# Using Demographic Techniques to Detect Errors in Age Based Data 

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#### Abstract

Demographic data are usually classified by age and sex, as they both are very important variables. National plans for the provision of such need as housing, food, education, health, e.t.c depend on the relevant socio - demographic statistics classified by age and sex. The importance of accurate age-sex data in demographic analysis cannot be over emphasized as there are errors associated with age and sex. As age data tend to be more inaccurate than sex data, there is need for investigation and evaluation of the quality of the data collected on age. This paper is purposely prepared to evaluate the accuracy of age reporting using the demographic and health survey 2018 for Nigeria using demographic techniques. The Whipples' and Meyer's indices as well as the United Nations AgeSex accuracy index were determined. The result of the work has shown very accurate age data reporting for all except male at age ending with " 0 " in Nigeria. For the Myer's index, the most preferred final digits are ' 5 ' and ' 0 ', while the most avoided final digit by both sexes is ' 1 '. Furthermore, the calculated age-sex accuracy index is 57.61 that qualified the age data is deficient and requires massive adjustment before they could be meaningfully used.


Keywords:- Digit preference, Whipple's index, Myer's index, Age, UN age-sex accuracy Index

## I. INTRODUCTION

Demographic analysis remains an important tool for evaluating census data, particularly in countries where independent sources of data, such as vital registration and sample surveys, are lacking or where a Post-Enumeration Survey (PES) is not conducted. Demographic data, which is the bed rock for any meaningful analysis, are usually classified by age and sex. Other parameters are often analyzed and results interpreted in relation to age. And as such, age is an important demographic variable. If any meaningful decision is to be made at any level, correct age or error free age data must be used because many decisions are age-sensitive and misrepresentation of age may lead to inappropriate action. For example, (in medicine) a screening mammography is recommended to start at age 50 and patient's inaccurate age may result in having either an unnecessary or delayed test.

The importance of accurate age-sex data in demographic analysis cannot be overemphasized. National development plans for the provision of such need as housing, food, education, health, employment, manpower, and etc, depend on the relevant socio-demographic
statistics classified by age and sex. Most population analysis like fertility and mortality are either age-sex dependent or age-sex selective (Lerche, 1983 and Kpedekpo, 1982).

The accuracy of age data collected by house-to house surveys varies in different set-ups and depends on numerous factors. This is clearly indicated in studies which describe the age-related data of census from different countries (Pardeshi, 2010). A number of errors and misstatements have been noted with respect to age-related data. Misstatement of age is a common example of content error in census and surveys. Of these irregularities, age heaping and age shifting are common phenomena. Age data frequently display excess frequencies at round or attractive ages, such as even numbers and multiples of 5 leading to age heaping. Age heaping is considered to be a measure of data quality and consistency.

In demographic studies, age misreporting is a common phenomenon (Shryock, 1976). The most common phenomenon among the irregularities is the age heaping. Age data frequently displays excess frequencies at round or attractive ages, such as even numbers and multiples of 5 leading to age heaping. Age heaping is considered to be a measure of data quality and consistency (Pardeshi, 2010).

In developing countries, the deficiencies among other problems are as the results of individual ignorance about certain personal details, also digits preference and sometimes open hostility to some types of inquiry due to ignorance (Yusuf, 2012). In Nigeria, age heaping is one of the irregularities in census/survey reporting of age. Since age misreporting is a common phenomenon in demographic studies, while the quality of data in age-sex distribution is very important in medical studies, innovative methods in data collection along with demographic techniques for evaluation of the age and sex data should be applied to ensure accuracy of the age data. The demographic evaluation techniques include Whipple's index, Myer's index and age-sex accuracy index. The Whipple's index (index of concentration), invented by the American demographer George Chandler Whipple (18661924), indicates the extent to which age data show systematic heaping on certain ages as a result of digit preference or rounding. Myer's blended index of digit preference is used for evaluating single-year age-sex data by giving the extend of digit preference for all the digits 0 , 1, 2, ..., 9 (Kpedekpo, 1982). Pardeshi (2010) has used Whipple's index and identified a large age heaping at ages ending with terminal digits ' 0 ' and ' 5 ', on a data collected during a community survey in the Yavatmal district,

Maharashtra, India. Shirley et al., (2004) have used Myer's blended index and age-sex accuracy index to evaluate age and sex data from the Census population of Provinces and Territories of Canada. The result has shown no preference or avoidance of any year of birth, and the accuracy of the age-sex population data for almost all the provinces in Canada. The Quality of age data in patients from developing countries was evaluated using Whipple's and Myer's indices (Denic et. al, 2003).

Despite the risk of misclassification of age data in medical studies, analysis on the prevalence and magnitude of age misreporting in medical studies is rarely available in Nigeria. Yusuf (2012), discovered that the age data collected for the outpatients in General Hospital Dutsin-ma were very rough in quality for both male and female outpatients. There was age heaping at ages ending with terminal digits ' 0 ' and ' 5 ', indicating a preference in reporting such ages. The result has shown that, about 86 percent of male outpatients and 88 percent of female outpatients reported ages with incorrect final digits. The evaluation of the outpatients' age data using the demographic techniques has finally qualified the data inaccurate as the results of systematic heaping and digit preference.

This study explored the Whipple's index, Myer's index and UN age-sex accuracy index to evaluate the accuracy of age and sex based data from Nigeria (DHS, 2018).

## II. MATERIALS AND METHODS

## A. Methods

The data used was from the Demographic and Health Survey (DHS), 2018 for Nigeria. The data presented according to sex and age in single years was used for both the Whipple's and Myer's indices. The data was then
interpolated for five-year for the UN age-sex accuracy index.

## B. Statistical Analysis

Age heaping and digit preference were measured by calculating Whipple's index and Myers' blended index. Age accuracy index was also calculated.

The analyses performed are:

## > Whipple's Index:

Whipple's index is applicable where age is reported in single-years. It gives the relative preference for digits ' 0 ' and ' 5 ' while reporting age in the interval 23 and 62 years (Kpedekpo, 1982). It is computed as

Whipple'sIndex $=\frac{\sum\left(P_{25}+P_{30}+P_{35}+\ldots+P_{60}\right)}{1 / 5 \sum\left(P_{25}+P_{30}+P_{35}+\ldots+P_{60}\right)} \times 100$
(1)

To evaluate for ages ending with ' 0 ', i.e. $30,40,50$ and 60, the index is calculated as

$$
\begin{equation*}
\text { Whipple'sIndex }=\frac{\sum\left(P_{30}+P_{40}+\ldots+P_{60}\right)}{1 / 5 \sum\left(P_{25}+P_{30}+P_{35}+\ldots+P_{60}\right)} \times 100 \tag{2}
\end{equation*}
$$

To evaluate for ages ending with ' 5 ', i.e. $25,35,45$ and 55 , the index is calculated as

$$
\begin{equation*}
\text { Whipple'sIndex }=\frac{\sum\left(P_{25}+P_{35}+P_{45}+P_{55}\right)}{1 / 5 \sum\left(P_{25}+P_{30}+P_{35}+\ldots+P_{60}\right)} \times 100 \tag{3}
\end{equation*}
$$

If there is no heaping at age reporting ending with ' 0 ' and ' 5 ', the index will have a value of 100 . If there is complete heaping, the index will have a value of 500 . Therefore, the value of Whipple's Index (WI) for each enddigit lies between zero (when no person is reported at ages ending with the end-digit) and 500 when every person was reported at ages with the end-digit

| Whipple's Index | Quality of data | Deviation from |
| :---: | :---: | :---: |
| $<105$ | Very Accurate | $5 \%$ |
| $105-110$ | Relatively Accurate | $5-9.99 \%$ |
| $110-125$ | Ok | $10-24.99 \%$ |
| $125-175$ | Bad | $25-74.99 \%$ |
| $>175$ | Very Bad | $\geq 75 \%$ |

Table 1: The united nations' recommendation for measuring age heaping as identified by whipple's index

## > Myer's Blended Index

This index is used for evaluating single-year age-sex data. It gives the extent of digit preference for all digits 0 , $1,2,3, \ldots, 9$. It can be used to report errors for all ages $10-$ 89 years (Kpedekpo, 1982). The underlined assumption of this method is that in the absence of systematic irregularities in the reporting of age, the blended sum at each terminal digit should be approximately equal to $10 \%$ of the total blended population. If the sum at any given digit exceeds $10 \%$ of the total blended population, it indicates over selection of ages ending in that digit (digit preference). On the other hand a negative deviation (or sum that is less than $10 \%$ of the total blended population) indicates under-selection of the ages ending in that digits (digit avoidance). If age heaping is non-existent, the index
would be approximately 0 (Kpedekpo, 1982). The procedure for computation is as follows:

- Sum all the population ending in each terminal digit over the whole range for the ages $10-89$.
- Sum all the population ending in each terminal digit over the whole range for the ages $20-89$.
- Multiply the sums of ages at each terminal digit in (1) above by co-efficient, 1,2,3,4,5,6,7,8,9,10.
- Multiply the sums of ages at each terminal digit in (2) above by co-efficient $9,8,7,6,5,4,3,2,1,0$.
- Add the product of (3) and (4) above to obtain the blended sum at each terminal digit.
- Add up the blended sum in (5) above.
- Find the percentage of the blended sum at each terminal digit to the total of the blended sum.
- Find the deviation of the percentage distribution from 10.
$>$ Ages-Sex Accuracy Index (Joint Score)
This index measures the level of quality of age-sex population data. It employs the age ratios and the sex ratios simultaneously (Kpedekpo, 1982), and computed as:

$$
V S=A R S M+A R S F+3(S R S)
$$

JS $=$ Joint Score

> ARSM $=$ Age Ratio Score for Male
> ARSF = Age Ratio Score for Female

The United Nation (UN) scaling for estimating the reliability of the data is:

- Reliable if JS < 20
- Usable with adjustment if $20 \leq J S \leq 40$
- Deficient and requires massive adjustment before use and interpreted with care and caution if $40 \leq J S \leq 60$ and
- Grossly erroneous and risky to utilize for any inference if $\mid S>60$


## > Age Ratios

Age ratio is usually defined as the ratio of the population in the given age group to one half of the population in the two adjacent groups.

## Mathematically,

Let $\sqrt{5} P_{x}$ be the age group from age $x$ to age $x+5$, ${ }_{5} P_{x-5}$ and ${ }_{5} P_{x+5}$ be the preceding and the following age groups respectively, then,

$$
\begin{equation*}
\text { Age ratio }=\frac{{ }_{5} P_{x}}{1 / 2\left({ }_{5} P_{x-5}+{ }_{5} P_{x+5}\right)} \times 100 \tag{5}
\end{equation*}
$$

The discrepancy at each computed age group when compared with the expected value (which is usually 100) is a measure of net age misreporting. An age accuracy index is derived by taking the absolute average deviation from

100 of the age ratios and summing over all the age groups. (The overall measure of the accuracy of an age distribution, called an age accuracy index.

## > Sex Ratios

The sex ratios or age specific sex ratios (number of males per 100 females in each age group) is defined as the ratio of the population of males in the given age group to the population of females in that given age group.

Mathematically,
Let ${ }_{5} P_{x}^{m}$ be male aged $x$ to age $x+5$ and ${ }_{5} P_{x}^{f}$ be female aged $x$ to age $x+5$

Age specific sexratio $=\frac{{ }_{5} P_{x}^{m}}{{ }_{5} P_{x}^{f}} \times 100$
(6)

When the age specific sex ratio is summed over successive absolute differences between one age group and the next one, the average of the summation is called the sex accuracy index (Kpedekpo, 1982)

## III. RESULT

The data consisting of the age and sex distributions of Nigeria was obtained from the Demographic and Health Survey (DHS), 2018. Various demographic techniques discussed were employed to evaluate and discuss the accuracy of the age and sex data.

## A. Whipple's Index

The total female population in the age group ' $23-62$ ' was 35512 . The total male population in the age group ' $23-$ 62 ' was 32023 . Among them, the population reporting age ending in ' 0 ' was 6149 (female), 6063 (Male) and those reporting age with the terminal digit of ' 5 ' were 7393 (female), 6211 (male). Thus, Whipple's index for age with terminal digit ' 0 ', was 86.58 (female) and 94.67 (male). Whipple's index for age with terminal digit ' 5 ', was 104.09 (female) and 96.98 (male).

Table 2 shows the Whipple's indices and their corresponding interpretations

| DIGIT END | FEMALE | MALE |
| :---: | :---: | :---: |
| $\mathbf{0}$ | 86.58 | 94.67 |
|  | (Highly Accurate) | (Highly Accurate) |
| $\mathbf{5}$ | 104.09 | 96.98 |
|  | (Highly Accurate) | (Highly Accurate) |

Table 2: Whipple's indices and their corresponding interpretation
B. Myer's Blended Index

Myer's blended index of digit preference is used for evaluating single-year age-sex data by giving the extend of digit preference for all the digits $0,1,2, \ldots, 9$. The computation for Myer's index

| Terminal <br> Digits | Sum of ages <br> $\mathbf{1 0 - 6 9}$ | coefficients | Product | Sum of ages <br> $\mathbf{2 0}-\mathbf{- 6 9}$ | coefficient |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 11951 | 1 | 11951 | 8682 | 9 |
| 1 | 4477 | 2 | 8954 | 2734 | 8 |
| 2 | 7288 | 3 | 21864 | 4616 | 7 |
| 3 | 5681 | 4 | 22724 | 3409 | 6 |
| 4 | 4208 | 5 | 21040 | 2696 | 5 |
| 5 | 10048 | 6 | 60288 | 7949 | 4 |
| 6 | 4453 | 7 | 31171 | 2850 | 3 |
| 7 | 4667 | 8 | 37336 | 3039 | 2 |
| 8 | 6184 | 9 | 55656 | 4071 | 1 |
| 9 | 3352 | 10 | 33520 | 2076 | 0 |
|  |  |  |  |  |  |

Table 3: (a) myer's blended index (female)

| Terminal <br> Digits | Product | Blended <br> Sum | $\boldsymbol{\%}$ <br> Distribution | Deviation from <br> $\mathbf{1 0}$ | Remark |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 78138 | 90089 | 17.28 | 7.28 | Preference |
| 1 | 21872 | 30826 | 5.91 | -4.09 | Avoidance |
| 2 | 32312 | 54176 | 10.39 | 0.39 | Preference |
| 3 | 20454 | 43178 | 8.28 | -1.72 | Avoidance |
| 4 | 13480 | 34520 | 6.62 | -3.38 | Avoidance |
| 5 | 31796 | 92084 | 17.67 | 7.67 | Preference |
| 6 | 8550 | 39721 | 7.62 | -2.38 | Avoidance |
| 7 | 6078 | 43414 | 8.33 | -1.67 | Avoidance |
| 8 | 4071 | 59727 | 11.46 | 1.46 | Preference |
| 9 | 0 | 33520 | 6.43 | -3.57 | Avoidance |
|  |  | 521255 | 100.00 |  |  |

Table 4: myer's blended index (female) (....contd)
The result (from table III) revealed that there is over selection of ages ending with digits ' 0 ' and ' 5 ' with the respective preferences of $17.28 \%$ and $17.67 \%$. However, the ages ending with ' 1 ' have the highest avoidance, followed by ages ending with ' 9 ' and ' 4 '.

| Terminal <br> Digits | Sum of <br> ages <br> $\mathbf{1 0}-\mathbf{6 9}$ | coefficients | Product | Sum of <br> ages <br> $\mathbf{2 0}-\mathbf{6 9}$ | coefficient |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 11093 | 1 | 11093 | 7885 | 9 |
| 1 | 4250 | 2 | 8500 | 2431 | 8 |
| 2 | 6843 | 3 | 20529 | 4195 | 7 |
| 3 | 5159 | 4 | 20636 | 2999 | 6 |
| 4 | 4270 | 5 | 21350 | 2445 | 5 |
| 5 | 9127 | 6 | 54762 | 6909 | 4 |
| 6 | 4319 | 7 | 30233 | 2806 | 3 |
| 7 | 4367 | 8 | 34936 | 2805 | 2 |
| 8 | 5448 | 9 | 49032 | 3554 | 1 |
| 9 | 2827 | 10 | 28270 | 1826 | 0 |
|  |  |  |  |  |  |

Table 5: myer's blended index (male)

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| Terminal Digits | Product | Blended Sum | \% Distribution | Deviation from 10 |  |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 70965 | 82058 | 17.29 | 7.29 | Preference |
| 1 | 19448 | 27948 | 5.89 | -4.11 | Avoidance |
| 2 | 29365 | 49894 | 10.51 | 0.51 | Preference |
| 3 | 17994 | 38630 | 8.14 | -1.86 | Avoidance |
| 4 | 12225 | 33575 | 7.08 | -2.92 | Avoidance |
| 5 | 27636 | 82398 | 17.36 | 7.36 | Preference |
| 6 | 8418 | 38651 | 8.14 | -1.86 | Avoidance |
| 7 | 5610 | 40546 | 8.54 | -1.46 | Avoidance |
| 8 | 3554 | 52586 | 11.08 | 1.08 | Preference |
| 9 | 0 | 28270 | 5.96 | -4.04 | Avoidance |
|  |  | 474556 | 100.00 |  |  |

Table 6: MYER'S BLENDED INDEX (MALE) (.....contd)
Table IV shows the computation of male population from Nigeria DHS, 2018. The result has also shown the over selection of ages ending with digits ' 0 ' and ' 5 ' with the respective preferences of $17.29 \%$ and $17.36 \%$. Similarly, the ages ending with ' 1 ' have the highest avoidance, followed by ages ending with ' 9 '.


Fig. 1: Pattern of Deviation from the Expected 10\% for Female


Fig. 2: Myer's Indices for Female


Fig. 3: Pattern of Deviation from the Expected $10 \%$ for Male


Fig. 4: Myer’s Indices for Male
Figure 1-4 describe the deviations of the percentage of the blended population from 10 among each of the terminal digits. The most preferred terminal digits while reporting ages were ' 0 ' and ' 5 ' for both male and female population.
C. Age-Sex Accuracy Index (Joint Score)

| 1 | 2 | 3 | 4 |
| :---: | :---: | :---: | :---: |
| Age (in 5 yrs) | Female | Age Ratio | Deviation from 100 |
| 0-4 | 15647 |  |  |
| 5-9 | 15407 | 113.64 | 13.64 |
| 10-14 | 11468 | 95.07 | -4.93 |
| 15-19 | 8719 | 93.67 | -6.33 |
| 20-24 | 7149 | 86.57 | -13.43 |
| 25-29 | 7798 | 115.07 | 15.07 |
| 30-34 | 6404 | 95.72 | -4.28 |
| 35-39 | 5583 | 108.18 | 8.18 |
| 40-44 | 3918 | 88.31 | -11.69 |
| 45-49 | 3290 | 93.81 | -6.19 |
| 50-54 | 3096 | 114.20 | 14.20 |
| 55-59 | 2132 | 91.38 | -8.62 |
| 60-64 | 1570 | 94.75 | -5.25 |
| 65-69 | 1182 |  |  |
| Total (irrespective of sign) |  |  | 111.81 |
| Mean |  |  | 9.3175 |
| UN Joint Score |  |  |  |
| 5 | 6 | 7 | 8 |
| $\begin{gathered} \text { Age } \\ \text { (in } 5 \mathrm{yrs} \text { ) } \\ \hline \end{gathered}$ | Male | Age Ratio | Deviation from 100 |
| 0-4 | 16305 |  |  |
| 5-9 | 15935 | 113.96 | 13.96 |
| 10-14 | 11660 | 96.67 | -3.33 |
| 15-19 | 8188 | 96.90 | -3.10 |
| 20-24 | 5240 | 77.12 | -22.88 |
| 25-29 | 5401 | 100.95 | 0.95 |
| 30-34 | 5460 | 101.24 | 1.24 |
| 35-39 | 5385 | 109.80 | 9.80 |
| 40-44 | 4349 | 97.91 | -2.09 |
| 45-49 | 3499 | 99.07 | -0.93 |
| 50-54 | 2715 | 97.14 | -2.86 |
| 55-59 | 2091 | 85.24 | -14.76 |
| 60-64 | 2191 | 121.22 | 21.22 |
| 65-69 | 1524 |  |  |
| Total (irrespective of sign) |  |  | 97.12 |
| Mean |  |  | 8.09 |
| UN Joint Score |  |  |  |


| 9 <br> Age <br> (in 5 yrs) | $\mathbf{1 0}$ | $\mathbf{1 1}$ |
| :---: | :---: | :---: |
| $0-4$ | Sex ratio | First difference |
| $5-9$ | 95.96 | -0.72 |
| $10-14$ | 96.69 | -1.67 |
| $15-19$ | 98.35 | -8.13 |
| $20-24$ | 106.49 | -29.95 |
| $25-29$ | 136.43 | -7.95 |
| $30-34$ | 144.38 | 27.09 |
| $35-39$ | 117.29 | 13.61 |
| $40-44$ | 103.68 | 13.59 |
| $45-49$ | 90.09 | -3.94 |
| $50-54$ | 94.03 | -20.01 |
| $55-59$ | 114.03 | 12.07 |
| $60-64$ | 101.96 | 30.30 |
| 65-69 | 71.66 | -5.90 |
| Total (irrespective of sign) |  | $\mathbf{1 7 4 . 2 1}$ |
| Mean |  | $\mathbf{1 3 . 4 0}$ |
| UN Joint Score |  | $\mathbf{5 7 . 6 1}$ |

Table 7: Results of age ratios, sex ratios and joint score
The Joint Score for Nigeria is 57.61 The implication of this is that the data is deficient and requires massive adjustment.


Fig. 5: Pattern of Age ratio
Figure 5 shows the patterns in the reporting of age ratio for sex by 5-years age group in Nigeria using the NDHS, 2018


Fig. 6: Pattern of Sex ratio
Figure 6 shows the patterns in the reporting of sex ratio in Nigeria using the NDHS, 2018

## IV. CONCLUSION

The age data collected from the Demographic and Health Survey, 2018 for Nigeria. The data for the separate age end-digit were highly accurate quality. There was age heaping at ages ending with terminal digits ' 0 ' and ' 5 ', indicating a preference in reporting such ages. The evaluation of the age data using the demographic techniques has finally qualified the data inaccurate as the results of systematic heaping and digit preference. The UN Joint Score revealed that the data from the data is deficient and requires massive adjustment before they could be meaningfully used, and any interpretation with the data should be with care and caution. It is hereby recommended that the data be adjusted to remove the irregularities

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