

Socio-Economic Determinants and Health Care Utilisation: An Examination of Low Income Households of India

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Abstract

The objective of the study is to examine the influence of socio-economic determinants on health care utilization of low income households in the Punjab state of India. The study is cross sectional study that collected 1254 low income households from various districts of Punjab. Structured questionnaire covering the factors from Andersen's Behavioral model for health care use is used to collect the responses using multistage random sampling method. Multinomial logistic regression model is used to assess the influence of predisposing, enabling and need-illness factors of health services utilisation. Findings reveal that men household heading joint family and enrolled in Government sponsored schemes is associated with health services utilisation. Respondents with educational background (9- 10 standard) prefer to visit private hospitals where as households with good health status preferred private hospitals, chemists and Government hospitals over no treatment or home treatment.

Keywords: Catastrophic Expenditures, Health Seeking Behaviour, Health Insurance Policy, Health services utilization
JEL Classification: I12, I13, I15

INTRODUCTION

Health inequality is a reflection of health disparity observed in access to health care determinants. People with low income are more vulnerable to health disparities and suffer from a greater amount of health risks(Qian et al., 2017) . In fact, vulnerable population in low and middle income countries suffers from lack of adequate health care facilities in public sector. India has implemented major health care sector reforms since its first health policy documented in 1946 to improve access to health care services and widen the choice of health care providers(Ghosh, 2014). Nonetheless, the implementation of reforms were handicapped due to lack of support and coordination of State Governments that led to the dominance of private sector in health care delivery increasing out-of-pocket expenditures to poor (Bali & Ramesh, 2015).

With 22% population falling below the poverty line in India, achieving health equity is far from realization due to rapid privatization of health care services(Chaudhuri, 2012). Understanding patterns of health service utilization can improve health care and increase use of health services(Gan-Yadam et al., 2013). Applying behavioural models of health service utilisation in different contexts helps to understand the challenges and means to improve the health status of people. For example, the behavioural model proposed byGelberg L, Andersen RM &Leake BD(Gelberg et al., 2000)has extensively been used to understand the individual and contextual determinants to examine the health services utilisation(Gelberg et al., 2000; Pandey, 2017). Most of the studies in the recent past in developing countries have explored what determines the access and health services utilization among the gender, public/private service facilities, cities, regions/counties/provinces/states, and countries(Abuduxike et al., 2020; Law et al., 2005; Roy &Chaudhuri, 2008).In addition,previous studies also explored the utilization of a health care system while investigating several socio-demographic factors, social structures, level of education, cultural beliefs and practices, gender discrimination, status of women, economic and political systems and the disease pattern(Dey&Jorm, 2017). Despite the volume of such studies, there is a dearth of such studies in India which emphasizes the low income households.

The aim of our study is to examine the influence of predisposing, enabling and need factors of Andersen's behavioural model in choosing health care services providers amongst low income households. The study addressed gaps in the literature regardingchoosing health care provider which may be presented in dimensions such as a) examine how predisposing factors added with number of sick members and number of dependents in the family b) examine how need-illness factors influence health service utilisation when catastrophic health care expenditure is added c) examine how enabling factors impact choosing health care when enrolment in Government social sector schemes, distance travelled for medical treatment and consumption in the context of low income households.

The study is unique for two reasons. First, Andersen's behavioural model is tested in a low income group with limited economic sources having access to various Governments social sector schemes as compared to examining the model in disease specific conducted by most previous researchers. Second, the study provides a perspective to test the theory with an identical setting like in India with mixed culture and socio-economic conditions. Hence with adequate understanding of the authors, this study should add to the existing area of research in health seeking behaviours.

CONCEPTUAL FRAMEWORK

Andersen's Behavioral Model of Health Care Use and Hypothesis Formulation

The seminal work of Andersen's Behavioural model of health care use that explains the impact of Predisposing, enabling and need-illness factors on health seeking behaviour is an internationally accepted and reliable tool in understanding the health care services utilisation which was further extended as Gelberg-Andersen Behavioural Model for Vulnerable Populations (R. Andersen, 1968; R. M. Andersen, 1995; Freidoony et al., 2018; Gelberg et al., 2000). Numerous studies that explored the influence of health seeking predictors used secondary data, which means primary studies are required to understand the nature of predictors in variety of settings (Adane et al., 2017; Freidoony et al., 2018; Lilienthal et al., 2017). Since Andersen Health Behaviour Model was proposed in 1968, a wide investigation has been undertaken by examining socio-demographic factors, effects of geography, psychological, social support, consumer choice and alternate therapies, distance and health care utilization, perceived health status (child, adult and mental), and insurance status in association with health service utilization (B. L. Andersen et al., 2004; R. M. Andersen, 2008; R. Andersen & Newman, 1973; Anderson et al., 2006; Arcury et al., 2005; Babitsch et al., 2012; Bartsokas et al., 2019; Hiscock et al., 2020; Kelner & Wellman, 1997; Lu et al., 2020; Nemet & Bailey, 2000). The model talks about three major factors including predisposing factors, enabling factors and need & illness factors.

Pre-disposing factors

Predisposing factors are widely explained by the association between age, sex, marital status and past illness (demographic factors), education, occupation, family size, ethnicity, religion, residential, mobility (social structure), values concerning health and illness, attitudes towards health services, knowledge about diseases (R. M. Andersen, 1995; Babitsch et al., 2012; Gelberg et al., 2000). Age and gender significantly explain the variation of hospital usage (Habibov, 2010). In the context of Mongolia, married is a highly significant predictor of health care utilization (Gan-Yadam et al., 2013, p.). Domicile also plays a significant role in health care service utilization, as individuals who do not use hospital service are likely to live in a rural area (Hamilton et al., 2017). Contrary to the above studies, there is no significant association found between utilization of health services and socio-demographic factors such as gender, education level, and age (Roy & Chaudhuri, 2008). Residence has remained significant predictors of health service utilization nationally and globally (Dias et al., 2008; Ejike et al., 2020; Moroka & Tshimanga, 2009). Recent immigrants in Canada are less likely to visit a general practitioner, but the established immigrants use physicians services intensively (Tiagi, 2016). Occupation and educational attainment that represents the economic empowerment of family are significantly associated with the health care (Ononokpono & Odimegwu, 2014). Ethnic communities such as muslim women, and women belonged to scheduled castes, scheduled tribes, and other backward classes are less likely to avail safe delivery services (Singh et al., 2012). Family size represents the intensity of network relations manage with the social networks towards decision making. Large family size means larger the social networks followed than the smaller family size (Baker & Liu, 2006).

Enabling Factors

Access to and utilization of health services is a key for health equity and quality of life (dos Anjos Luis & Cabral, 2016). Knowing the location of service providers and coverage breadth of service providers is of utmost importance for an effective healthcare planning and utilization of services (dos Anjos Luis & Cabral, 2016; Munoz & Källestål, 2012). Studies pertaining to geographical barriers and their impediments on the quality health care, specifically, on rural areas are essential due to substantial mortality penalties for provider-seekers (Karra et al., 2017). Geographical and spatial behaviour factors, distance and driving license possession were significantly associated with health care utilization for both regular treatments and chronic care (Jordan et al., 2004). Poorly trained personnel, badly under-equipped and availability of hospital beds and cultural barriers subsides the geographical barriers for health care services utilization (Chavehpour et al., 2017). Poor urban, due to income inequalities forced to approach or consult cheaper, less qualified and often unregulated providers. In the context of Norway, there is negative association between income and mental health care treatment (Straiton et al., 2016). Poor treatment results towards reluctant to use services and might ignore health care during chronic illness, as well (Jongeneel-Grimen et al., 2011; Matthews et al., 2010; Zimmerman et al., 2011).

Need and Illness Factors

Need and illness factors represent one's own health status comprising mental and physical health. The impairment of any of mental and physical health condition lead to chronic health conditions and their severity is an indicator of health care utilization (Prinja et al., 2017). However, health services utilization varies according to the longevity of illness as well as surgery and availability of intensive care inside hospital (Habibov, 2010). Pain intensity, aging, and mental depression have an impact in selection of physicians; for instance, patients suffering from high pain intensity or limited pain-related disability and insomnia used physical consultations more often (Blyth et al., 2004). Similarly, Aboriginal Australians with cardiac problem face significant barriers to attend health care services resulting in sub-optimal health care (Artuso et al., 2013). In addition, while adjusting the socio-economic conditions of the people, treatment for antenatal care, pain-related disability, cardiovascular disorders and chronic diseases have significant association with the health care utilization (Artuso et al., 2013; Blyth et al., 2004; Rosella et al., 2014; Simkhada et al., 2008).

In the light of the literature reviewed, this study seeks to answer the contribution of the above factors to determine the health care services utilization of low income households and the study hypothesizes:

H₁: The predisposing factors have significant influence on the health services utilisation of low income households.

H₂: The enabling factors have significant influence on the health services utilisation of low income households.

H₃: The need and illness factors have significant influence on the health services utilisation of low income households.

MATERIALS AND METHODS

The study was conducted in Punjab state of India having 75.84% literacy rate with 11.3% population of below poverty line (Kumar & Singh, 2020). Cross Sectional research design was used for the purpose of this study. The study covers low income household with monthly income possessing blue and yellow rationing cards (Monthly income below INR 5130 {1USD= 17.446 INR, PPP Exchange Rate}). Data is collected from districts with highest and lowest per capita income and density of population using official Records of the State Government of Punjab, 2012. The data is collected by using a structured questionnaire to elicit the responses with a mix of open and close ended questions. The sampling area of target group of respondents is selected based on the density of low income people residing in Punjab state, thereby following multistage random sampling technique is used to select the sample respondents. Our study focuses primarily on the individuals whose work as street hawkers, micro business-men and migrant workers in factories.

Instruments Used

Health services utilization

The dependent variable, health services utilization, is a categorical variable which examines the health seeking behaviour of low income households that takes one of values (0= no treatment/any other treatment, 1= Chemists/Pharmacists, 2= RMP/Local Doctor, 3= Hakim/Faith Healer, 4= Government Hospital, 5= Private Hospital).

Predisposing factors

As suggested by Andersen's behavioural model, information on six predisposing factors were sought including age, gender, marital status, family type, domicile and number of dependents.

Need factors

Information about respondents suffering with communicable or non-communicable diseases in the last one year, in-patient or out-patient hospitalization record and spent catastrophic expenditure was collected in line with Andersen's behavioural model.

Enabling factors

Based on Andersen's behavioural model, details about enrolment in RSBY, BSSSY, ESIS, Blue & Yellow card and MNREGA was collected in addition to out-of-pocket expenditures, education profile, health insurance coverage and distance travelled from respondents.

RESULTS

Data Analysis

Descriptive details of socio-demographic characteristics of respondents and their health services utilization is provided in table-1. Authors have further employed multinomial logistics regression to check the influence of all three factors on health services utilization. Respondents facing catastrophic expenditures were classified on the basis of distribution of health payments and catastrophic expenditures methodology (Xu, 2005)

Determinants of Health Care Utilization-Multinomial Logistic Regression Model

Before administering logistic regression, the assumptions of multi-collinearity were tested using Kendall tau -b correlation test. Kendall's tau - b correlation coefficient, as a non-parametric test was widely used to test the strength of the categorical variables. As per the recommendation of Hair JF, Black WC & Babin BJ, Anderson RE and Jobson JD, the Kendall's tau-b coefficient value is tested for all categorical variables and found to be satisfactory (all values are below 0.7) (Hair et al., 2013; Jobson, 2012). In addition, the Pearson correlation coefficient was also calculated to check the multi-collinearity among the continuous variables such as out-of-pocket expenses, total consumption, distance travelled, number of dependents and number of sick members in the family. The Pearson correlation coefficient values are less than 0.7 suggesting the continuous variables are also free from multi-collinearity problem.

Table-2 represents the multinomial logistic regression results and significant explanatory variables that influence the health care service utilization of low income people of Punjab. To administer multinomial logistic regression, any other treatment methods such as homemade remedies or no treatment is taken as reference category for an outcome variable, health service utilization. The results of model fit measures reveal that the model is significant and fit (Chi-square = 1007, df= 165, p<0.001) to include the explanatory variables to explain the outcome variable. The Nagelkerke Chi-square (also called pseudo R-square) and Mc Fadden's R-square are used to evaluate to what extent the explanatory variables explain the variance in the outcome variable. The Nagelkerke Chi-square (35.9 per cent) and Mc Fadden's R -square (31.2 per cent) for the present study are found to be satisfactory (Petrucci, 2009). The results of Omnibus Likelihood Ratio tests of multinomial regression states that total consumption, out-of-pocket expenditure, education profile, family type, communicable or non-communicable diseases, catastrophic expenditure, hospitalization history (inpatient/out-patient), number of sick-members in the family, overall health status of family, distance travelled, possession of RSBY, ESIS, Yellow Card Holder and domicile of respondents are significant at p<0.01, p<0.05 and p<0.10.

The parameter estimates for predisposing factors from table-2 reveals that those male respondents who were married are statistically significant at $p < 0.05$ and prefer to visit Government hospitals for treatment and also prefer chemists and pharmacists. The results are also significant at $p < 0.05$ for married male respondents prefer Hakim/faith healer and not given preference to private hospitals. Family type (joint family) was also significant in choosing health care services such as faith healer, government hospital and private hospital. Domicile of respondents, number of dependents, number of sick members and age of respondents are insignificant in opting health care services. While evaluating the influence of need- illness factors and health services utilisation, the results shows that respondents bear the catastrophic health care expenditure preferred to visit hakim/faith healer and the results are significant at $p < 0.05$. Communicable/non-communicable diseases and type of hospitalization are insignificant factors for health services utilisation.

The parameter estimates pertaining to enabling factors shows the subscription of MNREGA, blue and yellow cards, ESIS and RSBY have significant influence on using regular and alternative health care services. Chemists, Government hospitals and private hospitals are significantly preferred by the respondents with good health status. Respondents with 9-10 and 11-12 educational background significantly preferred to use health care services. As the distance travelled increases, preference for using medical services is significant towards using RMP and local medical practitioner. The increased out of pocket health care expenditure significantly influenced to prefer hakim/faith healer.

DISCUSSION

The present study examines the influence of predisposing, need and enabling factors to use health care services across India (a nation with 22% population falling below poverty line). The results determine that the health services utilisation depends on the predisposing factors such as gender, marital status and family type. The study finds the significant influence of gender on the health care utilization. Married males with at least formal education heading a joint family, the household preferred to visit the Government Hospitals, chemists, and hakim/faith healer, and rather preferring private hospital. This might be because of high medical cost burden and low income of the head of the family. In contrast, the female health care seeking behaviour is changing towards visit to private health care clinics, whereas males preferred government health care services (Kastor & Shrestha, 2018). This is justifiable as female respondents complain or of opinion that the preferring public hospitals is time consuming and doctors would not diagnose the problem carefully due to their limitation in treating a huge rush of patients in Government Hospitals (Ergler et al., 2011). The findings have clearly understated that the gender differentials still exist (Roy & Chaudhuri, 2008), and consistent with theoretical underpinning of Andersen behavioural model of health care use (R. M. Andersen, 1995). Therefore, the wide spread programmes of Ministry of Family and Health Care such as Pradhan Manti Swastya Suraksha Yojana of Government of India and Universal Health Insurance Coverage programmes are available to make them use of facilities for treatment at affordable cost.

Our results also reinforce that the health care expenditure contributes to choose health care service provider based upon the type of disease and burden faced by household. For example, (Grover et al., 2005) evinced that the diseases like diabetes mellitus bears the higher contribution of direct cost followed by indirect cost and doctors' cost. The affordable cost of treatment, quality of treatment and proximity of health care providers were strongly associated with health care utilization (Deshmukh et al., 2017). The finding has an implication for the health care service providers to reallocate their resources for offering better treatment with affordable cost. One way of exposing the poorest quintiles for better treatment in private hospitals and public hospitals is to sensitize the households for insurance coverage and expose them to the quality preventive care to reduce the burden of diseases and retain the policy holders to the scheme (Delavallade, 2017).

The other determinant, education profile is also an important determinant in influencing the health care services utilization. The present study shows that the respondents with low education profile preferred treatment from faith healer and private hospital. As the low educated respondents visit private hospitals, they are bound to spend high burden of medical expenses. Higher the education level, understanding the intensity and problem of disease and selecting an appropriate health service provider will be appropriate. The finding is also in line with the study conducted by (Bhakta & Ganesh Kumar, 2014). According to the study, parental education directly influences the child health status, utilization of institutional health care facilities is better than uneducated parents, whether or not the facilities are available in their locality that corroborates the theory of Andersen behavioural use of health care. The health status of the household and family members is found to be the significant determinant of health care service utilization. Attaining positive health outcomes in least possible cost shall be the endeavour of any health service provider (Hall & Christian, 2017). The questions like "What shall be the intensity of treatment?" and "What shall be the cost of the treatment?" will be understood, when the health service provider and patient jointly select treatment intensity (Aizcorbe et al., 2017). The orientation and preference towards allied health services is an important contribution to prevent and manage the occurrence of chronic diseases (Foster et al., 2017). The study found insignificant association between enrolment for insurance schemes such as RSBY and BPSSY towards health seeking behaviour. Our findings corroborate with the findings of Jowett M, Deolalikar A, & Martinsson P (Jowett et al., 2004) indicate that the insured patients are more likely to use out-patient facilities in the context of low-income countries (Jowett et al., 2004). However, in Indian context, the enrolment in RSBY has not benefitted the insured comprehensively. The enrollees in RSBY who had used the services still faced out-of-pocket expenditures at the time of hospitalization mainly because the enrollees were asked to purchase the medicine and diagnostics, due to ceiling limit of the coverage (Devadasan et al., 2013).

CONCLUSION

The study aims to study the impact of predisposing, enabling and need- illness factors of Andersen Behavioural model for health care use in health services utilisation in Indian context. Using multistage random sampling method, a total of 1254 low income households of Punjab state are interviewed. The study documents the evidence that Government hospitals, traditional healers, registered medical practitioners and chemists supported by Government sponsored schemes are the most preferred health care service providers over private hospitals. Future studies can be replicated with the addition of variables specific to culture, health care sector reforms, types of diseases and economic status.

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Table 1. Socio-demographic Characteristics of Respondents Vs Health Services Utilization

Nature of Respondents	Details of Respondents	Any other/ No treatment	Chemist	Government Hospital	Hakim/ Faith healer	Private Hospital	RMP/ Local Doctor	Total	Chi-Square
Gender	Female	0(0.00%)	27(2.20%)	67(5.30%)	1(0.10%)	114(9.10%)	33(2.60%)	242(19.30%)	7.244
	Male	4(0.30%)	107(8.50%)	225(17.90%)	4(0.30%)	474(37.80%)	198(15.80%)	1012(80.70%)	
Religion	Any Other	2(0.20%)	14(1.10%)	42(3.30%)	0(0.00%)	65(5.20%)	34(2.70%)	157(12.50%)	70.925*
	Christian	0(0.00%)	1(0.10%)	19(1.50%)	0(0.00%)	6(0.50%)	1(0.10%)	27(2.20%)	
	Hindu	1(0.10%)	52(4.10%)	114(9.10%)	2(0.20%)	227(18.10%)	77(6.10%)	473(37.70%)	
	Muslim	0(0.00%)	2(0.20%)	19(1.50%)	1(0.10%)	19(1.50%)	3(0.20%)	44(3.50%)	
	Sikh	1(0.10%)	65(5.20%)	98(7.80%)	2(0.20%)	271(21.60%)	116(9.30%)	553(44.10%)	
Education Profile	1-5 Grade	0(0.00%)	21(1.70%)	59(4.70%)	0(0.00%)	86(6.90%)	36(2.90%)	202(16.10%)	64.96*
	11-12 Grade	2(0.20%)	8(0.60%)	22(1.80%)	0(0.00%)	45(3.60%)	13(1.00%)	90(7.20%)	
	6-8 Grade	0(0.00%)	34(2.70%)	24(1.90%)	1(0.10%)	103(8.20%)	38(3.00%)	200(15.90%)	
	9- 10 Grade	0(0.00%)	17(1.40%)	33(2.60%)	1(0.10%)	93(7.40%)	55(4.40%)	199(15.90%)	
	Graduate and Above	0(0.00%)	0(0.00%)	3(0.20%)	0(0.00%)	14(1.10%)	5(0.40%)	22(1.80%)	
	No formal Education	2(0.20%)	54(4.30%)	151(12.00%)	3(0.20%)	247(19.70%)	84(6.70%)	541 (43.10%)	
Marital Status	Married	4(0.30%)	102(8.10%)	232(18.50%)	3(0.20%)	474(37.80%)	191(15.20%)	1006(80.20%)	4.745
	Unmarried	0(0.00%)	32(2.60%)	60(4.80%)	2(0.20%)	114(9.10%)	40(3.20%)	248(19.80%)	
Occupation Profile	Casual Employment (Agriculture)	0(0.00%)	14(1.10%)	47(3.70%)	1(0.10%)	105(8.40%)	33(2.60%)	200(15.90%)	229.45*
	Casual Employment (Non-agriculture)	0(0.00%)	67(5.30%)	88(7.00%)	3(0.20%)	327(26.10%)	164(13.10%)	649(51.80%)	
	Cultivation	2(0.20%)	22(1.80%)	77(6.10%)	1(0.10%)	65(5.20%)	11(0.90%)	178(14.20%)	
	Fishing	0(0.00%)	11(0.90%)	26(2.10%)	0(0.00%)	16(1.30%)	0(0.00%)	53(4.20%)	
	Forest Gatherer	0(0.00%)	2(0.20%)	20(1.60%)	0(0.00%)	9(0.70%)	3(0.20%)	34(2.70%)	
	Interest and rental income	0(0.00%)	1(0.10%)	1(0.10%)	0(0.00%)	0(0.00%)	1(0.10%)	3(0.20%)	
	Livestock	1(0.10%)	4(0.30%)	23(1.80%)	0(0.00%)	7(0.60%)	0(0.00%)	35(2.80%)	
	Own non-agricultural enterprises/ services	0(0.00%)	6(0.50%)	5(0.40%)	0(0.00%)	31(2.50%)	12(1.00%)	54(4.30%)	
Type of Family	Salaried employment	1(0.10%)	7(0.60%)	5(0.40%)	0(0.00%)	28(2.20%)	7(0.60%)	48(3.80%)	66.47*
	Joint Family	0(0.00%)	15(1.20%)	88(7.00%)	2(0.20%)	87(6.90%)	13(1.00%)	205(16.30%)	
	Nuclear Family	4(0.30%)	119(9.50%)	204(16.30%)	3(0.20%)	501(40.00%)	218(17.40%)	1049(83.70%)	
	Any Other	0(0.00%)	2(0.20%)	12(1.00%)	0(0.00%)	7(0.60%)	3(0.20%)	24(1.90%)	78.116*

Type of House	Katcha	0(0.00%)	15(1.20%)	57(4.50%)	0(0.00%)	75(6.00%)	26(2.10%)	173(13.80%)	
	Pucca	3(0.20%)	57(4.50%)	157(12.50%)	3(0.20%)	250(19.90%)	70(5.60%)	540(43.10%)	
	Semi-pucca	1(0.10%)	60(4.80%)	66(5.30%)	2(0.20%)	256(20.40%)	132(10.50%)	517(41.20%)	
Type of Disease	Communicable	1(0.10%)	45(3.60%)	106(8.50%)	5(0.40%)	192(15.30%)	80(6.40%)	429(34.20%)	17.483**
	Non-communicable	3(0.20%)	85(6.80%)	168(13.40%)	0(0.00%)	371(29.60%)	146(11.60%)	7736(61.60%)	
	Others	0(0.00%)	4(0.30%)	18(1.40%)	0(0.00%)	25(2.00%)	5(0.40%)	52(4.10%)	
Health Expenditure	Catastrophic	2(0.20%)	49(3.90%)	128(10.20%)	4(0.30%)	503(40.10%)	141(11.20%)	827(65.90%)	219.012*
	Non-Catastrophic	2(0.20%)	85(6.80%)	164(13.10%)	1(0.10%)	85(6.80%)	90(7.20%)	427(34.10%)	
In-patient Hospitalization History	No	4(0.30%)	131(10.40%)	238(19.00%)	5(0.40%)	462(36.80%)	226(18.00%)	1066(85.00%)	70.436*
	Yes	0(0.00%)	3(0.20%)	54(4.30%)	0(0.00%)	126(10.00%)	5(0.40%)	188(15.00%)	
Ownership of Health Insurance	No	3(0.20%)	99(7.90%)	205(16.30%)	4(0.30%)	502(40.00%)	196(15.60%)	1009(80.50%)	35.161*
	Yes	1(0.10%)	35(2.80%)	87(6.90%)	1(0.10%)	86(6.90%)	35(2.80%)	245(19.50%)	
Health Status	Average	1(0.10%)	26(2.10%)	60(4.80%)	0(0.00%)	158(12.60%)	65(5.20%)	310(24.70%)	48.685*
	Excellent	1(0.10%)	5(0.40%)	18(1.40%)	0(0.00%)	33(2.60%)	13(1.00%)	70(5.60%)	
	Good	1(0.10%)	54(4.30%)	89(7.10%)	3(0.20%)	183(14.60%)	96(7.70%)	426(34.00%)	
	Poor	1(0.10%)	47(3.70%)	119(9.50%)	2(0.20%)	184(14.70%)	57(4.50%)	410(32.70%)	
	Very Poor	0(0.00%)	2(0.20%)	6(0.50%)	0(0.00%)	30(2.40%)	0(0.00%)	38(3.00%)	
Domicile	Rural	1(0.10%)	83(6.60%)	109(8.70%)	3(0.20%)	322(25.70%)	134(10.70%)	652(52.00%)	36.920*
	Urban	3(0.20%)	51(4.10%)	183(14.60%)	2(0.20%)	266(21.20%)	97(7.70%)	602(48.00%)	
Age Group	Less than 25	1(0.10%)	9(0.70%)	18(1.40%)	0(0.00%)	39(3.10%)	10(0.80%)	77(6.10%)	58.602*
	26-35	1(0.10%)	41(3.30%)	110(8.80%)	1(0.10%)	114(9.10%)	49(3.90%)	316(25.20%)	
	36-45	1(0.10%)	39(3.10%)	85(6.80%)	1(0.10%)	176(14.00%)	85(6.80%)	387(30.90%)	
	46-55	0(0.00%)	24(1.90%)	37(3.00%)	2(0.20%)	108(8.60%)	45(3.60%)	216(17.20%)	
	More than 55	1(0.10%)	21(1.70%)	42(3.30%)	1(0.10%)	151(12.00%)	42(3.30%)	258(20.60%)	

Significant at $p < 0.05^*$, $p < 0.10^{**}$

Table 2. Determinants of Health Care Utilization- Multinomial Logistic Regression Coefficients

Determinants of Health Care Utilization	Chemists/Pharmacists		Government Hospital		Hakim/Faith Healer		Private Hospital		RMP/Local Doctor	
	Estimate	Odds ratio	Estimate	Odds ratio	Estimate	Odds ratio	Estimate	Odds ratio	Estimate	Odds ratio
Intercept	30.23*		34.76*		-58.66*		28.99*		-6.91*	0.00
PREDISPOSING FACTORS										
Gender: Female										

Male	7.11**	0.00	7.14**	0.00	4.97 ^{NS}	0.01	7.07**	0.00	6.70**	0.00
Marital Status: Unmarried										
Married	7.67**	0.00	7.55**	0.00	12.32**	0.00	-7.59**	0.00	7.33**	0.00
Family Type: Nuclear Family										
Joint Family	12.49*	266583.93	13.64*	837105.55	15.30*	0.00	13.23*	557309.3	11.97*	157316.50
Domicile: Rural										
Urban	-1.89 ^{NS}	0.15	-1.02 ^{NS}	0.36	-2.56 ^{NS}	0.08	-1.34 ^{NS}	0.26	-1.55 ^{NS}	0.21
No of Dependents	-1.00 ^{NS}	0.37	-0.93 ^{NS}	0.39	-0.98 ^{NS}	0.38	-1.01 ^{NS}	0.37	-1.01 ^{NS}	0.37
No of Sick Members	3.20*	0.04	3.53 ^{NS}	0.03	-2.94 ^{NS}	0.05	3.53*	0.03	3.30*	0.04
Age: Less than 25										
Above 55	-2.58 ^{NS}	0.08	-2.38 ^{NS}	0.09	1.43 ^{NS}	4.18	-2.36 ^{NS}	0.09	-2.04 ^{NS}	0.13
36-45	2.21 ^{NS}	9.11	2.79 ^{NS}	16.31	3.74 ^{NS}	42.27	2.67 ^{NS}	14.40	2.93 ^{NS}	18.68
26-35	8.41 ^{NS}	4481.61	8.60 ^{NS}	5412.48	11.74 ^{NS}	125251.57	8.64 ^{NS}	5666.49	8.46 ^{NS}	4710.39
46-55	4.21 ^{NS}	67.19	4.44 ^{NS}	84.35	8.11 ^{NS}	3340.32	4.26 ^{NS}	71.04	4.68 ^{NS}	107.79
NEED FACTORS										
Communicable/ Non-Communicable/ Others: Others										
Communicable	-0.57 ^{NS}	0.56	-1.41 ^{NS}	0.24	5.70 ^{NS}	297.61	-0.06 ^{NS}	0.94	0.05 ^{NS}	1.06
Non-Communicable	-0.98 ^{NS}	0.38	-1.88 ^{NS}	0.15	-3.93 ^{NS}	0.02	-0.66 ^{NS}	0.52	-0.50 ^{NS}	0.61
Hospitalized: No										
Yes	8.31 ^{NS}	4060.85	10.60 ^{NS}	39973.48	2.11 ^{NS}	8.28	9.82 ^{NS}	18479.07	8.34 ^{NS}	4204.92
Catastrophic :Catastrophic										
Non-Catastrophic	-2.88 ^{NS}	0.06	-2.76 ^{NS}	0.06	16.37*	0.00	-3.28 ^{NS}	0.04	-3.80 ^{NS}	0.02
ENABLING FACTORS										
LOGOOP	-0.48 ^{NS}	0.62	0.03 ^{NS}	1.03	-6.38**	0.00	1.51 ^{NS}	4.54	-0.51 ^{NS}	0.60
Education: No formal Education										
1- 5 Grade	3.06 ^{NS}	21.41	3.50 ^{NS}	33.00	2.72 ^{NS}	0.07	3.00 ^{NS}	20.07	3.04 ^{NS}	20.97

11- 12 Grade	7.81*	0.00	-7.76*	0.00	-15.46*	0.00	8.32*	0.00	8.20*	0.00
6- 8	7.12 ^{NS}	1232.12	5.95 ^{NS}	381.98	5.14 ^{NS}	171.34	6.38 ^{NS}	589.30	6.74 ^{NS}	843.46
9- 10 Grade	3.82*	45.72	3.92*	50.45	2.87 ^{NS}	17.72	4.01*	55.22	4.39*	80.76
Graduate and Above	20.48*	0.00	4.44 ^{NS}	85.00	3.50 ^{NS}	33.26	5.27 ^{NS}	194.54	5.31 ^{NS}	201.40
Health Insurance: No										
Yes	5.31 ^{NS}	202.41	5.33 ^{NS}	206.15	8.22 ^{NS}	3706.54	4.96 ^{NS}	142.27	5.05 ^{NS}	155.98
Distance Travelled	-0.09 ^{NS}	0.91	-0.04 ^{NS}	0.96	-0.01 ^{NS}	0.99	-0.02 ^{NS}	0.98	-0.11**	0.89
Health Status: Very Poor										
Average	-1.59 ^{NS}	0.20	-2.43 ^{NS}	0.09	-12.17 ^{NS}	0.00	-3.89 ^{NS}	0.02	33.77*	463.00
Excellent	-5.82 ^{NS}	0.00	-5.91 ^{NS}	0.00	13.02*	0.00	-6.78 ^{NS}	0.00	29.58*	704.00
Good	5.32*	0.00	6.18**	0.00	-8.44 ^{NS}	0.00	7.28*	0.00	29.61*	724.00
Poor	-3.96	0.02	-4.57 ^{NS}	0.01	-6.00 ^{NS}	0.00	5.92**	0.00	30.62*	198.00
Log Consumption	2.22 ^{NS}	9.17	1.00 ^{NS}	2.71	27.43*	0.00	2.04 ^{NS}	7.72	2.85 ^{NS}	17.37
Yes	14.23*	0.00	12.85 ^{NS}	0.00	21.24*	0.00	13.49*	0.00	13.03*	0.00
BPSSY: No										
Yes	-2.34 ^{NS}	0.10	2.69 ^{NS}	0.07	-12.32 ^{NS}	0.00	-3.04 ^{NS}	0.05	-2.94 ^{NS}	0.05
ESIS: No										
Yes	9.06*	0.00	8.66 ^{NS}	0.00	12.29**	0.00	9.89*	0.00	9.76*	0.00
Blue_Card_Holder: No										
Yes	9.86 ^{NS}	19180.96	9.44 ^{NS}	12632.62	11.57**	105431.89	9.54 ^{NS}	13840.08	9.19 ^{NS}	9837.73
Yellow_Card: No										
Yes	7.54*	1887.63	8.17*	3533.31	3.02*	20.54	5.51*	247.33	-25.98*	0.00
MNREGA_Job_Card: No										
Yes	7.75*	2332.57	9.24*	10259.79	-1.37*	0.25	8.69*	5963.31	7.38**	1607.56

Source: Author's Calculation Significant at $p < 0.01^*$, $p < 0.05^{**}$, $p < 0.10^{***}$, NS – Not Significant

