



Cite this research:
Xiang, C; Abouelyazid, M.,(2020). *The Impact of Generational Cohorts and Visit Environment on Telemedicine Satisfaction: A Novel Investigation* SSRAML SageScience, 1(1), 1–15.



Article history:

Received:
April/12/2019
Accepted:
December/08/2020

The Impact of Generational Cohorts and Visit Environment on Telemedicine Satisfaction: A Novel Investigation

Chen Xiang

University of Evansville

Mahmoud Abouelyazid

University of Evansville

Abstract

Background: Telemedicine has gained significant importance in recent years, but the impact of generational cohorts and visit environment on patient satisfaction remains unexplored. This study aims to fill this research gap by empirically investigating the influence of these factors on telemedicine satisfaction.

Methods: A survey was conducted with a sample size of 281 participants. Generational cohorts were categorized as Baby Boomers (born 1946-1964), Generation X (born 1965-1980), Millennials (born 1981-1996), and Generation Z (born 1997-2012). Visit environment was classified as office (1) or home (0). Locally Estimated Scatterplot Smoothing (LOESS) Regression, Multivariate Adaptive Regression Splines (MARS), and Ridge Regression were employed for data analysis. Other variables, such as convenience, accessibility, shorter wait times, technical difficulties, limited physical examination, and type of healthcare service, were included to minimize omitted variable bias.

Results: The regression analysis revealed that Millennials and Generation Z had a positive effect on telemedicine satisfaction, while Generation X had a neutral effect. Younger generations, being digital natives, strongly preferred virtual visits and exhibited higher satisfaction levels. Home environment had a positive impact on satisfaction due to comfort, privacy, and reduced stress, while workplace/office environments had a negative effect due to distractions and reduced privacy. Convenience, accessibility, and shorter wait times positively influenced satisfaction, while technical difficulties and limited physical examination had negative effects.

Conclusion: This study highlights the significant impact of generational cohorts and visit environment on telemedicine satisfaction. Healthcare providers should consider these factors when designing and delivering telemedicine services to optimize patient satisfaction. Further research is needed to explore the long-term implications of these findings and to develop targeted interventions for enhancing telemedicine experiences across different generations and visit environments.

Keywords: Generational cohorts, Patient satisfaction, Telemedicine, Visit environment, Younger generations

Introduction

In recent years, telemedicine has experienced a significant rise. This growth can be attributed to several key factors, including technological advancements, increased

accessibility and convenience[1]. Technological advancements have played an important role in the rise of telemedicine. The widespread availability of high-speed internet, smartphones, and tablets has made it possible for patients to connect with healthcare providers remotely, eliminating the need for in-person visits. The development of secure video conferencing platforms, electronic health record systems, and remote monitoring devices has further enhanced the capabilities of telemedicine, enabling healthcare providers to offer a wide range of services, from consultations and diagnoses to treatment planning and follow-up care [2], [3].

Moreover, telemedicine has greatly increased accessibility and convenience for patients. Telemedicine has made it easier for individuals living in remote or underserved areas to access quality healthcare services by eliminating the need to travel to a healthcare facility. Patients with mobility issues, transportation challenges, or busy schedules can now receive care from the comfort of their own homes, saving time and reducing the burden of attending in-person appointments. Additionally, telemedicine has the potential to reduce wait times and improve the efficiency of healthcare delivery, as providers can see more patients in a given timeframe. The COVID-19 pandemic has further accelerated the adoption of telemedicine. As social distancing measures and stay-at-home orders were implemented to curb the spread of the virus, many healthcare providers quickly pivoted to offering telemedicine services to ensure continuity of care for their patients. Patients, in turn, embraced telemedicine as a safer alternative to in-person visits, reducing their risk of exposure to the virus. The pandemic has highlighted the value of telemedicine in maintaining access to healthcare services during a public health crisis and has catalyzed a shift in attitudes towards virtual care, with many patients and providers now recognizing its benefits and expressing a desire to continue using telemedicine beyond the pandemic.

Patient satisfaction is a key indicator of the quality of care delivered and has been shown to have a significant impact on health outcomes, patient retention and loyalty, and healthcare provider reputation [4], [5]. Numerous studies have established a strong link between patient satisfaction and health outcomes. Patients who are satisfied with their healthcare experiences are more likely to adhere to treatment plans, engage in preventive care, and communicate openly with their providers about their health concerns. This increased engagement and compliance can lead to better management of chronic conditions, improved recovery from illnesses or injuries, and overall better health outcomes. On the other hand, dissatisfied patients may be less likely to follow through with recommended treatments or to seek necessary care, potentially leading to adverse health consequences.

In competitive healthcare market, patients have more choices than ever when it comes to selecting healthcare providers. Satisfied patients are more likely to continue seeking care from the same provider or healthcare organization, leading to increased patient retention. They are also more likely to recommend their provider to family and friends, helping to attract new patients through positive word-of-mouth referrals. Conversely, dissatisfied patients may choose to switch providers or healthcare organizations, resulting in loss of revenue and potential reputational damage. Healthcare provider reputation is closely tied to patient satisfaction. In the era of online reviews and social media, patients

have a powerful platform to share their experiences with a wide audience. Positive patient experiences and high levels of satisfaction can contribute to a strong, positive reputation for healthcare providers, attracting new patients and fostering trust within the community [6]. On the other hand, negative patient experiences and low satisfaction levels can quickly damage a provider's reputation, leading to decreased patient volumes and potential financial losses. In an increasingly value-based healthcare, patient satisfaction is also becoming a key metric for evaluating provider performance and determining reimbursement rates from payers.

Generational cohorts are groups of individuals born within a similar timeframe who share common life experiences, values, and characteristics shaped by the historical, social, and cultural context of their formative years. Understanding the distinct characteristics of each generational cohort is necessary for healthcare providers seeking to tailor their services and communication strategies to meet the unique needs and preferences of their patients.

Baby Boomers, born between 1946 and 1964, are the oldest of the four cohorts discussed in this study. They are characterized by their strong work ethic, loyalty to employers, and respect for authority. Baby Boomers value face-to-face communication and may be less comfortable with technology compared to younger generations. They prioritize quality and personalized care and may have higher expectations for the patient-provider relationship.

Generation X, born between 1965 and 1980, is known for their independence, adaptability, and skepticism towards authority. They have witnessed the rise of personal computers and the internet, making them more tech-savvy than Baby Boomers. Generation X values efficiency, convenience, and a balance between work and family life. They appreciate straightforward communication and may be more open to alternative healthcare approaches.

Millennials, born between 1981 and 1996, are the first generation to grow up with widespread access to digital technology. They are characterized by their comfort with technology, desire for customization and personalization, and value for transparency and authenticity. Millennials prioritize convenience, flexibility, and on-demand services. They are more likely to seek out health information online and may prefer digital communication channels with their healthcare providers.

Generation Z, born between 1997 and 2012, is the youngest cohort and the first to be considered true "digital natives." They have grown up in a world of smartphones, social media, and instant access to information. Generation Z values diversity, inclusivity, and social responsibility. They are highly adept at using technology and may prefer virtual or AI-assisted healthcare services. This generation prioritizes mental health and well-being and may seek out healthcare providers who offer holistic, personalized approaches to care.

The visit environment impacts patients' healthcare experiences, both in traditional in-person settings and in the context of telemedicine. The environment in which a patient

receives care can significantly impact their comfort, privacy [7], communication, and overall satisfaction with the healthcare service. In healthcare settings, patient comfort and privacy are key considerations. A welcoming, clean, and well-designed environment can help patients feel at ease, reducing anxiety and promoting a positive mindset. Privacy is also essential, as patients may need to discuss sensitive health information or undergo physical examinations. In the context of telemedicine, the visit environment can impact patient comfort and privacy in unique ways. Home-based telemedicine visits, for example, may offer a greater sense of comfort and familiarity for patients, as they are able to receive care in a setting that is personal and convenient. However, home environments may also present challenges related to privacy if patients live with others or have limited space for a confidential conversation.

The visit environment can also influence communication and engagement between patients and healthcare providers. In traditional in-person settings, factors such as lighting, noise levels, and room layout can impact the quality of communication and the ability of patients and providers to engage in meaningful discussions. In telemedicine, the visit environment may present additional challenges related to technology, such as audio and video quality, internet connectivity, and the ability to establish eye contact and read nonverbal cues.

Telemedicine visit environments can take several forms, each with its own potential impact on patient satisfaction. Home-based visits, as mentioned earlier, offer convenience and comfort but may present privacy challenges. Office-based telemedicine visits, where patients receive care from a healthcare provider's office or clinic via video conferencing, may offer a more structured and professional environment but may lack the convenience and familiarity of home-based visits. Other potential telemedicine environments, such as community centers or pharmacies, may offer a blend of convenience and professional support but may also present challenges related to privacy and technical infrastructure.

The impact of visit environment on telemedicine satisfaction is an important consideration for healthcare providers and researchers. Patients' perceptions of the visit environment may influence their overall satisfaction with the telemedicine experience, as well as their willingness to engage in future telemedicine visits. Factors such as comfort, privacy, communication quality, and technical reliability may all contribute to patient satisfaction in different telemedicine environments. Understanding the unique challenges and opportunities presented by each type of visit environment can help healthcare providers design and deliver telemedicine services that optimize patient satisfaction and outcomes. Providers can tailor their telemedicine offerings to create the most satisfying and effective care experiences possible by considering the preferences and needs of different patient populations, such as generational cohorts.

Research gap and Novelty

There is currently a limited body of research examining the combined impact of generational cohorts and visit environment on patient satisfaction with telemedicine services [8]–[11]. While some studies have explored the influence of age or technology

adoption on telemedicine perceptions, few have taken an approach to understanding how the unique characteristics and preferences of different generations, along with the specific context of the telemedicine visit environment, may shape patient satisfaction [12]–[14]. This research gap highlights the need for empirical evidence to guide the design and delivery of telemedicine services that are tailored to the needs and expectations of diverse patient populations.

To address this research gap, the present study aims to investigate the influence of generational cohorts on telemedicine satisfaction, examining how the distinct values, attitudes, and technology preferences of Baby Boomers, Generation X, Millennials, and Generation Z may impact their experiences with virtual care. Additionally, the study seeks to explore the impact of visit environment on telemedicine satisfaction, comparing patient perceptions of home-based visits, office-based visits, and other potential telemedicine settings. This study aims to provide a more understanding of the factors that contribute to telemedicine satisfaction by considering the interaction between generational cohorts and visit environment.

The study will identify and examine other key factors that may influence patient satisfaction with telemedicine, such as convenience, accessibility, technical difficulties, and the quality of communication and engagement with healthcare providers. This study aims to inform the design and delivery of targeted telemedicine interventions by taking a detailed approach to understanding the drivers of telemedicine satisfaction.

This research can help healthcare providers, policymakers, and technology developers to design and implement telemedicine services that are more closely aligned with the needs and preferences of different patient populations by providing empirical evidence on the impact of generational cohorts and visit environment on patient perceptions and experiences. This, in turn, can lead to improved patient satisfaction, increased adoption and utilization of telemedicine services, and ultimately, better health outcomes.

The findings of this study can inform the development of targeted telemedicine interventions that are tailored to the unique characteristics and needs of different generational cohorts and visit environments. For example, providers may use the insights gained from the findings of this research to develop telemedicine platforms and communication strategies that are more engaging and user-friendly for older generations, or to create home-based telemedicine protocols that prioritize patient comfort and privacy. Healthcare organizations can create more effective and patient-centered virtual care experiences by using a deeper understanding of the factors that drive telemedicine satisfaction.

This study has implications for improving patient experiences and health outcomes in healthcare delivery. As telemedicine becomes an increasingly integral part of modern healthcare systems, it is to ensure that virtual care services are designed and delivered in a way that maximizes patient satisfaction, engagement, and trust. This study can help to promote the development of high-quality, patient-centered telemedicine services that

have the potential to transform healthcare access, efficiency, and effectiveness for generations to come by contributing to the evidence base on telemedicine satisfaction and its key drivers.

Methods

1. To investigate Generational differences in telemedicine satisfaction

Following Dummy variables used:

Baby Boomers (born 1946-1964)

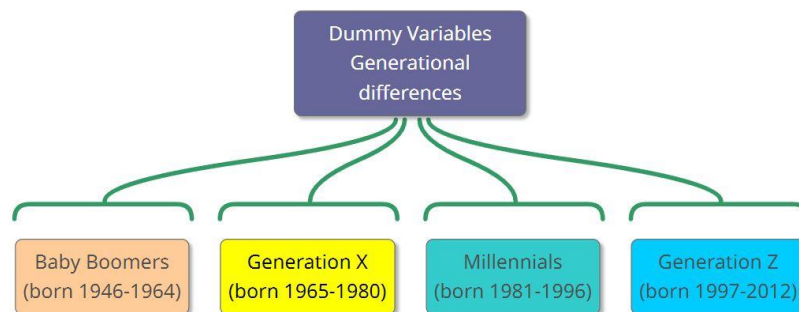
Generation X (born 1965-1980)

Millennials (born 1981-1996)

Generation Z (born 1997-2012)

Where, Baby Boomers (born 1946-1964) group is used as reference group. To avoid dummy variable trap.

Figure 1. Dummy variables used to investigate generational differences in telemedicine satisfaction



2. To investigate the influence of telemedicine, visit environment on satisfaction

To Investigate how the patient's physical environment during a telemedicine visit (e.g., home, workplace, public space) affects their satisfaction with the encounter. to determine the relationship between visit location and satisfaction, considering factors such as privacy, comfort, and distractions.

Dummy variable: Office =1, home=0

3. other variables used to minimize omitted variable bias:

- Convenience
- Accessibility
- Shorter wait times
- Technical difficulties

- Limited physical examination
- Type of healthcare service

Data

Data for this study were collected through a survey administered to a sample of 281 participants. The survey was designed to gather information on participants' demographic characteristics, including their generational cohort (Baby Boomers, Generation X, Millennials, or Generation Z), as well as their experiences with telemedicine services. Participants were asked to provide details about their most recent telemedicine visit, including the visit environment (office or home), and to rate their satisfaction with various aspects of the telemedicine experience, such as convenience, accessibility, wait times, technical difficulties, and the quality of the physical examination. Additionally, participants were asked about the type of healthcare service they received through telemedicine. The survey was distributed through various channels, such as online platforms and healthcare provider networks, to ensure a diverse and representative sample. The collected data were then cleaned, coded, and prepared for statistical analysis using techniques such as LOESS Regression, MARS, and Ridge Regression, while controlling for potential confounding variables to minimize omitted variable bias.

Estimation methods

Locally Estimated Scatterplot Smoothing (LOESS) Regression, Multivariate Adaptive Regression Splines (MARS), Ridge Regression have been used to obtain the empirical results.

Results from the regression analysis

Locally Estimated Scatterplot Smoothing (LOESS)

The results presented are from a Locally Estimated Scatterplot Smoothing (LOESS) regression analysis, which investigates the relationship between the dependent variable "SATISFACTION" and several independent variables. The sample size for this analysis is 281 observations. The findings indicate that the independent variables ACCESSIBILITY, CONVENIENCE, ENV, GENZ, MILLENNIALS, and WAIT have positive and statistically significant coefficients (p -values < 0.05), suggesting that they positively influence SATISFACTION. On the other hand, the variables PHYSICAL and TECHNICAL have negative and statistically significant coefficients, implying that they negatively affect SATISFACTION. The variables GENX and TYPES do not have statistically significant coefficients (p -values > 0.05), indicating that they do not significantly impact SATISFACTION.

The R-squared value of 0.653826 suggests that approximately 65.38% of the variation in SATISFACTION can be explained by the independent variables included in the model. The adjusted R-squared value of 0.641005, which accounts for the number of independent variables in the model, provides a more conservative estimate of the model's explanatory power. The F-statistic of 50.99543 and its corresponding p -value of 0.000000 indicate that the overall model is statistically significant. Furthermore, the Durbin-Watson statistic of

1.995365 is close to 2, suggesting that there is likely no significant autocorrelation in the residuals.

Table 1.

Dependent Variable: SATISFACTION
 Method: Locally Estimated Scatterplot Smoothing (LOESS)
 Regression
 Sample: 1 281
 Included observations: 281

| Variable | Coefficient | Std. Error | t-Statistic | Prob. |
|--------------------|-------------|-----------------------|-------------|--------|
| ACCESSIBILITY | 1.064157 | 0.129232 | 8.234486 | 0.0000 |
| CONVENIENCE | 1.018078 | 0.122389 | 8.318384 | 0.0000 |
| ENV | 0.894448 | 0.124153 | 7.204376 | 0.0000 |
| GENX | -0.120668 | 0.118370 | -1.019414 | 0.3089 |
| GENZ | 1.062341 | 0.131294 | 8.091330 | 0.0000 |
| MILLENNIALS | 1.027764 | 0.129640 | 7.927832 | 0.0000 |
| PHYSICAL | -1.102944 | 0.119489 | -9.230498 | 0.0000 |
| TECHNICAL | -1.003312 | 0.119551 | -8.392312 | 0.0000 |
| TYPES | 0.080259 | 0.122119 | 0.657220 | 0.5116 |
| WAIT | 1.181713 | 0.125718 | 9.399711 | 0.0000 |
| C | 0.959087 | 0.210029 | 4.566443 | 0.0000 |
| R-squared | 0.653826 | Mean dependent var | 2.959863 | |
| Adjusted R-squared | 0.641005 | S.D. dependent var | 0.977824 | |
| S.E. of regression | 0.585875 | Akaike info criterion | 1.806940 | |
| Sum squared resid | 92.67749 | Schwarz criterion | 1.949366 | |
| Log likelihood | -242.8750 | Hannan-Quinn criter. | 1.864061 | |
| F-statistic | 50.99543 | Durbin-Watson stat | 1.995365 | |
| Prob(F-statistic) | 0.000000 | | | |

The table 2 presents the Variance Inflation Factors (VIF) for the independent variables included in the regression model. VIF is a measure of multicollinearity, which occurs when independent variables are highly correlated with each other. High VIF values (typically greater than 5 or 10) indicate the presence of multicollinearity, which can affect the interpretation of the regression coefficients and the model's stability.

Figure 2. Residual analysis for Locally Estimated Scatterplot Smoothing (LOESS)

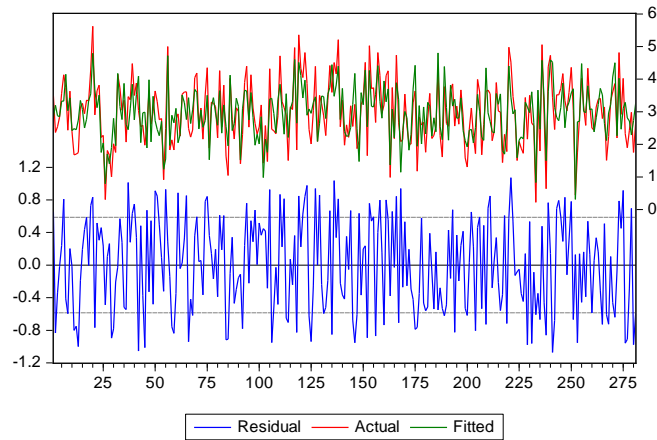
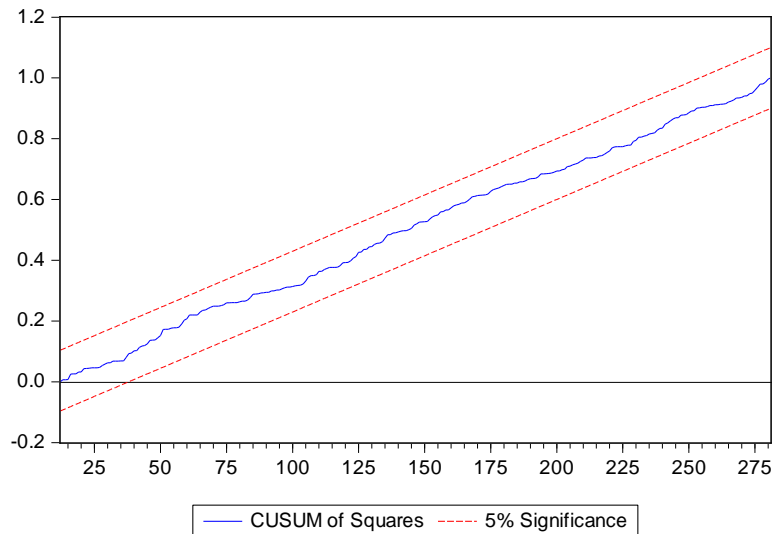


Figure 3. Stability analysis for Locally Estimated Scatterplot Smoothing (LOESS)



In this case, the centered VIF values for all the independent variables are close to 1, ranging from 1.016960 to 1.079140. These low values suggest that there is no significant multicollinearity among the independent variables. This means that each independent variable provides unique information to the model and does not have a strong linear relationship with the other independent variables.

The uncentered VIF values are higher than the centered VIF values, but this is expected as the uncentered VIF includes the constant term (intercept) in the calculation. The constant term often has a high uncentered VIF value, as it is not centered around zero like the other variables. In this case, the uncentered VIF for the constant term (C) is 36.11236, which is not a concern since it does not affect the interpretation of the coefficients for the independent variables.

Table 2.

Variance Inflation Factors
 Date: 04/18/24 Time: 20:27
 Sample: 1 281
 Included observations: 281

| Variable | Coefficient Variance | Uncentered VIF | Centered VIF |
|---------------|----------------------|----------------|--------------|
| ACCESSIBILITY | 0.016701 | 4.673683 | 1.046936 |
| CONVENIENCE | 0.014979 | 4.106008 | 1.022522 |
| ENV | 0.015414 | 4.106547 | 1.021634 |
| GENX | 0.014011 | 3.770363 | 1.018900 |
| GENZ | 0.017238 | 4.111803 | 1.037335 |
| MILLENNIALS | 0.016807 | 4.762755 | 1.079140 |
| PHYSICAL | 0.014278 | 3.958787 | 1.024586 |
| TECHNICAL | 0.014293 | 4.213096 | 1.027757 |
| TYPES | 0.014913 | 3.974722 | 1.025590 |
| WAIT | 0.015805 | 4.006532 | 1.016960 |
| C | 0.044112 | 36.11236 | NA |

Adaptive Regression Splines (MARS)

The Multivariate Adaptive Regression Splines (MARS) analysis, detailed in Table 3, elucidates the factors influencing satisfaction levels among the 281 observations included in the sample. Utilizing Huber Type I standard errors and covariance estimation alongside M-estimation, the analysis employs Bisquare weighting with a tuning parameter of 4.685 and a scale based on the Median Absolute Deviation (MAD). The results highlight significant coefficients for several variables, notably accessibility, convenience, environmental factors (ENV), generation Z (GENZ), millennials, and wait time, all demonstrating positive associations with satisfaction levels. Conversely, physical and technical factors exhibit negative coefficients, indicating that improvements in these areas may correspond to decreased satisfaction.

Generation X (GENX) and TYPES display non-significant coefficients. Performance statistics shows the robustness of the model, with an R-squared of 58.97%, indicating that the model explains a substantial portion of the variance in satisfaction. Adjusted R-squared and other metrics further support the model's goodness-of-fit. Additionally, the Rw-squared statistic and associated p-value emphasize the model's overall significance. The mean dependent variable (satisfaction) remains consistent at approximately 2.96, with a standard deviation of 0.98. The scale of 0.747 and the deviance of 88.25 indicate the model's efficacy in capturing the data's variability.

Table 3.

Dependent Variable: SATISFACTION
 Method: Multivariate Adaptive Regression Splines (MARS)
 Date: 04/18/24 Time: 20:19
 Sample: 1 281
 Included observations: 281
 Method: M-estimation
 M settings: weight=Bisquare, tuning=4.685, scale=MAD (median centered)

Huber Type I Standard Errors & Covariance

| Variable | Coefficient | Std. Error | z-Statistic | Prob. |
|---------------|-------------|------------|-------------|--------|
| ACCESSIBILITY | 1.066184 | 0.138736 | 7.684976 | 0.0000 |
| CONVENIENCE | 1.016210 | 0.131390 | 7.734297 | 0.0000 |
| ENV | 0.884898 | 0.133284 | 6.639175 | 0.0000 |
| GENX | -0.126533 | 0.127075 | -0.995731 | 0.3194 |
| GENZ | 1.059978 | 0.140950 | 7.520250 | 0.0000 |
| MILLENNIALS | 1.018186 | 0.139174 | 7.315900 | 0.0000 |
| PHYSICAL | -1.112751 | 0.128277 | -8.674597 | 0.0000 |
| TECHNICAL | -0.996674 | 0.128344 | -7.765658 | 0.0000 |
| TYPES | 0.084202 | 0.131100 | 0.642275 | 0.5207 |
| WAIT | 1.203009 | 0.134964 | 8.913548 | 0.0000 |
| C | 0.963217 | 0.225476 | 4.271927 | 0.0000 |

Performance Statistics I

| | | | |
|-----------------------|----------|------------------------|----------|
| R-squared | 0.589750 | Adjusted R-squared | 0.574555 |
| Rw-squared | 0.664938 | Adjust Rw-squared | 0.664938 |
| Akaike info criterion | 170.7285 | Schwarz criterion | 220.1173 |
| Deviance | 88.25168 | Scale | 0.747140 |
| Rn-squared statistic | 444.1120 | Prob(Rn-squared stat.) | 0.000000 |

Performance Statistics II

| | | | |
|--------------------|----------|--------------------|----------|
| Mean dependent var | 2.959863 | S.D. dependent var | 0.977824 |
| S.E. of regression | 0.585939 | Sum squared resid | 92.69774 |

Figure 4. confidence ellipses for Adaptive Regression Splines (MARS)

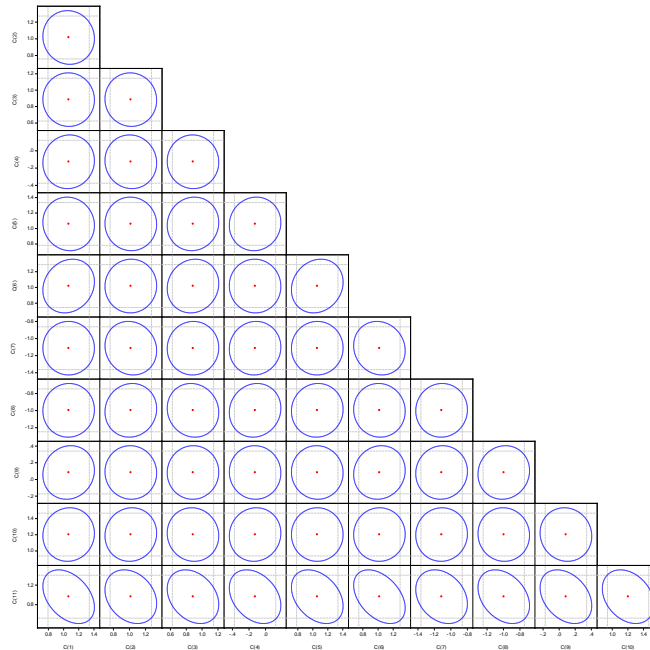
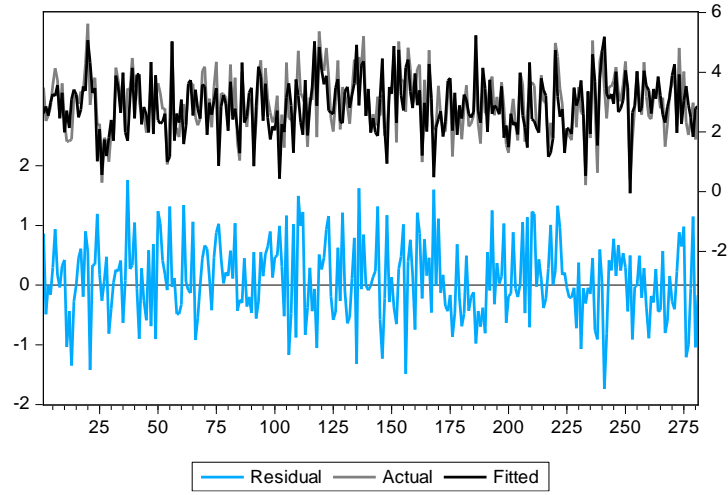


Figure 5. residual analysis for Adaptive Regression Splines (MARS)



Ridge Regression

The results from the ridge regression analysis, as presented in Table 4. The model employed Huber Type I standard errors and covariance estimation. Notably, variables such as accessibility, convenience, generation X (GENX), generation Z (GENZ), millennials, and wait time demonstrated statistically significant coefficients, indicating their substantial impact on satisfaction.

Specifically, accessibility, convenience, GENZ, millennials, and wait time exhibited positive coefficients, suggesting that as these factors increase, satisfaction levels also tend to increase. Conversely, physical factors and technical aspects displayed negative coefficients, implying that improvements in these areas may lead to lower satisfaction levels.

The coefficient for environmental factors (ENV) did not reach statistical significance. Performance statistics indicate that the model explains approximately 33.6% of the variance in satisfaction, with an adjusted R-squared of 31.1%. The mean dependent variable (satisfaction) was approximately 2.96, with a standard deviation of 0.98. The model's performance is further supported by a relatively low scale of 0.691 and a deviance of 0.478. Additionally, the Rn-squared statistic of 135.9745 and its associated p-value of 0.000 indicate the model's overall significance. The standard error of regression was 0.673, and the sum of squared residuals amounted to 122.3505, reflecting the model's fit to the data.

Table 4.

Dependent Variable: SATISFACTION

Method: Ridge Regression

Sample: 1 281

Included observations: 281

S settings: tuning=1.547645, breakdown=0.5, trials=200, subsmpl=11,

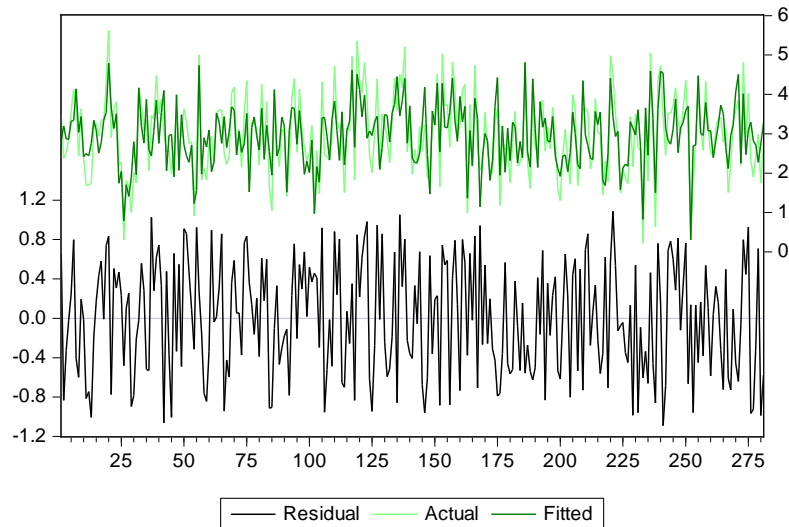
refine=2, compare=5
 Random number generator: rng=kn, seed=1075781712
 Huber Type I Standard Errors & Covariance

| Variable | Coefficient | Std. Error | z-Statistic | Prob. |
|---------------|-------------|------------|-------------|--------|
| ACCESSIBILITY | 1.349025 | 0.298334 | 4.521866 | 0.0000 |
| CONVENIENCE | 0.858402 | 0.282537 | 3.038195 | 0.0024 |
| ENV | 0.434665 | 0.286610 | 1.516572 | 0.1294 |
| GENX | 0.117317 | 0.273259 | 0.429326 | 0.6677 |
| GENZ | 1.367272 | 0.303094 | 4.511052 | 0.0000 |
| MILLENNIALS | 1.221940 | 0.299276 | 4.082984 | 0.0000 |
| PHYSICAL | -1.366550 | 0.275843 | -4.954092 | 0.0000 |
| TECHNICAL | -0.859840 | 0.275986 | -3.115517 | 0.0018 |
| TYPES | -0.220980 | 0.281913 | -0.783859 | 0.4331 |
| WAIT | 1.978767 | 0.290222 | 6.818108 | 0.0000 |
| C | 0.491228 | 0.484856 | 1.013141 | 0.3110 |

| Performance Statistics I | | | |
|--------------------------|----------|------------------------|----------|
| R-squared | 0.335855 | Adjusted R-squared | 0.311257 |
| Scale | 0.691035 | Deviance | 0.477530 |
| Rn-squared statistic | 135.9745 | Prob(Rn-squared stat.) | 0.000000 |

| Performance Statistics II | | | |
|---------------------------|----------|--------------------|----------|
| Mean dependent var | 2.959863 | S.D. dependent var | 0.977824 |
| S.E. of regression | 0.673164 | Sum squared resid | 122.3505 |

Figure 6. residual analysis for Ridge Regression



Findings and discussion

Generation X, born between 1965 and 1980, has shown a neutral effect on telemedicine satisfaction. Compared to Baby Boomers, they are more tech-savvy and appreciate the

flexibility and time-saving aspects of telemedicine. However, they still prefer in-person visits for major health issues, while finding telemedicine suitable for routine care. Although they have relatively high satisfaction levels, some members of Generation X have expressed frustration with technical difficulties encountered during telemedicine visits.

Millennials, born between 1981 and 1996, have demonstrated a positive effect on telemedicine satisfaction. As digital natives, they are very comfortable with technology and virtual communication. They prefer the convenience, speed, and 24/7 access that telemedicine visits offer. Having grown up with instant access to information and services, Millennials expect the same level of accessibility from their healthcare providers. As a result, they have high satisfaction levels and view telemedicine very favorably.

Generation Z, born between 1997 and 2012, has also shown a positive effect on telemedicine satisfaction. They are true digital natives who have never known life without the internet and smartphones. This generation strongly prefers virtual visits and digital health tools over in-person doctor visits. They are the most likely generation to utilize telemedicine and be satisfied with the experience. However, one potential concern is their shorter attention spans, which may affect their adherence to virtual care plans.

Younger generations tend to view telemedicine much more positively than older generations and have higher satisfaction levels. However, most generations have neutral to positive views on telemedicine as virtual care has become more prevalent. The convenience factor is appreciated by all age groups, regardless of their generation. It is likely that satisfaction levels will continue to rise across all generations, with younger generations leading the way in embracing and utilizing virtual healthcare services.

The visit environment plays a significant role in shaping patients' telemedicine experiences and satisfaction levels. Home environments have been shown to have a positive effect on telemedicine satisfaction due to several factors. Patients are able to experience the comfort and familiarity of their own space, which can help them feel more relaxed and at ease during the virtual visit. Conducting telemedicine visits from home also reduces the stress associated with traveling to a clinical setting and waiting in a potentially crowded or uncomfortable waiting room. Additionally, home environments offer increased privacy compared to public spaces, allowing patients to discuss sensitive health matters without fear of being overheard. This increased sense of privacy can lead to more open and honest communication between patients and providers. Finally, being in a familiar home environment may allow patients to better focus on the telemedicine visit without external distractions, leading to a more engaging and productive healthcare experience.

On the other hand, conducting telemedicine visits from the workplace or office has been shown to have a negative effect on patient satisfaction. In professional settings, patients may be more susceptible to distractions or interruptions from work-related matters, which can disrupt the flow of the telemedicine visit and reduce the quality of the interaction. Privacy concerns are also heightened in workplace environments, as patients may feel uncomfortable discussing personal health matters in a setting where colleagues

or supervisors could potentially overhear. This lack of privacy can lead to patients holding back important information or feeling less engaged in the visit. Additionally, the blending of professional and personal matters in a workplace setting may create feelings of awkwardness or discomfort for some patients, further reducing their satisfaction with the telemedicine experience. The visit environment can have a significant impact on telemedicine satisfaction, with home environments generally having a positive effect and workplace environments having a negative effect. Healthcare providers should take these factors into consideration when designing and implementing telemedicine services, and should strive to create virtual care experiences that prioritize patient comfort, privacy, and engagement. Providers can tailor their telemedicine offerings to meet the needs and preferences of their patients, ultimately leading to higher levels of satisfaction and better health outcomes, by understanding the unique challenges and opportunities presented by different visit environments.

Telemedicine satisfaction is influenced by a multitude of factors, some of which have a positive impact, while others have a negative or neutral effect. Among the positive factors, convenience stands out as a significant advantage of telemedicine. Telemedicine saves patients time and effort, making it easier to access care, by eliminating the need for them to physically travel to healthcare facilities. This is beneficial for patients with mobility issues, transportation challenges, or busy schedules. Additionally, telemedicine improves accessibility to healthcare services for patients residing in remote or underserved areas where traditional healthcare facilities may be limited or absent. This increased access to care can lead to better health outcomes and higher patient satisfaction. Moreover, telemedicine appointments often have shorter wait times compared to in-person visits, as patients can avoid the time spent in waiting rooms and can be seen more quickly by providers.

Telemedicine also has some negative factors that can impact patient satisfaction. Technical difficulties, such as poor internet connectivity, subpar audio/video quality, or patients' unfamiliarity with technology, can lead to frustration and dissatisfaction with the telemedicine experience. These technical issues can disrupt the flow of the visit, making communication more challenging and less effective. Furthermore, the limited ability to perform physical examinations during telemedicine visits may raise concerns among patients about the accuracy of diagnoses and the appropriateness of treatment plans. This lack of physical interaction can also impact the patient-provider relationship, as some patients may feel less connected to their provider in a virtual setting.

There are also neutral factors that can influence telemedicine satisfaction, such as the type of healthcare service being provided. Patient satisfaction may vary depending on the specific nature of the telemedicine visit. For example, mental health counseling, dermatology consultations, or post-operative follow-ups may be well-suited to telemedicine and result in high patient satisfaction. On the other hand, visits that require more hands-on physical assessments or procedures may be less satisfactory when conducted virtually.

Understanding these positive, negative, and neutral factors is crucial for healthcare providers looking to design and implement effective telemedicine services. Providers can create telemedicine experiences that prioritize patient satisfaction and engagement by using the positive aspects, such as convenience and accessibility, while addressing the negative factors, such as technical difficulties and limitations in physical examinations. Additionally, by considering the neutral factors and tailoring telemedicine services to the specific needs and preferences of different patient populations and healthcare contexts, providers can further optimize the virtual care experience and drive better health outcomes.

Conclusion

To improve patient satisfaction and optimize the telemedicine experience for different generational cohorts and visit environments, healthcare providers, policymakers, and telemedicine platform developers should implement targeted strategies. Telemedicine platforms should be tailored to generational preferences, with user-friendly interfaces for Baby Boomers, flexibility-focused features for Generation X, and mobile-friendly, personalized content for Millennials and Generation Z. Offering training and support for patients, such as online tutorials, live technical assistance, and in-person training sessions, can help bridge the digital literacy gap and ensure that all patients can effectively use telemedicine services.

Investing in reliable, high-quality telemedicine infrastructure is needed for minimizing technical disruptions and protecting patient privacy. This includes implementing robust security measures, optimizing audio and video quality, and collaborating with stakeholders to expand broadband access in underserved areas. Healthcare providers should also develop guidelines for optimal home telemedicine environments, offering patients tips and resources for setting up comfortable, private spaces and troubleshooting technical issues. Additionally, enhancing provider training and communication skills, with a focus on adapting to the preferences and needs of different generational cohorts, can foster trust and improve the overall telemedicine experience.

Implementing hybrid care models and triage protocols can help healthcare organizations identify which types of services and patient needs are best suited for telemedicine versus in-person visits. Providers can ensure continuous improvement and adapt to the evolving needs of their patients by offering a combination of virtual and in-person care options and regularly assessing patient feedback and satisfaction data. Finally, promoting telemedicine awareness and education through public campaigns, collaborations with community organizations, and provider-patient discussions can increase adoption and utilization of virtual care services.

Healthcare organizations can create personalized telemedicine experiences that cater to the unique needs and preferences of different generational cohorts and visit environments by implementing these specific strategies and policies. This targeted approach can improve patient satisfaction, increase the adoption and utilization of telemedicine services.

References

- [1] B. McGrath, Ed., "Telemedicine and telehealth," Hayle Medical, 2019.
- [2] M. J. Elson *et al.*, "Telemedicine for Parkinson's disease: Limited engagement between local clinicians and remote specialists," *Telemed. J. E. Health.*, vol. 24, no. 9, pp. 722–724, Sep. 2018.
- [3] K. Kempf *et al.*, "Telemedical coaching improves long-term weight loss in overweight persons: A randomized controlled trial," *Int. J. Telemed. Appl.*, vol. 2018, p. 7530602, Sep. 2018.
- [4] D. L. Drury *et al.*, "Patient satisfaction measurement in occupational and Environmental Medicine practice," *J. Occup. Environ. Med.*, vol. 60, no. 5, pp. e227–e231, May 2018.
- [5] S. Miah, "Audit of patient satisfaction with upper limb regional blockade in a tertiary referral hand trauma centre," 06-Sep-2018.
- [6] . S. and R. I. L., "Analysis of the influence of service quality and hospital image on inpatient loyalty with patient satisfaction as intervening variable," *Int. Adv. Res. J. Sci. Eng. Technol.*, vol. 5, no. 9, pp. 75–83, Sep. 2018.
- [7] A. K. Saxena, "Balancing Privacy, Personalization, and Human Rights in the Digital Age," *Eigenpub Review of Science and Technology*, vol. 4, no. 1, pp. 24–37, 2020.
- [8] K. A. Poulsen, C. M. Millen, and U. I. Lakshman, "Satisfaction with rural rheumatology telemedicine service," *Aquat. Microb. Ecol.*, 2015.
- [9] I. H. Kraai, M. L. A. Luttik, R. M. de Jong, and T. Jaarsma, "Heart failure patients monitored with telemedicine: patient satisfaction, a review of the literature," *Journal of cardiac*, 2011.
- [10] Y. M. Chae, J. H. Lee, S. H. Ho, H. J. Kim, and K. H. Jun, "Patient satisfaction with telemedicine in home health services for the elderly," *International journal of*, 2001.
- [11] K. Collins, P. Nicolson, and I. Bowns, "Patient satisfaction in telemedicine," *Health Informatics J.*, 2000.
- [12] K. A. Martinez, M. Rood, N. Jhangiani, and L. Kou, "Patterns of use and correlates of patient satisfaction with a large nationwide direct to consumer telemedicine service," *Journal of general*, 2018.
- [13] P. S. Whitten and F. Mair, "Telemedicine and patient satisfaction: current status and future directions," *Telemed. J. E. Health.*, vol. 6, no. 4, pp. 417–423, Winter 2000.
- [14] S. S. Gustke, D. C. Balch, V. L. West, and L. O. Rogers, "Patient satisfaction with telemedicine," *Telemed. J.*, 2000.