

1                                    **Mathematical connection between**  
2                                    **short telomere induced senescence calculation**  
3                                    **and mortality rate data**

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10        **Abstract:**

11        The last 20 years have seen a surge in scientific activity and promising results in the study of aging and  
12        longevity. Many researchers have focused on telomeres, which are composed of a series of TTAGGG  
13        repeat nucleotide sequences at the ends of each chromosome. Measurements of the length of these telomere  
14        strands show that they decrease in length with increasing age, leading many authors to propose that when the  
15        length of these telomere strands decreases sufficiently, the cells enter into a state of replicative senescence,  
16        eventually leading to disease and death. These ideas are supported by evidence that short telomere length is  
17        correlated with increased mortality. In this paper, we extend this idea to make an actual calculation of the  
18        predicted mortality rate caused by short telomere length induced senescence (STLIS). We derive a simple  
19        equation for the mathematical relationship between telomere length and mortality rate. Using only 3  
20        parameters based on telomere length measurement data of Canadians, we have calculated both the  
21        magnitude and the age dependence of the mortality rate, for both men and women. We show that these  
22        calculated data are in good quantitative agreement with the actual number of Canadians that die. This  
23        agreement provides strong evidence (but not proof) that the mechanism of STLIS plays an important role in  
24        the major diseases of aging (e.g., cardiovascular disease, many cancers, and diabetes mellitus) which

dominate human mortality. This result represents significant progress in our understanding the factors behind the cause of aging.

## Measurements of telomere lengths

Many mechanisms have been proposed as the cause of aging [1,2]. In this paper, we will focus on a model based on telomeres, whose lengths has been shown [3-6] correlate with the mortality of a number of diseases of aging. Since the initial work on telomeres in the 1970's, more than a hundred studies [6-9] have measured the telomere length as a function of age for a large number of individuals, using different techniques. As an example, Fig 1 shows the data of Aubert et al [7] for male Canadians, using the Flow FISH technique.

**Fig 1: The measured telomere length (in Kbp, thousands of base pairs) using the Flow FISH technique is plotted as a function of age for 226 Canadian males, along with a linear fit to the data.**

Each data point corresponds to the measured "average" telomere length for one individual. The first feature of the data is that different individuals with the same age have telomere lengths that differ by as much as a factor of 2. These differences have been attributed to differences in heredity, lifestyles, exposures to inflammation and oxidation, telomerase activity, as well as stress. This distribution of lengths among these individuals is presumed to be a normal distribution, similar to the distribution in heights among different individuals, for example. With this assumption, we can calculate the standard deviation ( $\sigma$ ) by fitting the telomere length data (using STEYX in Excel, Table 1). We find that  $\sigma$  is very large (890-900 bp) and varies little with age ( $A > 40$ ), as observed in other measurements [8]. This standard deviation measures the width of the distribution of measured telomere lengths for different individuals having the same age.

**Table 1: Values of 4 telomere measurement-based parameters.**

	men	women
$TL_{m0}$ (bp)	7718	8301
$\alpha$ (bp/yr.)	32.6	36.1
$\Delta$ (bp)	3750	3750
$\sigma$ (bp)	910	890

52 The second feature of the data is that with increasing age, there is a clear decrease in measured  
53 telomere lengths. This decrease is due, in part, to cellular replication, in which the length of the telomeres  
54 shortens with each division. Changes with age in the factors mentioned above also contribute (both  
55 positively and negatively) to a drop in telomere length (TL). This decrease is observed in more than a  
56 hundred experiments [6-10], where the measured telomere length ( $TL_m$ ) is well approximated by a linear  
57 decrease with age (A):

$$58 \quad TL_m(A) = TL_{m0} - \alpha A \quad (1)$$

59 In which the parameters  $TL_{m0}$  and  $\alpha$  are constants. For the Canadian data in Fig 1, these parameters  
60 (obtained by fitting the telomere data) are shown in Table 1 for both men and women.

## 61 **Short telomere length induced senescence**

62 Since the discovery of telomeres, hundreds of papers have been published reporting measurements of  
63 telomere lengths and their correlation with lifestyle factors and with longevity, building the evidence for  
64 using telomere length as a cellular marker of aging [3-6]. Furthermore, many authors [11-15] have proposed  
65 that aging may be caused by shortened telomere lengths inducing senescence (STLIS). The general idea  
66 behind this model is that when the telomere length decreases with age and becomes "sufficiently short", the  
67 cells stop replicating (Hayflick limit) and go into a state of senescence. In this state, they begin secreting  
68 inflammatory chemicals (SASP) into the cell, which induce disease and subsequent death. But the measured  
69 telomere lengths (Fig 2) are far from going to zero, even for individuals of 100 years old.

70 This apparent conflict is related to the fact that each individual in Fig 2 is represented as a single  
71 point, with a single measurement of his/her telomere length. However, in reality, each individual has a large  
72 number of telomeres and they have a wide range of telomere lengths. This can be shown by using a more  
73 sophisticated measurement technique, in which the full distribution of telomere lengths for an individual can  
74 be measured. The High Throughput Q-FISH (Quantitative Fluorescence In-Situ Hybridization) technique is  
75 used in laboratories of only a very few universities [16] and one company [17]. An example of this  
76 measurement is shown in Fig 2a for a 44 year-old USA male with average measured telomere length [18].  
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**Fig 2: (a) Relative frequency of telomeres as a function of fluorescence intensity**

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**(proportional to telomere length) for a 44 year-old USA male, (b) A schematic figure, comparing the**

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**telomere lengths measured by different techniques.** The bubbles represent the single “average” telomere

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length measured by the PCR, FF, and TRF techniques, compared with the full telomere length distribution,

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including zero length, the 10<sup>th</sup> Percentile (TL<sub>10</sub>), the Median (MTL) and Average (ATL) lengths and even

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more at higher lengths, all included in the HT-Q-FISH measurement.

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This typical individual has a very asymmetric distribution of widely different telomere lengths (Fig 2a),

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ranging from several hundred base pairs to tens of thousands [17]. Because of the asymmetry, the Median

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and Average Telomere Lengths (MTL and ATL) are much longer than the peak of the distribution. Also

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shown are the critical lowest length telomeres, those below the 10th percentile, which are marked in red.

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In Fig 2(b), we compare the results from different measurement techniques [19]. The Median and

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Average Telomere length (MTL and ATL) from Fig 2a are shown from HT Q-FISH measurements, along

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with the shortest 10% of the telomere lengths (in red). Other techniques measure only a single number for

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this wide distribution of telomere lengths, which is some kind of weighted average of the full distribution.

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Examples from measurements using the "Flow FISH" (FF) technique for the average 44-year-old male

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Canadian [7] and using the TRF (Terminal Restriction Fragment) technique for the average 44-year-old

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Danish male [8] are represented by the data points shown as the blue and green bubbles in Fig 2b at 6,284 bp

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and 6,768 bp, respectively. Results using the popular PCR (Polymerase Chain Reaction) technique vary

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considerably. The orange bubble shown in Fig 2b is the data point for an average 44-year-old Danish male,

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using this technique [6]. The last three techniques measure only a single "average" length, which lies near

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the peak of the distribution for the individual (Fig 2a) and which is substantially lower than the actual

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median (MTL) (10,500 bp) and the average (ATL) (12,400 bp) values (a consequence of the very skewed

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distribution in Fig 2a). More significantly, they are significantly higher than the lowest (red) TL which are

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those involved in senescence. These different “telomere lengths” measured by different techniques have

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caused some confusion in the literature. In the rest of this paper, we shall use the term “measured” telomere

length,  $TL_m$ , to refer to the values of the “average” telomere lengths measured by these latter techniques.

The models of short telomere length induced senescence (STLIS) predict that when the lengths of the critically lowest telomeres (in red) become “sufficiently short”, the cells in this individual will senesce and diseases of aging will begin. However, these models do not specify what is actually meant by “sufficiently short”. We shall arbitrarily estimate that cellular senescence will have been induced when the lowest 10% of the telomere lengths have decreased to zero. A critical parameter for this model is then the difference in telomere length between the **measured** length of the individual and the length of his 10 percentile telomeres,  $TL_{10}$ , in Fig 2b. This difference we call  $\Delta$  which is defined as  $\Delta = TL_m - TL_{10}$ . The STLIS model then can be described with the use of Fig 2: as this individual ages, his entire telomere length distribution (Fig 2a) will shift to lower lengths, making the important assumption (for simplicity) that it will maintain approximately the same shape [17]. Thus, both  $TL_m$  and  $TL_{10}$  also shift together to lower lengths, with the difference in TL between them ( $\Delta$ ) remaining constant. The point when the  $TL_{10}$  has decreased to zero (and 10% of the telomeres are below zero) is the point at which the cells will have started to senesce. (Note that this will occur long before the **measured** telomere length ( $TL_m$ ) (the bubbles in Fig 2b) approach zero.)

The parameter  $\Delta$  will be different for each technique. For Flow-FISH measurements, for example, the value of  $\Delta$  is estimated from Fig 2b to be near 4,000 bp, whereas for TRF it would be closer to 4,500 bp. For HT-Q-FISH it would be nearer to 8,000 bp (using MTL as the measured value). A large number of authors have discussed the importance of the critically short length telomeres [16]. Using TRF, the Aviv group [20] has introduced the related concept of a “telomere brink”: when the measured telomere length decreases and approaches the “telomere brink”, there is a high risk of subsequent death. The brink was estimated to be about 5,000 bp, similar to the value of 4,500 bp, estimated above.

## Calculation of mortality rate due to STLIS

In order to calculate the mortality at any given age, we need to look at populations of individuals having that age. In Fig 3, we show the number of individuals aged 40, 60 and 80 years old calculated from using a normal distribution and the telomere data in Table I, obtained from fitting the data in

Fig 1. These are plotted vs. their  $TL_{10}$  since it is these, shortest telomeres that are going to senesce and induce eventual mortality, according to the STLIS model.

**Fig 3: Number of individuals in the population/100K vs. their measured telomere length for ages=40, 60, and 80 years.** The number of people expected to have died is the integrated number of people whose  $TL_{10}$  is negative, i.e., the hashed area under the curves for different ages.

At age A, the people dying are those individuals who have the shortest measured telomere length relative to the rest of the population and consequently their shortest individual telomere lengths have gone to zero. The total number of these people predicted to have died at a certain age A is the mortality rate,  $M_R(A)$ , and is equal to the total number of individuals for whom 10% of their telomere lengths have gone to zero, i.e., those whose  $TL_{10}$  is less than 0. This is obtained by integrating the area under the curves in Fig 3 for negative  $TL_{10}$ , i.e., the hashed areas under the left side of the distribution. In this figure, one can see how dramatically this number increases with increasing age.

Mathematically, we can write this integration as:

$$M_R(A) = \frac{10^5}{\sigma \sqrt{2\pi}} \int_{-\infty}^0 e^{-\frac{1}{2} \left( \frac{TL - TL_{10}(A)}{\sigma} \right)^2} dTL \quad (2)$$

(which may be calculated in Excel by  $M_R(A) = 10^5 \times \text{NORMDIST}(0, (TL_{m0} - \Delta - \alpha A), \sigma, \text{TRUE})$ ).

Notice that the mortality rate is dependent basically on only 3 telomere parameters: the standard deviation

( $\sigma$ ), the slope from Fig 1 ( $\alpha$ ), and the **difference** ( $TL_{m0} - \Delta$ ). For a specific age, A, we obtain  $M_R(A)$

using the NORMDIST function to calculate the number of them under the left side of the normal distribution

curves of Fig 3 for negative  $TL_{10}$ , i.e., the hashed areas.

168 Compared with earlier correlations [3-6] between shorter telomere lengths and higher mortality,  
169 the present calculation (Equation 2) gives a complete mathematical relation between telomere length  
170 and mortality, for the STLIS model. Using Equation 2 and three telomere parameters (2 of which are  
171 measured and 1 estimated), we calculate the mortality rate,  $M_R(A)$ , as a function of age for the STLIS  
172 model.

## 173 **Actual mortality rate data and agreement with calculated values**

174 Since the telomere data in Fig 1 and Table 1 are for Canadians, we show the mortality rate data [21]  
175 for Canadian women (solid red lines) and men (solid blue lines) in Fig 4.

**176 Fig 4: The solid lines are the logarithm of the age-dependent total mortality rates per  $10^5$   
177 population for Canadian men (blue) and women (red) in 2013. The dashed lines are the same  
178 data, after subtracting the mortality due to Accidents, Suicides, and Assaults.  
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180 The characteristic feature of these and other mortality data is the strong, exponential increase in the  
181 mortality rate ( $M_R$ ) with increasing age, especially above 40 years, as recognized by Gompertz [22]. This  
182 increase is attributed to "Diseases of Aging", in which age is the dominant risk factor, such as cardiovascular  
183 disease, cancers, and Alzheimer's. At younger ages, however, other types of mortality are significant as  
184 well. For example, the Canadian mortality database includes deaths due to accidents, suicides, and assaults.  
185 We have subtracted the known mortality of these causes from the total mortality data and obtained the two  
186 dashed lines in Fig 4. Even though the bump in the original data near age 25 is removed, there remains  
187 some mortality below age 40 due to infant mortality, infections, childhood cancers, and other diseases not  
188 related to aging. In order to minimize the effect of these, we shall concentrate on ages greater than 40 years,  
189 where the mortality data are dominated by diseases of aging.

190 In Fig 5, we compare the actual mortality data (dashed lines from Fig 4) for  $A > 40$  (after  
191 subtracting the Accidents-Suicides-Assaults contribution) to the mortality rate data predicted by  
192 Equation 2 and the telomere data in Table 1 (solid lines), where data for men are in blue and women in  
193 red.

**194 Fig 5: The log of the mortality rate (per 100K) vs. age for men (red) and women (blue),  
195 comparing the calculated data (solid lines) with actual data (dashed lines) for Canadians (2013).**

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197 For a better agreement, we used  $\Delta = 3,750$  bp as the value for both men and women, instead of our initial  
198 estimate of 4,000bp (Fig 2). (Note that using a different value for  $\Delta$  for men and for women, we would  
199 obtain an even better fit to the data, but it would add another parameter.)

200 The results of the calculation are in good agreement with both the magnitude and the age dependence  
201 of the mortality, for both men and for women. Such an agreement should perhaps not have been expected,  
202 considering the fact that the data have extra mortality due to non-aging diseases and the fact that the model  
203 describes the onset of the disease, while the data refers to death (often delayed by treatment). In addition,  
204 this simple model is calculating the mortality for such very different diseases, as different as cancer and  
205 cardiovascular disease and Alzheimer's.

206 In conclusion, it has been proposed [11-15] that short telomere lengths induce senescence (STLIS)  
207 and that this mechanism is an important cause of the diseases of aging. Using this model and 3 parameters  
208 based on only telomere measurements, we have calculated the magnitude of the all-cause mortality rate and  
209 its age dependence in good agreement with the actual number of people who die each year and their age  
210 dependence, for both men and women. This result provides strong evidence (but not proof) that the STLIS  
211 model plays an important role in most of the diseases of aging.

212  
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217 Excel.

218 **Potential conflict of interest:** J.B.T. has been a customer of Teloyears and Life Length and is a shareholder  
219 in Life Length.

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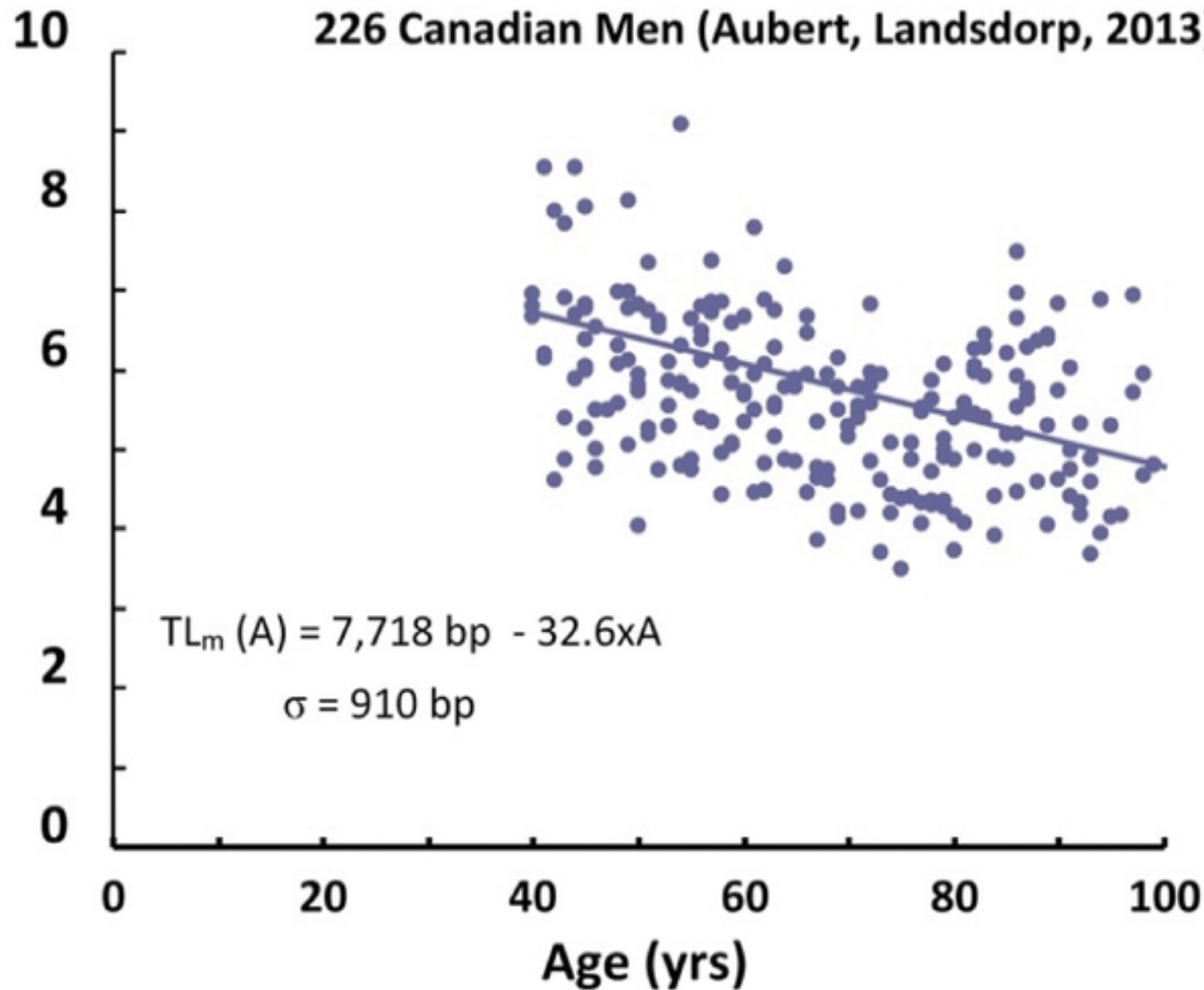
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Measured  
 $TL_m$ (Kbp)

226 Canadian Men (Aubert, Landsdorp, 2013)



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Figure 1

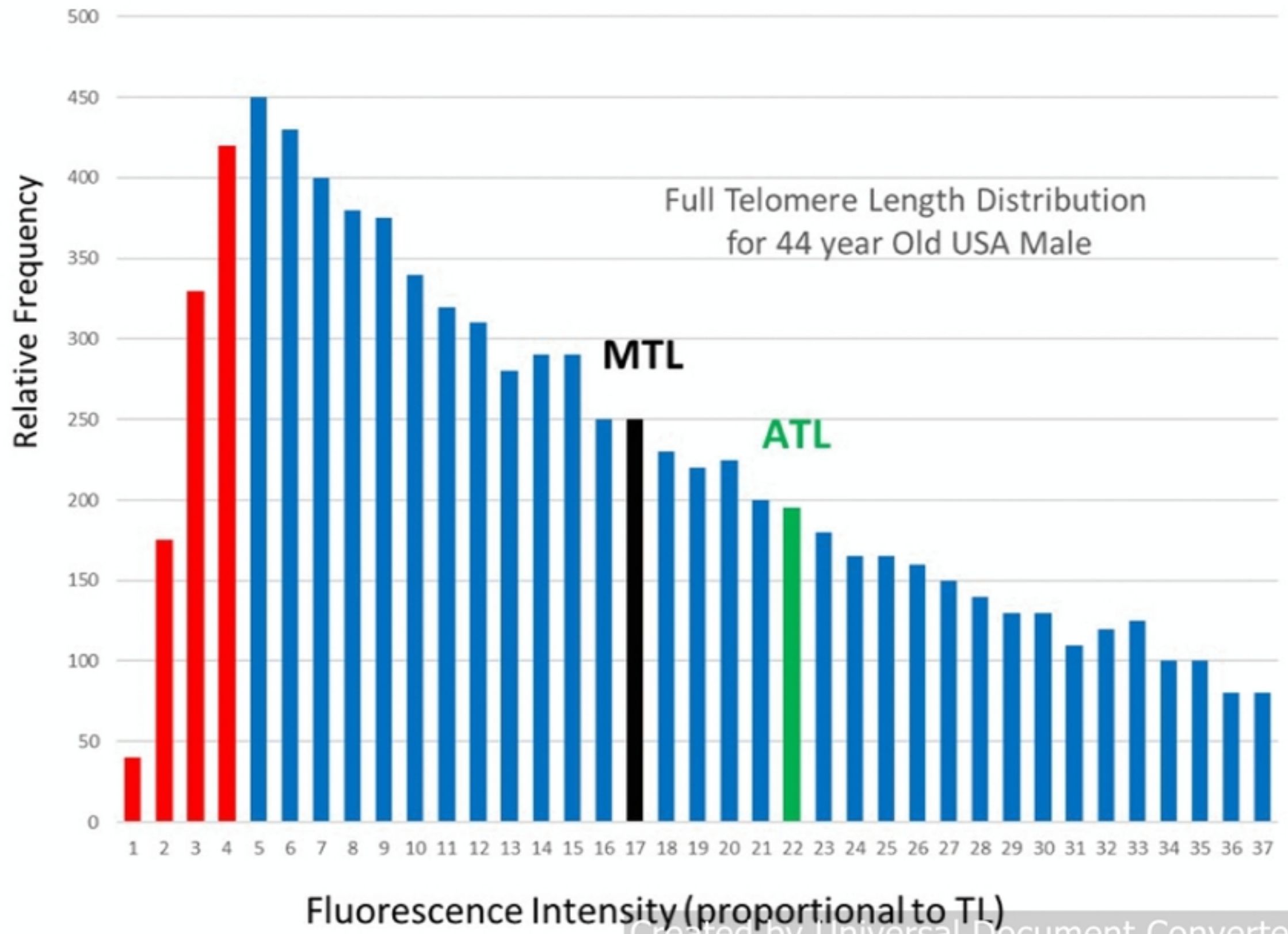
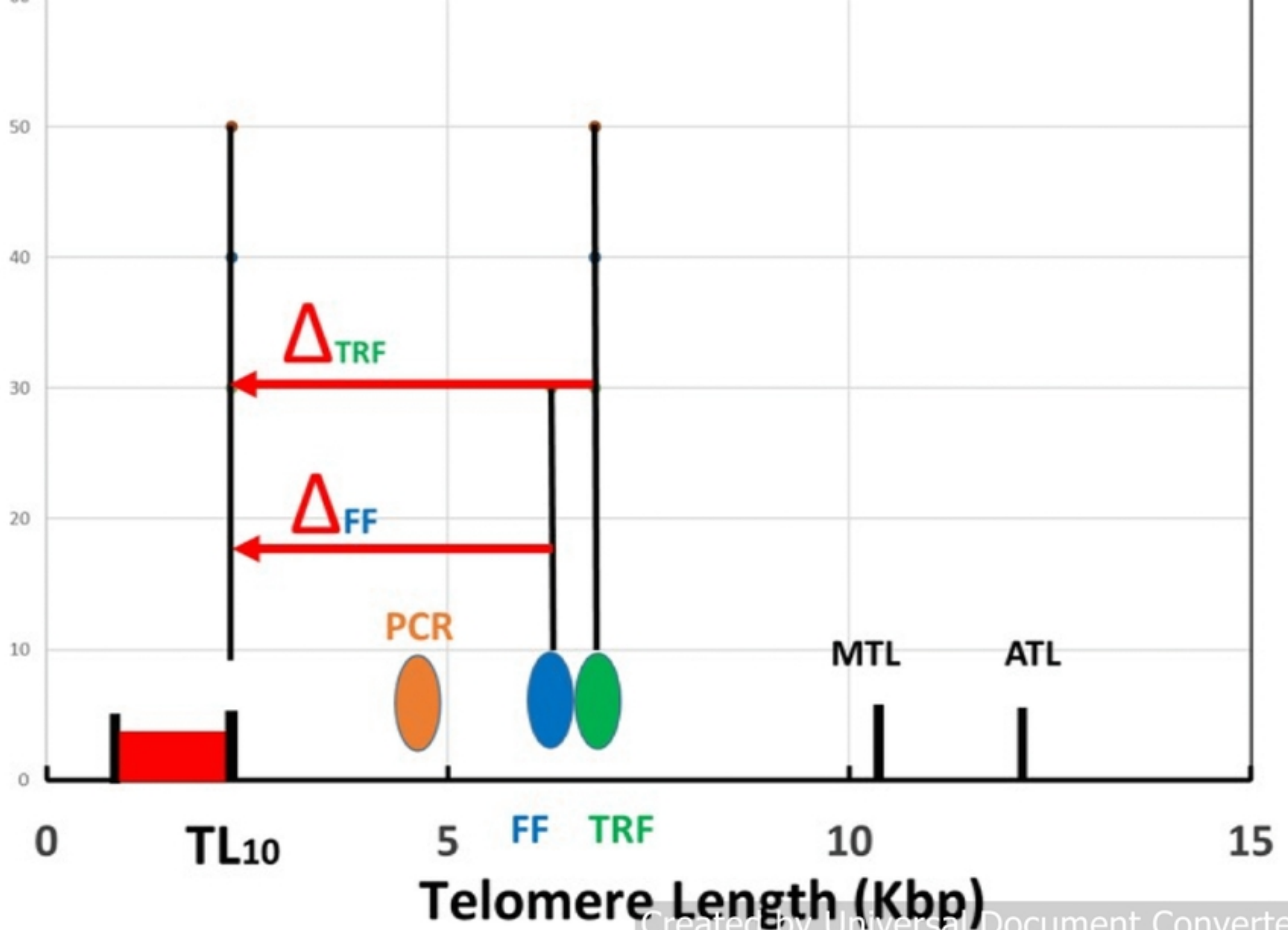
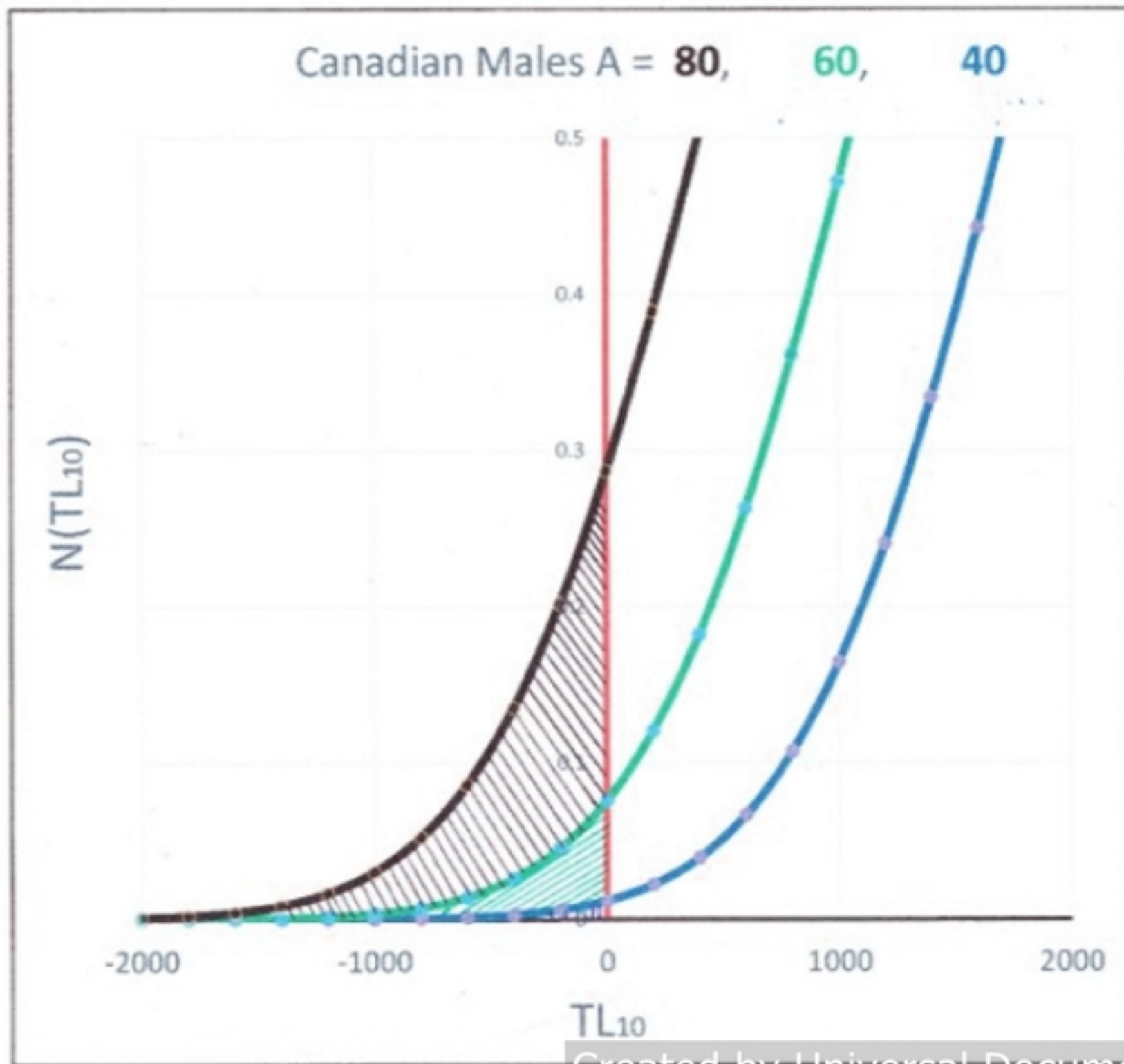


Figure 2A



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Figure 2B



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Figure 3



# Mortality Rate Canadian Men, Women

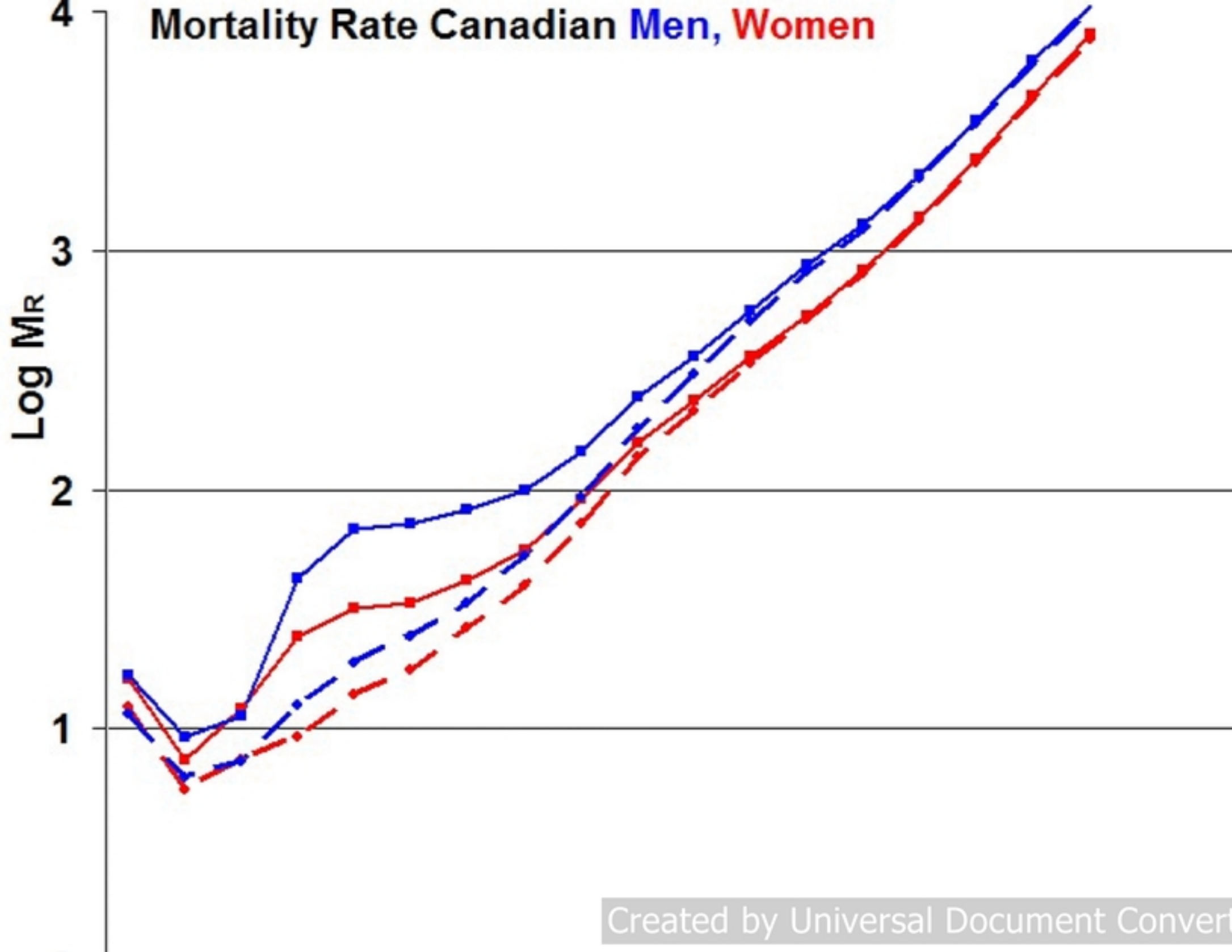


Figure 4

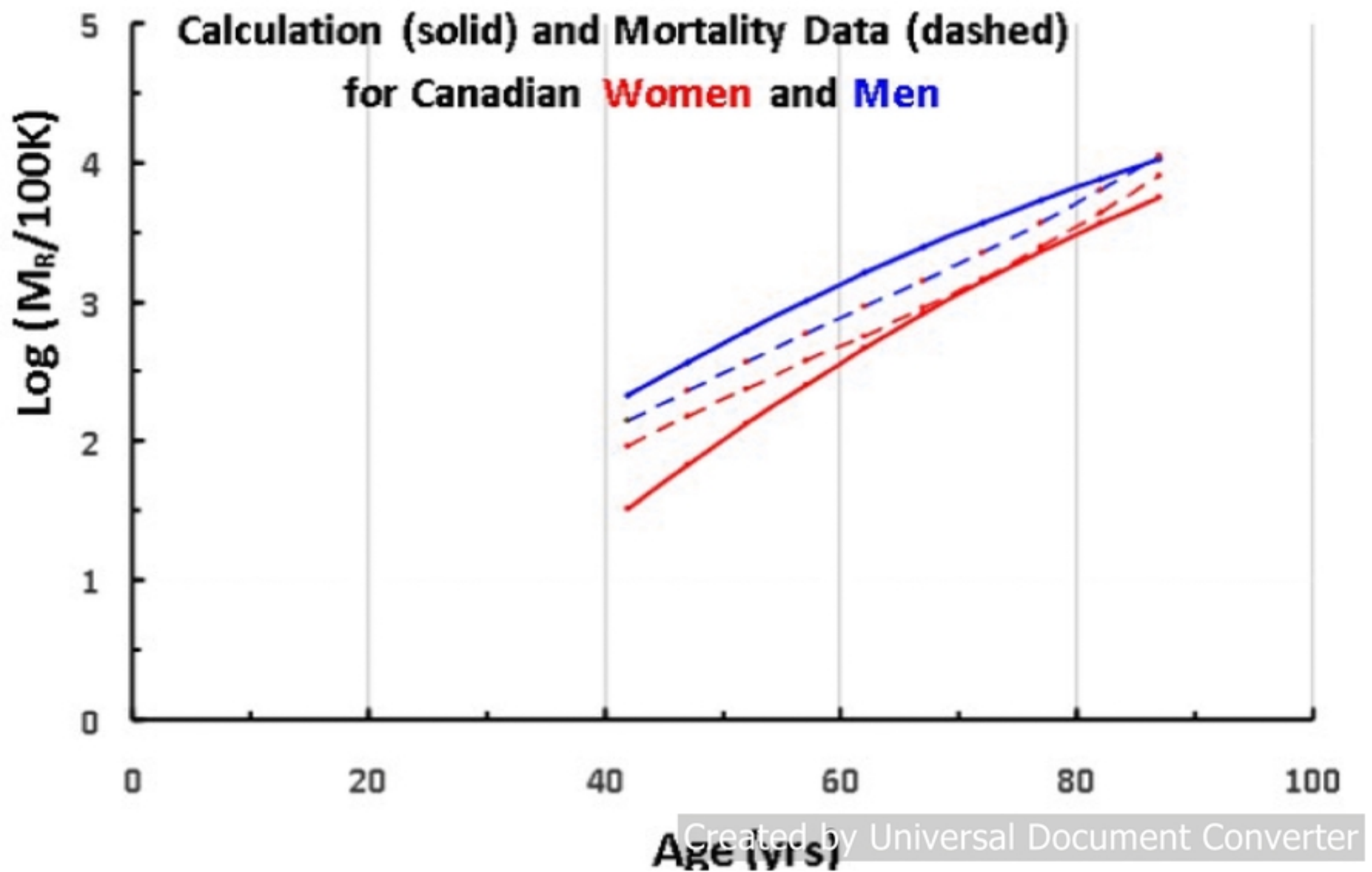


Figure 5