# Factors Affecting Patients' Acceptance of and Satisfaction with Cloud-Based Telehealth for Chronic Disease Management: A Case Study in the Workplace

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# Abstract

**Objective** Understanding patients' acceptance of and satisfaction with telehealth use is important for workplace health promotion. In this study, we used a questionnaire to measure patients' usage behavior and satisfaction with cloud-based telehealth services in the workplace. We empirically investigated the factors that influence patients' usage and satisfaction based on data collected from 101 participants.

**Methods** As its main research framework, this study utilized a revised version of the technology acceptance model 2 that was based on the telehealth services provided for chronic disease management. Through integrating a cross-sectional research design with an author-developed structured questionnaire that was assessed using reliability and validity tests, an anonymous survey was conducted on selected participants. The proposed research model and hypotheses were validated through path analysis using SPSS.

**Results** We found that users believe telehealth services can promote their workplace health management; that job relevance, result demonstrability, and perceived ease of use (PEOU) positively affect the perceived usefulness (PU), which implies that cognitive instrumental processes have the most significant impact on the PU of cloud-based telehealth; and that both PEOU and PU positively affect the intention to use (IU), but PU has a bigger influence than PEOU on users' intentions to continue using telehealth. In particular, the IU and actual usage behavior were critical to the patients' satisfaction with telehealth services.

- **Keywords**
- satisfaction
- telehealth
- chronic disease management

acceptance model 2

technology

**Conclusion** This research contributes to the rapid developing field of technology acceptance research by examining workplace telemedicine engagement. Our results will provide researchers with useful advice and a user-centered strategy for promoting workplace health management, which benefits both health care providers and corporate managers.

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#### **Background and Significance**

Telehealth is an assistive technology that has been used to mitigate the shortage of health care personnel and assist in the management of chronic diseases. Diabetes is a serious chronic condition that is recognized as an important cause of premature death and disability worldwide,<sup>1,2</sup> and having metabolic syndrome drastically raises the risk of diabetes.<sup>3</sup> Adequate glycemic control is essential in minimizing the long-term complications of prediabetes and diabetes.<sup>4</sup> Self-management is an important skill for patients with diabetes mellitus,<sup>5,6</sup> and this involves monitoring glucose levels and making behavioral changes to achieve better glycemic control.<sup>7</sup> There is a large body of evidence that supports the use of innovative technologies, such as telehealth, to monitor and manage chronic diseases such as diabetes, orthopedic conditions, human immunodeficiency virus/acquired immunodeficiency syndrome, or renal disease at a distance and as frequently as necessary.4,8-13

Although there has been a high level of interest in using technology in health care and significant growth is expected in this area,<sup>14</sup> implementation has not been without problems, and many of the forecasts have not yet been fully realized.<sup>15,16</sup> For example, many telehealth services that started with pilot or small-scale projects are not regularly maintained,<sup>15,17,18</sup> and telehealth is still not considered a mainstream activity in the health sector.<sup>15</sup> It is estimated that up to 80% of technology projects introduced in the health care environment have failed.<sup>19</sup> Faced with the rapid development and application of new technology, users' adoption and acceptance of each system and their satisfaction with using it are major issues worthy of attention.

Issues related to patient access and satisfaction are primary for many administrators. Theoretical frameworks for technology adoption can help elucidate possible user responses to new technological systems, as well as the drivers and barriers for subsequent adoption. Technology acceptance model (TAM) is one of the most widely used theories to study how users are motivated to adopt and use technology.<sup>20</sup> Although the issue of user-centered design is important in the development of new technology, most studies focus on home- or hospital-based telehealth care,<sup>21-23</sup> and no one has explicitly considered the possibility of integrating workplace health management to move beyond the home and hospital settings. Therefore, this study adopted TAM2<sup>24</sup> as the main research framework, and revised it to use for evaluating telehealth services in the workplace.

#### Objectives

The objective of this study was to evaluate patients' acceptance of and satisfaction with using cloud-based telehealth services in the workplace to support their practical needs and self-care behavior for health management.

#### Methods

#### The Cloud-Based Telehealth Service

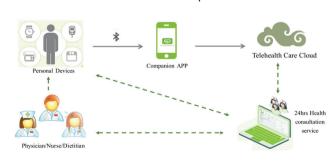
As part of workplace health promotion, a medical center and an enterprise began utilizing smart technology to allow employees to conduct self-health management beginning in 2017. This telehealth cloud is a Web-based system accessible on the Internet and is, therefore, not limited to operating systems or devices. The telehealth platform provides a comprehensive health solution that includes hardware, software, and services. The hardware is a Bluetooth-connected wireless measuring device, the software is a Web-based platform with the application (APP), and the service is a medical institution that provides services related to chronic disease care and health promotion.

The health care cloud management platform provides telehealth care to employees, collects physiological data through wireless health measurement medical equipment and wearable devices, and provides health monitoring and telehealth care services for employees with chronic diseases. Health monitoring is mainly used to assist with the daily management of self-health. Users can use measurement devices such as blood pressure monitors, blood glucose meters, and smart wearables to monitor their own physiological measurement values, which can be continuously recorded and observed. Data can also be sent via the cloud-based health platform for collection and analysis by the professional team. If abnormal signs are detected, the remote smart device can be used to provide appropriate advice or information to patients immediately. - Fig. 1 shows the infrastructure design of the online health care management system (Telehealth care).

#### Participant Recruitment

In this study, a purposive sampling approach was used to collect the data. A cross-sectional research design with a questionnaire-base survey was implemented to collect data for assessing participant (employees with chronic disease) perceptions regarding the telehealth system. The research

Telehealth care process



# **Fig. 1** Designing of the online diabetes health care management system. The caregiver can collect physiological data through wireless health measurement medical equipment and wearable devices, and send data and data analysis through the health platform to the professional team through the telehealth cloud; caregivers can also access the system and provide information and support to ensure interoperability between systems (Source: Telehealth Counseling Center of the Medical Center).

team offered onsite explanations of the study and the questionnaire survey was distributed in the company health center after employees had completed their clinical check. Inclusion criteria were as follows: (1) metabolic syndrome  $(\geq 3 \text{ items})$ : body mass index  $\geq 24$ ; systolic blood pressure  $\geq$  140 mm Hg; diastolic blood pressure  $\geq$  90 mm Hg; fasting blood glucose  $\geq$  101 mg/dL; hemoglobin A1c  $\geq$  7%; triglyceride  $\geq$  150 mg/dL; low-density lipoprotein cholesterol  $\geq$  130 mg/dL. (2) Diabetes ( $\geq$  1 item): fasting blood glucose  $\geq$  126 mg/dL; random blood glucose  $\geq$  200 mg/dL; polydipsia; polyuria; polyphagia; weight loss. Employees who met either criteria (metabolic syndrome  $\geq$  3 items or diabetes  $\geq$  1 item) were included in the study. Exclusion criteria were (1) unwillingness to participate after being fully informed, (2) involuntary use of the system, and (3) less than 3 months of use. A copy of the research instructions was attached to each questionnaire to achieve informed consent, allowing participants to comprehend the research objectives before answering the questionnaire. In total, 200 questionnaires were distributed, and after deleting 3 invalid questionnaires, which were not fully completed, the final sample contained 101 completed surveys that were collected by postal response. The survey was conducted between October 2017 and January 2018. It was conducted with the approval of the Human Research Protection Program of Changhua Christian Hospital (Institutional Review Board No. 160819) and abided by the principles of beneficence, autonomy, and equality during data collection.

#### **Research Design and Framework**

Technology acceptance is a key factor affecting the adoption of a new system. Despite the continuous development and diversification of telehealth technology, there is still an urgent need to investigate the acceptance and satisfaction of new technologies by end-users to assist patients with chronic diseases to perform good health management. The primary purpose of this research was to develop a conceptual model to predict the acceptance of and satisfaction with telehealth in the workplace. Telehealth is a Web-based information system that exhibits information technology characteristics. Therefore, it is reasonable to construct a research model based on technology acceptance theories, such as TAM,<sup>25</sup> which can explain 60% of technology acceptance.<sup>26</sup> Therefore, this study adopted and extended TAM2<sup>24</sup> to acquire participants' detailed opinions about their acceptance of and satisfaction with telehealth and explore significant factors behind endusers' responses to this program.<sup>24,27</sup> The conceptual framework is shown in **~Fig. 2**.

A quantitative method based on a TAM questionnaire was designed as the main research tool. **- Table 1** provides detailed conceptual definitions of the main dimensions and evaluation indicators of the questionnaire. The questionnaire had 12 dimensions in total with 75 items, and a 5-point Likert scale, ranging from strongly disagree (score: 1) to strongly agree (score: 5), was employed as the evaluation method. After the validity (Cronbach's  $\alpha > 0.8$ , corrected item total correlations > 0.35) and reliability (communality > 0.4, factor loadings > 0.4, Kaiser-Meyer-Olkin value > 0.6) assessment of the measurement model, the structural model was examined to test the hypotheses proposed for conceptual modeling in this study.

#### **Research Hypotheses**

TAM theorizes that perceived usefulness (PU) and perceived ease of use (PEOU) are antecedents to attitudes toward the adoption of a technology and that they are determined by external factors. According to Davis et al,<sup>25</sup> "PU" is defined as the degree to which a person believes that using a particular system would enhance his or her job performance, whereas "PEOU" is defined as the degree to which a person believes

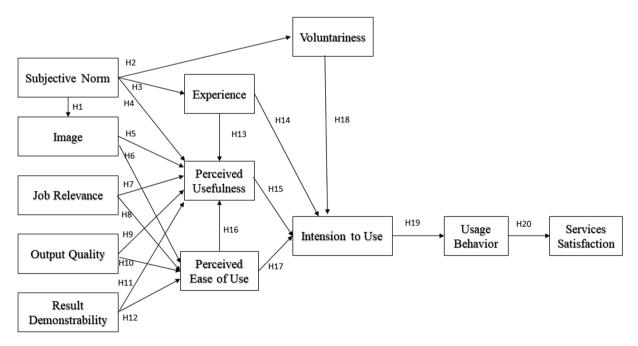


Fig. 2 Research design and procedure of the framework.

Evaluation dimensions	Conceptual definitions	Evaluation Indicators				
Subjective norm	Users' perceived pressure or push factors when using telehealth	Recommend to use by others, encourage to use by others, continuous use				
lmage	The degree to which use of telehealth is perceived to enhance health image of users	Personal image, health control, health awareness, care service				
Job relevance	A user's perception regarding the degree to which the telehealth is applicable to manage their health	Rewarding, system functions, system services, gain knowledge, effectiveness				
Output quality	Perceived quality of tasks fulfilled by means of the telehealth	Accurate data, quality, meet the requirement, easy to understand				
Result demonstrability	The degree to which the results or benefits of using the telehealth are apparent	Online stability, easy interpretation, system advantages, interactive, easy to use				
Perceived usefulness	The degree to which a person believes that using telehealth would enhance his or her health status	Understanding, assist, effectiveness, real-time, receiving information, complete record, share in time, easy to share, Interactive process, system service				
Perceived ease of use	Users' perceived easiness to use telehealth	Ease to learn, ease to use, ease of use, clear and understandable, ease to access, ease to operate				
Intention to use	Users' subjective intention toward Telehealth use in the future	Continue to use, recommend for others, priority use, share information, interactive, attempt to use				
Usage behavior	Users' experience with telehealth after actual use	Usage time, usage frequency, interaction, effectiveness of daily use				
Experience	User's personal experience with telehealth use	Health status, diet, system service, exercise, explanation, self-care, standard criteria, problem solved				
Voluntariness	Users' willingness to continue using telehealth	Initiative to try, seeking information, recommend for others, sharing information, setting standards, service improvement				
Services satisfaction	User satisfaction with telehealth use	Education, care service, professional knowledge, timeless, technical support assistance, remote assistance, troubleshoot, hardware equipment, system functions, cost, consultation service				

Table 1	Evaluation	dimensions,	conceptual	definitions,	and indicators
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that using a particular system would be free from effort.<sup>24</sup> In this regard, this study hypothesizes that

- H 15: PU will have a positive effect on intention to use (IU).
- H 16: PEOU will have a positive effect on PU.
- H 17: PEOU will have a positive effect on IU.

Subsequently, TAM2<sup>24</sup> extended the TAM<sup>25</sup> to reflect social influence (subjective norms, voluntariness, and image) and cognitive instrumental processes (job relevance [JR], output quality [OQ], result demonstrability [RD], and PEOU). Therefore, it is hypothesized that

H 1: Subjective norm (SN) will have a positive effect on image.

- H 2: SN will have a positive effect on voluntariness (VOL).
- H 3: SN will have a positive effect on experience.
- H 4: SN will have a positive effect on PU.
- H 5: Image will have a positive effect on PU.
- H 7: JR will have a positive effect on PU.
- H 9: OQ will have a positive effect on PU.
- H 11: RD will have a positive effect on PU.
- H 13: Experience (EXP) will have a positive effect on PU.
- H 14: EXP will have a positive effect on IU.
- H 18: VOL will have a positive effect on IU.
- H 19: IU will have a positive effect on usage behavior (UB).

Throughout the evolution of different TAM models, PEOU and PU have been shown to be closely related, so we can assume that the factors that affect PU will also affect PEOU. Therefore, we assume that PEOU is correlated with image, JR, OQ, and RD, which are direct determinants of PU. We believe that the less effort required to use a system, the more likely it is that using it can improve a patient's ability to manage chronic diseases through self-care.

- H 6: Image will have a positive effect on PEOU.
- H 8: JR will have a positive effect on PEOU.
- H 10: OQ will have a positive effect on PEOU.
- H 12: RD will have a positive effect on PEOU.

With the increasing prevalence of telehealth, it is important to maintain the key quality indicator of patient satisfaction. Empirical evidence has demonstrated that system UB is linked with user satisfaction.<sup>28</sup> Therefore, it is possible to use these measures to benchmark user satisfaction in terms of service use.

H 20: UB will have a positive effect on services satisfaction (SS).

#### Data Analysis

To characterize the sample, descriptive analyses (number and percentage) using demographic data were conducted.

The mean test was used to calculate the satisfaction score for each dimension. To examine the associations among each dimension, the path model was explored based on structural equation modeling (SEM). Path analysis (PA) is an extension of multiple regression, which identifies effects between variables in a proposed model.<sup>29-31</sup> Using PA, direct and indirect effects were tested, and the strength of the effects was quantified by calculating the standardized regression coefficient ( $\beta$ ). This  $\beta$  weight allowed for an interpretation of the strength of the effects between the variables. While the interpretation does not imply causality, it does have the power to predict relationships. The model fit was evaluated using several indices: the goodness-of-fit (GFI), the comparative fit index (CFI), the incremental fit index (IFI), the normed fit index (NFI), and the root means square error of approximation (RMSEA). Values of GFI  $\geq$  0.90, CFI  $\geq$  0.90, IFI  $\geq$  0.90, NFI  $\geq$  0.90, and RMSEA < 0.08 are assumed to be indicative of a good-fitting model, as recommended by Hu and Bentler<sup>32</sup> and McDonald and Ho.<sup>33</sup> IBM SPSS Statistics for Windows and AMOS, version 22.0 (IBM Corporation, Armonk, New York, United States) was used to analyze the results. The level of significance was set at p < 0.05.

### **Research Results**

#### **Demographic Variables**

We collected survey data, and 101 participants, who each had participated in the telehealth program for at least 3 months, were selected for analysis. There were 76 (75.2%) male respondents, but we found that gender differences had no effect on any of the variables examined. In addition, 65 respondents (64.4%) lived in central Taiwan, 22 respondents (21.8%) lived in northern Taiwan, and 14 respondents (13.9%) lived in Taipei City. Details of the demographic variables are shown in **►Table 2**.

#### **Mean Satisfaction Score for Each Dimension**

The average user evaluation score was 4.50, which indicates a medium level of satisfaction. As shown in **— Table 3**, the mean SN and VOL scores were 3.83 and 3.98, respectively, signifying that users only agree (rather than strongly agree) with these two dimensions. The fact that the remaining dimensions all received a mean score exceeding 4 shows that users thought telehealth service was able to meet the requirements of workplace health management.

#### **Results of TAM Evaluation**

A summary of the PA model is presented in **-Fig. 3.** A goodness-of-fit test was performed, yielding results that met relevant requirements:  $^{2}/df = 1.271 (\leq 3)$ , GFI = 0.94 ( $\geq 0.90$ ), CFI = 0.99 ( $\geq 0.90$ ), NFI = 0.96 ( $\geq 0.90$ ), IFI = 0.99 ( $\geq 0.90$ ), and RMSEA = 0.05 (< 0.08). Our findings validated 12 hypotheses and rejected 8 among all 20 hypotheses that were proposed based on the research framework. Therefore, the following conclusions were made: (1) SN positively affected image, EXP, and VOL, with coefficients of 0.27, 0.57, and 1.47 (H1, H2, and H3), respectively; (2) JR positively affected PU and PEOU, with coefficients of 0.39 and 0.51 (H7 and H8), which demonstrates that JR has a larger effect on

**Table 2** The demographic variables of participants (n = 101)

	Ν	(%)	
Sex	Male	76	75.2
	Female	25	24.8
Age	30–34 years old	9	8.9
	35–39 years old	31	30.7
	40–44 years old	28	27.7
	45–49 years old	17	16.8
	50–54 years old	9	8.9
	55–59 years old	7	6.9
Educational	Senior high school	11	10.9
attainment	Junior college	16	15.8
	Bachelor	35	34.7
	Postgraduate school	39	38.6
Occupation	Electronic industry	48	47.5
	Manufacturing industries	26	25.7
	Information and communications industry	23	22.8
	Others	4	4.0
Length	3 mo	97	96.0
of use	Less than 6 mo (including 6 mo)	4	4.0
Place of	Central Taiwan	65	64.4
residence	Taipei City	14	13.9
	Northern Taiwan	22	21.8

PEOU; (3) RD positively affected PU and PEOU, with coefficients of 0.35 and 0.37 (H11 and H12); (4) PEOU positively affected PU, with the coefficient of 0.21 (H16); (5) PU and PEOU positively affect IU, with coefficients of 0.74 and 0.21 (H15 and H17), which means that PU has a larger influence than PEOU on patients' intentions to use telehealth; (6) IU positively affected UB, with a coefficient of 0.97 (H19); and (7) UB positively affected SS (H20), with a coefficient of 0.98. The results indicate that the most important factors that influence patients' intentions of using telehealth are JR and RD. This study indicated that there was a positive linear relationship between system satisfaction and acceptance.

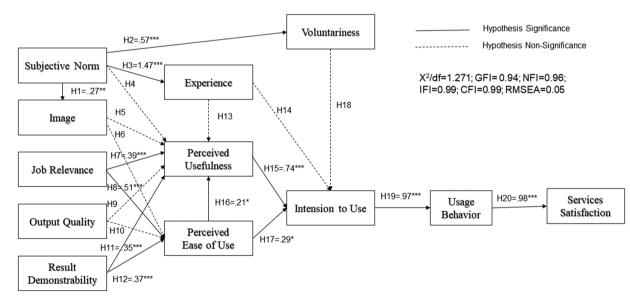
#### Application of TAM2 for Patients in the Workplace

Most of the participants were approximately 35 to 44 years old and were highly educated. Their occupations are related to technology, so they are familiar with operating devices (SN) such as mobile phones and tablets, and they have APP experience (EXP). These experiences also strengthen their willingness to use a new technology like telehealth (VOL). New cloud-based telehealth services were introduced into the workplace, and because these were not limited to the home or hospital settings, they make self-control and health management of diseases easier (PEOU). Through regular physiological monitoring and data analysis, personalized health advice can be provided (JR), and patients with abnormal physiological values can be

Questions	Evaluation dimensions											
	A	В	С	D	E	F	G	н	I	J	К	L
1	4.24	4.16	4.42	4.27	3.95	4.33	4.22	4.00	4.15	4.33	4.05	4.29
2	4.09	4.23	4.46	4.20	4.19	4.27	4.20	4.17	4.19	4.26	3.88	4.33
3	3.72	4.19	4.36	4.22	4.11	4.29	3.92	4.07	4.04	4.20	3.97	4.34
4	3.66		4.28		4.03	4.21	4.15	4.01	4.07	4.19	3.95	4.28
5	3.42		4.29			4.21	4.30	4.02	4.16	4.28	4.09	4.21
6						4.34	4.28	4.14	4.12	4.30	3.91	4.13
7						4.32				4.16		4.13
8						4.28				4.04		4.24
9						4.25						4.19
10						4.26						4.23
11												4.29
12												4.19
13												4.10
Mean	3.83	4.19	4.36	4.23	4.07	4.27	4.18	4.07	4.12	4.22	3.98	4.22

 Table 3 The values of Mean of satisfaction score for each dimension

Note: A: Subjective Norm; B: Image; C: Job Relevance; D: Output Quality; E: Result Demonstrability; F: Perceived Usefulness; G: Perceived Ease of Use; H: Intension to Use; I: Usage Behavior; J: Experience; K: Voluntariness; L: Services Satisfaction. Boldfaced values denote scores below average.



 $\label{eq:Fig.3} Results of testing the research model. The numerical figure is standardized parameter estimate, `p-value < 0.05; ``p-value < 0.01; ``p-value < 0.001. ``p-value < 0.01; ``p-v$ 

notified immediately (RD). This may help individuals better understand their own health and improve their effectiveness in caring for chronic diseases (PU), so that patients are more willing to use (IU) and cooperate with telehealth care plans (UB), and this may ultimately improve their satisfaction with the system (SS). Overall, we discovered that telehealth could meet the health management needs of employees with chronic diseases in the workplace.

#### Discussion

This study provides empirical support for the hypotheses proposed in relation to PU, PEOU, RD, and JB in the system usage, all of which have an impact on system acceptance and satisfaction. In addition, the results of this study demonstrated that JB and RD not only affected PU and PEOU simultaneously, but also had a relatively strong influence on PEOU. Specifically, PU and PEOU were critical factors associated with patients' actual and continued use of the system. Finally, there was a positive linear relationship between SS and UB.

In contrast to previous research,<sup>24</sup> the SN–IU relationship was not moderated by "EXP" and VOL (H14 and H18). TAM2 theorizes that the direct impact of SN on users' intentions to use the system will be strong initially, but will weaken over time as increasing direct experience with the system provides a better basis for IU it on an ongoing basis.<sup>24</sup> This idea was supported by this study because all users were voluntarily paying to use the telehealth system, which they used for more than 3 months. Furthermore, the SN–PU relationship was not moderated by EXP (not supporting H13). Although the hypothesis that SN affected image (H1) was supported by TAM2, the image–PU relationship was not (H5). In this study, the hypotheses related to the relationship between social influences (EXP, VOL, SN, and image) and the "IU" in the workplace system were rejected.

In addition, the positive influence of cognitive instrumental processes, including JR, RD, and PEOU on PU and IU in the system was empirically confirmed. First, JR relates to the personal perception of whether the use of the telehealth system can effectively support work tasks. This study supported the hypothesis that not only is JR an important factor that determines whether medical professionals in medical institutions will accept the telehealth system,<sup>34</sup> but it is also helpful for improving the health care of patients in the workplace. When using the telehealth system allows a user to simultaneously maintain his or her health and meet job needs (JR), PEOU and PU will increase because users believe that good health management will help them work better.

Second, RD makes it easy for others to recognize the positive effects of technology use, so the use of technology can improve PEOU and PU. The effect of the RD factor on patients' intentions to use the system may be due to the tangible improvements in patient care that result from using telehealth in the workplace. For example, personal health data can be sent to medical institutions via the telehealth care cloud where caregivers can then review abnormal cases in a timely manner and provide proactive services to assist with early warning and further reduce the risks of chronic disease.

Furthermore, the greater the PU and PEOU, the greater a patient's intentions (IU) and actual use (UB), which was demonstrated by Davis et al.<sup>25</sup> Our study supports these findings and suggests that patients with chronic diseases adopt APP with adequate support. They will ultimately perceive that they are able to improve their self-care behaviors, thereby leading to better health. We found that telehealth has been demonstrated to play a positive role in the workplace-based treatment of chronic diseases such as diabetes<sup>35</sup> and other diseases.<sup>10</sup> Mettler revealed that automatic behavior or habits can facilitate electronic medical record adoption.<sup>36</sup> Because participants possessed the APP and monitors, they knew their blood glucose and blood pressure values instantly, which helped them to control their diet and increased their attention to personal health. This implies that users believed that using telehealth increased their ability to efficiently manage their health, which in turn contributes to better control of chronic diseases and supports work health promotion.

Finally, we also extended TAM2 to determine if the system's UB positively affected SS. Using data and explicit satisfaction feedback collected from this study, it was found that user behavior is closely related to satisfaction. The average score for overall satisfaction with the telehealth care system was 4.2 (median score: 4.0). It has been reported that users (patients) in general are satisfied with such telehealth services and believe that using them can lead to improvements in their

health.<sup>37</sup> As health awareness has increased in recent years, consumers have also begun using wearables devices and medical mobile apps to manage their medical records, nutrition, medications, and other information. Therefore, user satisfaction can be predicted by examining UB, because it indicates that the participants who actually repeatedly use the telehealth system find it to be effective. Because the behavior of patients can be affected by their intentions, to effectively predict user satisfaction, one needs to consider not only the actual use but also the underlying intent of each user with respect to their experiences. As a result, system providers who understand how consumers use digital technology and take action can develop better patient engagement strategies and help individuals make better health management.

The aging and declining births have caused a serious shortage of care manpower, so the development of telehealth applications has become the common goal of many countries. Due to the spread of medical information and the development of science and technology, patients' requirements for medical care are also different from before. According to Internet World Stats statistics 2019,<sup>38</sup> Taiwan 's Internet users in June 2019 reached 92.8%, compared with 89.4% in North America, 39.6% in Africa, 87.7% in Europe, 68.9% in Latin America, and 68.4% in Australia, therefore, Taiwan can be regarded as the best field for cloud-based telehealth application. The workplace is an important setting for health promotion and disease prevention programs. On average, Taiwanese who are working fulltime spend more than one-third of their day, 5 days per week, at the workplace. As discussed in other studies,<sup>37</sup> the high user acceptance rate of telehealth systems means that telehealth can facilitate the monitoring of chronic diseases. Furthermore, high user satisfaction indicates that telehealth services are suitable for use in workplace health management. Unlike early telehealth, which only connected hospital and home, <sup>13,22</sup> this cloud-based telehealth platform can provide care at multiple locations, connecting community-based health care providers and patients across the lifecycle of care delivery-in the workplace, hospital, and at home.

This study had several limitations. First, it was a crosssectional study that utilized a small sample, with participants selected from two technology companies and without a control group from the community or hospital. This could weaken the interpretation of the results. Because the telehealth care cloud was only implemented recently, end-users had a relatively low willingness to participate in the research. Future studies could collect physiological data at different time periods and evaluate the results by conducting repeated-measure analyses or control-group selection to verify the effects of this care on chronic disease management. Moreover, further studies could evaluate whether such a system is successful at promoting self-management in patients with chronic diseases. Although postal surveys are commonly used to gather information from health care research, mean response rates to postal surveys are low  $(42-56\%)^{39,40}$ ; this was also true in this study (51%). This could result in unknown levels of bias (nonresponse bias). A sample size of 100 to 200 is generally considered to be the minimum sample size for conducting SEM.<sup>41</sup> Although a notable limitation of TAM-based studies is self-reported, actual usage, that is,

UB driven by IU, is usually surrogated by a person's selfreported usage. This is still the most straightforward way to understand the end-user's perception of accepting a new technology based on quantitative research strategy.

# Conclusion

This study contributed to evaluating the adoption of telehealth by applying revised TAM2. It indicated that cognitive tool processes are more important than social impact processes among people who are using telehealth in the workplace. During implementation and use of the system, changes in user behavior are critical to the ultimate success of the system, and these behaviors can also predict user satisfaction with the system. If the behavior is inconsistent with the usage of the system, it may lead to low system acceptance and satisfaction. These findings provide valuable information that telehealth service providers, workplace supervisors, and health care providers can use to improve strategies and accelerate adoption of the technology. By understanding how telehealth can be accepted by its users for managing their health, the needs of users can be accurately presented, and the gap between service providers and those in need can be reduced. The next step in the research plan is to consider the success of cloud-based telehealth care in workplace health management using a larger sample size.

## **Clinical Relevance Statement**

This study enhances our understanding of the acceptance of and satisfaction with cloud-based telehealth care for workplace health management from the perspective of patients. It provides valuable evidence that telehealth service system developers and care personnel can use to overcome deficiencies in the existing telehealth systems to maintain patients' loyalty and allow for the successful implementation of telehealth in the future.

# **Multiple Choice Questions**

- 1. What kind of the effectiveness care has been widely adopted in diabetes care and metabolic control?
  - a. Telehealth care.
  - b. Intensive care.
  - c. Health care.
  - d. Long term care.

**Correct Answer:** The correct answer is option a. The effectiveness of telehealth care has been indicated and online informatics applications have been widely adopted in diabetes care and metabolic control.

- For health information system evaluation, what is the most appropriate model for recognizing end-users' opinion of rejection or acceptance health care technology?
   a. Information success model (IS success model).
  - b. Technology acceptance model II (TAM II).
  - c. Technology task fit model (TTF model).

d. Social technology model.

**Correct Answer:** The correct answer is option b. The initial version of the TAM II was designed to determine behaviors of computer system users, exploring significant factors behind end-users' responses to information systems (i.e., rejection or acceptance technology).

- 3. What are the benefits of receiving telehealth for diabetes care?
  - a. Self-monitoring blood glucose to strengthen self-care.
  - b. Promote the quality of insulin injection care.
  - c. Behavior improvement (diet / exercise / medication).
  - d. All of the above.

**Correct Answer:** The correct answer is option d. Telehealth for diabetes provides for tighter glucose control, improved clinical outcomes, and behavior change that prevents or arrests development of serious complications.

- 4. In which areas can the cloud-based health management platform be used for chronic disease management?
  - a. Home.
  - b. Hospital.
  - c. Workplace.
  - d. All of the above.

**Correct Answer:** The correct answer is option d. This cloud-based telehealth platform can provide care at multiple locations, connecting community-based health care providers and patients across the lifecycle of care delivery —in the workplace, hospital, and at home.

#### Protection of Human and Animal Subjects

The study was performed in compliance with the World Medical Association Declaration of Helsinki on Ethical Principles for Medical Research Involving Human Subjects, and was reviewed by Human Research Protection Program of Changhua Christian Hospital (Institutional Review Board No. 160819).

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#### **Conflict of Interest**

None declared.

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