# Original **Article**

# National Health Insurance Role in Hospital Utilisation in Disadvantaged Areas: Evidence from Indonesia

Ratna Dwi Wulandari<sup>1</sup>, Leny Latifah<sup>2</sup>, Agung Dwi Laksono<sup>2</sup>, Wahyu Pudji Nugraheni<sup>2</sup>, Tati Suryati<sup>2</sup>, Tety Rachmawati<sup>2</sup>, Diah Yunitawati<sup>2</sup>, Rofingatul Mubasyiroh<sup>2</sup>, Irfan Ardani<sup>2</sup>, Asep Kusnali<sup>2</sup>

Submitted: 10 Jul 2024 Accepted: 10 Oct 2024 Online: 31 Dec 2024

- <sup>1</sup> Faculty of Public Health, Universitas Airlangga, Surabaya, Indonesia
- <sup>2</sup> National Research and Innovation Agency, Jakarta, Indonesia

To cite this article: Wulandari RD, Latifah L, Laksono AD, Nugraheni WP, Suryati T, Rachmawati T, Yunitawati D, Mubasyiroh R, Ardani I, Kusnali A. National health insurance role in hospital utilisation in disadvantaged areas: evidence from Indonesia. *Malays J Med Sci.* 2024;**31(6)**:205–216. https://doi.org/10.21315/mjms2024.31.6.16

To link to this article: https://doi.org/10.21315/mjms2024.31.6.16

#### Abstract -

Background: The Indonesian government policy regarding obtaining universal coverage through National Health Insurance (NHI) is expected to increase public access to health service facilities, including in disadvantaged areas. This study analysed the role of NHI in hospital utilisation in underprivileged areas of Indonesia.

Methods: Data from the 2023 National Socioeconomic Survey were used in this cross-sectional study that included 130,331 participants. Hospital utilisation was the dependent variable and NHI membership was the independent variable. Residence, age, sex, marital status, education, occupation, and wealth status were control factors. A multinomial logistic regression was employed in the final stage for data evaluation.

Results: In 2023, the hospital utilisation rate in Indonesia's disadvantaged regions was 1.5% and the percentage of NHI members was 74.5%. People with an NHI membership were 3.01 times more likely to utilise the hospital than those without [95% confidence interval (CI) 2.58–3.50]. Seven control variables related to hospital utilisation were identified, namely, residence type, age, sex, marital status, education level, employment status, and wealth status.

Conclusion: This study concluded that NHI membership influenced hospital utilisation in disadvantaged areas of Indonesia. Individuals with NHI membership were three times more likely to visit hospitals.

**Keywords:** hospital utilisation, disadvantaged areas, National Health Insurance, healthcare evaluation, public health

#### Introduction

The hospital referral system is an essential component of Indonesian healthcare. It is established in a hierarchy to ensure that each patient receives proper care at an appropriate level of service. Primary healthcare facilities are at the bottom of the system and provide initial contact and primary care. When a patient's

condition is too severe for these facilities to handle, they are sent to secondary or tertiary hospitals for specialised care. This system is designed to make the best use of resources and improve patient outcomes by sending patients to healthcare settings that best fit their needs (1). The effectiveness of a referral system depends on its ability to efficiently reduce disparities in healthcare access and manage patient burden. In Indonesia, several challenges remain such as unequal access to services and the accumulation of patients in specific hospitals, which can lead to overburden and decreased quality of services. Studies have shown that urban residents are more likely to use hospital services than rural residents, indicating this disparity in the referral system must be addressed (2).

Indonesia is the world's largest archipelago and its different regions have different levels of health and economic well-being due to weather conditions and a lack of infrastructure. Disparities caused by growth also make it more difficult for people to access healthcare facilities (3). Regions with a good economic status tend to have better access to healthcare facilities. Hospital utilisation in Indonesia, including inpatient and outpatient services, has been the subject of several studies. In 2018, Indonesia's national average inpatient hospital utilisation was 3.053%, and that for outpatients was 1.465% (4). This condition was better than in 2013, when the average utilisation was 1.6% for inpatients and 1.1% for outpatients (5). Hospital utilisation trends differ significantly between countries, typically reflecting each country's healthcare structure and financial systems. Although the governments of Malaysia and Vietnam have enacted measures to attain equality, they encounter similar challenges in guaranteeing equal and fair access to health services in different areas of their countries (6, 7).

Previous studies have shown that various factors affect the extent to which healthcare used. Using Andersen's conceptual framework, researchers have categorised factors that influence healthcare use into three groups, i.e., need, allowing, and predisposing (8–11). According to research, age, education, knowledge, marital status, and sex are all healthcare associated with higher (9-11). Enabling factors are related to service use. Distance to a health facility, place of residence, insurance ownership, and income all contribute to the overuse and underuse of hospital services (8, 12, 13). Need parameters, such as disease severity and previous experience with healthcare utilisation, are also associated

with the use of hospitals as referral healthcare institutions (8, 10, 11). Based on the above framework, geographical disparities and a national health insurance health protection programme are significant barriers and enabler to accessing hospital utilisation, respectively.

In Indonesia, the Ministry of Health Regulation No. 71 of 2013, along with its amendments, pertains to the utilisation of hospitals within the National Health Insurance (NHI) framework and constitutes a pivotal policy aimed at improving access to and quality of healthcare services for the population. This policy underscores the importance of fair access to healthcare services for all citizens. It underlines the imperative for collaboration the central government, authorities, and private sector to guarantee effectiveness and efficiency in healthcare services (14, 15). Efforts to broaden healthcare service coverage are reflected in programmes, such as incentives for healthcare personnel and the development of healthcare facilities in these regions. In 2022, the National Social Security Council and the Health Social Security Agency (HSSA) registered 2,745 involved hospitals, including government and private hospitals, and main clinics [Advanced Referral Healthcare (ARHF)] in partnership with the HSSA (16). This number has increased since 2016 despite a decline in 2019. The ARHF-to-enrolled NHI participant ratio remained stable from 2016 to 2021, with a national ratio of 1 ARHF per 100,000 participants. However, the bed ratio in hospitals cooperating with the HSSA is 2 per 1,000 participants, which falls short of the World Health Organization recommendation of 5 per 1,000 people. A significant aspect of this policy is the regulation of healthcare financing, including hospital costs, through the NHI mechanism. In practice, the NHI allows participants, including those residing in underserved areas, to receive services at hospitals participating in the programme (17). The NHI encourages hospitals to expand their reach and improve the quality of healthcare services, including in underserved areas, through incentives and regulations, some of which are accommodated in the Ministry of Health Regulation No. 21 of 2020 from the Ministry of Health's Strategic Plan.

Based on this background information, this study analysed the role of the NHI in hospital utilisation in Indonesia's disadvantaged areas.

#### **Materials and Methods**

#### Data Source

This study used secondary data obtained from the 2023 National Socioeconomic Survey, which was a nationwide cross-sectional survey conducted by Indonesian Statistics. The poll gathered data in March 2023.

The 2023 National Socioeconomic Survey comprised the entire population of Indonesian households. This study covered a sample size of 345,000 households distributed among 34 provinces and 514 districts/cities in Indonesia. The survey used a systematic sampling method to select a sample of 10 homes in each census block, which were selected using probability proportional to size. The total number of census block samples used for the survey was 34,500. The survey conducted stratification at the census block and household levels within specific census blocks to obtain a sample that accurately represented the population. Census block stratification involved explicitly grouping the complete population of regular census blocks from the 2020 Population Census according to urban or rural classifications. Implicit stratification was based on the education level for the head of household (18).

This survey included all individuals aged ≥15 years who resided in Indonesia's underprivileged areas. The sampling methods determined the sample size, which consisted of 130,331 participants.

#### Setting

The study examines the utilisation of hospitals in Indonesia's disadvantaged regions. Presidential Regulation Number 63 of 2020, titled "Determining Underdeveloped Regions for 2020–2024", defines the limits of economically underprivileged regions. According to the regulation, underdeveloped areas in Indonesia include 62 provinces in 11 provinces: North Sumatera Province (Nias, South Nias, North Nias, West Nias), West Sumatera Province (Mentawai Islands), South Sumatera Province (North Musi Rawas), Lampung Province (West Pesisir), West Nusa Tenggara Province (West Lombok), East Nusa Tenggara Province (West

Sumba, East Sumba, Kupang, East Timor Tengah, Belu, Alor, Lembata, Rote Ndao, Central Sumba, Southwest Sumba, East Manggarai, Sabu Raijua, Malaka), Central Sulawesi Province (Donggala, Tojo Una-una, Sigi), Maluku Province (West Maluku Tenggara, Aru Islands, West Seram, East Seram, Southwest Maluku, South Buru), North Maluku Province (Sula Islands, Taliabu Island), West Papua Province (Wondama Gulf, Bintuni Gulf, South Sorong, Sorong, Tambrauw, Maybrat, South Manokwari, Arfak Mountains), and Papua Province (Jayawijaya, Nabire, Paniai, Puncak Jaya, Boven Digoel, Mappi, Asmat, Yahukimo, Bintang Mountains, Tolikara, Keerom, Waropen, Supiori, Great Mamberamo, Nduga, Lanny Jaya, Central Mamberamo, Yalimo, Puncak, Dogivai, Intan Java, Deivai).

#### Outcome Variable

Hospital utilisation was the dependent variable, which pertained to the degree individuals used hospitals for outpatient and inpatient treatments. Hospital utilisation was categorised as unused or used. In contrast, the study focused on outpatient hospitalisations that occurred the month before while it examined inpatient hospitalisations that occurred in the previous year. The study requested that individuals recollect outpatient and inpatient incidents (19).

#### Exposure Variable

NHI membership was an independent variable in the analysis. NHI comprises all forms of membership, including mandatory enrolment for public servants, police, and army personnel, and coverage provided by companies or through government support. NHI membership was classified as either "No" or "Yes".

#### **Control Variables**

Seven control factors were incorporated, namely, residence type, age, sex, marital status, education level, employment status, and wealth status. The survey classified residential areas into two distinct categories, i.e., urban and rural. Furthermore, the survey utilised the urban-rural classification criteria provided by Indonesian

The participants' ages were determined by their most recent birthday. Sex was classified into males and females. Marital status had three categories, i.e., never married, married, and divorced or widowed.

The term "respondent's education" referred to current academic credentials grouped into four levels of education, namely, primary school, middle school, high school, and university. Employment status was either unemployed and employed.

The survey utilised the wealth index formula to determine the participants' status. The survey calculated the wealth index using a weighted average of household expenses. The poll determined the wealth index by considering primary household expenditures such as health insurance, food, housing, and other miscellaneous items. Furthermore, the poll classified the income index into five categories, i.e., least affluent, less affluent, middle, more affluent, and most prosperous (20).

#### Data Analysis

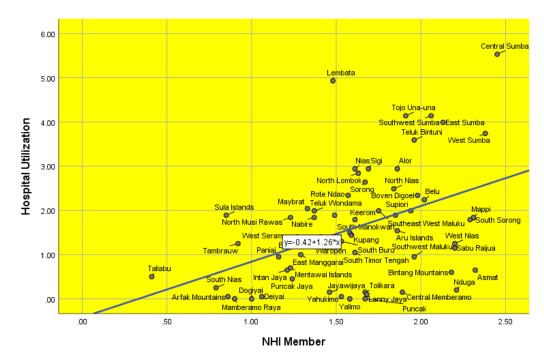
At the beginning of the sample period, the chi-squared test was used to compare the two categories of variables. Concurrently, *t*-tests were used to assess continuous age variables. A collinearity test was used to confirm that the independent variables in the final regression model were not strongly associated. The final step in the study involved the use of a multinomial logistic regression analysis. This study utilised a previously established method to analyse the multivariate correlations between all independent variables and hospital utilisation. Statistical Package for the Social Sciences (SPSS) version 26 (IBM Corp., Armonk, NY, US) was used for the statistical analyses.

# Results

This study found that the hospital utilisation rate in Indonesia's disadvantaged regions in 2023 was 1.5%. The percentage of NHI members was 74.5%. Table 1 lists the characteristics of the respondents. Figure 1 displays the scatter plot for the proportion of NHI members and hospital utilisation in the disadvantaged areas by regency in Indonesia in 2023. A positive relationship between these two factors was indicated (Figure 1). The higher the proportion of NHI members, the higher the hospital utilisation in the regency.

**Table 1.** Characteristics of respondents (n = 130,331)

Characteristics of respondents         n         %           Hospital utilisation         128,324         98.5           Utilised         2,007         1.5           NHI member         33,198         25.5           No         33,198         25.5           Yes         97,133         74.5           Residence type         Urban         12,821         9.8           Rural         117,510         90.2           Age         130,331         100.0           Gender         Male         66,307         50.9           Female         64,024         49.1           Marrial status         Never Married         67,642         51.9           Married         55,655         42.7           Divorced/widowed         7,034         5.4           Education level         Primary school         87,406         67.1           Junior high school         18,983         14.6           Senior high school         17,431         13.4           College         6,511         5.0           Employment status         Unemployed         74,125         56.9           Employed         56,206         43.1           Wealth stat		150,551)	
Unutilised       128,324       98.5         Utilised       2,007       1.5         NHI member       33,198       25.5         Yes       97,133       74.5         Residence type       Urban       12,821       9.8         Rural       117,510       90.2         Age       130,331       100.0         Gender       49.1         Male       66,307       50.9         Female       64,024       49.1         Marrial status       87,655       42.7         Divorced/widowed       7,034       5.4         Education level         Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0		n	%
Utilised       2,007       1.5         NHI member       33,198       25.5         Yes       97,133       74.5         Residence type       Urban       12,821       9.8         Rural       117,510       90.2         Age       130,331       100.0         Gender       Male       66,307       50.9         Female       64,024       49.1         Marital status       Never Married       67,642       51.9         Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level         Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2 <td>Hospital utilisation</td> <td></td> <td></td>	Hospital utilisation		
NHI member No 33,198 25.5 Yes 97,133 74.5  Residence type Urban 12,821 9.8 Rural 117,510 90.2  Age 130,331 100.0  Gender Male 66,307 50.9 Female 64,024 49.1  Marital status Never Married 67,642 51.9 Married 55,655 42.7 Divorced/widowed 7,034 5.4  Education level Primary school 87,406 67.1 Junior high school 18,983 14.6 Senior high school 17,431 13.4 College 6,511 5.0  Employment status Unemployed 74,125 56.9 Employed 56,206 43.1  Wealth status Poorest 53,131 40.8 Poorer 29,032 22.3 Middle 19,538 15.0 Richer 15,938 15.0	Unutilised	128,324	98.5
No       33,198       25.5         Yes       97,133       74.5         Residence type       Urban       12,821       9.8         Rural       117,510       90.2         Age       130,331       100.0         Gender       Male       66,307       50.9         Female       64,024       49.1         Marital status       Never Married       67,642       51.9         Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level         Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Utilised	2,007	1.5
Yes       97,133       74.5         Residence type       12,821       9.8         Rural       117,510       90.2         Age       130,331       100.0         Gender       Male       66,307       50.9         Female       64,024       49.1         Marital status       Never Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level       Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status       Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	NHI member		
Residence type  Urban 12,821 9.8 Rural 117,510 90.2  Age 130,331 100.0  Gender  Male 66,307 50.9 Female 64,024 49.1  Marital status  Never Married 67,642 51.9  Married 55,655 42.7  Divorced/widowed 7,034 5.4  Education level  Primary school 87,406 67.1  Junior high school 18,983 14.6  Senior high school 17,431 13.4  College 6,511 5.0  Employment status  Unemployed 74,125 56.9 Employed 56,206 43.1  Wealth status  Poorest 53,131 40.8  Poorer 29,032 22.3  Middle 19,538 15.0  Richer 15,938 12.2	No	33,198	25.5
Urban       12,821       9.8         Rural       117,510       90.2         Age       130,331       100.0         Gender       50.9       50.9         Male       66,307       50.9         Female       64,024       49.1         Marital status       55.655       42.7         Never Married       67,642       51.9         Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level         Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       56,206       43.1         Wealth status       56,206       43.1         Wealth status       700rest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Yes	97,133	74.5
Rural       117,510       90.2         Age       130,331       100.0         Gender	Residence type		
Age       130,331       100.0         Gender       Male       66,307       50.9         Female       64,024       49.1         Marital status       Vere Married       67,642       51.9         Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level         Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Urban	12,821	9.8
Gender       Male       66,307       50.9         Female       64,024       49.1         Marital status       Senior high school       7,034       5.4         Education level       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Rural	117,510	90.2
Male       66,307       50.9         Female       64,024       49.1         Marital status       Never Married       67,642       51.9         Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level         Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status         Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Age	130,331	100.0
Female       64,024       49.1         Marital status       64,024       49.1         Never Married       67,642       51.9         Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level         Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Gender		
Marital status       67,642       51.9         Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level       87,406       67.1         Primary school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status       Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Male	66,307	50.9
Never Married       67,642       51.9         Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level         Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Vunemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Female	64,024	49.1
Married       55,655       42.7         Divorced/widowed       7,034       5.4         Education level       Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Marital status		
Divorced/widowed       7,034       5.4         Education level       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Never Married	67,642	51.9
Education level         Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       56,206       43.1         Wealth status       53,131       40.8         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Married	55,655	42.7
Primary school       87,406       67.1         Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status       56.9       56.9         Employed       56,206       43.1         Wealth status       7900 cest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Divorced/widowed	7,034	5.4
Junior high school       18,983       14.6         Senior high school       17,431       13.4         College       6,511       5.0         Employment status         Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Education level		
Senior high school       17,431       13.4         College       6,511       5.0         Employment status       56.9       56.9         Unemployed       56,206       43.1         Wealth status       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Primary school	87,406	67.1
College     6,511     5.0       Employment status     56.9       Unemployed     74,125     56.9       Employed     56,206     43.1       Wealth status       Poorest     53,131     40.8       Poorer     29,032     22.3       Middle     19,538     15.0       Richer     15,938     12.2	Junior high school	18,983	14.6
Employment status       74,125       56.9         Unemployed       56,206       43.1         Wealth status       53,131       40.8         Poorest       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Senior high school	17,431	13.4
Unemployed       74,125       56.9         Employed       56,206       43.1         Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	College	6,511	5.0
Employed     56,206     43.1       Wealth status     40.8       Poorest     53,131     40.8       Poorer     29,032     22.3       Middle     19,538     15.0       Richer     15,938     12.2	Employment status		
Wealth status         Poorest       53,131       40.8         Poorer       29,032       22.3         Middle       19,538       15.0         Richer       15,938       12.2	Unemployed	74,125	56.9
Poorest 53,131 40.8 Poorer 29,032 22.3 Middle 19,538 15.0 Richer 15,938 12.2	Employed	56,206	43.1
Poorer 29,032 22.3 Middle 19,538 15.0 Richer 15,938 12.2	Wealth status		
Middle 19,538 15.0 Richer 15,938 12.2	Poorest	53,131	40.8
Richer 15,938 12.2	Poorer	29,032	22.3
m: 1	Middle	19,538	15.0
Richest 12,672 9.7	Richer	15,938	12.2
	Richest	12,672	9.7



**Figure 1.** Scatter plot of the proportion of NHI members and hospital utilisation in disadvantaged areas by the regency in Indonesia in 2023

Source: Visualisation by the authors

Table 2 presents the results of bivariate analysis. NHI members used hospitals more than uninsured individuals. Rural areas were the dominant residence type in both NHI member groups. People with a NHI membership had a mean age older than that of those without a NHI membership. Males had a higher ratio than females in both NHI membership groups.

The data in Table 2 show that regarding marital status, never married dominated in both groups of NHI membership. Based on education level, primary school dominated in both groups of NHI membership. Meanwhile, unemployed dominated for those with all types of NHI membership. The poorest category of wealth status dominated in the two groups of NHI membership.

Subsequently, a collinearity test was performed. The test results suggested no noticeable connection between the independent variables. The tolerance value was more significant than 0.10, whereas the variance inflation factor value for each variable was less

than 10.00. The analysis revealed no evidence of multicollinearity in the regression model, suggesting that the test's basis for generating conclusions was strong.

Table 3 presents the findings of the multinomial logistic regression analysis on hospital use in Indonesia in 2023. Based on NHI membership, individuals with an NHI membership were 3.01 times more likely to utilise the hospital than those without (95% confidence interval [CI] 2.58–3.50).

This study demonstrated a correlation between hospital utilisation and six control factors. Based on residence type, individuals living in rural areas were 0.58 times less likely to use the hospital than those in urban areas (95% CI 0.51–0.65). Five demographic factors were linked to hospital utilisation in disadvantaged communities in Indonesia, namely, age, sex, marital status, education level, and employment position. Furthermore, based on wealth status, Table 3 shows that the wealthier people were the more likely they are to use the hospitals.

**Table 2.** Bivariate analysis (n = 130,331)

	NHI me	NHI member		
Demography characteristics	No (n = 33,012)	Yes (n = 97,133)	<i>p</i> -value	
Hospital utilisation			< 0.001	
Unutilised	99.4	98.1		
Utilised	0.6	1.9		
Residence type			< 0.001	
Urban	9.3	10.0		
Rural	90.7	90.0		
Age (mean)	(23.57)	(29.94)	< 0.001	
Gender				
Male	51.0	50.8		
Female	49.0	49.2		
Marital status			< 0.001	
Never in union	61.4	48.7		
Married	34.0	45.7		
Divorced/widowed	4.6	5.7		
Education level			< 0.001	
Primary school	73.9	64.7		
Junior high school	12.5	15.3		
Senior high school	10.7	14.3		
College	2.9	5.7		
Employment status			< 0.001	
Unemployed	66.7	53.5		
Employed	33.3	46.5		
Wealth status			< 0.001	
Poorest	48.6	38.1		
Poorer	23.1	22.0		
Middle	13.7	15.5		
Richer	9.0	13.3		
Richest	5.6	11.1		

#### **Discussion**

This study found that individuals who joined the NHI programme changed how often they used hospitals in Indonesia's poorer areas. There are several reasons people were more likely to visit the hospital since the NHI programme started, especially in regions that are not well developed. The NHI can help people who have trouble paying for hospital care. People with a poorer status who sign up for NHI can receive medical care without spending much on hospital stays, treatments, and procedures

(17, 21–24). The increase in hospital utilisation may also be attributed to the integration of health promotion initiatives within the NHI programme, which aims to enhance knowledge of healthcare needs (25). Hospital services need improvement and capacity must to be increased to ensure that people receive good care in places that are not well developed and do not have adequate healthcare infrastructures. These changes may include training healthcare workers, improving medical facilities and equipment, and establishing quality assurance protocols to ensure that patients receive quick and reasonable care (26, 27)

**Table 3.** The findings of the multinomial logistic regression study on hospital use in Indonesia in 2023 (n = 130,331)

	Utilised hospital			
Predictor	Adjusted odds ratio	95% CI		
		Lower bound	<b>Upper bound</b>	<i>p</i> -value
NHI membership: No (ref.)	_	_	_	_
NHI membership: Yes	3.01	2.58	3.50	<0.001
Residence: Urban (ref.)	_	_	_	_
Residence: Rural	0.58	0.51	0.65	<0.001
Age	0.005	0.004	0.007	<0.001
Gender: Male (ref.)	_	_	_	_
Gender: Female	0.90	0.81	0.99	0.038
Marital: Never in union (ref.)	_	_	_	_
Marital: Married/living with partner	3.43	3.06	3.86	<0.001
Marital: Divorced/widowed	3.79	3.15	4.56	<0.001
Education: Primary school (ref.)	_	_	_	_
Education: Junior high school	0.96	0.84	1.10	0.539
Education: Senior high school	1.25	1.11	1.42	<0.001
Education: College	1.74	1.48	2.04	<0.001
Employment: Unemployed (ref.)	_	_	_	_
Employment: Employed	0.39	0.34	0.43	<0.001
Wealth: Poorest (ref.)	_	_	_	_
Wealth: Poorer	1.28	1.12	1.45	<0.001
Wealth: Middle	1.45	1.27	1.67	<0.001
Wealth: Richer	1.56	1.36	1.79	<0.001
Wealth: Richest	1.71	1.47	1.98	<0.001

The results of this study revealed that individuals residing in disadvantaged areas of Indonesia were three times more likely to have NHI membership than those who did not. The higher likelihood of hospital utilisation among individuals enrolled in the NHI in underserved areas proves the vital role of the NHI (23, 28). The NHI policy ensures equitable access to healthcare for residents in underserved areas (17, 29), including hospitals. Earlier studies attributed the increase in hospital utilisation to the implementation of health insurance ownership (4, 21, 30). Health insurance schemes in low- and middle-income countries generally increase access to healthcare facilities (30). In Malaysia, health insurance ownership determines access to healthcare, although it does not influence frequency of use (7). A study of four states in the US also found no increase in hospital utilisation after the expansion of uncompensated Medicaid; however,

decreased significantly (31). Thus, the specific impact of the NHI might differ based on various circumstances such as the healthcare policies and systems of different nations.

The utilisation of hospital services is a benchmark for the success of a healthcare referral system. Several challenges remain, such as unequal access to services and the accumulation of patients in certain hospitals (2). In Indonesia, the NHI policy aims to ensure equitable access to healthcare for residents in underserved areas (17, 29), including hospitals. The equity aim aligns with Health Law No. 17 of 2023 and Government Regulation No. 78 of 2014 to accelerate the development of underserved areas, emphasising the importance considering primary healthcare needs in underserved areas in healthcare facility development, including but not limited to healthcare financing patterns (32). A significant aspect of this policy is the regulation of healthcare financing, including hospital costs, through the NHI mechanism. In practice, the NHI allows participants, including those residing in underserved areas, to receive services at hospitals participating in the programme (17). The NHI encourages hospitals to expand their reach and improve the quality of healthcare services, including in underserved areas, through incentives and regulations, some of which are accommodated in the Ministry of Health Regulation No. 21 of 2020 on the Ministry of Health's Strategic Plan.

In this study, individuals living in rural areas were less likely to use hospital services than those living in urban areas. Rural areas often require better access because of geography and gaps in the distribution of resources (4). Vietnam have shown that significant strides in healthcare access have been achieved, although urbanrural disparities still exist (6). There are few health workers and healthcare facilities in rural areas, particularly for referral healthcare (4). Patients in rural areas rely mainly on essential healthcare services and cannot receive as much specialised medical care as those in cities where hospitals are better equipped (6). Higher hospital utilisation rates have been observed in cities with better healthcare facilities (33). How well a referral system works depends on how well it can level the playing field regarding healthcare access and handling patient burden. When new rules and funds for healthcare are made, this gap should be prioritised (2).

This study revealed five demographic factors linked to hospital utilisation i.e., age, sex, marital status, education level, and employment utilisation increases position. Healthcare with age (34). Adults are highly susceptible to various chronic illnesses. As they age, they tend to develop multiple diseases (35). In this study, females were less likely to visit hospitals than men. Similar results show that males have a greater hospital utilisation rate because of the influence of economic status and health conditions (36). A South African study reported contrasting results (34). This findings regarding marital status in this study are consistent with a survey conducted in Maluku Province that found hospital utilisation is more common among married or divorced individuals than among single individuals (37, 38). Similar to this study, research in South Africa demonstrated that the higher the education level, the higher the utilisation of health services (34). People with more education use health services more

frequently because they have a better awareness of health-related aspects (39). Educated people devote more attention to health problems and often take preventative actions to improve health outcomes, which reduces utilisation of health services (40). Hospital utilisation was lower among employed individuals than among unemployed individuals. Employed people may be less likely to go to the hospital unless they have to because of work obligations and the risk of losing income or job security that comes with taking time off. Unemployed people may be more stressed, live in poor conditions, or have trouble obtaining healthy foods. These factors can hurt health and cause more people to visit hospitals. People with jobs may do healthier things such as eating well and exercising regularly, which can lower their need for hospital care (41).

This study showed that the wealthier the participants were, the more likely they were to use hospitals. Wealthier individuals can purchase health insurance or pay out-of-pocket for their required treatments and can access medical treatment; others can have financial barriers that prevent access to health services. Wealthy people with higher education levels are more proactive about their health, seeking preventative treatment and undergo regular examinations, which can lead to early disease identification. Affluent people are more likely to utilise hospitals that offer high-quality services, including access to advanced medical equipment (42, 43). Furthermore, research in Ghana found that the advantages derived from commercial and public healthcare services disproportionately favour wealthier individuals over less affluent individuals (44).

#### Strength and Limitation

The study analysed extensive data to present facts on a nationwide scale. However, the study analysed secondary data, which implies that it only considers relevant aspects for examination. Prior research has not investigated supplementary variables associated with hospital utilisation, such as the length and cost of transportation to the hospital and the particular nature of the illness (2, 45–47).

#### Conclusion

The study concluded that NHI membership influenced hospital utilisation in disadvantaged areas in Indonesia. Individuals with NHI

membership were three times more likely to visit hospitals. Therefore, ensuring universal health coverage for those residing in the underprivileged regions of Indonesia is essential for achieving health equity, particularly for accessing the referral healthcare system. The threefold increase in hospital visits among NHI members indicated that having insurance made health care access more equal. This situation is something that policymakers should prioritise when developing health programmes that aim to reduce differences regarding who can receive health care.

# **Availability of Data and Materials**

The data supporting this study's findings are available from the Indonesian Statistics. Nonetheless, restrictions apply to the availability of these data, which were used under licence for the current research and are not publicly available. The data are available to researchers who need it. They can submit a request to Indonesian Statistics via https://silastik.bps.go.id/v3/index.php/site/login/.

# **Acknowledgements**

The authors would like to thank Indonesian Statistics for agreeing to analyse this article's 2023 National Socioeconomic Survey.

### **Ethics of Study**

The National Ethics Committee of the National Research and Innovation Agency has granted permission for this study involving secondary data, classifying it as exempt.

#### **Conflict of Interests**

None.

#### **Funds**

None.

#### **Authors' Contributions**

Conception and design: RDW, LL, ADL Analysis and interpretation of the data: RDW, LL, ADL

Drafting of the article: LL, ADL, WPN, TS, TR,

DY, RM, IA, AK

Critical revision of the article for important intellectual content: RDW, LL, ADL Final approval of the article: RDW, ADL

# Correspondence

Professor Dr. Ratna Dwi Wulandari Faculty of Public Health, Universitas Airlangga Campus C, 60115 Mulyorejo, Surabaya, Indonesia. Tel: +62 31 592 0948

Email: ratna-d-w@fkm.unair.ac.id

#### References

- Handayani PW, Saladdin IR, Pinem AA, Azzahro F, Hidayanto AN, Ayuningtyas D. Health referral system user acceptance model in Indonesia. Heliyon. 2018;4(12):e01048. https://doi.org/10.1016/j.heliyon.2018.e01048
- Skinner L, Wong S, Colla C. Rethinking rurality: using hospital referral regions to investigate ruralurban health outcomes. *BMC Health Serv Res*. 2022;22(1):1–8. https://doi.org/10.1186/s12913-022-08649-0
- 3. Laksono AD, Wulandari RD, Rohmah N, Rukmini R, Tumaji T. Regional disparities in hospital utilisation in Indonesia: a cross-sectional analysis data from the 2018 Indonesian Basic Health Survey. *BMJ Open.* 2023;**13(1)**:e064532. https://doi.org/10.1136/bmjopen-2022-064532
- Wulandari RD, Laksono AD, Nantabah ZK, Rohmah N, Zuardin Z. Hospital utilization in Indonesia in 2018: do urban-rural disparities exist? *BMC Health Serv Res.* 2022;22(1):1-11. https://doi.org/10.1186/s12913-022-07896-5
- 5. Mahmudiono T, Laksono AD. Disparity in the hospitals utilization among regions in Indonesia. *Open Access Maced J Med Sci.* 2021;**9(E)**:1461–1466. https://doi.org/10.3889/oamjms.2021.7304

- Kim JY, Kim DI, Park HY, Pak Y, Tran PNH, Thai TT, et al. Unmet healthcare needs and associated factors in rural and suburban Vietnam: A cross-sectional study. *Int J Environ Res Public Health*. 2020;17(17):1–12. https://doi.org/10.3390/ijerph17176320
- Abu-Bakar A, Samsudin S, Regupathi A, Aljunid S. The effect of health insurance on health care utilization: evidence from Malaysia. In:
   B. Mohamad, editor. Challenge of ensuring research rigor in soft sciences, vol 14. European proceedings of social and behavioural sciences. Future Academy; 2016. pp. 362–368. https://doi.org/10.15405/epsbs.2016.08.51
- 8. Kundu J, Bharadwaz MP, Kundu S, Bansod DW. The interregional disparity in the choice of health care utilization among elderly in India. *Clin Epidemiol Glob Heal*. 2022 Jan;13:100929. https://doi.org/10.1016/j.cegh.2021.100929
- Lwin KZ, Punpuing S. Determinants of institutional maternity services utilization in Myanmar. PLoS One. 2022;17(4): e0266185. https://doi.org/10.1371/journal.pone.0266185
- 10. Galicia-Diez Barroso D, Abeijón-Malvaez LD, Moreno Altamirano GA, Irigoyen-Camacho ME, Finlayson TL, Borges-Yáñez SA. Using the Expanded Andersen Model to determine factors associated with Mexican adolescents' utilization of dental services. *Healthcare*. 2023;11(24): 3159. https://doi.org/10.3390/healthcare11243159
- Nigusie A, Azale T, Yitayal M. Institutional delivery service utilization and associated factors in Ethiopia: a systematic review and META-analysis. *BMC Pregnancy Childbirth*. 2020;20:364. https://doi.org/10.1186/s12884-020-03032-5
- Laksono AD, Wulandari RD, Matahari R. The determinant of health insurance ownership among pregnant women in Indonesia. *BMC Public Health*. 2021;21(1):1538. https://doi.org/10.1186/s12889-021-11577-z
- 13. 1Wulandari RD, Laksono AD. Urban-Rural Disparity: the Utilization of Primary Healthcare Centers Among Elderly in East Java, Indonesia. *J Adm Kesehat Indones*. 2019;7(2):147–154. https://doi.org/10.20473/jaki.v7i2.2019.147-154

- 14. Adyas A. The Indonesian Strategy to Achieve Universal Health Coverage through National Health Insurance System: Its Challenges in Human Resources. Kesmas Natl Public Health J. 2021;16(4):221–227. https://doi.org/10.21109/ kesmas.v16i4.5440
- 15. Wulandari RD, Laksono AD, Mubasyiroh R, Rachmalina R, Ipa M, Rohmah N. Hospital utilization among urban poor in Indonesia in 2018: is government run insurance effective? BMC Public Health. 2023;23:92. https://doi.org/10.1186/s12889-023-15017-y
- The National Social Security Council (DJSN). National Health Insurance Statistics 2016–2021. Jakarta: The National Social Security Council; 2022.
- 17. Laksono A, Nugraheni W, Ipa M, Rohmah N, Wulandari R. The Role of Government-run Insurance in Primary Health Care Utilization: A Cross-Sectional Study in Papua Region, Indonesia, in 2018. Int J Soc Determ Health Health Serv. 2023;53(1):85-93. https://doi.org/10.1177/00207314221129055
- 18. Indonesian Statistics. The 2023 Indonesian Health Statistics Profile (Profil Statistik Kesehatan 2023) [Internet]. Jakarta; 2023. Available from: https://www. bps.go.id/id/publication/2023/12/20/ feffe5519c812d56obb131ca/profil-statistikkesehatan-2023.html
- The Indonesian MOH. The 2018 Indonesian Basic Health Survey. Jakarta: The Indonesian MOH; 2018.
- 20. Wulandari RD, Laksono AD, Prasetyo YB, Nandini N. Socioeconomic Disparities in Hospital Utilization Among Female Workers in Indonesia: A Cross-Sectional Study. J Prim Care Community Health. 2022;13:1–7. https://doi. org/10.1177/21501319211072679
- 21. Nugraheni WP, Hidayat B, Nadjib M, Pambudi ES, Kosen S, Trihandini I, et al. Impact evaluation of national health insurance toward access hospital inpatient care in indonesia. *Indian J Public Health Res Dev.* 2018;9(2):196–200. https://doi.org/10.5958/0976-5506.2018.00118.3

- Firori FA, Wisana IDGK. the Effect of Participation in Jkn on Unmet Needs for Healthcare Services. *Indones J Health Adm.* 2023;11(2):186–195. https://doi.org/10.20473/ jaki.v11i2.2023.186-195
- 23. Maulana N, Soewondo P, Adani N, Limasalle P, Pattnaik A. How Jaminan Kesehatan Nasional (JKN) coverage influences out-of-pocket (OOP) payments by vulnerable populations in Indonesia. PLOS Glob Public Health. 2022;2(7):e0000203. https://doi.org/10.1371/journal.pgph.0000203
- 24. Nugraheni WP, Nuraini S, Hartono RK, Agency I. The Effect of the Covid-19 Pandemic on the Utilization and Catastrophic Costs of National Health Insurance. *Health Sci J Indones*. 2022;**13(1)**:9–16.
- 25. Freeman M, Simmonds J, Parry C. Health promotion: How government can ensure that the National Health Insurance Fund has a fighting chance. *S Afr Med J*. 2020;**110(3)**:188–191. https://doi.org/10.7196/SAMJ.2020.v110i3.14499
- 26. Arifin B. Do Limited-Resource Hospitals Improve Medical Care Utilization in Underdeveloped Areas: Evidence From Mobile Hospitals in Indonesia. Value Health Reg Issues. 2022;30:67– 75. https://doi.org/10.1016/j.vhri.2021.12.002
- 27. Cecilia A, Saeerang DPE, Tasik H. a Comparative Study of Service Quality Before and After the Implementation of Jkn on Private and Public Hospitals. *J EMBA*. 2018;**6(4)**:4043–4052.
- 28. Laksono AD, Rukmini R, Wulandari RD. Regional disparities in antenatal care utilization in Indonesia. *PLoS One.* 2020;**15(2)**:e0224006. https://doi.org/10.1371/journal.pone.0224006
- 29. Wulandari RD, Laksono AD, Rohmah N, Latifah L, Ashar H. Determine The Target to Increase Primary Healthcare Utilization in Indonesia's Disadvantaged Areas. *Indones J Health Adm.* 2023;**11(2)**:299–310. https://doi.org/10.20473/jaki.v11i2.2023.299-310
- 30. Erlangga D, Suhrcke M, Ali S, Bloor K. The impact of public health insurance on health care utilisation, financial protection and health status in low- and middle-income countries: A systematic review. *PLoS One*. 2019;**14(8)**:e0219731. https://doi.org/10.1371/journal.pone.0219731

- 31. Admon AJ, Valley TS, Ayanian JZ, Iwashyna TJ, Cooke CR, Tipirneni R. Trends in Hospital Utilization After Medicaid Expansion. *Med Care*. 2019;**57(4)**: 57(4):312–317. https://doi.org/10.1097/MLR.0000000000001082
- 32. Nugraheni W, Mubasyiroh R, Kusuma R. *The Role of National Health Insurance (JKN) in Reducing the Financial Burden of Childbirth*. Jakarta: Health Policy Plus; 2019.
- 33. Putri LP, O'Sullivan BG, Russell DJ, Kippen R. Factors associated with increasing rural doctor supply in Asia-Pacific LMICs: a scoping review. *Hum Resour Health*. 2020;**18**:93. https://doi. org/10.1186/s12960-020-00533-4
- 34. Abaerei AA, Ncayiyana J, Levin J. Health-care utilization and associated factors in Gauteng province, South Africa. *Glob Health Action*. 2017;**10(1)**:1305765. https://doi.org/10.1080/16549716.2017.1305765
- 35. Atella V, Piano Mortari A, Kopinska J, Belotti F, Lapi F, Cricelli C, et al. Trends in age-related disease burden and healthcare utilization. *Aging Cell.* 2019;**18(1)**:e12861. https://doi.org/10.1111/acel.12861
- 36. You CH, Kwon YD, Kang S. Sex differences in factors affecting hospital outpatient department visits: Korea health panel survey data from 2009 to 2016. *Int J Environ Res Public Health*. 2019;**16(24)**:5028. https://doi.org/10.3390/ijerph16245028
- 37. Sillehu S, Laksono AD, Wulandari RD, Khoiri A. Hospital Utilization in Maluku Province. *Indones J Public Health*. 2023;**18(3)**:470–480. https://doi.org/10.20473/ijph.v18i3.2023.470-480
- 38. Bitew Workie S, Mekonen N, Michael MW, Molla G, Abrha S, Zema Z, et al. Modern Health Service Utilization and Associated Factors among Adults in Southern Ethiopia. *J Environ Public Health*. 2021;2021(1):5–11. https://doi.org/10.1155/2021/8835780
- 39. Ye L, Shia B-C, Fang Y, Lee T-S. Heterogeneous health profiles and healthcare utilization of the middle-aged and elderly with multiple health insurance schemes in China. *Public Health*. 2019;170:61–69. https://doi.org/10.1016/j. puhe.2019.01.011

- 40. Lotfi F, Nouraei Motlagh S, Mahdavi G, Keshavarz K, Hadian M, Abolghasem Gorji H. Factors affecting the utilization of outpatient health services and importance of health insurance. *Shiraz E Med J.* 2017;18(8):e57570. https://doi.org/10.5812/semj.57570
- 41. Li K, Lorgelly P, Jasim S, Morris T, Gomes M. Does a working day keep the doctor away? A critical review of the impact of unemployment and job insecurity on health and social care utilisation. *Eur J Health Econ.* 2023;24:179–186. https://doi.org/10.1007/s10198-022-01468-4
- 42. Pinilla J, López-Valcárcel BG. Income and wealth as determinants of voluntary private health insurance: Empirical evidence in Spain, 2008-2014. *BMC Public Health*. 2020;**20**:1262. https://doi.org/10.1186/s12889-020-09362-5
- 43. Lin SC, Hammond G, Esposito M, Majewski C, Foraker RE, Karen E Joynt Maddox. Segregated Patterns of Hospital Care Delivery and Health Outcomes. *JAMA Health Forum*. 2023;4(11):e234172. https://doi.org/10.1001/jamahealthforum.2023.4172

- 44. Awoke MA, Negin J, Moller J, Farell P, Alfred E, Biritwum RB, et al. Predictors of public and private healthcare utilization and associated health system responsiveness among older adults in Ghana. *Glob Health Action*. 2017;**10(1)**:1301723. https://doi.org/10.1080/16549716.2017.1301723
- 45. Wei Y, Yu H, Geng J, Wu B, Guo Z, He L, et al. Hospital efficiency and utilization of high-technology medical equipment: A panel data analysis. *Health Policy Technol*. 2018;**7(1)**:65–72. https://doi.org/10.1016/j.hlpt.2018.01.001
- 46. Laksono AD, Megatsari H, Senewe FP, Latifah L, Ashar H. Policy to expand hospital utilization in disadvantaged areas in Indonesia: who should be the target? *BMC Public Health*. 2023;23:12. https://doi.org/10.1186/s12889-022-14656-x
- 47. Ipa M, Laksono AD, Wulandari RD. The Role of Travel Time on Hospital Utilization in the Islands Area: A Cross-Sectional Study in the Maluku Region, Indonesia, in 2018. *Indian J Community Med.* 2023;48(2):269–273. https://doi.org/10.4103/ijcm.ijcm\_229\_22