Kumaraswamy Distribution in Analyzing the Health-related Quality of Life and Effective Factors in Elderly Patients with Epilepsy

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Received 2019 June 17; Revised 2019 July 27; Accepted 2019 August 07.

Abstract

Background: Epilepsy, which develops in the elderly, is recognized as a major health burden. Although health-related quality of life (HRQoL) is an essential element in the medical treatment of elderly patients with epilepsy, it is a question whether epilepsy and its treatment effectively influence the quality of life (QoL) in the elderly.

Objectives: The current study aimed at evaluating the relationship between demographic and clinical aspects of epilepsy in HRQoL of elderly patients. Since HRQoL scores are bounded, the Kumaraswamy (Kum) regression model was used to analyze the data.

Methods: The current study was conducted on 766 elderly patients diagnosed with epilepsy taking at least one antiepileptic drug (AED) selected from six neurologic clinics in Iran. In addition to demographic information, the Liverpool seizure severity scale (LSSS), medication adherence report scale (MARS-5), and quality of life in epilepsy (QoLIE-31) questionnaire were completed for patients. Data were analyzed using multiple linear regression (MLR) and the Kum regression models.

Results: Most of the patients included in the study had focal (70.2%) epilepsy. Mean duration of disease was 17.71 ± 4.56 years and the average number of seizures was 3.4 ± 3.2 episodes per month. The Kum regression model indicated that seizure frequency (β = -0.157, P < 0.0001) and LSSS score (β = -0.003, P = 0.009) were significant and negative predictors of overall QoLIE-31 score; MARS-5 score was a positive predictor of overall QoLIE-31 score (β = 0.014, P = 0.002). However, disease duration and serum AED level had no significant effects on overall QoLIE-31 score.

Conclusions: The findings suggested that increased seizure frequency and severity were associated with lower QoL and medication adherence was directly associated with HRQoL. The Kum regression could be a suitable alternative to the methods currently used in the analysis of HRQoL data.

Keywords: Epilepsy, Health-related Quality of Life, Medication Adherence, Seizure, Kumaraswamy Regression

1. Background

Epilepsy is one of the most common disabling neurological disorders with a relatively high prevalence in the elderly after stroke and dementia (1). Epilepsy can markedly affect patients' health-related quality of life (HRQoL) and lead to a lower quality of life (QoL) by the impact on the mental and social aspects of the patients (2, 3). It is often necessary to assess the HRQoL of such patients in order to measure health status and evaluate medical care results. Validated tools to measure HRQoL can provide information about the disease and its impact on patients' lives, in a standardized, comparable and relatively objective manner (4). Despite the importance of determining the treatment effects and individual characteristics on HRQoL, the appropriate analyzing method in this field is not completely understood yet, and various regression techniques (5-8) are proposed to analyze HRQoL data. Due to the simplicity of interpretation, multiple linear regression (MLR) is one of the techniques most widely used to study the effects of treatment on HRQoL and individual characteristics (8-12). However, due to some certain properties of HRQoL score, it is implausible that MLR is the most suitable method to analyze such data. Firstly, HRQoL outcomes have a double bounded format (e.g., 0 and 1); therefore, tend to be dis-
distributed non-normally. Furthermore, the distribution of these outcomes is highly skewed. Due to these properties, they usually represent heteroscedasticity, where the variance is smaller near the extremes and asymmetry. Therefore, applying standard methods of analysis such as linear regression that assume normality and constant variances may not be appropriate for such data.

One of the distributions that may be suitable for modeling such data is Kumaraswamy (Kum) distribution. The Kum distribution was originally proposed by Kumaraswamy [13] for variables that are lower and upper bounded. The Kum distribution is highly flexible and its distribution can provide many shapes such as unimodal, increasing, decreasing, and uniform; therefore, it might be suitable for modeling variables observed on the finite interval such as HRQoL scores. Although MLR models are used in most studies that analyze HRQoL, it is a question whether the Kum distribution is better than MLR models to analyze such data. The current study primarily aimed at applying a specific class of regression models based on the Kum distribution [14] to address the features mentioned in the HRQoL data and comparing the Kum model and MLR performances.

2. Objectives

The dataset employed to examine the application of the Kum model corresponded to HRQoL data in elderly people with epilepsy. The current study focused on two main aspects: development of the regression model based on the Kum distribution for bounded data and its comparison with that of MLR method, particularly HRQoL, as response variables, and evaluating the relationship between HRQoL with demographic characteristics and clinical features of patients with epilepsy.

3. Methods

3.1. Data Source

The study was conducted on elderly patients diagnosed with epilepsy referred to six neurological clinics in Iran (two in Qazvin and four in Tehran) recruited by convenience sampling from March 2014 to December 2015. The diagnosis was based on the International League Against Epilepsy criteria [15]. The six neurological clinics were asked to recruit patients based on the following inclusion criteria: age 65 years or above, receiving at least one antiepileptic drug (AED), and signing the consent form. The exclusion criteria were history of alcohol and/or drug abuse and history of cardiovascular disease, metabolic disorders such as diabetes, rheumatoid arthritis, hepatic diseases, malignant tumors, and kidney dysfunctions.

All eligible participants completed a questionnaire including items on demographic characteristics, clinical features, and the medication adherence at baseline. Medication adherence was evaluated through the medication adherence report scale (MARS-5) [16]. It is a self-reporting questionnaire including five statements of non-adherent behaviors. The total score of MARS-5 ranges 5 to 25, with higher scores indicating higher adherence.

Blood samples were collected from the median cubital vein prior to the next daily routine dose of a drug to measure serum AED levels after the six-month follow-up period. Serum AED levels were determined using a microparticle enzyme immunoassay kit (Abbott Assym®, Abbott Laboratories, Abbott Park, IL, USA) [17]. Moreover, during the six-month follow-up, the patients were asked to complete the Liverpool seizure severity scale (LSSS) and the quality of life in epilepsy inventory-31 (QoLI-31).

LSSS evaluates severity of seizure in patients with epilepsy. The LSSS scores range 0 to 100, with higher scores indicating the greater the perceived seizure severity [18]. Furthermore, the QoLI-31 has seven dimensions that measure different aspects of HRQoL [19]. The total score of the QoLI-31 varies from 0 to 1 and is calculated by weighting and summarizing its dimension scores; higher scores indicate a better HRQoL.

3.2. Statistical Methods

Continuous variables are expressed as mean ± standard deviation (SD), and categorical variables are presented as absolute and relative frequencies. Multiple linear regression was used to investigate the relationship between the total score of QoLI-31 with the demographic characteristics and clinical features of the participants. The presence of heteroscedasticity was detected by the Breush-Pagan test available in Imtest package and based on the obtained results, MLR model showed heteroscedasticity.

HRQoL scores have a double bounded format; on the other hand, the linear regression does not consider the data being bounded; therefore, the Kum regression model was also applied to model the data. The Kum regression is a modeling approach, assuming that the dependent variable \( y_t \) follows the Kum distribution with density function:

\[
f(y_t; \omega_1, p) = \left( \frac{1}{b - a} \right) \frac{\log(0.5)}{\log(1 - \omega_p)} y_t^{p-1} \left( 1 - y_t \right)^{\frac{\log(0.5)}{\log(1 - \omega_p)} - 1}
\]

with \( 0 < y_t < 1 \)

where \( 0 < \omega_1 < 1 \) is the median and \( P > 0 \) is the dispersion parameter. The Kum regression model is obtained by assuming that the median of \( y_t \) can be written as
\[
\logit (\omega_t) = \sum_{i=1}^{k} x_{ti}\beta_i, \text{ where } \beta = (\beta_1, \ldots, \beta_k)^T \text{ is a vector of unknown regression parameters and } x_{t1}, \ldots, x_{tk} \text{ are observations on } k \text{ known and fixed covariates (14).}
\]

The interpretation of the Kum regression coefficients is based on the odds ratio of the median score.

Finally, MLR and the Kum models were compared by the Akaike information criterion (AIC) and the Bayesian information criterion (BIC) and calculated as follows:

\[
AIC = -2\ln L_{fit} + 2k \tag{2}
\]

\[
BIC = -2\ln L_{fit} + 2k\ln N \tag{3}
\]

where \(\ln L_{fit}\) is the maximized log-likelihood, \(k\) is the number of parameters in the model, and \(N\) is the number of observations.

Data analysis was performed using the R statistical software version 3.5.1 (VGAM package), and the significance level was 0.05.

4. Results

4.1. Description of Dataset

The study sample consisted of 766 elderly patients with epilepsy, aged above 65 years (mean \(\pm\) SD = 73.9 \(\pm\) 5.7). The general and clinical characteristics of the participants are presented in Table 1. Almost half of the participants were female (54.7%), most of them were married (76%), and about one-third of them were employed (36.0%). Most of the patients had focal epilepsy (70.2%), with an average disease duration of 17.71 \(\pm\) 4.56 years and seizure frequency of 3.4 \(\pm\) 3.2 episodes per month. Nearly half of them (48.7%) had a serum AED level lower than the therapeutic range (i.e., non-adherent). Moreover, the mean overall score of QoLIE-31 in the study participants was 0.68 \(\pm\) 0.2 (Table 1).

4.2. Regression Models

The results of MLR and the Kum regression models are presented in Table 2. According to MLR model, level of education (\(\beta = 0.004, P = 0.001\)) and MARS-5 score (\(\beta = 0.003, P < 0.0001\)) were significant and positive predictors of the overall score of QoLIE-31. Conversely, QoLIE-31 score decreased by the increase of seizure frequency (\(\beta = -0.043, P < 0.0001\)) and LSSS score (\(\beta = -0.002, P < 0.0001\)). Similarly, based on the Kum regression model, level of education (\(\beta = 0.017, P = 0.003\)) and MARS-5 score (\(\beta = 0.014, P = 0.002\)) were positively correlated with QoLIE-31 score, while seizure frequency (\(\beta = -0.157, P < 0.0001\)) and LSSS score (\(\beta = -0.003, P = 0.009\)) were inversely correlated with QoLIE-31 score. Moreover, gender (\(\beta = -0.144, P = 0.026\)) and marital status (\(\beta = 0.137, P = 0.045\)) significantly associated with QoLIE-31 score in the Kum model, whilst in MLR model these associations were insignificant. The comparison of AIC and BIC indicated that their values for the Kum model were smaller than that of MLR model (Table 2). Therefore, based on these criteria, the Kum model was preferable than MLR in fitting such data.

A common diagnostic tool for the MLR model is the normal Q-Q plot of residuals. Figure 1 shows the normal Q-Q plot of residuals.
Q plot for QoLIE-31 scores. As shown in Figure 1, the points at the two ends of the plots in the MLR model are not close to a straight line; therefore, the residuals are not normally distributed.

5. Discussion

The current study was conducted on elderly patients with focal and generalized epilepsy in which the association of patients’ and diseases’ characteristics with HRQoL was evaluated using both MLR and the Kum models. The study results indicated a significant reduction in HRQoL with increasing the frequency and severity of seizure among elderlies with epilepsy. Numerous studies examined the association of seizure frequency and severity with QoL. Adebayo et al. using the same seizure severity tool as that of the current study reported a significant decrease in HRQoL of adult patients with epilepsy, following the increase in seizure severity (20). In another study by Tedrus et al. greater seizure frequencies were the main factors influencing QoL as evaluated by QoLIE-31 in patients with epilepsy (8). Furthermore, seizure frequency is reported as a negative predictor of QoL in adults with epilepsy (3, 21). These results indicated the importance of encouraging patients to record the frequency and severity of their seizure episodes and share the information with their healthcare provider to improve the HRQoL.

Poor adherence to medication was previously reported as an important predictor of HRQoL in patients with epilepsy (22-24). In the current study, medication adherence was also directly associated with HRQoL among the patients. In accordance with the current study results, Ettinger et al. demonstrated that HRQoL directly affects the QoL (22). Moreover, in a study by Martins et al. scores of adherence to treatment strongly correlated with all QoLIE-31 domains indicating higher HRQoL in patients with good medication adherence (25). Based on these findings, non-adherence to medication may lead to uncontrolled seizure with substantial deleterious effects on HRQoL. Therefore, the response to treatment may be an important issue to improve HRQoL among the elderly with epilepsy.

In the current study, a significant and positive associa-
tion was observed between education level of patients and overall score of QoLIE-31. Numerous studies examined the relationship between education levels and HRQoL in patients with epilepsy. For example, in a study by Ridsdale et al., education level was linearly associated with the higher QoL in patients with drug-resistant epilepsy (23). In addition, other studies illustrated a direct association between education level and QoL in patients with epilepsy (3, 26, 27). This may indicate that patients with higher level of education are aware of different aspects of the disease and may improve their QoL through appropriate treatment and seizure control. Certainly, further studies are required to obtain more conclusive results.

Based on the Kum model, other factors that influenced patients’ overall HRQoL score in the current study included gender and marital status. According to the findings of the current study, being female and unmarried were significant predictors of lower QoL in the Kum model; however, these associations were not significant in the MLR model. Similarly, Nabukenya et al. in their study reported that being female and unmarried were negative predictors of HRQoL in patients with epilepsy (3). Other studies also reported that gender influenced HRQoL in patients with epilepsy; female patients had significantly lower HRQoL than males, which was in agreement with the current study results (21, 27). Based on these findings, healthcare providers should recognize that gender might be a factor when evaluating HRQoL in the elderly patients with epilepsy. Moreover, being married affords a social and psychological support and, hence, reduces the negative impact of lower scores of these aspects on overall HRQoL.

The limitations of the present study should be considered in the interpretation of the study findings. Firstly, the participants included in the study were recruited from six urban clinics in Qazvin and Tehran where the QoL might be higher compared to the population living in rural areas. Therefore, the findings may not be generalizable to all patients with epilepsy in Iran. Secondly, due to participants’ conditions, sometimes they could not understand the questions asked, necessitating the use of a caretaker to interpret the questions for them and sometimes clarify on the patients’ responses. There is a possibility that the caretakers did not interpret the questions correctly, which might yield a wrong response. However, all the caretakers were oriented on the meaning of the different questions and their comprehension of the questions was evaluated. Finally, authors could not assess mental, emotional, psychological, and socioeconomic conditions in the study subjects. The current study also had several strengths including a relatively large sample size, an adequate follow-up period, and its longitudinal design.

In conclusion, the present study revealed that female gender, seizure frequency, and seizure severity were negatively correlated with HRQoL, while higher education level, being married, and medication adherence were positively correlated. Therefore, all strategies and health policies to improve HRQoL in elderly patients with epilepsy should be based on improving medication adherence and seizure-
related factors.

Acknowledgments

The authors extend their sincerest thanks to all the patients who served as samples of the study.

Footnotes

Authors’ Contribution: Study concept and design: Amir Pakpour, Mir Saeed Yekaninejad and Mohammad Reza Eshraghian; analysis and interpretation of data: Soudabeh Hamedi-Shahraki and Aliakbar Rasekhi; drafting of the manuscript: Soudabeh Hamedi-Shahraki; critical revision of the manuscript for important intellectual content: Farshad Amirkhizi and Mir Saeed Yekaninejad.

Conflict of Interests: The authors declared no conflict of interest.

Ethical Considerations: Ethical code IR.TUMS.SPH.REC.1396.2907.

Funding/Support: There was no financial support for the study.

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