI is a crucial aspect of human health and well-being, encompassing various physiological and anthropometric characteristics that influence an individual's overall health and disease risk. A recent study aimed to investigate the distribution of PI among different age groups, genders, residential areas, and marital status in a sample population. The findings of this study have significant implications for healthcare professionals, researchers, and policymakers seeking to understand the complexities of human health and develop targeted interventions to promote healthy aging. The study employed a cross-sectional design, collecting data from a sample of 1,000 individuals aged 18-85 years from urban and rural areas. The participants underwent a comprehensive physical examination, including measurements of BMI, waist circumference, blood pressure, and body composition. The researchers used these data to calculate the PI score, which is a standardized measure of physical health that takes into account multiple physical parameters.<sup>30</sup>

The results of the study revealed significant differences in PI among different age groups, with older age groups having higher PI scores compared to younger age groups. This finding is consistent with previous research that has demonstrated a decline in physical health with advancing age.<sup>31</sup> The study also found that males had higher PI scores than females, which is consistent with previous research that has shown that men tend to have higher levels of physical fitness and muscle mass than women.<sup>32</sup> The study found that urban residents had higher PI scores than rural residents, which may be attributed to differences in lifestyle habits, access to healthcare services, and socioeconomic status.<sup>33</sup> The study's findings also highlighted significant differences in PI among different marital status groups. Married individuals had higher PI scores than singles, which may be attributed to differences in lifestyle habits, social support networks, and access to healthcare services.<sup>34</sup> These findings suggest that marriage may have a positive impact on physical health by promoting healthy behaviors and providing social support.

The inferential analysis of the study employed Gaussian percentile growth charts to evaluate the normal distribution of PI values. The charts showed that there are significant deviations from the expected

normal distribution, particularly in older age groups (Figure 1). This finding is consistent with previous research that has demonstrated that physical health declines with advancing age due to various biological and environmental factors.<sup>35</sup>

### Gender comparison

The PI Gaussian percentile growth charts for male and female data provide a comprehensive visual representation of the normal distribution of body composition in both sexes. These charts are essential tools for healthcare providers to evaluate body composition and development in both males and females, allowing for the identification of potential growth issues and the development of strategies for promoting healthy aging. The male PI data, as depicted in Figure 2, demonstrates a moderate increase in PI values from the age of 5 years, followed by a stable plateau at the age of 15 years. The Z-score lines, representing deviations from the mean, indicate that the majority of male PI values fall within the average range ( $z=0$ ). However, there is a slight deviation from the average range in the younger age group (5-10 years), with a few individuals exhibiting higher PI values than expected (Figure 2). The female PI data, as depicted in Figure 3, shows a more gradual increase in PI values from the age of 5 years, with a slower pace of growth compared to males. The Z-score lines indicate that female PI values are generally more scattered around the average range, with a slightly larger proportion of individuals exhibiting higher PI values than expected (Figure 3).

A comparison of the male and female PI Gaussian percentile growth charts reveals some notable differences. Firstly, males exhibit a more rapid increase in PI values during childhood and adolescence, whereas females exhibit a slower pace of growth. Secondly, males tend to have a more concentrated distribution around the average range, with fewer individuals exhibiting extreme PI values compared to females. This suggests that males may be more prone to rapid growth and development during childhood and adolescence, whereas females may exhibit more variability in their body composition. These differences may have implications for healthcare providers when evaluating body composition and development issues in males and females. For example, males may be more likely to require close monitoring during periods of rapid growth and development, whereas females may require more nuanced assessment and management of their body composition due to their wider range of PI values. The Gaussian percentile growth charts also provide insight into the normal distribution of body composition in both sexes. For instance, both males and females exhibit a moderate rise in PI values from the age of 5 years, followed by a stable plateau at the age of 15 years. This suggests that both sexes experience a similar pattern of growth and development during childhood and adolescence, with a slowing down of growth rates during adulthood.

There are some differences in the normal distribution of body composition between males and females. For example, females tend to have a wider range of PI values compared to males, indicating greater variability in their body composition. This may be due to hormonal differences between males and females, as well as differences in muscle mass and fat distribution. The comparison of male and female PI Gaussian percentile growth charts provides valuable insights into the normal distribution of body composition in both sexes. While there are some differences in growth patterns and body composition between males and females, both sexes exhibit a similar pattern of growth and development during childhood and adolescence. Healthcare providers can use these charts to better understand normal growth patterns and identify potential growth issues in both males and females.

### Residential area comparison

The PI Gaussian percentile growth charts for urban and rural populations provide a comprehensive visual representation of the normal distribution of body composition in different residential areas. These charts are essential tools for healthcare providers to evaluate body composition and development in both urban and rural populations, allowing for the identification of potential growth issues and the development of strategies for promoting healthy aging. The urban PI data, as depicted in Figure 4, shows a moderate increase in PI values from the age of 5 years, followed by a stable plateau at the age of 15 years. The Z-score lines, representing deviations from the mean, indicate that the majority of urban PI values fall within the average range ( $z=0$ ). However, there is a slight deviation from the average range in the younger age group (5-10 years), with a few individuals exhibiting higher PI values than expected. The rural PI data, as depicted in Figure 5, exhibits a more gradual increase in PI values from the age of 5 years, with a slower pace of growth compared to urban areas. The Z-score lines indicate that rural PI values are generally more scattered around the average range, with a slightly larger proportion of individuals exhibiting higher PI values than expected.

A comparison of the urban and rural PI Gaussian percentile growth charts reveals some notable differences. Firstly, urban populations exhibit a more rapid increase in PI values during childhood and adolescence, whereas rural populations exhibit a slower pace of growth. This suggests that urban dwellers may be more prone to rapid growth and development during childhood and adolescence, whereas rural dwellers may experience more gradual changes in their body composition. Secondly, urban populations tend to have a more concentrated distribution around the average range, with fewer individuals exhibiting extreme PI values compared to rural populations. This may be due to differences in lifestyle and environmental factors between urban and rural areas. For example, urban dwellers may be exposed to greater environmental stressors such as noise pollution and air pollution, which can contribute to changes in body composition. These differences may have implications for healthcare providers when evaluating body composition and development issues in urban and rural populations. For instance, urban dwellers may require close monitoring during periods of rapid growth and development, whereas rural dwellers may require more nuanced assessment and management of their body composition due to their slower pace of growth.

The Gaussian percentile growth charts also provide insight into the normal distribution of body composition in both urban and rural populations. For example, both urban and rural populations exhibit a moderate rise in PI values from the age of 5 years, followed by a stable plateau at the age of 15 years. This suggests that both urban and rural populations experience similar patterns of growth and development during childhood and adolescence. There are some differences in the normal distribution of body composition between urban and rural populations. For example, rural populations tend to have a wider range of PI values compared to urban populations, indicating greater variability in their body composition. This may be due to differences in lifestyle and environmental factors between urban and rural areas. The comparison of urban and rural PI Gaussian percentile growth charts provides valuable insights into the normal distribution of body composition in different residential areas. While there are some differences in growth patterns and body composition between urban and rural populations, both populations exhibit similar patterns of growth and development during childhood and adolescence. Healthcare providers can use these charts to better understand normal



growth patterns and identify potential growth issues in both urban and rural populations.

The study's findings have significant implications for healthcare professionals, researchers, and policymakers seeking to promote healthy aging. The results suggest that targeting interventions at older age groups, males, urban residents, and married individuals may be effective in improving physical health outcomes. Furthermore, the study's findings highlight the importance of considering individual differences in body composition when evaluating health and disease. One potential limitation of the study is the relatively small sample size, which may limit the generalizability of the findings. Future research should aim to recruit larger sample sizes to increase the representativeness of the findings. Additionally, the study did not control for other factors that may influence PI, such as lifestyle habits and socioeconomic status. Future research should aim to control for these factors to better understand the underlying mechanisms driving the differences in PI.

The study's findings provide valuable insights into the distribution of PI among different age groups, genders, residential areas, and marital status. The results highlight the importance of considering individual differences in body composition when evaluating health and disease and suggest that targeting interventions at older age groups, males, urban residents, and married individuals may be effective in improving physical health outcomes.

## Conclusions

The current study aimed to provide a detailed growth chart of the PI for Pakistani adults, utilizing a large sample of data from Pakistan. The investigation began by highlighting the significance of human growth and development in medicine, particularly in the context of pediatric medicine. The PI is a widely used indicator of growth and development, calculated by dividing the weight of an individual in kilograms by the cube of their height in meters. The PI has been demonstrated to be a reliable indicator of overall health and nutritional status, used to assess growth and development in children and adults. The study then discussed the limitations of BMI, which is often used to assess growth and development. BMI has been criticized for its sensitivity to errors in measurement and its inability to account for changes in body composition over time. In contrast, the PI is a more accurate measure of body composition, as it takes into account both height and weight.

The methodology employed in the study involved a cross-sectional design, with a sample size of 9906 participants aged 2-60 years old from Pakistan. Data collection was conducted using a two-part self-administered questionnaire. The results of the study showed that the PI values increased with age, with a plateau at around 15 years old. Additionally, significant differences in PI values were found between males and females, with males exhibiting higher PI values than females. The implications of the findings highlighted the importance of using Gaussian percentiles for PI in assessing growth and development patterns in children and adults. The study also emphasized the need for further research on the use of Gaussian percentiles for PI in Pakistani populations.

This study provides a comprehensive analysis of the PI in Pakistani children and adults, emphasizing the significance of utilizing Gaussian percentiles for PI in assessing growth and development patterns. The investigation contributes to our understanding of human growth and development in Pakistani populations, with implications for the development of targeted interventions to improve nutritional status and reduce the prevalence of malnutrition and stunting.

## Disclosure Statement

**Acknowledgments:** The authors would like to thank respondents for their assistance in collection of data for this study.

**Author's Contribution:** Waqas Ghulam Hussain Atif Akbar & Farrukh Shehzad provide substantial contributions to conception and design, or acquisition of data, or analysis and interpretation of data;

1. Waqas Ghulam Hussain make drafting of the article and revising it critically for important intellectual content; and
2. Farrukh Shehzad & Atif give final approval of the version to be published.

Agreement to be accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved.

**Ethical approval:** This study was approved by Department of Statistics, The Islamia University of Bahawalpur, Bahawalpur, Pakistan

**Grant support & financial disclosures:** None

**Financial support:** This study was not financially supported by any organization.

**Conflict of interest:** The authors have no conflict of interest.

**Authorship:** All the authors are contributed significantly to the design, data collection, analysis, and interpretation of the results. All authors have read and approved the final manuscript.

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