

# Evaluating the completeness of death registration at old ages: A new method and its application to developed and developing countries\*

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# Abstract

This paper focuses on assessing the performance of the methods for evaluating the completeness of death registration at old ages in developed and developing countries.

Standard analytical methods to evaluate death registration rely on two or more population censuses, and assume no migration and/or no or similar census errors. This paper analyzes how much such evaluation is affected when these two assumptions are violated; and introduces the intercensal cohort survival evaluation (ICSE) to check the consistency between the results based on two successive censuses and expected deaths. It provides the conditions under which census populations can be used for such purpose. Since migrations are often negligible at older ages, the paper focuses on the evaluation of deaths at older ages (i.e., 60 years and over). The paper examines the application of the ICSE method and other death distribution methods to a subset of developed and developing countries.

A key finding is that given the levels of census error, the lower the mortality level, the larger the evaluation error through such analytical approaches and vice versa. The study finds that a small relative error in enumerating population in the censuses leads to a large relative error in estimating deaths or in evaluating the completeness of death registration, and over-evaluation errors tend to appear more often than under-evaluation errors.

The analysis leads to two conclusions: (1) existing analytical methods are too sensitive to enumeration errors to provide useful results when mortality is low and completeness is high (e.g., in developed countries), but (2) analytical methods can provide useful results for older ages in situations where mortality is not low and completeness is not high (e.g., many developing countries) because the incompleteness of death registration is much greater than the range of errors in population enumerations.

Keywords: Mortality, deaths, civil registration, vital statistics, old ages, evaluation, census, errors

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## I. INTRODUCTION

In 2015-2020, 64 per cent of deaths worldwide are estimated to take place at age 60 years and older (United Nations, 2019). During this period, 37 million out of an annual average total of 57 million deaths occurred in that age group. Complete registration of deaths is still not universal and only 55% of countries and areas have at least 90% coverage (United Nations, 2017). Assessing the completeness of death registration plays an important part in preparing population estimates.

Analytical evaluations of the completeness of death registration (DR) originate from stable population models. In stationary populations, the number of deaths at or above a given age is the number of persons in the population at the given age. Therefore, the number of registered deaths at or above a certain age could be evaluated by comparing them with the number of persons at this age, if the population is stationary. In a stable population, the number of deaths at or above a given age is the number of persons in the population at the given age minus an additional term, which is the product of the number of persons in the population at or above the given age and the growth rate of the stable population. This relationship was first utilized by Brass (1975), to evaluate the completeness of DR. Using the growth rates by age obtained from two successive censuses, the evaluation was extended to non-stable populations by Preston and Hill (1980), Bennett and Horiuchi (1981), and Hill (1987). These evaluations are sophisticated and require various assumptions, among which two are common and fundamental. The first is that there is no migration; and the second is that there are no census errors. Since the two fundamental assumptions are unrealistic in most situations, the various types of errors that would be caused by the aforementioned approach require further investigation.

The purposes of this paper are to analyse the evaluation errors when these two fundamental assumptions (i.e., no migration and/or no or similar census errors) are violated; and to propose the intercensal cohort survival evaluation (ICSE) to address problems that occur in evaluating the completeness of DR in highly developed countries. Subtracting the number of survivors in a certain old age group in the first census from the number of individuals in that cohort in the first census gives the number of deaths computed by ICSE. The number of *registered* deaths that occurred to the same cohort can be counted using Lexis triangles (United Nations, 2004), or estimated using assumptions such as even distribution over age and across time. <sup>1</sup> The completeness of DR is evaluated as the ratio of the corresponding number of DR deaths to the ICSE-computed number of deaths. The ICSE is based on the survival process, not on a balance of growth process. It provides a simple comparison procedure to check the consistency between the results based on two successive censuses and expected deaths.

The first difference between ICSE and other methods, such as the General Growth Balance method (Hill, 1987) and the Variable-r method (Bennett and Horiuchi, 1981), is that ICSE does not contain complex relationships. The effects of census error can be assessed and the assumption that census error is zero (or that the errors in the two censuses are similar) can be confirmed. The second difference is that ICSE focuses

<sup>&</sup>lt;sup>1</sup> In the case of the deaths of Japanese males aged 60-64 between 2000-2004, the error of assuming an even distribution when transforming deaths by 5-year period and 5-year age group into cohort deaths for the corresponding 5-year period is 0.25 per cent (based on data from the Human Mortality Database).

on old ages, so the required assumption of zero migration should not be far off the mark because at old ages, such as 60 years and over, numbers of migrants are usually negligible compared to deaths.

# II. PROBLEMS WITH THE APPLICATION OF THE ICSE METHOD TO HIGH QUALITY DATA

The use of the ICSE method is expected to provide reasonable results for countries with sufficiently high-quality census data. The Human Mortality Database (HMD), for instance, covers 38 countries (or areas) where death registration and census data are virtually complete and provides a high-quality dataset commonly used as a benchmark for further research. Unfortunately, the application of the ICSE method to a subset of HMD countries provided inconclusive results.

In the HMD, populations according to age group on 1 January of years 2000 and 2010, for instance, are estimated from corresponding censuses and can be conveniently used to match the period in which deaths are registered annually. Any conceptual or definitional issues about respective data sources have already been resolved by country teams through the HMD method protocol. For example, the numbers of Japanese men aged 60-64 on 1 January 2000 and aged 70-74 on 1 January 2010 are estimated in the HMD, using data from the 2000 and 2010 censuses, and the numbers of deaths by age are collected annually between 2000 and 2010 by the Japanese DR system. Applying ICSE to these data, however, would suggest that the DR over-registered male deaths by 18 per cent, which is implausible and makes the evaluation meaningless.

Choosing Japan as an example is useful because Japan is one of the few countries that collected data not only on in-migration, but also on out-migration. At ages 60-74 years, the annual net international male migration was estimated to be less than 0.01 per cent of the population (National Institute of Population and Social Security Research, 2002), which, cumulated over the ten years between 2000 and 2010, accounts for less than 0.1 per cent of the population. In other words, the effect of migration is equivalent to less than 0.1 per cent error in the population of one census. According to the results of the Post-Enumeration Survey (PES) of the 2010 census (Statistics Bureau of Japan, 2013), the census errors at ages 60-64, 65-69 and 70-74 are 1.44 per cent, 1.14 per cent and 0.92 per cent, respectively. Thus, the effect of census error is 10 times larger than that of migration. If the 2000 census errors under counted the population aged 60-64 by 1.44 per cent and the 2010 census over-counted the population aged 70-74 by 0.92 per cent, the result of ICSE would be that the DR system over-registered deaths by less than 1 per cent if the completeness is close to 100 per cent.

How can such a small census error (for example, 1.5 per cent) cause such a large degree of error (in the example above, 18 per cent) with the application of ICSE? The quality of Japan's census data is high. If the census errors make the application of ICSE meaningless for Japan, what about other countries? An answer is offered later in the paper.

A further issue is that for many indirect estimation methods, mortality levels are estimated using the population numbers in two successive censuses. Can such estimates be accurate and useful? An answer is provided in Appendix A.

# III. THE DIFFERENT TYPES OF ERRORS IN USING INTERCENSAL COHORT SURVIVAL EVALUATION (ICSE)

The previous section discussed the nature of the problem of applying the ICSE method to high quality data. The present section investigates in more theoretical and algebraic terms the 'source' of the problem.

Let the number of persons in a given age interval enumerated in the first census be  $p_1$  and the number of survivors in the next census be  $p_2$ . Further, let the net undercounting rates<sup>2</sup> be  $u_1$  and  $u_2$  for the first and second censuses, respectively. Neglecting intercensal migration, the numbers of deaths ( $\hat{d}$ ) and estimated deaths ( $\hat{d}$ ) by cohort are:

$$d = p_1 - p_2,$$
  

$$\hat{d} = \hat{p}_1 - \hat{p}_2 = p_1(1 - u_1) - p_2(1 - u_2) = d - (p_1u_1 - p_2u_2).$$
(1)

Furthermore, let the survival ratio be:

$$s = p_2 / p_1. \tag{2}$$

Then, the relative error in estimating the number of deaths is:

$$E_{d} = \frac{\hat{d} - d}{d} = -\frac{p_{1}u_{1} - p_{2}u_{2}}{d} = -\frac{p_{1}[u_{1} - s \cdot u_{2}]}{p_{1}(1 - s)} = -\frac{u_{1} - s \cdot u_{2}}{(1 - s)}.$$
(3)

Now, consider death registration (DR) and let the number of registered deaths be  $d_R$ . Then, the completeness of DR, namely *c*, and the evaluated completeness of DR,  $\hat{c}$ , are:

$$c = \frac{d_R}{d},$$

$$\hat{c} = \frac{d_R}{\hat{d}}.$$
(4)

And the relative error of evaluating the completeness of DR is:

$$E_{c}(s,u_{1},u_{2}) = \frac{\hat{c}-c}{c} = \frac{\hat{c}}{c} - 1 = \frac{d}{\hat{d}} - 1 = \frac{1}{1+E_{d}} - 1 = \frac{-E_{d}}{1+E_{d}} = \frac{u_{1}-s \cdot u_{2}}{1-s - u_{1} + su_{2}},$$
(5)

which is a function of mortality level (s) and census errors.

 $<sup>^2</sup>$  The net undercount rate represents the relative difference between the reported and the true numbers of population, which could be the result of misreporting of people or misreporting of age. A positive net undercounting rate indicates net under-counting or that the reported number is smaller than the true number. The net undercount rate could also be negative to reflect net over-counting that may or may not be caused by misreporting of age.

#### A. IDEAL CENSUS ERRORS

Obviously, when  $u_1 = u_2 = 0$  or  $u_1 = s \cdot u_2$ , (5) yields  $E_c(s, u_1, u_2) = 0$ . In other words, when census errors are zero or are similar between the two censuses, the ICSE result would be perfect. But the  $u_1 = u_2 = 0$  or  $u_1 = s \cdot u_2$ , or other similar requirements that are taken as assumptions for using various models to evaluate the completeness of DR, are unrealistic and cannot explain evaluation errors in practice.

The following section investigates the causes of unreasonable results from applying ICSE, such as the 18 per cent "over registration" of Japanese male deaths.

## B. MARGINAL EFFECTS OF CENSUS ERRORS

According to (5), we have:

$$\frac{\partial E_{c}(s, u_{1}, u_{2})}{\partial u_{1}} = \frac{1-s}{\left[1-s-u_{1}+s \cdot u_{2}\right]^{2}} > 0,$$

$$\frac{\partial E_{c}(s, u_{1}, u_{2})}{\partial u_{2}} = \frac{-s(1-s)}{\left[1-s-u_{1}+s \cdot u_{2}\right]^{2}} < 0.$$
(6)

Therefore, for  $u_1, u_2 > 0$ ,<sup>3</sup>

$$\begin{split} E_{c}(s,u_{1},u_{2}) &\approx E_{c}(s,0,u_{2}) + u_{1} \frac{\partial E_{c}(s,u_{1},u_{2})}{\partial u_{1}} \Big|_{u_{1}=0} > E_{c}(s,0,u_{2}), \\ E_{c}(s,u_{1},u_{2}) &\approx E_{c}(s,u_{1},0) + u_{2} \frac{\partial E_{c}(s,u_{1},u_{2})}{\partial u_{2}} \Big|_{u_{2}=0} < E_{c}(s,u_{1},0), \\ E_{c}(s,0,u_{2}) < E_{c}(s,u_{1},u_{2}) < E_{c}(s,u_{1},0) \end{split}$$
(7)

Thus, in general  $E_c(s, u_1, u_2)$  lies between two marginal values, which are:

$$E_{c}(s,u_{1},0) = \frac{u_{1}}{1-s-u_{1}},$$
(8)

and

$$E_{c}(s,0,u_{2}) = \frac{-s \cdot u_{2}}{1-s+s \cdot u_{2}}.$$
(9)

Given  $u_1$  and  $u_2$ ,  $E_c(s, u_1, 0)$  or  $|E_c(s, 0, u_2)|$  will increase with s and could be quite large when s is large. When  $u_2 = 0$ , (8) could explain the unreasonable "over registrations" of Japanese male deaths. The

<sup>&</sup>lt;sup>3</sup> For  $u_1 < 0$  or  $u_2 > 0$ , the analysis can be done in the same way.

s of Japanese men in the above example is about 0.866. Thus, plausibly taking  $u_1 = 0.02$ , (8) shows  $E_c(s, u_1, 0) = 0.18$  and explains why the unreasonable result for Japan occurs. On the other hand, if  $u_1 = 0$ , (9) could explain "under registrations", which can also be quite large when s is large. Taking also the above example of Japanese women and assuming  $u_2 = 0.02$ , (9) shows  $E_c(s, 0, u_2) = -0.15$ .

In general, the evaluation error described by (5) depends on  $u_1$  and  $u_2$ , and will be between that of (8) and (9).

### C. THE EFFECT OF MORTALITY LEVEL

Knowledge about what factors affect the evaluation of DR is limited. Studies have been carried out through simulations (Hill and others, 2009; Murray and others, 2010; Palloni and others, 2015). As implied by the analytical framework introduced above, the idea that the mortality level affects the evaluation of DR completeness is a new finding that has remained unidentified by previous works. How the level of mortality affects the evaluation of DR is described by equations (7)-(9), which indicate that when the mortality level is lower (or s is larger), evaluation errors are bigger and vice versa. For the purpose of illustration, selective values of ICSE error are shown in Table 1, which indicates how the error increases (in absolute value) with the ratio of survival from age group 60-64 to age group 70-74 (s) at different levels of census error. For example, if  $u_1 = (1-s) = 0.05$  and  $u_2 = 0$ , the under-enumeration of 5 per cent of the population in the first census will just offset the 5 per cent deaths among the population. Consequently, the evaluated deaths will be zero. The evaluation error will be infinite regardless of the number of registered deaths, which is shown as 'INF' in Table 1.

| Survival ratio s            | 0.5  | 0.55 | 0.6  | 0.65 | 0.7   | 0.75  | 0.8   | 0.85  | 0.9   | 0.95  |
|-----------------------------|------|------|------|------|-------|-------|-------|-------|-------|-------|
| Value of $u_1$ ( $u_2=0$ )  |      |      |      |      |       |       |       |       |       |       |
| 0.01                        | 2.0  | 2.3  | 2.6  | 2.9  | 3.4   | 4.2   | 5.3   | 7.1   | 11.1  | 25.0  |
| 0.02                        | 4.2  | 4.7  | 5.3  | 6.1  | 7.1   | 8.7   | 11.1  | 15.4  | 25.0  | 66.7  |
| 0.03                        | 6.4  | 7.1  | 8.1  | 9.4  | 11.1  | 13.6  | 17.6  | 25.0  | 42.9  | 150.0 |
| 0.04                        | 8.7  | 9.8  | 11.1 | 12.9 | 15.4  | 19.0  | 25.0  | 36.4  | 66.7  | 400.0 |
| 0.05                        | 11.1 | 12.5 | 14.3 | 16.7 | 20.0  | 25.0  | 33.3  | 50.0  | 100.0 | INF   |
| Values of $u_2$ ( $u_1=0$ ) |      |      |      |      |       |       |       |       |       |       |
| 0.01                        | -1.0 | -1.2 | -1.5 | -1.8 | -2.3  | -2.9  | -3.8  | -5.4  | -8.3  | -16.0 |
| 0.02                        | -2.0 | -2.4 | -2.9 | -3.6 | -4.5  | -5.7  | -7.4  | -10.2 | -15.3 | -27.5 |
| 0.03                        | -2.9 | -3.5 | -4.3 | -5.3 | -6.5  | -8.3  | -10.7 | -14.5 | -21.3 | -36.3 |
| 0.04                        | -3.8 | -4.7 | -5.7 | -6.9 | -8.5  | -10.7 | -13.8 | -18.5 | -26.5 | -43.2 |
| 0.05                        | -4.8 | -5.8 | -7.0 | -8.5 | -10.4 | -13.0 | -16.7 | -22.1 | -31.0 | -48.7 |
|                             |      |      |      |      |       |       |       |       |       |       |

TABLE 1. EVALUATION ERRORS (PERCENTAGE) OF ICSE BY SURVIVAL RATIO (S) AND CENSUS ERROR

This conclusion is not difficult to understand. When the mortality level is low, a small number of deaths is estimated based on large population numbers. Therefore, a small relative error in enumerating population in the censuses will lead to a large relative error in estimating deaths or in evaluating the completeness of DR. This conclusion similarly applies to the death distribution methods (DDM) that also use the census population numbers to estimate the number of deaths.

The conclusion is supported by the ICSE assessments in Figure 1, using data on population and death from HMD, assuming that the completeness of DR is close to 100 per cent for different old age intervals (e.g., 60-74, 65-79, 70-84). Female mortality is generally lower than male mortality at those ages. Consequently, the ICSE errors for females are larger than those for males. Likewise, mortality levels at younger ages are lower than at older ages. Therefore, the ICSE errors at younger ages are larger than at older ages.

Since it is highly likely that DR is almost 100 per cent complete in the countries in Figure 1, any estimate significantly different from 100 per cent completeness must be considered suspect. Figure 1 therefore indicates that for the highly developed countries, ICSE is unable to provide reasonable evaluations of survival from age 60-64 to 70-74) or at still older ages. This raises the question: can ICSE work at all? The conditions for ICSE to work are illustrated below.



Figure 1. Percentage of ICSE completeness of death registration by sex and age group, selected developed countries 2000-2010

Source: computations by the authors based on HMD data

Canada

France

Germany

# IV. APPROPRIATE CONDITIONS FOR USING INTERCENSAL COHORT SURVIVAL EVALUATION (ICSE)

Italy

UK

Japan

US

The census errors at age 60 or over in the 2010 census of Japan are slightly greater than 1 per cent on average. Assuming that the quality of the Japanese census is higher than the other developed countries compared in Figure 1, it can be expected that, in general, census errors at age 60 or over are 1 per cent.

Using  $u_1 = u_2 = 0.01$ , the ranges of ICSE assessment error are described by (8)-(9) as functions of survival ratio and depicted in Figure 2.



Figure 2. The range of ICSE assessment error with one per cent census error

*Note:*  $E_c(s, u_1, u_2)$  is the relative error of evaluating the completeness of DR which is a function of mortality level (s) and errors in the first and second censuses ( $u_1$  and  $u_2$ ).

When the completeness of death registration is high, so that only very small evaluation errors are acceptable, or when the level of mortality is low, so that the evaluation errors are large, the ICSE method cannot provide a reasonable result for old ages because the incompleteness is significantly smaller than the error range. This explains the problems encountered when applying the ICSE method to the HMD countries in recent years. Consequently, the ICSE method should not be applied to developed countries, at least for recent years.

When the completeness is not high, so that moderate evaluation errors are acceptable and when the level of mortality is not low, so that the evaluation errors are not large, the ICSE method could provide a reasonable result for older ages such as 60 years or over because the incompleteness is much greater than the error range. This is the situation of many developing countries in recent and earlier years. Consequently, the ICSE method remains applicable to developing country conditions.

The two curves in figure 2 are not symmetric to level 0, and the marginal errors of over-evaluation (positive) are larger than the absolute value of the marginal errors of under-evaluation. This feature indicates that when the errors in the two censuses are similar, the over-evaluating effect would be bigger than the under-valuating effect. Because of the cancelling out of the two effects, over-evaluation errors would tend to appear more often than under-evaluation errors. This feature is supported by the evaluations in figure 1, in which there are indeed more over-evaluation errors (>100).

# V. APPLICATION

To investigate the performance of this approach, the ICSE method can be tested in a sample of five developing countries with multiple censuses about 5 to 10 years apart, and death counts from vital registration available annually over several intercensal periods. The five countries are Brazil for 1980-1991, 1991-2000 and 2000-2010 intercensal periods; Egypt for 1947-1960, 1960-1976, 1976-1986, 1986-1996 and 1996-2006 intercensal periods; Maldives for 1985-1990, 1990-1995, 1995-2000, 2000-2006 and 2006-2014 intercensal periods; Malaysia for 1991-2000 and 2000-2010 intercensal periods; and Thailand for 1960-1970, 1970-1980, 1980-1990, 1990-2000, and 2000-2010 intercensal periods.

Summary results are provided in Table 2 for selected age groups from age 60 and over, as well as for corresponding open age groups. Appendix B provides further details about data sources and an illustrative example of the steps involved in the computations.

Figures 3A to 3E provide a summary plot by sex for each of these respective countries, showing the trend over time of the intercensal completeness in death registration. Each summary plot is based on the application of the ICSE method for selected age groups from age 60 onward (see also Appendix C for results with open age groups), the application of three of the most well-established death distribution methods: Generalized Growth Balance, ggb (Hill, 1987); Synthetic Extinct Generation, seg (Bennett and Horiuchi, 1981 and 1984); and the extended method using ggb first to adjust census completeness before applying seg, denoted here as ggbseg (Hill and others, 2009).

Estimates of completeness for these three death distribution methods (DDM) are based on the same input data as for the ICSE method and were computed using R with the DDM package (Riffe et al, 2017). Table 3 provides a summary of these DDM results. The age range used for each DDM varies for each country, period, sex and method, and was chosen automatically by the DDM R package by minimizing the average squared residual and finding the best-fitting linear relationship by "picking ages that follow the advice typically given for doing so visually."

#### Figure 3A. Brazil 1980-2010 intercensal completeness of death registration by sex based on ICSE for selected age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

#### A. BRAZIL

Results from the application of the ICSE method to Brazil for the 1980-2010 period (orange-red lines on Figure 3A for ages 60-74, 65-79, 70-84) suggest that the completeness of death registration is better for males than for females and has improved in the most recent intercensal decade to about 95 per cent for males and 90-95 per cent for females. Overall results, especially for the most recent decade, are reasonably consistent with those from the three DDMs. Differences in ICSE results by specific age groups indicate a greater challenge with regard to completeness or data quality reporting in earlier periods, especially under age 70 and for females.

#### B. EGYPT

In Egypt (Figure 3B), due to data availability only with a lower open age group (75+), the ICSE method can only be computed over the 1947-2006 period for the age group 60-74. While the overall trend suggests some improvement over time, the ICSE results suggest a rather low completeness (with female lower than male). The results suggest a far lower completeness than the results from the application of the three DDMs (in green on Figure 3B), which are more consistent with the consensus from national authorities about the completeness of death registration in Egypt in recent decades.

This discrepancy between ICSE and DDM results is related to the sensitivity of the age reporting and data quality used for the ICSE with a particular age group. If instead the ICSE method is computed for the open age group 60+ (see Appendix C figure C2), the results are more consistent with the DDM evaluation. However, the use of the open age group 65+ in this case shows some completeness results implausibly high and suggests that the use of data at older ages in Egypt is problematic.

Figure 3B. Egypt 1947-2006 intercensal completeness of death registration by sex, based on ICSE for selected age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

## C. MALDIVES

The application of the ICSE method in 2000-2014 in the Maldives (Figure 3C) demonstrates some reasonably consistent results for age groups starting at age 65 with the application of the three DDMs, which suggest overall a very high level of completeness. However, the ICSE results for the age group 60-74 years are far more erratic and implausible, and are indicative of migration perturbations, especially below age 65. But the inclusion of data at higher ages for the open age group 60+ onward shows that before 2000, data on older ages in the Maldives were probably too unreliable to provide a meaningful assessment of completeness (see Appendix C figure C3).

# Figure 3C. Maldives 1985-2014 intercensal completeness of death registration by sex, based on ICSE for selected age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

#### D. MALAYSIA

In the case of Malaysia, the ICSE results for males are overall consistent with results of using DDMs and indicative of high completeness for the 1991-2010 period (Figure 3D). For females, the ICSE results are far more discordant and indicate an implausibly low level of completeness based on the age group 60-74. Similar to the case of Egypt, if the ICSE method is computed on the open age group 60+ (see Appendix C figure C4), the results are more consistent with the DDM evaluation and with a very high level of completeness. This evidence suggests that data at older ages, especially for females in Malaysia, are more affected by age reporting and data quality issues.

#### E. THAILAND

Finally, the application of the ICSE method to Thailand for the period 1960-2010 (Figure 3E), provides reasonable consistency with the DDMs results, including the fluctuations over time related to migration issues, especially in the mid-1990s. Results for specific age groups are consistent overall, irrespective of the ages used, including the case where open age groups are included (see Appendix C figure C5). ICSE results for 1970-1990 and 2000-2010 indicate a high completeness of 90 per cent or more for both sexes, with a higher completeness in the 1970-1990 period for males than for females and since 2000 slightly higher for females than for males.

Figure 3D. Malaysia 1991-2010 intercensal completeness of death registration by sex, based on ICSE for selected age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

Figure 3E. Thailand 1960-2010 intercensal completeness of death registration by sex, based on ICSE for selected age groups and death distribution methods



An important implication of this research, already stated, is worth repeating: ICSE cannot provide reasonable results for young ages, at which the level of mortality is low, and the number of migrants can matter more than deaths. An example of applying ICSE to all ages in Thailand is shown in Figure 4.

Figure 4. Percentage of ICSE completeness of death registration by sex and age group, Thailand 2000-2010



|                       |       |      | Ļ                 | Specific age | group             | Open age group |      |                   |        |                   |  |
|-----------------------|-------|------|-------------------|--------------|-------------------|----------------|------|-------------------|--------|-------------------|--|
| Location and          |       | Male |                   | Female       |                   |                | Male |                   | Female |                   |  |
| intercensal<br>period | age   | sx   | Complete<br>-ness | sx           | Complete<br>-ness | Age            | sx   | Complete<br>-ness | SX     | Complete<br>-ness |  |
| A. Brazil             |       |      |                   |              |                   |                |      |                   |        |                   |  |
| 1980-1991             | 60-74 | 0.71 | 107.2             | 0.78         | 90.8              | 60+            | 0.54 | 104.2             | 0.61   | 97.6              |  |
|                       | 65-79 | 0.57 | 90.0              | 0.66         | 81.9              | 65+            | 0.45 | 103.3             | 0.52   | 99.1              |  |
|                       | 70-84 | 0.45 | 103.6             | 0.55         | 99.2              | 70+            | 0.35 | 110.3             | 0.42   | 106.3             |  |
|                       |       |      |                   |              |                   | 75+            | 0.25 | 115.3             | 0.32   | 110.3             |  |
| 1991-2000             | 60-74 | 0.74 | 93.9              | 0.82         | 83.3              | 60+            | 0.58 | 94.1              | 0.65   | 90.2              |  |
|                       | 65-79 | 0.62 | 85.7              | 0.71         | 77.3              | 65+            | 0.49 | 94.1              | 0.57   | 91.6              |  |
|                       | 70-84 | 0.51 | 95.4              | 0.63         | 94.5              | 70+            | 0.40 | 97.9              | 0.48   | 96.6              |  |
|                       |       |      |                   |              |                   | 75+            | 0.31 | 99.4              | 0.38   | 97.6              |  |
| 2000-2010             | 60-74 | 0.77 | 105.4             | 0.84         | 96.0              | 60+            | 0.59 | 100.3             | 0.67   | 96.6              |  |
|                       | 65-79 | 0.66 | 100.5             | 0.75         | 91.3              | 65+            | 0.50 | 99.2              | 0.59   | 96.7              |  |
|                       | 70-84 | 0.54 | 96.3              | 0.65         | 92.8              | 70+            | 0.41 | 98.8              | 0.50   | 98.1              |  |
|                       |       |      |                   |              |                   | 75+            | 0.31 | 100.1             | 0.38   | 100.3             |  |
| B. Egypt              |       |      |                   |              |                   |                |      |                   |        |                   |  |
| 1947-1960             | 60-74 | 0.49 | 47.1              | 0.54         | 31.5              | 60+            | 0.44 | 113.7             | 0.46   | 106.3             |  |
|                       |       |      |                   |              |                   | 65+            | 0.39 | 161.2             | 0.39   | 151.4             |  |
| 1960-1976             | 60-74 | 0.54 | 73.5              | 0.58         | 49.5              | 60+            | 0.43 | 106.2             | 0.45   | 117.0             |  |
|                       |       |      |                   |              |                   | 65+            | 0.35 | 123.9             | 0.36   | 149.0             |  |
| 1976-1986             | 60-74 | 0.61 | 89.8              | 0.49         | 49.2              | 60+            | 0.44 | 102.2             | 0.37   | 94.6              |  |
|                       |       |      |                   |              |                   | 65+            | 0.31 | 107.5             | 0.29   | 118 3             |  |
| 1986-1996             | 60-74 | 0.57 | 86.8              | 0.52         | 59.1              | 60+            | 0.40 | 94.5              | 0.39   | 103.9             |  |
|                       |       |      |                   |              |                   | 65+            | 0.28 | 97.6              | 0.30   | 127.3             |  |
| 1996-2006             | 60-74 | 0.57 | 74.6              | 0.56         | 59 3              | 60+            | 0.20 | 103.2             | 0.50   | 114.4             |  |
| 1770-2000             | 00 /1 | 0.57 | /1.0              | 0.50         | 57.5              | 65             | 0.25 | 115.9             | 0.15   | 142.2             |  |
|                       |       |      |                   |              |                   | 03+            | 0.55 | 115.8             | 0.38   | 145.5             |  |
| C. Malaysia           | (0.74 | 0.72 | 101 7             | 0.75         | 79.0              |                | 0.54 | 07.0              | 0.57   | 90.1              |  |
| 1991-2000             | 60-74 | 0.73 | 101.7             | 0.75         | /8.0              | 60+            | 0.54 | 97.9              | 0.57   | 89.1              |  |
|                       |       |      |                   |              |                   | 65+            | 0.44 | 96.8              | 0.48   | 92.1              |  |
| 2000-2010             | 60-74 | 0.73 | 96.3              | 0.75         | 74.3              | 60+            | 0.60 | 112.1             | 0.62   | 104.5             |  |
|                       |       |      |                   |              |                   | 65+            | 0.52 | 117.9             | 0.54   | 113.9             |  |
| D. Maldives           |       |      |                   |              |                   |                |      |                   |        |                   |  |
| 1985-1990             | 60-74 | 0.70 | 41.2              | 0.57         | 26.3              | 60+            | 0.71 | 86.3              | 0.67   | 70.7              |  |
|                       |       |      |                   |              |                   | 65+            | 0.72 | 122.1             | 0.76   | 154.1             |  |
| 1990-1995             | 60-74 | 0.72 | 43.5              | 0.72         | 46.1              | 60+            | 0.74 | 96.2              | 0.74   | 95.2              |  |
|                       |       |      |                   |              |                   | 65+            | 0.76 | 144.8             | 0.76   | 143.8             |  |

| TABLE 2. INTERCENSAL COMPLETENESS OF DEATH REGISTRATION BY SEX, BASED ON ICSE FOR SELECTED AGE GROUP | S |
|--|---|
| AND BY OPEN AGE GROUPS FOR FIVE SELECTED COUNTRIES   |   |

|                       |       |      |                   | group  | Open age group    |     |      |                   |        |                   |
|-----------------------|-------|------|-------------------|--------|-------------------|-----|------|-------------------|--------|-------------------|
| Location and          |       | Male |                   | Female |                   |     | Male |                   | Female |                   |
| intercensal<br>period | age   | sx   | Complete<br>-ness | sx     | Complete<br>-ness | Age | sx   | Complete<br>-ness | sx     | Complete<br>-ness |
| 1995-2000             | 60-74 | 0.89 | 114.3             | 0.87   | 85.7              | 60+ | 0.79 | 105.5             | 0.78   | 108.4             |
|                       |       |      |                   |        |                   | 65+ | 0.72 | 105.6             | 0.72   | 116.4             |
| 2000-2006             | 60-74 | 0.92 | 206.1             | 0.91   | 183.5             | 60+ | 0.83 | 127.5             | 0.84   | 127.2             |
|                       | 65-79 | 0.87 | 126.3             | 0.90   | 149.1             | 65+ | 0.78 | 128.2             | 0.80   | 133.3             |
|                       | 70-84 | 0.80 | 116.0             | 0.76   | 96.4              | 70+ | 0.71 | 132.6             | 0.71   | 131.5             |
|                       | 75-89 | 0.67 | 103.7             | 0.75   | 148.9             | 75+ | 0.62 | 136.9             | 0.65   | 155.8             |
|                       | 80-94 | 0.56 | 101.2             | 0.54   | 94.8              | 80+ | 0.55 | 149.1             | 0.54   | 139.1             |
|                       | 85-99 | 0.52 | 117.3             | 0.55   | 107.9             | 85+ | 0.54 | 170.1             | 0.54   | 157.4             |
|                       |       |      |                   |        |                   | 90+ | 0.57 | 185.8             | 0.53   | 166.9             |
| 2006-2014             | 60-74 | 0.86 | 174.4             | 0.88   | 157.7             | 60+ | 0.59 | 92.5              | 0.62   | 87.6              |
|                       | 65-79 | 0.64 | 87.1              | 0.68   | 81.7              | 65+ | 0.49 | 84.2              | 0.50   | 80.4              |
|                       | 70-84 | 0.51 | 85.3              | 0.45   | 72.7              | 70+ | 0.39 | 83.2              | 0.36   | 80.2              |
|                       | 75-89 | 0.32 | 77.3              | 0.33   | 89.0              | 75+ | 0.27 | 81.9              | 0.26   | 86.6              |
|                       | 80-94 | 0.24 | 95.9              | 0.20   | 83.2              | 80+ | 0.19 | 87.5              | 0.17   | 84.2              |
|                       |       |      |                   |        |                   | 85+ | 0.11 | 77.0              | 0.13   | 85.6              |
| E. Thailand           |       |      |                   |        |                   |     |      |                   |        |                   |
| 1960-1970             | 60-74 | 0.57 | 67.0              | 0.69   | 65.5              | 60+ | 0.45 | 79.4              | 0.54   | 78.3              |
|                       | 65-79 | 0.47 | 75.1              | 0.60   | 77.4              | 65+ | 0.37 | 85.4              | 0.46   | 82.6              |
|                       | 70-84 | 0.34 | 81.5              | 0.44   | 75.6              | 70+ | 0.29 | 91.7              | 0.36   | 84.8              |
|                       |       |      |                   |        |                   | 75+ | 0.24 | 100.5             | 0.29   | 90.7              |
| 1970-1980             | 60-74 | 0.68 | 94.4              | 0.79   | 96.1              | 60+ | 0.54 | 96.1              | 0.60   | 89.6              |
|                       | 65-79 | 0.55 | 88.5              | 0.66   | 87.2              | 65+ | 0.44 | 96.7              | 0.50   | 88.1              |
|                       | 70-84 | 0.42 | 92.6              | 0.51   | 81.2              | 70+ | 0.34 | 101.4             | 0.40   | 88.5              |
|                       |       |      |                   |        |                   | 75+ | 0.26 | 108.8             | 0.30   | 93.0              |
| 1980-1990             | 60-74 | 0.73 | 98.5              | 0.82   | 98.8              | 60+ | 0.58 | 99.1              | 0.65   | 96.0              |
|                       | 65-79 | 0.62 | 94.8              | 0.73   | 97.8              | 65+ | 0.50 | 99.4              | 0.57   | 95.5              |
|                       | 70-84 | 0.49 | 92.0              | 0.59   | 86.3              | 70+ | 0.41 | 101.5             | 0.47   | 94.8              |
|                       |       |      |                   |        |                   | 75+ | 0.33 | 108.8             | 0.37   | 99.6              |
| 1990-2000             | 60-74 | 0.69 | 66.0              | 0.78   | 67.2              | 60+ | 0.54 | 75.8              | 0.61   | 78.3              |
|                       | 65-79 | 0.59 | 75.6              | 0.68   | 74.6              | 65+ | 0.45 | 79.4              | 0.52   | 81.1              |
|                       | 70-84 | 0.45 | 77.6              | 0.56   | 78.5              | 70+ | 0.35 | 81.1              | 0.41   | 83.2              |
|                       |       |      |                   |        |                   | 75+ | 0.25 | 83.3              | 0.31   | 85.4              |
| 2000-2010             | 60-74 | 0.77 | 88.2              | 0.83   | 85.8              | 60+ | 0.61 | 89.9              | 0.67   | 92.7              |
|                       | 65-79 | 0.67 | 89.7              | 0.76   | 91.9              | 65+ | 0.53 | 90.3              | 0.59   | 94.1              |
|                       | 70-84 | 0.55 | 87.5              | 0.64   | 90.1              | 70+ | 0.43 | 90.6              | 0.48   | 94.8              |
|                       |       |      |                   |        |                   | 75+ | 0.31 | 92.6              | 0.35   | 97.0              |

|             | Male completeness by method |       | Age r  | Age range |       | mpleteness | by method | Age range |       |       |
|-------------|-----------------------------|-------|--------|-----------|-------|------------|-----------|-----------|-------|-------|
| Location    | ggb                         | seg   | ggbseg | Lower     | Upper | ggb        | seg       | ggbseg    | Lower | Upper |
| A. Brazil   |                             |       |        |           |       |            |           |           |       |       |
| 1980-1991   | 108.9                       | 97.6  | 111.3  | 15        | 50    | 103.4      | 97.0      | 103.8     | 30    | 70    |
| 1991-2000   | 105.4                       | 104.6 | 102.0  | 25        | 65    | 100.6      | 101.1     | 97.9      | 30    | 65    |
| 2000-2010   | 99.7                        | 101.5 | 95.8   | 25        | 70    | 100.1      | 98.7      | 95.1      | 20    | 60    |
| B. Egypt    |                             |       |        |           |       |            |           |           |       |       |
| 1947-1960   | 91.3                        | 101.9 | 107.5  | 15        | 55    | 88.1       | 90.4      | 108.9     | 20    | 55    |
| 1960-1976   | 99.7                        | 105.3 | 102.5  | 20        | 55    | 102.0      | 93.0      | 119.6     | 15    | 55    |
| 1976-1986   | 100.5                       | 105.6 | 100.3  | 25        | 60    | 99.7       | 91.9      | 103.3     | 15    | 65    |
| 1986-1996   | 100.6                       | 98.1  | 100.9  | 20        | 55    | 101.8      | 91.0      | 112.4     | 15    | 60    |
| 1996-2006   | 102.1                       | 117.7 | 107.0  | 30        | 65    | 100.6      | 116.4     | 122.6     | 15    | 55    |
| C. Maldives |                             |       |        |           |       |            |           |           |       |       |
| 1985-1990   | 101.7                       | 85.0  | 100.5  | 25        | 60    | 75.9       | 86.6      | 86.5      | 15    | 55    |
| 1990-1995   | 104.8                       | 91.5  | 108.0  | 25        | 60    | 94.9       | 93.7      | 104.2     | 15    | 50    |
| 1995-2000   | 101.2                       | 111.9 | 93.2   | 20        | 60    | 101.0      | 115.9     | 102.7     | 25    | 65    |
| 2000-2006   | 100.2                       | 113.0 | 99.8   | 40        | 75    | 104.3      | 116.8     | 105.1     | 20    | 55    |
| 2006-2014   | 94.1                        | 84.6  | 91.4   | 15        | 50    | 88.8       | 83.8      | 85.2      | 30    | 65    |
| D. Malaysia |                             |       |        |           |       |            |           |           |       |       |
| 1991-2000   | 95.0                        | 115.4 | 90.2   | 35        | 70    | 96.5       | 105.4     | 95.1      | 35    | 70    |
| 2000-2010   | 97.1                        | 106.0 | 97.4   | 20        | 55    | 93.8       | 102.5     | 103.3     | 15    | 50    |
| E. Thailand |                             |       |        |           |       |            |           |           |       |       |
| 1960-1970   | 97.1                        | 78.1  | 101.2  | 40        | 75    | 92.8       | 72.5      | 93.2      | 35    | 70    |
| 1970-1980   | 87.9                        | 107.8 | 88.5   | 15        | 50    | 81.9       | 97.7      | 82.3      | 15    | 50    |
| 1980-1990   | 93.2                        | 124.6 | 88.0   | 15        | 50    | 83.7       | 120.1     | 83.3      | 15    | 50    |
| 1990-2000   | 67.4                        | 77.9  | 70.7   | 15        | 50    | 67.7       | 76.1      | 72.3      | 15    | 50    |
| 2000-2010   | 76.4                        | 96.9  | 79.2   | 15        | 50    | 85.2       | 95.4      | 85.4      | 15    | 55    |

 TABLE 3. INTERCENSAL COMPLETENESS OF DEATH REGISTRATION BY SEX, BASED ON THREE DEATH DISTRIBUTION METHODS

 (GGB, SEG, GGBSEG) FOR FIVE SELECTED COUNTRIES

### VI. SUMMARY

In the evaluation of the completeness of death registration (DR) using census data on populations by age, previous methods are based mainly on two assumptions. The first is zero migration and the second is that the errors of the two successive censuses are zero or are similar. These assumptions are unrealistic and therefore produce errors. Investigating the errors of these evaluation approaches is necessary, but extremely difficult. The purposes of this paper were to analyse the errors of the evaluation and provide the conditions under which census populations can be used to evaluate the completeness of DR.

To achieve these goals, this paper proposed a simple evaluation, namely the intercensal cohort survival evaluation (ICSE). Because ICSE focuses on old ages, the assumption of zero migration is acceptable, given that at old ages the number of migrants is normally negligible compared to the number of deaths. ICSE involves only the process of intercensal cohort survival, which can be used to analyse the effect of census error. Consequently, the assumption that census errors are zero or obey special relationships is eliminated.

The basic finding of this paper is that given the levels of census error, the lower the mortality level, the larger the evaluation error and vice versa. This finding is not difficult to understand. When the mortality level is low, a small number of deaths is estimated using large population numbers. Consequently, a small relative error in enumerating population in the censuses will lead to a large relative error in estimating deaths or in evaluating the completeness of DR. This finding should apply to the death distribution methods (DDMs) that also use the numbers of census population to estimate the number of deaths. This finding has not been reached by previous simulation studies and leads to two conclusions about applying the ICSE method.

The first conclusion is that ICSE cannot provide reasonable results for situations where mortality is low and completeness is high, which typically include developed countries. This was illustrated in the example where ICSE was applied to highly developed countries in the 2000-2010 period.

The second conclusion is that ICSE can provide reasonable results for situations where mortality is not low and completeness is not high. Such situations are typically found in developing countries. Guided by this condition, ICSE provides a reasonably easy way to check the consistency and usability of mortality data from vital registration at older ages. As for other analytical methods, ICSE depends on the reliability of the census data. The evaluation using several different age groups, including data for open age groups, provides further insights into the sensitivity and robustness of these results, and potential issues with the reliability of data at older ages, in some countries or periods.

How to evaluate the completeness of death registration at young ages is a question to be answered in future studies - notably, through the potential use of record linkage approaches combining multiple independent sources of individual information.

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## APPENDICES

#### A. THE ERRORS OF INDIRECTLY ESTIMATING MORTALITY LEVEL USING CENSUS POPULATION

To see the fundamental difference between the errors of ICSE and those from indirect estimation of mortality levels using populations in two successive censuses, the error of estimating the survival ratio between the two censuses is analysed below.

The estimated survival ratio can be written as:

$$\hat{s} = \hat{p}_2 / \hat{p}_1 = \frac{p_2(1-u_2)}{p_1(1-u_1)} = s \frac{(1-u_2)}{(1-u_1)}.$$
(a.1)

Using (2), the relative errors of estimating *s* is:

$$E_s(s, u_1, u_2) = \frac{\hat{s} - s}{s} = \frac{1 - u_2}{1 - u_1} - 1 = \frac{u_1 - u_2}{1 - u_1}.$$
 (a.2)

It can be seen that the estimating error is independent from *s*, which is an exceptionally good property. Further, (6) still stands:

$$\frac{\partial E_c(s, u_1, u_2)}{\partial u_1} = \frac{1 - u_2}{(1 - u_1)^2} > 0,$$
  
$$\frac{\partial E_c(s, u_1, u_2)}{\partial u_2} = \frac{-1}{(1 - u_1)} < 0.$$
 (a.3)

So that the marginal situations are still useful:

$$-u_{2} = E_{s}(s,0,u_{2}) < E_{s}(s,u_{1},u_{2}) < E_{s}(s,u_{1},0) = \frac{u_{1}}{1-u_{1}}.$$
 (a.4)

Furthermore, as (a.4) shows, the marginal relative errors in estimating *s* are just the census net undercounting rates, which are usually small. The principle difference between (a.4) and (7)-(9) is that, (a.4) excludes survival ratio but (7)-(9) include survival ratio. The above analysis indicates that indirect estimations using census population, such as the Census Method (Li and Gerland, 2013) or the Variable-r Method (Bennett and Horiuchi, 1981), are entirely different from ICSE and able to provide reasonable results.

Taking also Japanese men between 2000 and 2010 as an example, the ratio of surviving from 60-64 to 70-74 is estimated as 0.866 using populations in the 2000 and 2010 censuses, which is only 2.4 per cent higher than the corresponding survival ratio in HMD and can be explained by (a.4) and the Japanese 2010 Post-Enumeration Survey (PES) results.

#### B. EXAMPLE OF COUNTRY APPLICATION OF INTERCENSAL COHORT SURVIVAL EVALUATION (ICSE)

Census population counts from censuses and death counts from vital registration were compiled from the United Nations Statistics Division Demographic Yearbook online database.<sup>4</sup> Data gaps were filled-in using auxiliary sources such as census reports from national authorities and death counts from the World Health Organization (WHO) Mortality Database.<sup>5</sup>

When multiple versions of data existed, the official final published results (eventually adjusted by national statistical authorities, based on post-enumeration survey or other methods) rather than provisional values were selected; regarding population, the de-facto rather than de-jure concept was favoured; and for vital events, the year of occurrence rather than the year of registration was selected. For each intercensal period, age group distributions were harmonized using the highest common open age group between population and death counts, and unknown age counts were proportionately redistributed.

For each country and each intercensal period, a standardized tabular dataset was prepared with a structure like the example shown in table B.1 using Brazil in the 2000-2010 period.

In table B1, the respective columns correspond to the following information:

Column 1 is a label describing the series.

Columns 2 and 3 provide descriptors for sex and age with "m" and "f" respectively for male and female as sex, and for age only the start of the age group (e.g., 60 means 60-64) up to the last open age group. Here, age 85 means 85 and over. Note that for the ICSE application, data under age 60 are not used, but they are used for the application of the standard death distribution methods from age 5 onward.

Columns 4 and 5 contain the population enumerated, respectively, in 2000 and 2010 censuses.

Columns 6 and 7 provide, respectively, the date for the oldest and most recent census in decimal. year. Knowing these two dates, the length of the intercensal period can be computed here equal to 10.12 years.

Columns 8 and 9 are based on the length of the intercensal period as the closest multiple of either 5 or 10 years (to remain consistent with the five-year age groups distribution and to follow intercensal cohorts). Column 8 corresponds to the sum of the first 10 years of annual deaths starting from the year of the first census (2000) up to the end of 2009 (see table B2 for annual deaths used as input). Column 9 corresponds to the sum of the last 10 years of annual deaths ending with the year of the second census (2010), thus covering the period 2001 up to the end of 2010.

Using the dataset in table B1 and similar ones for other countries, all computations have been implemented in R with the supporting datasets for public replication and documentation (see "TP\_2019-05\_Evaluating-Completeness-of-DR-Supplement.zip" with R source code "VR-Dx-completeness-ICSE.r" and input datasets which also include as a default, the number of "deaths:" the number of deaths occurring between census dates for the computation of DDMs). A simple text file called "filelist.txt" provides a list of the various datasets to be processed, with each dataset being analysed one at a time and the results pooled into an overall summary text output.

<sup>&</sup>lt;sup>4</sup> United Nations Statistics Division, Demographic Yearbook, available from http://unstats.un.org/unsd/demographic/products/dyb/dyb2.htm and online database http://data.un.org/Browse.aspx?d=POP.

<sup>&</sup>lt;sup>5</sup> WHO mortality database, available from www.who.int/healthinfo/mortality\_data/en/.

| (col.1)          | (col.2) | (col.3) | (col.4) | (col.5) | (col.6)   | (col.7)  | (col.8)       | (col.9)      |
|------------------|---------|---------|---------|---------|-----------|----------|---------------|--------------|
| Location         | sex     | age     | pop1    | pop2    | date1 dec | date2dec | deaths10first | deaths10last |
| Brazil 2000-2010 | m       | 0       | 1635916 | 1378532 | 2000.59   | 2010.71  | 233613        | 221178       |
| Brazil 2000-2010 | m       | 1       | 6691010 | 5638455 | 2000.59   | 2010.71  | 45767         | 43550        |
| Brazil 2000-2010 | m       | 5       | 8402353 | 7624144 | 2000.59   | 2010.71  | 28040         | 27012        |
| Brazil 2000-2010 | m       | 10      | 8777639 | 8725413 | 2000.59   | 2010.71  | 35481         | 35052        |
| Brazil 2000-2010 | m       | 15      | 9019130 | 8558868 | 2000.59   | 2010.71  | 144795        | 144819       |
| Brazil 2000-2010 | m       | 20      | 8048218 | 8630229 | 2000.59   | 2010.71  | 216836        | 217937       |
| Brazil 2000-2010 | m       | 25      | 6814328 | 8460995 | 2000.59   | 2010.71  | 206348        | 208949       |
| Brazil 2000-2010 | m       | 30      | 6363983 | 7717658 | 2000.59   | 2010.71  | 203757        | 204557       |
| Brazil 2000-2010 | m       | 35      | 5955875 | 6766664 | 2000.59   | 2010.71  | 227387        | 226030       |
| Brazil 2000-2010 | m       | 40      | 5116439 | 6320568 | 2000.59   | 2010.71  | 271023        | 271289       |
| Brazil 2000-2010 | m       | 45      | 4216418 | 5692014 | 2000.59   | 2010.71  | 321243        | 325171       |
| Brazil 2000-2010 | m       | 50      | 3415678 | 4834995 | 2000.59   | 2010.71  | 370692        | 379097       |
| Brazil 2000-2010 | m       | 55      | 2585244 | 3902344 | 2000.59   | 2010.71  | 407219        | 418604       |
| Brazil 2000-2010 | m       | 60      | 2153209 | 3041035 | 2000.59   | 2010.71  | 455018        | 463413       |
| Brazil 2000-2010 | m       | 65      | 1639325 | 2224065 | 2000.59   | 2010.71  | 515731        | 523569       |
| Brazil 2000-2010 | m       | 70      | 1229329 | 1667372 | 2000.59   | 2010.71  | 562363        | 572508       |
| Brazil 2000-2010 | m       | 75      | 780571  | 1090517 | 2000.59   | 2010.71  | 558317        | 571517       |
| Brazil 2000-2010 | m       | 80      | 428501  | 668623  | 2000.59   | 2010.71  | 465744        | 482973       |
| Brazil 2000-2010 | m       | 85      | 302849  | 464499  | 2000.59   | 2010.71  | 537077        | 564077       |
| Brazil 2000-2010 | f       | 0       | 1577394 | 1334712 | 2000.59   | 2010.71  | 179230        | 170168       |
| Brazil 2000-2010 | f       | 1       | 6471408 | 5444459 | 2000.59   | 2010.71  | 37535         | 35501        |
| Brazil 2000-2010 | f       | 5       | 8139974 | 7345231 | 2000.59   | 2010.71  | 19911         | 19368        |
| Brazil 2000-2010 | f       | 10      | 8570428 | 8441348 | 2000.59   | 2010.71  | 22015         | 21743        |
| Brazil 2000-2010 | f       | 15      | 8920685 | 8432004 | 2000.59   | 2010.71  | 39392         | 39064        |
| Brazil 2000-2010 | f       | 20      | 8093297 | 8614963 | 2000.59   | 2010.71  | 49834         | 49644        |
| Brazil 2000-2010 | f       | 25      | 7035337 | 8643419 | 2000.59   | 2010.71  | 58969         | 59415        |
| Brazil 2000-2010 | f       | 30      | 6664961 | 8026854 | 2000.59   | 2010.71  | 71111         | 71594        |
| Brazil 2000-2010 | f       | 35      | 6305654 | 7121915 | 2000.59   | 2010.71  | 94973         | 94344        |
| Brazil 2000-2010 | f       | 40      | 5430255 | 6688796 | 2000.59   | 2010.71  | 130160        | 130283       |
| Brazil 2000-2010 | f       | 45      | 4505123 | 6141338 | 2000.59   | 2010.71  | 170287        | 172765       |
| Brazil 2000-2010 | f       | 50      | 3646923 | 5305407 | 2000.59   | 2010.71  | 207158        | 211456       |
| Brazil 2000-2010 | f       | 55      | 2859471 | 4373877 | 2000.59   | 2010.71  | 242462        | 248901       |
| Brazil 2000-2010 | f       | 60      | 2447720 | 3468085 | 2000.59   | 2010.71  | 293377        | 297775       |
| Brazil 2000-2010 | f       | 65      | 1941781 | 2616745 | 2000.59   | 2010.71  | 359134        | 364220       |
| Brazil 2000-2010 | f       | 70      | 1512973 | 2074264 | 2000.59   | 2010.71  | 434682        | 442452       |
| Brazil 2000-2010 | f       | 75      | 999016  | 1472930 | 2000.59   | 2010.71  | 491864        | 504896       |
| Brazil 2000-2010 | f       | 80      | 607533  | 998349  | 2000.59   | 2010.71  | 487915        | 507552       |
| Brazil 2000-2010 | f       | 85      | 493222  | 804113  | 2000.59   | 2010.71  | 779926        | 823633       |

TABLE B1. 2000 and 2010 census population and intercensal vital registration deaths by age and sex for Brazil

In an effort to use the information available with the least amount of additional interference introduced by the evaluation method, the annual deaths are used as reported for a fixed 5- or 10-year period either from the year of the first census or ending in the year of the second census. Death counts are for the civil calendar year, from January 1 to 31 December, and the populations enumerated at the two censuses are shifted accordingly to the start and end of the closest 5- or 10-year period. As censuses are generally not conducted on 1 January, to estimate the corresponding population at this date the intercensal growth rate (r) by age for each sex is first computed and used to shift the population to this new reference time (also used in the variable-r approach). Practically, censuses are often not exactly 5 or 10 years apart but a variable number of years either closer to 5 or 10. Shifting the population using intercensal growth rates by age provides a reasonable approximation only within a couple of years from each census and is not used for longer intercensal periods of 15 or more years.

| Age | Sex | 2000  | 2001  | 2002  | 2003  | 2004  | 2005  | 2006  | 2007  | 2008  | 2009  | 2010   |
|-----|-----|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|--------|
| 0   | m   | 30287 | 26699 | 25651 | 25075 | 23819 | 22256 | 21420 | 20062 | 19286 | 19061 | 17851  |
| 1   | m   | 5769  | 5403  | 4977  | 5018  | 4605  | 4269  | 4223  | 3969  | 3852  | 3683  | 3552   |
| 5   | m   | 3360  | 2884  | 2993  | 2889  | 2734  | 2672  | 2774  | 2660  | 2577  | 2498  | 2331   |
| 10  | m   | 3729  | 3747  | 3678  | 3559  | 3643  | 3561  | 3441  | 3450  | 3337  | 3335  | 3300   |
| 15  | m   | 14291 | 14587 | 15213 | 14666 | 14406 | 14284 | 14444 | 14439 | 14410 | 14055 | 14315  |
| 20  | m   | 20990 | 20763 | 22462 | 22572 | 21828 | 20844 | 21421 | 21646 | 21892 | 22418 | 22092  |
| 25  | m   | 19645 | 19654 | 20482 | 20460 | 20288 | 19892 | 20593 | 21317 | 21778 | 22239 | 22245  |
| 30  | m   | 20747 | 20763 | 20749 | 20380 | 20010 | 19483 | 19845 | 20254 | 20360 | 21166 | 21547  |
| 35  | m   | 23660 | 23240 | 23376 | 23155 | 23095 | 22062 | 22254 | 22140 | 22168 | 22238 | 22303  |
| 40  | m   | 26881 | 26544 | 26960 | 27099 | 27477 | 26638 | 27352 | 27094 | 27611 | 27367 | 27146  |
| 45  | m   | 30082 | 30551 | 30979 | 31845 | 32427 | 32250 | 32926 | 32985 | 33630 | 33568 | 34010  |
| 50  | m   | 33239 | 34155 | 34851 | 35459 | 37240 | 37011 | 38336 | 39089 | 40436 | 40876 | 41644  |
| 55  | m   | 36428 | 36478 | 37804 | 38831 | 40375 | 40434 | 42749 | 43388 | 44664 | 46067 | 47813  |
| 60  | m   | 43401 | 43569 | 43486 | 44846 | 45575 | 43962 | 45637 | 46741 | 48735 | 49066 | 51796  |
| 65  | m   | 47917 | 48239 | 49427 | 50570 | 52365 | 51540 | 53455 | 53179 | 54524 | 54515 | 55755  |
| 70  | m   | 52601 | 53970 | 54462 | 55913 | 56700 | 54889 | 57104 | 57231 | 58891 | 60601 | 62745  |
| 75  | m   | 49309 | 50085 | 52591 | 54887 | 57011 | 55788 | 58996 | 58958 | 60018 | 60672 | 62509  |
| 80  | m   | 39557 | 40577 | 42315 | 44018 | 46123 | 45949 | 49417 | 50533 | 52903 | 54352 | 56786  |
| 85  | m   | 43938 | 45533 | 48336 | 51379 | 53784 | 52614 | 56784 | 59032 | 61311 | 64367 | 70938  |
| 0   | f   | 23061 | 20676 | 19439 | 19075 | 18141 | 17157 | 16409 | 15240 | 15240 | 14793 | 13999  |
| 1   | f   | 4871  | 4571  | 4153  | 3984  | 3665  | 3485  | 3460  | 3246  | 3073  | 3029  | 2837   |
| 5   | f   | 2239  | 2041  | 2154  | 1983  | 1973  | 1962  | 1946  | 1901  | 1933  | 1778  | 1697   |
| 10  | f   | 2403  | 2199  | 2363  | 2144  | 2167  | 2120  | 2195  | 2145  | 2158  | 2122  | 2131   |
| 15  | f   | 4152  | 4125  | 4070  | 4099  | 4012  | 3804  | 3881  | 3744  | 3715  | 3792  | 3823   |
| 20  | f   | 5092  | 4859  | 5174  | 5018  | 5099  | 4842  | 4920  | 4780  | 4871  | 5180  | 4902   |
| 25  | f   | 5799  | 5608  | 5845  | 5833  | 5653  | 5812  | 5832  | 6160  | 6052  | 6375  | 6245   |
| 30  | f   | 7302  | 7274  | 7114  | 7008  | 6891  | 6773  | 6854  | 7167  | 7140  | 7588  | 7785   |
| 35  | f   | 10032 | 9503  | 9742  | 9469  | 9325  | 9236  | 9385  | 9266  | 9407  | 9608  | 9403   |
| 40  | f   | 12807 | 12836 | 12816 | 12942 | 12801 | 12708 | 13005 | 13193 | 13483 | 13569 | 12930  |
| 45  | f   | 15811 | 15995 | 16742 | 16734 | 16989 | 16888 | 17452 | 17539 | 17995 | 18141 | 18289  |
| 50  | f   | 18927 | 19145 | 19668 | 19709 | 20631 | 20503 | 21268 | 21418 | 22641 | 23247 | 23225  |
| 55  | f   | 21640 | 22063 | 22719 | 23327 | 23935 | 23646 | 25333 | 26087 | 26499 | 27212 | 28079  |
| 60  | f   | 28736 | 28034 | 28237 | 28486 | 29183 | 27828 | 29430 | 30294 | 31674 | 31475 | 33134  |
| 65  | f   | 33666 | 33568 | 34661 | 35305 | 36698 | 36010 | 36989 | 36809 | 37489 | 37939 | 38753  |
| 70  | f   | 40793 | 41495 | 42268 | 42914 | 43582 | 41904 | 44202 | 44802 | 45586 | 47136 | 48563  |
| 75  | f   | 41986 | 43204 | 46537 | 47754 | 49720 | 49277 | 52810 | 53314 | 53158 | 54104 | 55018  |
| 80  | f   | 41799 | 42139 | 44151 | 45539 | 47601 | 47606 | 51097 | 53915 | 55565 | 58502 | 61437  |
| 85  | f   | 60836 | 64241 | 69832 | 73771 | 76821 | 77892 | 83906 | 86894 | 90304 | 95430 | 104543 |

TABLE B2. SUPPLEMENTARY 2000-2010 ANNUAL VITAL REGISTRATION DEATHS BY AGE AND SEX FOR BRAZIL

In the example given in table B1 for the 2000-2010 intercensal period in Brazil, the completeness is estimated for two 10-year periods: 2000-2009 and 2001-2010, corresponding to the 10-year period either starting from the year of the first census or ending in the year of the second census. The average of the two estimates is used as the final estimate.

In the first case, deaths10first is used based on the cumulated number of deaths for the first 10 years starting from the year of the first census (2000) up to the end of 2009 (see column 8). The population on 1 January 2000 (as pop1estimate) is computed using pop1 \*  $\exp(r * (2000-date1dec))$  where  $r = \log(pop2 / pop1) / (date2dec - date1dec)$  and the population on 1 January 2010 (as pop2estimate) is computed using pop2 \*  $\exp(r * (2010-date2dec))$ . In the second case, deaths10last (Column 9) is computed as the sum of the last 10 years of annual deaths ending with the year of the second census (2010), thus covering the period 2001 up to the end of 2010. In this case, for the rest of the evaluation the population on 1 January 2001 is computed using Pop1 \*  $\exp(r * (2001-date1dec))$  and the population on 1 January 2011 using pop2 \*  $\exp(r * (2011-date2dec))$ .

Table B3 provides these intermediate values for female by 5-year age groups from age 60 onward for the first case using deaths10first as deaths. Death completeness (DxCompleteness) in this case is computed for each age group summing up the deaths over the 10-year period by cohort and dividing them by the population change by cohort within this period<sup>6</sup>. For example, for the first age 60, the sum of deaths by cohort over this 10-year period corresponds to ((0.25\* deaths (60-64)) + (0.5\*deaths (65-69)) + (0.25\*deaths (70-74))) = ((0.25\*293377) + (0.5\*359134) + (0.25\*434682)) = 361582. The population change by cohort within this period corresponds to: poplestimate (60-64) – pop2estimate (70-74) = 2398842-2028870 = 369971. Thus, the ratio of deaths to surviving population for age 60-74 = 100 \* (361582 / 369971) = 97.7.

| age | sex | DateStart | DateEnd | deaths | r        | poplestimate | pop2estimate | DxCompleteness |
|-----|-----|-----------|---------|--------|----------|--------------|--------------|----------------|
| 60  | f   | 2000      | 2010    | 293377 | 0.034418 | 2398842      | 3384368      | 97.7           |
| 65  | f   | 2000      | 2010    | 359134 | 0.029467 | 1908535      | 2562569      | 90.5           |
| 70  | f   | 2000      | 2010    | 434682 | 0.031167 | 1485589      | 2028870      | 91.4           |
| 75  | f   | 2000      | 2010    | 491864 | 0.038349 | 976814       | 1433369      |                |
| 80  | f   | 2000      | 2010    | 487915 | 0.049062 | 590313       | 964173       |                |
| 85  | f   | 2000      | 2010    | 779926 | 0.04828  | 479462       | 777018       |                |

TABLE B3. COMPUTATION OF DEATH COMPLETENESS FOR 2000-2010 FEMALE IN BRAZIL FOR AGE GROUPS

The same computations can be performed for open age groups using the population and death distributions cumulated downwards from older ages to younger ones as seen in table B4.

<sup>&</sup>lt;sup>6</sup> Note that for other situations with a 5-year period, the sum of deaths by cohort at age 60-64 over a 5-year period corresponds to ((0.5\* deaths(60-64)) + (0.5\* deaths(65-69)) and the population change by cohort within this period corresponds to: poplestimate(60-64) – pop2estimate(65-69).

| age sex |   | DateStart | DateEnd | deaths. | pop1estimate. | pop2estimate. | DxCompletenessOpenAge |
|---------|---|-----------|---------|---------|---------------|---------------|-----------------------|
|         |   |           |         | CumSum  | CumSum        | CumSum        |                       |
| 60      | f | 2000      | 2010    | 2846898 | 7839554       | 11150367      | 96.2                  |
| 65      | f | 2000      | 2010    | 2553521 | 5440713       | 7766000       | 96.0                  |
| 70      | f | 2000      | 2010    | 2194387 | 3532178       | 5203430       | 97.5                  |
| 75      | f | 2000      | 2010    | 1759705 | 2046589       | 3174560       | 99.9                  |
| 80      | f | 2000      | 2010    | 1267841 | 1069775       | 1741191       |                       |
| 85      | f | 2000      | 2010    | 779926  | 479462        | 777018        |                       |

TABLE B4. COMPUTATION OF DEATH COMPLETENESS FOR 2000-2010 FEMALE IN BRAZIL FROM OPEN AGE GROUP

The computations performed using the deaths and population estimates for the first 5 or 10 years can be repeated in similar fashion for the last 5 or 10-years. Final estimates in this case can be computed as the average of the two and table 1 in this paper presents those.

## C. ICSE RESULTS FOR OPEN AGE GROUPS

# Figure C1. Brazil 1980-2010 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

Figure C2. Egypt 1947-2006 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



Figure C3. Maldives 1985-2014 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

Figure C4. Malaysia 1991-2010 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



Figure C5. Thailand 1960-2010 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



*Note*: data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

## D. EVALUATING COMPLETENESS OF DEATH REGISTRATION ONLINE SUPPLEMENT

Online supplement available at http://bit.ly/UNPD\_Mortality\_EvalCompDR

## I. INTRODUCTION

In 2015-2020, 64 per cent of deaths worldwide are estimated to take place at age 60 years and older (United Nations, 2019). During this period, 37 million out of an annual average total of 57 million deaths occurred in that age group. Complete registration of deaths is still not universal and only 55% of countries and areas have at least 90% coverage (United Nations, 2017). Assessing the completeness of death registration plays an important part in preparing population estimates.

Analytical evaluations of the completeness of death registration (DR) originate from stable population models. In stationary populations, the number of deaths at or above a given age is the number of persons in the population at the given age. Therefore, the number of registered deaths at or above a certain age could be evaluated by comparing them with the number of persons at this age, if the population is stationary. In a stable population, the number of deaths at or above a given age is the number of persons in the population at the given age minus an additional term, which is the product of the number of persons in the population at or above the given age and the growth rate of the stable population. This relationship was first utilized by Brass (1975), to evaluate the completeness of DR. Using the growth rates by age obtained from two successive censuses, the evaluation was extended to non-stable populations by Preston and Hill (1980), Bennett and Horiuchi (1981), and Hill (1987). These evaluations are sophisticated and require various assumptions, among which two are common and fundamental. The first is that there is no migration; and the second is that there are no census errors. Since the two fundamental assumptions are unrealistic in most situations, the various types of errors that would be caused by the aforementioned approach require further investigation.

The purposes of this paper are to analyse the evaluation errors when these two fundamental assumptions (i.e., no migration and/or no or similar census errors) are violated; and to propose the intercensal cohort survival evaluation (ICSE) to address problems that occur in evaluating the completeness of DR in highly developed countries. Subtracting the number of survivors in a certain old age group in the first census from the number of individuals in that cohort in the first census gives the number of deaths computed by ICSE. The number of *registered* deaths that occurred to the same cohort can be counted using Lexis triangles (United Nations, 2004), or estimated using assumptions such as even distribution over age and across time. <sup>1</sup> The completeness of DR is evaluated as the ratio of the corresponding number of DR deaths to the ICSE-computed number of deaths. The ICSE is based on the survival process, not on a balance of growth process. It provides a simple comparison procedure to check the consistency between the results based on two successive censuses and expected deaths.

The first difference between ICSE and other methods, such as the General Growth Balance method (Hill, 1987) and the Variable-r method (Bennett and Horiuchi, 1981), is that ICSE does not contain complex relationships. The effects of census error can be assessed and the assumption that census error is zero (or that the errors in the two censuses are similar) can be confirmed. The second difference is that ICSE focuses

<sup>&</sup>lt;sup>1</sup> In the case of the deaths of Japanese males aged 60-64 between 2000-2004, the error of assuming an even distribution when transforming deaths by 5-year period and 5-year age group into cohort deaths for the corresponding 5-year period is 0.25 per cent (based on data from the Human Mortality Database).

on old ages, so the required assumption of zero migration should not be far off the mark because at old ages, such as 60 years and over, numbers of migrants are usually negligible compared to deaths.

# II. PROBLEMS WITH THE APPLICATION OF THE ICSE METHOD TO HIGH QUALITY DATA

The use of the ICSE method is expected to provide reasonable results for countries with sufficiently high-quality census data. The Human Mortality Database (HMD), for instance, covers 38 countries (or areas) where death registration and census data are virtually complete and provides a high-quality dataset commonly used as a benchmark for further research. Unfortunately, the application of the ICSE method to a subset of HMD countries provided inconclusive results.

In the HMD, populations according to age group on 1 January of years 2000 and 2010, for instance, are estimated from corresponding censuses and can be conveniently used to match the period in which deaths are registered annually. Any conceptual or definitional issues about respective data sources have already been resolved by country teams through the HMD method protocol. For example, the numbers of Japanese men aged 60-64 on 1 January 2000 and aged 70-74 on 1 January 2010 are estimated in the HMD, using data from the 2000 and 2010 censuses, and the numbers of deaths by age are collected annually between 2000 and 2010 by the Japanese DR system. Applying ICSE to these data, however, would suggest that the DR over-registered male deaths by 18 per cent, which is implausible and makes the evaluation meaningless.

Choosing Japan as an example is useful because Japan is one of the few countries that collected data not only on in-migration, but also on out-migration. At ages 60-74 years, the annual net international male migration was estimated to be less than 0.01 per cent of the population (National Institute of Population and Social Security Research, 2002), which, cumulated over the ten years between 2000 and 2010, accounts for less than 0.1 per cent of the population. In other words, the effect of migration is equivalent to less than 0.1 per cent error in the population of one census. According to the results of the Post-Enumeration Survey (PES) of the 2010 census (Statistics Bureau of Japan, 2013), the census errors at ages 60-64, 65-69 and 70-74 are 1.44 per cent, 1.14 per cent and 0.92 per cent, respectively. Thus, the effect of census error is 10 times larger than that of migration. If the 2000 census errors under counted the population aged 60-64 by 1.44 per cent and the 2010 census over-counted the population aged 70-74 by 0.92 per cent, the result of ICSE would be that the DR system over-registered deaths by less than 1 per cent if the completeness is close to 100 per cent.

How can such a small census error (for example, 1.5 per cent) cause such a large degree of error (in the example above, 18 per cent) with the application of ICSE? The quality of Japan's census data is high. If the census errors make the application of ICSE meaningless for Japan, what about other countries? An answer is offered later in the paper.

A further issue is that for many indirect estimation methods, mortality levels are estimated using the population numbers in two successive censuses. Can such estimates be accurate and useful? An answer is provided in Appendix A.

# III. THE DIFFERENT TYPES OF ERRORS IN USING INTERCENSAL COHORT SURVIVAL EVALUATION (ICSE)

The previous section discussed the nature of the problem of applying the ICSE method to high quality data. The present section investigates in more theoretical and algebraic terms the 'source' of the problem.

Let the number of persons in a given age interval enumerated in the first census be  $p_1$  and the number of survivors in the next census be  $p_2$ . Further, let the net undercounting rates<sup>2</sup> be  $u_1$  and  $u_2$  for the first and second censuses, respectively. Neglecting intercensal migration, the numbers of deaths ( $\hat{d}$ ) and estimated deaths ( $\hat{d}$ ) by cohort are:

$$d = p_1 - p_2,$$
  

$$\hat{d} = \hat{p}_1 - \hat{p}_2 = p_1(1 - u_1) - p_2(1 - u_2) = d - (p_1u_1 - p_2u_2).$$
(1)

Furthermore, let the survival ratio be:

$$s = p_2 / p_1. \tag{2}$$

Then, the relative error in estimating the number of deaths is:

$$E_{d} = \frac{\hat{d} - d}{d} = -\frac{p_{1}u_{1} - p_{2}u_{2}}{d} = -\frac{p_{1}[u_{1} - s \cdot u_{2}]}{p_{1}(1 - s)} = -\frac{u_{1} - s \cdot u_{2}}{(1 - s)}.$$
(3)

Now, consider death registration (DR) and let the number of registered deaths be  $d_R$ . Then, the completeness of DR, namely *c*, and the evaluated completeness of DR,  $\hat{c}$ , are:

$$c = \frac{d_R}{d},$$

$$\hat{c} = \frac{d_R}{\hat{d}}.$$
(4)

And the relative error of evaluating the completeness of DR is:

$$E_{c}(s,u_{1},u_{2}) = \frac{\hat{c}-c}{c} = \frac{\hat{c}}{c} - 1 = \frac{d}{\hat{d}} - 1 = \frac{1}{1+E_{d}} - 1 = \frac{-E_{d}}{1+E_{d}} = \frac{u_{1}-s \cdot u_{2}}{1-s - u_{1} + su_{2}},$$
(5)

which is a function of mortality level (s) and census errors.

 $<sup>^2</sup>$  The net undercount rate represents the relative difference between the reported and the true numbers of population, which could be the result of misreporting of people or misreporting of age. A positive net undercounting rate indicates net under-counting or that the reported number is smaller than the true number. The net undercount rate could also be negative to reflect net over-counting that may or may not be caused by misreporting of age.

#### A. IDEAL CENSUS ERRORS

Obviously, when  $u_1 = u_2 = 0$  or  $u_1 = s \cdot u_2$ , (5) yields  $E_c(s, u_1, u_2) = 0$ . In other words, when census errors are zero or are similar between the two censuses, the ICSE result would be perfect. But the  $u_1 = u_2 = 0$  or  $u_1 = s \cdot u_2$ , or other similar requirements that are taken as assumptions for using various models to evaluate the completeness of DR, are unrealistic and cannot explain evaluation errors in practice.

The following section investigates the causes of unreasonable results from applying ICSE, such as the 18 per cent "over registration" of Japanese male deaths.

## B. MARGINAL EFFECTS OF CENSUS ERRORS

According to (5), we have:

$$\frac{\partial E_{c}(s, u_{1}, u_{2})}{\partial u_{1}} = \frac{1-s}{\left[1-s-u_{1}+s \cdot u_{2}\right]^{2}} > 0,$$

$$\frac{\partial E_{c}(s, u_{1}, u_{2})}{\partial u_{2}} = \frac{-s(1-s)}{\left[1-s-u_{1}+s \cdot u_{2}\right]^{2}} < 0.$$
(6)

Therefore, for  $u_1, u_2 > 0$ ,<sup>3</sup>

$$\begin{split} E_{c}(s,u_{1},u_{2}) &\approx E_{c}(s,0,u_{2}) + u_{1} \frac{\partial E_{c}(s,u_{1},u_{2})}{\partial u_{1}} \Big|_{u_{1}=0} > E_{c}(s,0,u_{2}), \\ E_{c}(s,u_{1},u_{2}) &\approx E_{c}(s,u_{1},0) + u_{2} \frac{\partial E_{c}(s,u_{1},u_{2})}{\partial u_{2}} \Big|_{u_{2}=0} < E_{c}(s,u_{1},0), \\ E_{c}(s,0,u_{2}) < E_{c}(s,u_{1},u_{2}) < E_{c}(s,u_{1},0) \end{split}$$
(7)

Thus, in general  $E_c(s, u_1, u_2)$  lies between two marginal values, which are:

$$E_{c}(s,u_{1},0) = \frac{u_{1}}{1-s-u_{1}},$$
(8)

and

$$E_{c}(s,0,u_{2}) = \frac{-s \cdot u_{2}}{1-s+s \cdot u_{2}}.$$
(9)

Given  $u_1$  and  $u_2$ ,  $E_c(s, u_1, 0)$  or  $|E_c(s, 0, u_2)|$  will increase with s and could be quite large when s is large. When  $u_2 = 0$ , (8) could explain the unreasonable "over registrations" of Japanese male deaths. The

<sup>&</sup>lt;sup>3</sup> For  $u_1 < 0$  or  $u_2 > 0$ , the analysis can be done in the same way.

s of Japanese men in the above example is about 0.866. Thus, plausibly taking  $u_1 = 0.02$ , (8) shows  $E_c(s, u_1, 0) = 0.18$  and explains why the unreasonable result for Japan occurs. On the other hand, if  $u_1 = 0$ , (9) could explain "under registrations", which can also be quite large when s is large. Taking also the above example of Japanese women and assuming  $u_2 = 0.02$ , (9) shows  $E_c(s, 0, u_2) = -0.15$ .

In general, the evaluation error described by (5) depends on  $u_1$  and  $u_2$ , and will be between that of (8) and (9).

### C. THE EFFECT OF MORTALITY LEVEL

Knowledge about what factors affect the evaluation of DR is limited. Studies have been carried out through simulations (Hill and others, 2009; Murray and others, 2010; Palloni and others, 2015). As implied by the analytical framework introduced above, the idea that the mortality level affects the evaluation of DR completeness is a new finding that has remained unidentified by previous works. How the level of mortality affects the evaluation of DR is described by equations (7)-(9), which indicate that when the mortality level is lower (or s is larger), evaluation errors are bigger and vice versa. For the purpose of illustration, selective values of ICSE error are shown in Table 1, which indicates how the error increases (in absolute value) with the ratio of survival from age group 60-64 to age group 70-74 (s) at different levels of census error. For example, if  $u_1 = (1-s) = 0.05$  and  $u_2 = 0$ , the under-enumeration of 5 per cent of the population in the first census will just offset the 5 per cent deaths among the population. Consequently, the evaluated deaths will be zero. The evaluation error will be infinite regardless of the number of registered deaths, which is shown as 'INF' in Table 1.

| Survival ratio s            | 0.5  | 0.55 | 0.6  | 0.65 | 0.7   | 0.75  | 0.8   | 0.85  | 0.9   | 0.95  |
|-----------------------------|------|------|------|------|-------|-------|-------|-------|-------|-------|
| Value of $u_1$ ( $u_2=0$ )  |      |      |      |      |       |       |       |       |       |       |
| 0.01                        | 2.0  | 2.3  | 2.6  | 2.9  | 3.4   | 4.2   | 5.3   | 7.1   | 11.1  | 25.0  |
| 0.02                        | 4.2  | 4.7  | 5.3  | 6.1  | 7.1   | 8.7   | 11.1  | 15.4  | 25.0  | 66.7  |
| 0.03                        | 6.4  | 7.1  | 8.1  | 9.4  | 11.1  | 13.6  | 17.6  | 25.0  | 42.9  | 150.0 |
| 0.04                        | 8.7  | 9.8  | 11.1 | 12.9 | 15.4  | 19.0  | 25.0  | 36.4  | 66.7  | 400.0 |
| 0.05                        | 11.1 | 12.5 | 14.3 | 16.7 | 20.0  | 25.0  | 33.3  | 50.0  | 100.0 | INF   |
| Values of $u_2$ ( $u_1=0$ ) |      |      |      |      |       |       |       |       |       |       |
| 0.01                        | -1.0 | -1.2 | -1.5 | -1.8 | -2.3  | -2.9  | -3.8  | -5.4  | -8.3  | -16.0 |
| 0.02                        | -2.0 | -2.4 | -2.9 | -3.6 | -4.5  | -5.7  | -7.4  | -10.2 | -15.3 | -27.5 |
| 0.03                        | -2.9 | -3.5 | -4.3 | -5.3 | -6.5  | -8.3  | -10.7 | -14.5 | -21.3 | -36.3 |
| 0.04                        | -3.8 | -4.7 | -5.7 | -6.9 | -8.5  | -10.7 | -13.8 | -18.5 | -26.5 | -43.2 |
| 0.05                        | -4.8 | -5.8 | -7.0 | -8.5 | -10.4 | -13.0 | -16.7 | -22.1 | -31.0 | -48.7 |
|                             |      |      |      |      |       |       |       |       |       |       |

TABLE 1. EVALUATION ERRORS (PERCENTAGE) OF ICSE BY SURVIVAL RATIO (S) AND CENSUS ERROR

This conclusion is not difficult to understand. When the mortality level is low, a small number of deaths is estimated based on large population numbers. Therefore, a small relative error in enumerating population in the censuses will lead to a large relative error in estimating deaths or in evaluating the completeness of DR. This conclusion similarly applies to the death distribution methods (DDM) that also use the census population numbers to estimate the number of deaths.

The conclusion is supported by the ICSE assessments in Figure 1, using data on population and death from HMD, assuming that the completeness of DR is close to 100 per cent for different old age intervals (e.g., 60-74, 65-79, 70-84). Female mortality is generally lower than male mortality at those ages. Consequently, the ICSE errors for females are larger than those for males. Likewise, mortality levels at younger ages are lower than at older ages. Therefore, the ICSE errors at younger ages are larger than at older ages.

Since it is highly likely that DR is almost 100 per cent complete in the countries in Figure 1, any estimate significantly different from 100 per cent completeness must be considered suspect. Figure 1 therefore indicates that for the highly developed countries, ICSE is unable to provide reasonable evaluations of survival from age 60-64 to 70-74) or at still older ages. This raises the question: can ICSE work at all? The conditions for ICSE to work are illustrated below.



Figure 1. Percentage of ICSE completeness of death registration by sex and age group, selected developed countries 2000-2010

Source: computations by the authors based on HMD data

Canada

France

Germany

# IV. APPROPRIATE CONDITIONS FOR USING INTERCENSAL COHORT SURVIVAL EVALUATION (ICSE)

Italy

UK

Japan

US

The census errors at age 60 or over in the 2010 census of Japan are slightly greater than 1 per cent on average. Assuming that the quality of the Japanese census is higher than the other developed countries compared in Figure 1, it can be expected that, in general, census errors at age 60 or over are 1 per cent.

Using  $u_1 = u_2 = 0.01$ , the ranges of ICSE assessment error are described by (8)-(9) as functions of survival ratio and depicted in Figure 2.



Figure 2. The range of ICSE assessment error with one per cent census error

*Note:*  $E_c(s, u_1, u_2)$  is the relative error of evaluating the completeness of DR which is a function of mortality level (s) and errors in the first and second censuses ( $u_1$  and  $u_2$ ).

When the completeness of death registration is high, so that only very small evaluation errors are acceptable, or when the level of mortality is low, so that the evaluation errors are large, the ICSE method cannot provide a reasonable result for old ages because the incompleteness is significantly smaller than the error range. This explains the problems encountered when applying the ICSE method to the HMD countries in recent years. Consequently, the ICSE method should not be applied to developed countries, at least for recent years.

When the completeness is not high, so that moderate evaluation errors are acceptable and when the level of mortality is not low, so that the evaluation errors are not large, the ICSE method could provide a reasonable result for older ages such as 60 years or over because the incompleteness is much greater than the error range. This is the situation of many developing countries in recent and earlier years. Consequently, the ICSE method remains applicable to developing country conditions.

The two curves in figure 2 are not symmetric to level 0, and the marginal errors of over-evaluation (positive) are larger than the absolute value of the marginal errors of under-evaluation. This feature indicates that when the errors in the two censuses are similar, the over-evaluating effect would be bigger than the under-valuating effect. Because of the cancelling out of the two effects, over-evaluation errors would tend to appear more often than under-evaluation errors. This feature is supported by the evaluations in figure 1, in which there are indeed more over-evaluation errors (>100).

# V. APPLICATION

To investigate the performance of this approach, the ICSE method can be tested in a sample of five developing countries with multiple censuses about 5 to 10 years apart, and death counts from vital registration available annually over several intercensal periods. The five countries are Brazil for 1980-1991, 1991-2000 and 2000-2010 intercensal periods; Egypt for 1947-1960, 1960-1976, 1976-1986, 1986-1996 and 1996-2006 intercensal periods; Maldives for 1985-1990, 1990-1995, 1995-2000, 2000-2006 and 2006-2014 intercensal periods; Malaysia for 1991-2000 and 2000-2010 intercensal periods; and Thailand for 1960-1970, 1970-1980, 1980-1990, 1990-2000, and 2000-2010 intercensal periods.

Summary results are provided in Table 2 for selected age groups from age 60 and over, as well as for corresponding open age groups. Appendix B provides further details about data sources and an illustrative example of the steps involved in the computations.

Figures 3A to 3E provide a summary plot by sex for each of these respective countries, showing the trend over time of the intercensal completeness in death registration. Each summary plot is based on the application of the ICSE method for selected age groups from age 60 onward (see also Appendix C for results with open age groups), the application of three of the most well-established death distribution methods: Generalized Growth Balance, ggb (Hill, 1987); Synthetic Extinct Generation, seg (Bennett and Horiuchi, 1981 and 1984); and the extended method using ggb first to adjust census completeness before applying seg, denoted here as ggbseg (Hill and others, 2009).

Estimates of completeness for these three death distribution methods (DDM) are based on the same input data as for the ICSE method and were computed using R with the DDM package (Riffe et al, 2017). Table 3 provides a summary of these DDM results. The age range used for each DDM varies for each country, period, sex and method, and was chosen automatically by the DDM R package by minimizing the average squared residual and finding the best-fitting linear relationship by "picking ages that follow the advice typically given for doing so visually."

#### Figure 3A. Brazil 1980-2010 intercensal completeness of death registration by sex based on ICSE for selected age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

#### A. BRAZIL

Results from the application of the ICSE method to Brazil for the 1980-2010 period (orange-red lines on Figure 3A for ages 60-74, 65-79, 70-84) suggest that the completeness of death registration is better for males than for females and has improved in the most recent intercensal decade to about 95 per cent for males and 90-95 per cent for females. Overall results, especially for the most recent decade, are reasonably consistent with those from the three DDMs. Differences in ICSE results by specific age groups indicate a greater challenge with regard to completeness or data quality reporting in earlier periods, especially under age 70 and for females.

#### B. EGYPT

In Egypt (Figure 3B), due to data availability only with a lower open age group (75+), the ICSE method can only be computed over the 1947-2006 period for the age group 60-74. While the overall trend suggests some improvement over time, the ICSE results suggest a rather low completeness (with female lower than male). The results suggest a far lower completeness than the results from the application of the three DDMs (in green on Figure 3B), which are more consistent with the consensus from national authorities about the completeness of death registration in Egypt in recent decades.

This discrepancy between ICSE and DDM results is related to the sensitivity of the age reporting and data quality used for the ICSE with a particular age group. If instead the ICSE method is computed for the open age group 60+ (see Appendix C figure C2), the results are more consistent with the DDM evaluation. However, the use of the open age group 65+ in this case shows some completeness results implausibly high and suggests that the use of data at older ages in Egypt is problematic.

Figure 3B. Egypt 1947-2006 intercensal completeness of death registration by sex, based on ICSE for selected age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

## C. MALDIVES

The application of the ICSE method in 2000-2014 in the Maldives (Figure 3C) demonstrates some reasonably consistent results for age groups starting at age 65 with the application of the three DDMs, which suggest overall a very high level of completeness. However, the ICSE results for the age group 60-74 years are far more erratic and implausible, and are indicative of migration perturbations, especially below age 65. But the inclusion of data at higher ages for the open age group 60+ onward shows that before 2000, data on older ages in the Maldives were probably too unreliable to provide a meaningful assessment of completeness (see Appendix C figure C3).

# Figure 3C. Maldives 1985-2014 intercensal completeness of death registration by sex, based on ICSE for selected age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

#### D. MALAYSIA

In the case of Malaysia, the ICSE results for males are overall consistent with results of using DDMs and indicative of high completeness for the 1991-2010 period (Figure 3D). For females, the ICSE results are far more discordant and indicate an implausibly low level of completeness based on the age group 60-74. Similar to the case of Egypt, if the ICSE method is computed on the open age group 60+ (see Appendix C figure C4), the results are more consistent with the DDM evaluation and with a very high level of completeness. This evidence suggests that data at older ages, especially for females in Malaysia, are more affected by age reporting and data quality issues.

#### E. THAILAND

Finally, the application of the ICSE method to Thailand for the period 1960-2010 (Figure 3E), provides reasonable consistency with the DDMs results, including the fluctuations over time related to migration issues, especially in the mid-1990s. Results for specific age groups are consistent overall, irrespective of the ages used, including the case where open age groups are included (see Appendix C figure C5). ICSE results for 1970-1990 and 2000-2010 indicate a high completeness of 90 per cent or more for both sexes, with a higher completeness in the 1970-1990 period for males than for females and since 2000 slightly higher for females than for males.

Figure 3D. Malaysia 1991-2010 intercensal completeness of death registration by sex, based on ICSE for selected age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

Figure 3E. Thailand 1960-2010 intercensal completeness of death registration by sex, based on ICSE for selected age groups and death distribution methods



An important implication of this research, already stated, is worth repeating: ICSE cannot provide reasonable results for young ages, at which the level of mortality is low, and the number of migrants can matter more than deaths. An example of applying ICSE to all ages in Thailand is shown in Figure 4.

Figure 4. Percentage of ICSE completeness of death registration by sex and age group, Thailand 2000-2010



|                       |       |      | Ļ                 | Specific age | group             | Open age group |      |                   |        |                   |  |
|-----------------------|-------|------|-------------------|--------------|-------------------|----------------|------|-------------------|--------|-------------------|--|
| Location and          |       | Male |                   | Female       |                   |                | Male |                   | Female |                   |  |
| intercensal<br>period | age   | sx   | Complete<br>-ness | sx           | Complete<br>-ness | Age            | sx   | Complete<br>-ness | sx     | Complete<br>-ness |  |
| A. Brazil             |       |      |                   |              |                   |                |      |                   |        |                   |  |
| 1980-1991             | 60-74 | 0.71 | 107.2             | 0.78         | 90.8              | 60+            | 0.54 | 104.2             | 0.61   | 97.6              |  |
|                       | 65-79 | 0.57 | 90.0              | 0.66         | 81.9              | 65+            | 0.45 | 103.3             | 0.52   | 99.1              |  |
|                       | 70-84 | 0.45 | 103.6             | 0.55         | 99.2              | 70+            | 0.35 | 110.3             | 0.42   | 106.3             |  |
|                       |       |      |                   |              |                   | 75+            | 0.25 | 115.3             | 0.32   | 110.3             |  |
| 1991-2000             | 60-74 | 0.74 | 93.9              | 0.82         | 83.3              | 60+            | 0.58 | 94.1              | 0.65   | 90.2              |  |
|                       | 65-79 | 0.62 | 85.7              | 0.71         | 77.3              | 65+            | 0.49 | 94.1              | 0.57   | 91.6              |  |
|                       | 70-84 | 0.51 | 95.4              | 0.63         | 94.5              | 70+            | 0.40 | 97.9              | 0.48   | 96.6              |  |
|                       |       |      |                   |              |                   | 75+            | 0.31 | 99.4              | 0.38   | 97.6              |  |
| 2000-2010             | 60-74 | 0.77 | 105.4             | 0.84         | 96.0              | 60+            | 0.59 | 100.3             | 0.67   | 96.6              |  |
|                       | 65-79 | 0.66 | 100.5             | 0.75         | 91.3              | 65+            | 0.50 | 99.2              | 0.59   | 96.7              |  |
|                       | 70-84 | 0.54 | 96.3              | 0.65         | 92.8              | 70+            | 0.41 | 98.8              | 0.50   | 98.1              |  |
|                       |       |      |                   |              |                   | 75+            | 0.31 | 100.1             | 0.38   | 100.3             |  |
| B. Egypt              |       |      |                   |              |                   |                |      |                   |        |                   |  |
| 1947-1960             | 60-74 | 0.49 | 47.1              | 0.54         | 31.5              | 60+            | 0.44 | 113.7             | 0.46   | 106.3             |  |
|                       |       |      |                   |              |                   | 65+            | 0.39 | 161.2             | 0.39   | 151.4             |  |
| 1960-1976             | 60-74 | 0.54 | 73.5              | 0.58         | 49.5              | 60+            | 0.43 | 106.2             | 0.45   | 117.0             |  |
|                       |       |      |                   |              |                   | 65+            | 0.35 | 123.9             | 0.36   | 149.0             |  |
| 1976-1986             | 60-74 | 0.61 | 89.8              | 0.49         | 49.2              | 60+            | 0.44 | 102.2             | 0.37   | 94.6              |  |
|                       |       |      |                   |              |                   | 65+            | 0.31 | 107.5             | 0.29   | 1183              |  |
| 1986-1996             | 60-74 | 0.57 | 86.8              | 0.52         | 59.1              | 60+            | 0.40 | 94.5              | 0.39   | 103.9             |  |
|                       |       |      |                   |              |                   | 65+            | 0.28 | 97.6              | 0.30   | 127.3             |  |
| 1996-2006             | 60-74 | 0.57 | 74.6              | 0.56         | 59 3              | 60+            | 0.20 | 103.2             | 0.50   | 114.4             |  |
| 1770-2000             | 00 /1 | 0.57 | /1.0              | 0.50         | 57.5              | 65             | 0.25 | 115.9             | 0.15   | 142.2             |  |
|                       |       |      |                   |              |                   | 03+            | 0.55 | 115.8             | 0.38   | 145.5             |  |
| C. Malaysia           | (0.74 | 0.72 | 101 7             | 0.75         | 79.0              |                | 0.54 | 07.0              | 0.57   | 90.1              |  |
| 1991-2000             | 60-74 | 0.73 | 101.7             | 0.75         | /8.0              | 60+            | 0.54 | 97.9              | 0.57   | 89.1              |  |
|                       |       |      |                   |              |                   | 65+            | 0.44 | 96.8              | 0.48   | 92.1              |  |
| 2000-2010             | 60-74 | 0.73 | 96.3              | 0.75         | 74.3              | 60+            | 0.60 | 112.1             | 0.62   | 104.5             |  |
|                       |       |      |                   |              |                   | 65+            | 0.52 | 117.9             | 0.54   | 113.9             |  |
| D. Maldives           |       |      |                   |              |                   |                |      |                   |        |                   |  |
| 1985-1990             | 60-74 | 0.70 | 41.2              | 0.57         | 26.3              | 60+            | 0.71 | 86.3              | 0.67   | 70.7              |  |
|                       |       |      |                   |              |                   | 65+            | 0.72 | 122.1             | 0.76   | 154.1             |  |
| 1990-1995             | 60-74 | 0.72 | 43.5              | 0.72         | 46.1              | 60+            | 0.74 | 96.2              | 0.74   | 95.2              |  |
|                       |       |      |                   |              |                   | 65+            | 0.76 | 144.8             | 0.76   | 143.8             |  |

| TABLE 2. INTERCENSAL COMPLETENESS OF DEATH REGISTRATION BY SEX, BASED ON ICSE FOR SELECTED AGE GROUP | S |
|--|---|
| AND BY OPEN AGE GROUPS FOR FIVE SELECTED COUNTRIES   |   |

| Specific age group    |       |      |                   |        |                   |     |      |                   | Open age g | roup              |
|-----------------------|-------|------|-------------------|--------|-------------------|-----|------|-------------------|------------|-------------------|
| Location and          |       | Male |                   | Female |                   |     | Male |                   | Female     |                   |
| intercensal<br>period | age   | sx   | Complete<br>-ness | SX     | Complete<br>-ness | Age | sx   | Complete<br>-ness | sx         | Complete<br>-ness |
| 1995-2000             | 60-74 | 0.89 | 114.3             | 0.87   | 85.7              | 60+ | 0.79 | 105.5             | 0.78       | 108.4             |
|                       |       |      |                   |        |                   | 65+ | 0.72 | 105.6             | 0.72       | 116.4             |
| 2000-2006             | 60-74 | 0.92 | 206.1             | 0.91   | 183.5             | 60+ | 0.83 | 127.5             | 0.84       | 127.2             |
|                       | 65-79 | 0.87 | 126.3             | 0.90   | 149.1             | 65+ | 0.78 | 128.2             | 0.80       | 133.3             |
|                       | 70-84 | 0.80 | 116.0             | 0.76   | 96.4              | 70+ | 0.71 | 132.6             | 0.71       | 131.5             |
|                       | 75-89 | 0.67 | 103.7             | 0.75   | 148.9             | 75+ | 0.62 | 136.9             | 0.65       | 155.8             |
|                       | 80-94 | 0.56 | 101.2             | 0.54   | 94.8              | 80+ | 0.55 | 149.1             | 0.54       | 139.1             |
|                       | 85-99 | 0.52 | 117.3             | 0.55   | 107.9             | 85+ | 0.54 | 170.1             | 0.54       | 157.4             |
|                       |       |      |                   |        |                   | 90+ | 0.57 | 185.8             | 0.53       | 166.9             |
| 2006-2014             | 60-74 | 0.86 | 174.4             | 0.88   | 157.7             | 60+ | 0.59 | 92.5              | 0.62       | 87.6              |
|                       | 65-79 | 0.64 | 87.1              | 0.68   | 81.7              | 65+ | 0.49 | 84.2              | 0.50       | 80.4              |
|                       | 70-84 | 0.51 | 85.3              | 0.45   | 72.7              | 70+ | 0.39 | 83.2              | 0.36       | 80.2              |
|                       | 75-89 | 0.32 | 77.3              | 0.33   | 89.0              | 75+ | 0.27 | 81.9              | 0.26       | 86.6              |
|                       | 80-94 | 0.24 | 95.9              | 0.20   | 83.2              | 80+ | 0.19 | 87.5              | 0.17       | 84.2              |
|                       |       |      |                   |        |                   | 85+ | 0.11 | 77.0              | 0.13       | 85.6              |
| E. Thailand           |       |      |                   |        |                   |     |      |                   |            |                   |
| 1960-1970             | 60-74 | 0.57 | 67.0              | 0.69   | 65.5              | 60+ | 0.45 | 79.4              | 0.54       | 78.3              |
|                       | 65-79 | 0.47 | 75.1              | 0.60   | 77.4              | 65+ | 0.37 | 85.4              | 0.46       | 82.6              |
|                       | 70-84 | 0.34 | 81.5              | 0.44   | 75.6              | 70+ | 0.29 | 91.7              | 0.36       | 84.8              |
|                       |       |      |                   |        |                   | 75+ | 0.24 | 100.5             | 0.29       | 90.7              |
| 1970-1980             | 60-74 | 0.68 | 94.4              | 0.79   | 96.1              | 60+ | 0.54 | 96.1              | 0.60       | 89.6              |
|                       | 65-79 | 0.55 | 88.5              | 0.66   | 87.2              | 65+ | 0.44 | 96.7              | 0.50       | 88.1              |
|                       | 70-84 | 0.42 | 92.6              | 0.51   | 81.2              | 70+ | 0.34 | 101.4             | 0.40       | 88.5              |
|                       |       |      |                   |        |                   | 75+ | 0.26 | 108.8             | 0.30       | 93.0              |
| 1980-1990             | 60-74 | 0.73 | 98.5              | 0.82   | 98.8              | 60+ | 0.58 | 99.1              | 0.65       | 96.0              |
|                       | 65-79 | 0.62 | 94.8              | 0.73   | 97.8              | 65+ | 0.50 | 99.4              | 0.57       | 95.5              |
|                       | 70-84 | 0.49 | 92.0              | 0.59   | 86.3              | 70+ | 0.41 | 101.5             | 0.47       | 94.8              |
|                       |       |      |                   |        |                   | 75+ | 0.33 | 108.8             | 0.37       | 99.6              |
| 1990-2000             | 60-74 | 0.69 | 66.0              | 0.78   | 67.2              | 60+ | 0.54 | 75.8              | 0.61       | 78.3              |
|                       | 65-79 | 0.59 | 75.6              | 0.68   | 74.6              | 65+ | 0.45 | 79.4              | 0.52       | 81.1              |
|                       | 70-84 | 0.45 | 77.6              | 0.56   | 78.5              | 70+ | 0.35 | 81.1              | 0.41       | 83.2              |
|                       |       |      |                   |        |                   | 75+ | 0.25 | 83.3              | 0.31       | 85.4              |
| 2000-2010             | 60-74 | 0.77 | 88.2              | 0.83   | 85.8              | 60+ | 0.61 | 89.9              | 0.67       | 92.7              |
|                       | 65-79 | 0.67 | 89.7              | 0.76   | 91.9              | 65+ | 0.53 | 90.3              | 0.59       | 94.1              |
|                       | 70-84 | 0.55 | 87.5              | 0.64   | 90.1              | 70+ | 0.43 | 90.6              | 0.48       | 94.8              |
|                       |       |      |                   |        |                   | 75+ | 0.31 | 92.6              | 0.35       | 97.0              |

|             | Male completeness by method |       |        | Age r | ange  | Female co | mpleteness | by method | Age range |       |  |
|-------------|-----------------------------|-------|--------|-------|-------|-----------|------------|-----------|-----------|-------|--|
| Location    | ggb                         | seg   | ggbseg | Lower | Upper | ggb       | seg        | ggbseg    | Lower     | Upper |  |
| A. Brazil   |                             |       |        |       |       |           |            |           |           |       |  |
| 1980-1991   | 108.9                       | 97.6  | 111.3  | 15    | 50    | 103.4     | 97.0       | 103.8     | 30        | 70    |  |
| 1991-2000   | 105.4                       | 104.6 | 102.0  | 25    | 65    | 100.6     | 101.1      | 97.9      | 30        | 65    |  |
| 2000-2010   | 99.7                        | 101.5 | 95.8   | 25    | 70    | 100.1     | 98.7       | 95.1      | 20        | 60    |  |
| B. Egypt    |                             |       |        |       |       |           |            |           |           |       |  |
| 1947-1960   | 91.3                        | 101.9 | 107.5  | 15    | 55    | 88.1      | 90.4       | 108.9     | 20        | 55    |  |
| 1960-1976   | 99.7                        | 105.3 | 102.5  | 20    | 55    | 102.0     | 93.0       | 119.6     | 15        | 55    |  |
| 1976-1986   | 100.5                       | 105.6 | 100.3  | 25    | 60    | 99.7      | 91.9       | 103.3     | 15        | 65    |  |
| 1986-1996   | 100.6                       | 98.1  | 100.9  | 20    | 55    | 101.8     | 91.0       | 112.4     | 15        | 60    |  |
| 1996-2006   | 102.1                       | 117.7 | 107.0  | 30    | 65    | 100.6     | 116.4      | 122.6     | 15        | 55    |  |
| C. Maldives |                             |       |        |       |       |           |            |           |           |       |  |
| 1985-1990   | 101.7                       | 85.0  | 100.5  | 25    | 60    | 75.9      | 86.6       | 86.5      | 15        | 55    |  |
| 1990-1995   | 104.8                       | 91.5  | 108.0  | 25    | 60    | 94.9      | 93.7       | 104.2     | 15        | 50    |  |
| 1995-2000   | 101.2                       | 111.9 | 93.2   | 20    | 60    | 101.0     | 115.9      | 102.7     | 25        | 65    |  |
| 2000-2006   | 100.2                       | 113.0 | 99.8   | 40    | 75    | 104.3     | 116.8      | 105.1     | 20        | 55    |  |
| 2006-2014   | 94.1                        | 84.6  | 91.4   | 15    | 50    | 88.8      | 83.8       | 85.2      | 30        | 65    |  |
| D. Malaysia |                             |       |        |       |       |           |            |           |           |       |  |
| 1991-2000   | 95.0                        | 115.4 | 90.2   | 35    | 70    | 96.5      | 105.4      | 95.1      | 35        | 70    |  |
| 2000-2010   | 97.1                        | 106.0 | 97.4   | 20    | 55    | 93.8      | 102.5      | 103.3     | 15        | 50    |  |
| E. Thailand |                             |       |        |       |       |           |            |           |           |       |  |
| 1960-1970   | 97.1                        | 78.1  | 101.2  | 40    | 75    | 92.8      | 72.5       | 93.2      | 35        | 70    |  |
| 1970-1980   | 87.9                        | 107.8 | 88.5   | 15    | 50    | 81.9      | 97.7       | 82.3      | 15        | 50    |  |
| 1980-1990   | 93.2                        | 124.6 | 88.0   | 15    | 50    | 83.7      | 120.1      | 83.3      | 15        | 50    |  |
| 1990-2000   | 67.4                        | 77.9  | 70.7   | 15    | 50    | 67.7      | 76.1       | 72.3      | 15        | 50    |  |
| 2000-2010   | 76.4                        | 96.9  | 79.2   | 15    | 50    | 85.2      | 95.4       | 85.4      | 15        | 55    |  |

 TABLE 3. INTERCENSAL COMPLETENESS OF DEATH REGISTRATION BY SEX, BASED ON THREE DEATH DISTRIBUTION METHODS

 (GGB, SEG, GGBSEG) FOR FIVE SELECTED COUNTRIES

### VI. SUMMARY

In the evaluation of the completeness of death registration (DR) using census data on populations by age, previous methods are based mainly on two assumptions. The first is zero migration and the second is that the errors of the two successive censuses are zero or are similar. These assumptions are unrealistic and therefore produce errors. Investigating the errors of these evaluation approaches is necessary, but extremely difficult. The purposes of this paper were to analyse the errors of the evaluation and provide the conditions under which census populations can be used to evaluate the completeness of DR.

To achieve these goals, this paper proposed a simple evaluation, namely the intercensal cohort survival evaluation (ICSE). Because ICSE focuses on old ages, the assumption of zero migration is acceptable, given that at old ages the number of migrants is normally negligible compared to the number of deaths. ICSE involves only the process of intercensal cohort survival, which can be used to analyse the effect of census error. Consequently, the assumption that census errors are zero or obey special relationships is eliminated.

The basic finding of this paper is that given the levels of census error, the lower the mortality level, the larger the evaluation error and vice versa. This finding is not difficult to understand. When the mortality level is low, a small number of deaths is estimated using large population numbers. Consequently, a small relative error in enumerating population in the censuses will lead to a large relative error in estimating deaths or in evaluating the completeness of DR. This finding should apply to the death distribution methods (DDMs) that also use the numbers of census population to estimate the number of deaths. This finding has not been reached by previous simulation studies and leads to two conclusions about applying the ICSE method.

The first conclusion is that ICSE cannot provide reasonable results for situations where mortality is low and completeness is high, which typically include developed countries. This was illustrated in the example where ICSE was applied to highly developed countries in the 2000-2010 period.

The second conclusion is that ICSE can provide reasonable results for situations where mortality is not low and completeness is not high. Such situations are typically found in developing countries. Guided by this condition, ICSE provides a reasonably easy way to check the consistency and usability of mortality data from vital registration at older ages. As for other analytical methods, ICSE depends on the reliability of the census data. The evaluation using several different age groups, including data for open age groups, provides further insights into the sensitivity and robustness of these results, and potential issues with the reliability of data at older ages, in some countries or periods.

How to evaluate the completeness of death registration at young ages is a question to be answered in future studies - notably, through the potential use of record linkage approaches combining multiple independent sources of individual information.

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## APPENDICES

#### A. THE ERRORS OF INDIRECTLY ESTIMATING MORTALITY LEVEL USING CENSUS POPULATION

To see the fundamental difference between the errors of ICSE and those from indirect estimation of mortality levels using populations in two successive censuses, the error of estimating the survival ratio between the two censuses is analysed below.

The estimated survival ratio can be written as:

$$\hat{s} = \hat{p}_2 / \hat{p}_1 = \frac{p_2(1-u_2)}{p_1(1-u_1)} = s \frac{(1-u_2)}{(1-u_1)}.$$
(a.1)

Using (2), the relative errors of estimating *s* is:

$$E_s(s, u_1, u_2) = \frac{\hat{s} - s}{s} = \frac{1 - u_2}{1 - u_1} - 1 = \frac{u_1 - u_2}{1 - u_1}.$$
 (a.2)

It can be seen that the estimating error is independent from *s*, which is an exceptionally good property. Further, (6) still stands:

$$\frac{\partial E_c(s, u_1, u_2)}{\partial u_1} = \frac{1 - u_2}{(1 - u_1)^2} > 0,$$
  
$$\frac{\partial E_c(s, u_1, u_2)}{\partial u_2} = \frac{-1}{(1 - u_1)} < 0.$$
 (a.3)

So that the marginal situations are still useful:

$$-u_{2} = E_{s}(s,0,u_{2}) < E_{s}(s,u_{1},u_{2}) < E_{s}(s,u_{1},0) = \frac{u_{1}}{1-u_{1}}.$$
(a.4)

Furthermore, as (a.4) shows, the marginal relative errors in estimating *s* are just the census net undercounting rates, which are usually small. The principle difference between (a.4) and (7)-(9) is that, (a.4) excludes survival ratio but (7)-(9) include survival ratio. The above analysis indicates that indirect estimations using census population, such as the Census Method (Li and Gerland, 2013) or the Variable-r Method (Bennett and Horiuchi, 1981), are entirely different from ICSE and able to provide reasonable results.

Taking also Japanese men between 2000 and 2010 as an example, the ratio of surviving from 60-64 to 70-74 is estimated as 0.866 using populations in the 2000 and 2010 censuses, which is only 2.4 per cent higher than the corresponding survival ratio in HMD and can be explained by (a.4) and the Japanese 2010 Post-Enumeration Survey (PES) results.

#### B. EXAMPLE OF COUNTRY APPLICATION OF INTERCENSAL COHORT SURVIVAL EVALUATION (ICSE)

Census population counts from censuses and death counts from vital registration were compiled from the United Nations Statistics Division Demographic Yearbook online database.<sup>4</sup> Data gaps were filled-in using auxiliary sources such as census reports from national authorities and death counts from the World Health Organization (WHO) Mortality Database.<sup>5</sup>

When multiple versions of data existed, the official final published results (eventually adjusted by national statistical authorities, based on post-enumeration survey or other methods) rather than provisional values were selected; regarding population, the de-facto rather than de-jure concept was favoured; and for vital events, the year of occurrence rather than the year of registration was selected. For each intercensal period, age group distributions were harmonized using the highest common open age group between population and death counts, and unknown age counts were proportionately redistributed.

For each country and each intercensal period, a standardized tabular dataset was prepared with a structure like the example shown in table B.1 using Brazil in the 2000-2010 period.

In table B1, the respective columns correspond to the following information:

Column 1 is a label describing the series.

Columns 2 and 3 provide descriptors for sex and age with "m" and "f" respectively for male and female as sex, and for age only the start of the age group (e.g., 60 means 60-64) up to the last open age group. Here, age 85 means 85 and over. Note that for the ICSE application, data under age 60 are not used, but they are used for the application of the standard death distribution methods from age 5 onward.

Columns 4 and 5 contain the population enumerated, respectively, in 2000 and 2010 censuses.

Columns 6 and 7 provide, respectively, the date for the oldest and most recent census in decimal. year. Knowing these two dates, the length of the intercensal period can be computed here equal to 10.12 years.

Columns 8 and 9 are based on the length of the intercensal period as the closest multiple of either 5 or 10 years (to remain consistent with the five-year age groups distribution and to follow intercensal cohorts). Column 8 corresponds to the sum of the first 10 years of annual deaths starting from the year of the first census (2000) up to the end of 2009 (see table B2 for annual deaths used as input). Column 9 corresponds to the sum of the last 10 years of annual deaths ending with the year of the second census (2010), thus covering the period 2001 up to the end of 2010.

Using the dataset in table B1 and similar ones for other countries, all computations have been implemented in R with the supporting datasets for public replication and documentation (see "TP\_2019-05\_Evaluating-Completeness-of-DR-Supplement.zip" with R source code "VR-Dx-completeness-ICSE.r" and input datasets which also include as a default, the number of "deaths:" the number of deaths occurring between census dates for the computation of DDMs). A simple text file called "filelist.txt" provides a list of the various datasets to be processed, with each dataset being analysed one at a time and the results pooled into an overall summary text output.

<sup>&</sup>lt;sup>4</sup> United Nations Statistics Division, Demographic Yearbook, available from http://unstats.un.org/unsd/demographic/products/dyb/dyb2.htm and online database http://data.un.org/Browse.aspx?d=POP.

<sup>&</sup>lt;sup>5</sup> WHO mortality database, available from www.who.int/healthinfo/mortality\_data/en/.

| (col.1)          | (col.2) | (col.3) | (col.4) | (col.5) | (col.6)   | (col.7)  | (col.8)       | (col.9)      |
|------------------|---------|---------|---------|---------|-----------|----------|---------------|--------------|
| Location         | sex     | age     | pop1    | pop2    | date1 dec | date2dec | deaths10first | deaths10last |
| Brazil 2000-2010 | m       | 0       | 1635916 | 1378532 | 2000.59   | 2010.71  | 233613        | 221178       |
| Brazil 2000-2010 | m       | 1       | 6691010 | 5638455 | 2000.59   | 2010.71  | 45767         | 43550        |
| Brazil 2000-2010 | m       | 5       | 8402353 | 7624144 | 2000.59   | 2010.71  | 28040         | 27012        |
| Brazil 2000-2010 | m       | 10      | 8777639 | 8725413 | 2000.59   | 2010.71  | 35481         | 35052        |
| Brazil 2000-2010 | m       | 15      | 9019130 | 8558868 | 2000.59   | 2010.71  | 144795        | 144819       |
| Brazil 2000-2010 | m       | 20      | 8048218 | 8630229 | 2000.59   | 2010.71  | 216836        | 217937       |
| Brazil 2000-2010 | m       | 25      | 6814328 | 8460995 | 2000.59   | 2010.71  | 206348        | 208949       |
| Brazil 2000-2010 | m       | 30      | 6363983 | 7717658 | 2000.59   | 2010.71  | 203757        | 204557       |
| Brazil 2000-2010 | m       | 35      | 5955875 | 6766664 | 2000.59   | 2010.71  | 227387        | 226030       |
| Brazil 2000-2010 | m       | 40      | 5116439 | 6320568 | 2000.59   | 2010.71  | 271023        | 271289       |
| Brazil 2000-2010 | m       | 45      | 4216418 | 5692014 | 2000.59   | 2010.71  | 321243        | 325171       |
| Brazil 2000-2010 | m       | 50      | 3415678 | 4834995 | 2000.59   | 2010.71  | 370692        | 379097       |
| Brazil 2000-2010 | m       | 55      | 2585244 | 3902344 | 2000.59   | 2010.71  | 407219        | 418604       |
| Brazil 2000-2010 | m       | 60      | 2153209 | 3041035 | 2000.59   | 2010.71  | 455018        | 463413       |
| Brazil 2000-2010 | m       | 65      | 1639325 | 2224065 | 2000.59   | 2010.71  | 515731        | 523569       |
| Brazil 2000-2010 | m       | 70      | 1229329 | 1667372 | 2000.59   | 2010.71  | 562363        | 572508       |
| Brazil 2000-2010 | m       | 75      | 780571  | 1090517 | 2000.59   | 2010.71  | 558317        | 571517       |
| Brazil 2000-2010 | m       | 80      | 428501  | 668623  | 2000.59   | 2010.71  | 465744        | 482973       |
| Brazil 2000-2010 | m       | 85      | 302849  | 464499  | 2000.59   | 2010.71  | 537077        | 564077       |
| Brazil 2000-2010 | f       | 0       | 1577394 | 1334712 | 2000.59   | 2010.71  | 179230        | 170168       |
| Brazil 2000-2010 | f       | 1       | 6471408 | 5444459 | 2000.59   | 2010.71  | 37535         | 35501        |
| Brazil 2000-2010 | f       | 5       | 8139974 | 7345231 | 2000.59   | 2010.71  | 19911         | 19368        |
| Brazil 2000-2010 | f       | 10      | 8570428 | 8441348 | 2000.59   | 2010.71  | 22015         | 21743        |
| Brazil 2000-2010 | f       | 15      | 8920685 | 8432004 | 2000.59   | 2010.71  | 39392         | 39064        |
| Brazil 2000-2010 | f       | 20      | 8093297 | 8614963 | 2000.59   | 2010.71  | 49834         | 49644        |
| Brazil 2000-2010 | f       | 25      | 7035337 | 8643419 | 2000.59   | 2010.71  | 58969         | 59415        |
| Brazil 2000-2010 | f       | 30      | 6664961 | 8026854 | 2000.59   | 2010.71  | 71111         | 71594        |
| Brazil 2000-2010 | f       | 35      | 6305654 | 7121915 | 2000.59   | 2010.71  | 94973         | 94344        |
| Brazil 2000-2010 | f       | 40      | 5430255 | 6688796 | 2000.59   | 2010.71  | 130160        | 130283       |
| Brazil 2000-2010 | f       | 45      | 4505123 | 6141338 | 2000.59   | 2010.71  | 170287        | 172765       |
| Brazil 2000-2010 | f       | 50      | 3646923 | 5305407 | 2000.59   | 2010.71  | 207158        | 211456       |
| Brazil 2000-2010 | f       | 55      | 2859471 | 4373877 | 2000.59   | 2010.71  | 242462        | 248901       |
| Brazil 2000-2010 | f       | 60      | 2447720 | 3468085 | 2000.59   | 2010.71  | 293377        | 297775       |
| Brazil 2000-2010 | f       | 65      | 1941781 | 2616745 | 2000.59   | 2010.71  | 359134        | 364220       |
| Brazil 2000-2010 | f       | 70      | 1512973 | 2074264 | 2000.59   | 2010.71  | 434682        | 442452       |
| Brazil 2000-2010 | f       | 75      | 999016  | 1472930 | 2000.59   | 2010.71  | 491864        | 504896       |
| Brazil 2000-2010 | f       | 80      | 607533  | 998349  | 2000.59   | 2010.71  | 487915        | 507552       |
| Brazil 2000-2010 | f       | 85      | 493222  | 804113  | 2000.59   | 2010.71  | 779926        | 823633       |

TABLE B1. 2000 and 2010 census population and intercensal vital registration deaths by age and sex for Brazil

In an effort to use the information available with the least amount of additional interference introduced by the evaluation method, the annual deaths are used as reported for a fixed 5- or 10-year period either from the year of the first census or ending in the year of the second census. Death counts are for the civil calendar year, from January 1 to 31 December, and the populations enumerated at the two censuses are shifted accordingly to the start and end of the closest 5- or 10-year period. As censuses are generally not conducted on 1 January, to estimate the corresponding population at this date the intercensal growth rate (r) by age for each sex is first computed and used to shift the population to this new reference time (also used in the variable-r approach). Practically, censuses are often not exactly 5 or 10 years apart but a variable number of years either closer to 5 or 10. Shifting the population using intercensal growth rates by age provides a reasonable approximation only within a couple of years from each census and is not used for longer intercensal periods of 15 or more years.

| Age | Sex | 2000  | 2001  | 2002  | 2003  | 2004  | 2005  | 2006  | 2007  | 2008  | 2009  | 2010   |
|-----|-----|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|--------|
| 0   | m   | 30287 | 26699 | 25651 | 25075 | 23819 | 22256 | 21420 | 20062 | 19286 | 19061 | 17851  |
| 1   | m   | 5769  | 5403  | 4977  | 5018  | 4605  | 4269  | 4223  | 3969  | 3852  | 3683  | 3552   |
| 5   | m   | 3360  | 2884  | 2993  | 2889  | 2734  | 2672  | 2774  | 2660  | 2577  | 2498  | 2331   |
| 10  | m   | 3729  | 3747  | 3678  | 3559  | 3643  | 3561  | 3441  | 3450  | 3337  | 3335  | 3300   |
| 15  | m   | 14291 | 14587 | 15213 | 14666 | 14406 | 14284 | 14444 | 14439 | 14410 | 14055 | 14315  |
| 20  | m   | 20990 | 20763 | 22462 | 22572 | 21828 | 20844 | 21421 | 21646 | 21892 | 22418 | 22092  |
| 25  | m   | 19645 | 19654 | 20482 | 20460 | 20288 | 19892 | 20593 | 21317 | 21778 | 22239 | 22245  |
| 30  | m   | 20747 | 20763 | 20749 | 20380 | 20010 | 19483 | 19845 | 20254 | 20360 | 21166 | 21547  |
| 35  | m   | 23660 | 23240 | 23376 | 23155 | 23095 | 22062 | 22254 | 22140 | 22168 | 22238 | 22303  |
| 40  | m   | 26881 | 26544 | 26960 | 27099 | 27477 | 26638 | 27352 | 27094 | 27611 | 27367 | 27146  |
| 45  | m   | 30082 | 30551 | 30979 | 31845 | 32427 | 32250 | 32926 | 32985 | 33630 | 33568 | 34010  |
| 50  | m   | 33239 | 34155 | 34851 | 35459 | 37240 | 37011 | 38336 | 39089 | 40436 | 40876 | 41644  |
| 55  | m   | 36428 | 36478 | 37804 | 38831 | 40375 | 40434 | 42749 | 43388 | 44664 | 46067 | 47813  |
| 60  | m   | 43401 | 43569 | 43486 | 44846 | 45575 | 43962 | 45637 | 46741 | 48735 | 49066 | 51796  |
| 65  | m   | 47917 | 48239 | 49427 | 50570 | 52365 | 51540 | 53455 | 53179 | 54524 | 54515 | 55755  |
| 70  | m   | 52601 | 53970 | 54462 | 55913 | 56700 | 54889 | 57104 | 57231 | 58891 | 60601 | 62745  |
| 75  | m   | 49309 | 50085 | 52591 | 54887 | 57011 | 55788 | 58996 | 58958 | 60018 | 60672 | 62509  |
| 80  | m   | 39557 | 40577 | 42315 | 44018 | 46123 | 45949 | 49417 | 50533 | 52903 | 54352 | 56786  |
| 85  | m   | 43938 | 45533 | 48336 | 51379 | 53784 | 52614 | 56784 | 59032 | 61311 | 64367 | 70938  |
| 0   | f   | 23061 | 20676 | 19439 | 19075 | 18141 | 17157 | 16409 | 15240 | 15240 | 14793 | 13999  |
| 1   | f   | 4871  | 4571  | 4153  | 3984  | 3665  | 3485  | 3460  | 3246  | 3073  | 3029  | 2837   |
| 5   | f   | 2239  | 2041  | 2154  | 1983  | 1973  | 1962  | 1946  | 1901  | 1933  | 1778  | 1697   |
| 10  | f   | 2403  | 2199  | 2363  | 2144  | 2167  | 2120  | 2195  | 2145  | 2158  | 2122  | 2131   |
| 15  | f   | 4152  | 4125  | 4070  | 4099  | 4012  | 3804  | 3881  | 3744  | 3715  | 3792  | 3823   |
| 20  | f   | 5092  | 4859  | 5174  | 5018  | 5099  | 4842  | 4920  | 4780  | 4871  | 5180  | 4902   |
| 25  | f   | 5799  | 5608  | 5845  | 5833  | 5653  | 5812  | 5832  | 6160  | 6052  | 6375  | 6245   |
| 30  | f   | 7302  | 7274  | 7114  | 7008  | 6891  | 6773  | 6854  | 7167  | 7140  | 7588  | 7785   |
| 35  | f   | 10032 | 9503  | 9742  | 9469  | 9325  | 9236  | 9385  | 9266  | 9407  | 9608  | 9403   |
| 40  | f   | 12807 | 12836 | 12816 | 12942 | 12801 | 12708 | 13005 | 13193 | 13483 | 13569 | 12930  |
| 45  | f   | 15811 | 15995 | 16742 | 16734 | 16989 | 16888 | 17452 | 17539 | 17995 | 18141 | 18289  |
| 50  | f   | 18927 | 19145 | 19668 | 19709 | 20631 | 20503 | 21268 | 21418 | 22641 | 23247 | 23225  |
| 55  | f   | 21640 | 22063 | 22719 | 23327 | 23935 | 23646 | 25333 | 26087 | 26499 | 27212 | 28079  |
| 60  | f   | 28736 | 28034 | 28237 | 28486 | 29183 | 27828 | 29430 | 30294 | 31674 | 31475 | 33134  |
| 65  | f   | 33666 | 33568 | 34661 | 35305 | 36698 | 36010 | 36989 | 36809 | 37489 | 37939 | 38753  |
| 70  | f   | 40793 | 41495 | 42268 | 42914 | 43582 | 41904 | 44202 | 44802 | 45586 | 47136 | 48563  |
| 75  | f   | 41986 | 43204 | 46537 | 47754 | 49720 | 49277 | 52810 | 53314 | 53158 | 54104 | 55018  |
| 80  | f   | 41799 | 42139 | 44151 | 45539 | 47601 | 47606 | 51097 | 53915 | 55565 | 58502 | 61437  |
| 85  | f   | 60836 | 64241 | 69832 | 73771 | 76821 | 77892 | 83906 | 86894 | 90304 | 95430 | 104543 |

TABLE B2. SUPPLEMENTARY 2000-2010 ANNUAL VITAL REGISTRATION DEATHS BY AGE AND SEX FOR BRAZIL

In the example given in table B1 for the 2000-2010 intercensal period in Brazil, the completeness is estimated for two 10-year periods: 2000-2009 and 2001-2010, corresponding to the 10-year period either starting from the year of the first census or ending in the year of the second census. The average of the two estimates is used as the final estimate.

In the first case, deaths10first is used based on the cumulated number of deaths for the first 10 years starting from the year of the first census (2000) up to the end of 2009 (see column 8). The population on 1 January 2000 (as pop1estimate) is computed using pop1 \*  $\exp(r * (2000-date1dec))$  where  $r = \log(pop2 / pop1) / (date2dec - date1dec)$  and the population on 1 January 2010 (as pop2estimate) is computed using pop2 \*  $\exp(r * (2010-date2dec))$ . In the second case, deaths10last (Column 9) is computed as the sum of the last 10 years of annual deaths ending with the year of the second census (2010), thus covering the period 2001 up to the end of 2010. In this case, for the rest of the evaluation the population on 1 January 2001 is computed using Pop1 \*  $\exp(r * (2001-date1dec))$  and the population on 1 January 2011 using pop2 \*  $\exp(r * (2011-date2dec))$ .

Table B3 provides these intermediate values for female by 5-year age groups from age 60 onward for the first case using deaths10first as deaths. Death completeness (DxCompleteness) in this case is computed for each age group summing up the deaths over the 10-year period by cohort and dividing them by the population change by cohort within this period<sup>6</sup>. For example, for the first age 60, the sum of deaths by cohort over this 10-year period corresponds to ((0.25\* deaths (60-64)) + (0.5\*deaths (65-69)) + (0.25\*deaths (70-74))) = ((0.25\*293377) + (0.5\*359134) + (0.25\*434682)) = 361582. The population change by cohort within this period corresponds to: poplestimate (60-64) – pop2estimate (70-74) = 2398842-2028870 = 369971. Thus, the ratio of deaths to surviving population for age 60-74 = 100 \* (361582 / 369971) = 97.7.

| age | sex | DateStart | DateEnd | deaths | r        | poplestimate | pop2estimate | DxCompleteness |
|-----|-----|-----------|---------|--------|----------|--------------|--------------|----------------|
| 60  | f   | 2000      | 2010    | 293377 | 0.034418 | 2398842      | 3384368      | 97.7           |
| 65  | f   | 2000      | 2010    | 359134 | 0.029467 | 1908535      | 2562569      | 90.5           |
| 70  | f   | 2000      | 2010    | 434682 | 0.031167 | 1485589      | 2028870      | 91.4           |
| 75  | f   | 2000      | 2010    | 491864 | 0.038349 | 976814       | 1433369      |                |
| 80  | f   | 2000      | 2010    | 487915 | 0.049062 | 590313       | 964173       |                |
| 85  | f   | 2000      | 2010    | 779926 | 0.04828  | 479462       | 777018       |                |

TABLE B3. COMPUTATION OF DEATH COMPLETENESS FOR 2000-2010 FEMALE IN BRAZIL FOR AGE GROUPS

The same computations can be performed for open age groups using the population and death distributions cumulated downwards from older ages to younger ones as seen in table B4.

<sup>&</sup>lt;sup>6</sup> Note that for other situations with a 5-year period, the sum of deaths by cohort at age 60-64 over a 5-year period corresponds to ((0.5\* deaths(60-64)) + (0.5\* deaths(65-69)) and the population change by cohort within this period corresponds to: poplestimate(60-64) – pop2estimate(65-69).

| age | e sex DateStart |      | DateEnd | deaths. | poplestimate. | pop2estimate. | DxCompletenessOpenAge |
|-----|-----------------|------|---------|---------|---------------|---------------|-----------------------|
|     |                 |      |         | CumSum  | CumSum        | CumSum        |                       |
| 60  | f               | 2000 | 2010    | 2846898 | 7839554       | 11150367      | 96.2                  |
| 65  | f               | 2000 | 2010    | 2553521 | 5440713       | 7766000       | 96.0                  |
| 70  | f               | 2000 | 2010    | 2194387 | 3532178       | 5203430       | 97.5                  |
| 75  | f               | 2000 | 2010    | 1759705 | 2046589       | 3174560       | 99.9                  |
| 80  | f               | 2000 | 2010    | 1267841 | 1069775       | 1741191       |                       |
| 85  | f               | 2000 | 2010    | 779926  | 479462        | 777018        |                       |

TABLE B4. COMPUTATION OF DEATH COMPLETENESS FOR 2000-2010 FEMALE IN BRAZIL FROM OPEN AGE GROUP

The computations performed using the deaths and population estimates for the first 5 or 10 years can be repeated in similar fashion for the last 5 or 10-years. Final estimates in this case can be computed as the average of the two and table 1 in this paper presents those.

# C. ICSE RESULTS FOR OPEN AGE GROUPS

# Figure C1. Brazil 1980-2010 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

Figure C2. Egypt 1947-2006 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



Figure C3. Maldives 1985-2014 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



*Note:* data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

Figure C4. Malaysia 1991-2010 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



Figure C5. Thailand 1960-2010 intercensal completeness of death registration by sex based on ICSE for open age groups and death distribution methods



*Note*: data adjusted using the ICSE approach are shown in red for selected age groups, and data adjusted using one of the three death distribution methods are shown in green with GGB: Generalized Growth Balance, SEG: Synthetic Extinct Generation, GGBSEG: extended method using GGB before SEG).

## D. EVALUATING COMPLETENESS OF DEATH REGISTRATION ONLINE SUPPLEMENT

Online supplement available at http://bit.ly/UNPD\_Mortality\_EvalCompDR