



# Article Adoption of Digital Vaccination Services: It Is the Click Flow, Not the Value—An Empirical Analysis of the Vaccination Management of the COVID-19 Pandemic in Germany

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**Abstract:** This research paper examines the adoption of digital services for the vaccination during the COVID-19 pandemic in Germany. Based on a survey in Germany's federal state with the highest vaccination rate, which used digital vaccination services, its platform configuration and adoption barriers are analyzed to understand existing and future levers for optimizing vaccination success. Though technological adoption and resistance models have been originally developed for consumer-goods markets, this study gives empirical evidence especially for the applicability of an adjusted model explaining platform adoption for vaccination services and for digital health services in general. In this model, the configuration areas of personalization, communication, and data management have a remarkable effect to lower adoption barriers, but only functional and psychological factors affect the adoption intention. Above all, the usability barrier stands out with the strongest effect, while the often-cited value barrier is not significant at all. Personalization is found to be the most important factor for managing the usability barrier and thus for addressing the needs, preferences, situation, and, ultimately, the adoption of the citizens as users. Implications are given for policy makers and managers in such a pandemic crisis to focus on the click flow and server-to-human interaction rather than emphasizing value messages or touching traditional factors.

**Keywords:** COVID-19; pandemic; vaccination; vaccination services; platform technology; technology adoption model; acceptance model; innovation barriers

# 1. Introduction

# 1.1. Lack of Research in Vaccination Management

The COVID-19 pandemic, caused by the severe acute respiratory syndrome coronavirus type 2 (SARS-CoV-2), led to serious social and economic global disruptions, culminating in the largest global recession since the Great Depression (IMF, International Monetary Fund Data, 2022). Research has focused, so far, either on the optimization of traditional approaches (e.g., sterilization protocols, hygiene rules, testing regime, contact tracing, and quarantine) [1,2] or on the development of innovative approaches such as mRNA vaccines [3]. As the different infection waves have shown, innovative vaccines can only provide positive results, when people accept and use the related services given that vaccination processes offer the most effective protection against the pandemic [4]. Since not only the supply of vaccines is limited but also medical facilities, and healthcare workers are constrained as resource capacity, the vaccination management is also a general economic problem which requires an optimal allocation strategy by policy makers and pandemic officers [5]. Against this background, this study focuses on the digital management of



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**Copyright:** © 2023 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). vaccination processes, including services such as the registration and admission in the vaccination system, the booking of vaccination dates, postinjection monitoring, documentation and reminders to follow ups [6].

Xu et al. [7] differentiates six research clusters based on the analysis of 5070 research contributions on the COVID-19 vaccination: (1) attitudes towards vaccination (e.g., vaccination willingness and misinformation), (2) immunoinformatic analysis (e.g., vaccine design and DNA vaccines), (3) clinical research on vaccines (e.g., clinical trials, bioinformatics, and drugs), (4) vaccine effectiveness (e.g., immune response, immunization, and antibody response), (5) side effects (e.g., safety and surveillance), and (6) public management (e.g., public health and health policy). The management of vaccination processes falls into cluster six, whereby the use and potential of digital platform technologies for the vaccination management and their adoption by users have been rarely scrutinized [8,9]. However, successful vaccination campaigns do not depend only on the quality and effectiveness of the vaccines but also on their administration and handling processes, with state-of-the-art digital platform services that people know from their social lives [6,10,11]. To react rapidly and efficiently in a pandemic situation, digital tools are indispensable in the vaccination management, given the fact that more than 50% of the 3.4 billion smartphone users should have health apps installed on their phones [12]. In Germany, where this research study is located, almost 60% of patients use digital tools for searching symptoms and disease-related information (Bertelsmann Foundation, 2022). Adoption of digital tools is a key factor in public management in general and healthcare specifically, so that this research study defines this phenomenon as "digital vaccination management". In a database search of Ex Libris Primo with the search strings "COVID-19 management" and "digital tools", only 35 articles were found (see Appendix A.1), of which only three articles put a focus on diagnosis and treatment (which is also our research focus with vaccination management). These three studies present a detailed review of the role of artificial intelligence as a decisive tool for the prognosis, analysis, and tracking of the COVID-19 cases [13]; a proposal for public participation, digital solutions, and e-health initiatives [14]; and a description of an early warning, in-hospital, mobile risk-analysis app for diagnosing COVID-19 [15]. No articles on e-health tools for vaccination management were found.

The adoption rate is as a crucial success factor since the public vaccination campaigns against COVID-19 have shown how important it is to quickly build the necessary capacity for process and service innovation and to manage it in a functional way [16]. Another study from Chowdhury et al. [17], which discovered 415 COVID-19-related mobile health applications in 2021, showed that of the relevant 75 applications only 3–5% were designed to meet the health literacy and adoption needs of communities. Countless new technologies promote health service innovations, but they also force possible resistance on the user side [18]. This research study aims to understand the barriers and factors of adopting digital vaccination services by following the research question:

RQ: Which platform configuration works best to overcome adoption barriers and increase the adoption intention of digital vaccination services?

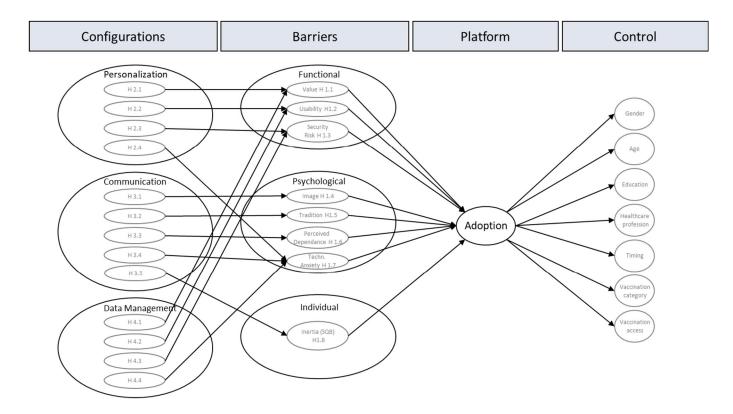
The paper is structured as follows. Based on the innovation acceptance and resistance theory, eight barriers are derived, which are then referred to the configuration categories of the TOPCOP patient portal model and formulated into a set of hypotheses in the theory section (Section 1). A web-based survey in Germany—approved and coordinated with the federal health ministry of Saarland—was conducted on the offered digital vaccination services. Based on 404 valid surveys, a component-based structural equation model is applied to analyze platform configuration domains (Section 2, Research Design). In the results section (Section 3), the effects of psychological, functional, and individual barriers on the intended adoption rate of digital vaccination services and the effects of the configuration categories on the barriers are shown, highlighting the significance of usability, security risk, and image barriers. The discussion section (Section 4) proposes an adjusted model for digital vaccination services, and implications for the policy makers managing the pandemic and health services are presented. Finally, the conclusions section (Section 5) emphasizes

the key learnings for policy makers to focus on the usability barrier and personalization as the key factors for adoption of digital vaccination services.

### 1.2. Theory

## 1.2.1. Barriers to Adopt Digital Platform Services

The acceptance of vaccination services can be explained by two research paradigms: innovation adoption (technology such as the acceptance model (TAM) [19,20], the theory of planned behavior (TPB) [21], the unified theory of acceptance and use of technologies (DART) [22], the dynamic acceptance model for the re-evaluation of technologies (DART) [23], and the unified theory of acceptance and use of technology 2 (UTAUT2) [24]), and the opposite, innovation resistance [25,26]. Though Ram [26] sees innovation resistance not as the opposite to innovation adoption, we perceive both research streams as valuable and relevant for serving our research question. Thereby, we follow the conclusion that "adoption of an innovation is conditioned by the overcoming of consumers' initial resistance" [27] (p. 783). To answer our research question, we followed the more fine-grained resistance theory models and formed an adjusted digital vaccination adoption model (see Figure 1), which is mainly based on the work of Mani and Chouk [27].



**Figure 1.** Adoption Model for digital platform services to manage COVID-19 vaccination (based on Mani and Chouk [27]).

Regarding functional barriers, the perceived value of a digital service plays a relevant role in determining the intention to adopt. Value barriers are often related to price–benefit ratios when adopting an innovation, usually referring to substitute products or services [28]. This also applies to the performance differences between the innovation and the substitute service [29], which is essential in healthcare systems without point-of-service payments. In this case, the notion of price should be understood in an extended way, according to transaction cost theory [30], as the sum of the efforts to register at the vaccination platform, and, according to the opportunity cost concept, as foregoing the benefits of other forms of vaccination (e.g., vaccination via mobile vaccination teams and vaccination in clinics). Another major resistance barrier is the usability of the innovation [31]: when the

functionality of an innovation is difficult to understand or does not unfold, people tend to reject technological innovations [26]. If the users do not understand how to use the digital vaccination service, they bounce or break up the session. Close to usability, a valid concern of potential service users is the security risk of the personal information involved in the service interaction [32]. This security risk barrier is of major concern when adopting digital services [33], especially for vaccination services. Medical data are perceived as one of the most sensitive; thus, they are data of users most worth protecting.

In the context of psychological barriers, the image barrier describes how people associate innovations with known identities [31]. Such a self-image incongruence can impede the innovation acceptance when the identity does not fit to the proposed function of the innovation [34]. Such a mismatch takes place if individuals connect the vaccination service, or healthcare in general, with personal interactions and consequently shun digital solutions. Moreover, daily routines and habits can conflict with digital service innovations such as the automated, unpersonal vaccination registration. These tradition barriers can have a negative influence on the acceptance of an innovation or can even lead to a complete rejection of an innovation [34]. In the last decades, technological developments have radically changed the behavior, attitudes, and beliefs of individuals. The phenomenon "technological vulnerability" became a challenge for research in digital domains [35] and has been analyzed in terms of the two barriers: "technology anxiety" and "perceived technological dependence" [27]. A general technology anxiety might lead to an aversion to new digital approaches for managing healthcare activities, such as digital vaccination services, due to a common fear of individuals to use them [36]. The perceived dependence barrier emerges because of the phenomenon that more and more areas of life are unthinkable without the reliance on technology. This can easily be seen as dependence, leading to dire results when the technology might be, due to unforeseen circumstances, not available anymore [37]. Due to the safety sensitivity of the healthcare data in the vaccination service, any digital substitution might raise doubts about this potential dependence and, in turn, negatively affect the intention to adopt a new digital service.

Individual barriers relate to the status quo bias (SQB) theory, which claims that maintaining the status quo (i.e., inertia) is an individual variable leading to resistance [38]. This personal predisposition leads an individual to prefer the current situation to situations of uncertainty or change [25]. Hence, inertia increases resistance to the new digital vaccination service.

In summary, we conclude the following hypotheses on the effect of adoption barriers:

**H1.1.** The value barrier (perceived price) negatively affects the intention to adopt the digital platform service.

**H1.2.** *The usability barrier (perceived complexity) negatively affects the intention to adopt the digital platform service.* 

**H1.3.** The perceived security risk barrier negatively affects the intention to adopt the digital platform service.

**H1.4.** *The image barrier (self-image incongruence) negatively affects the intention to adopt the digital platform service.* 

**H1.5.** *The tradition barrier (need for human interaction) negatively affects the intention to adopt the digital platform service.* 

**H1.6.** *The perceived dependence barrier negatively affects the intention to adopt the digital plat-form service.* 

**H1.7.** The technology anxiety barrier negatively affects the intention to adopt the digital platform service.

**H1.8.** *The individual inertia barrier (status quo bias) negatively affects the intention to adopt the digital platform service.* 

### 1.2.2. Platform Configuration of Vaccination Services to Mitigate Adoption Barriers

Though healthcare providers have been sluggish in adopting new technologies, the COVID-19 pandemic has accelerated the use of digital technologies in healthcare [39]. For instance, the German government reinforced the use of digital services in fighting the COVID-19 pandemic by developing the "Corona Warn App" (for contact tracing in 2020) or by issuing digital vaccination certificates (since 2021). The literature called for quick and, above all, unbureaucratic (digital) approaches with appropriate incentives along the vaccination process [2]. To establish and design successful digital services such as those on health platforms, their architecture and management are decisive points [40]. The TOPCOP taxonomy on patient portals serves health information managers to classify and structure digital health platforms [41]. For offering digital vaccination services, the original TOPCOP patient portal was reduced in its complexity to three platform configuration areas: personalization, communication, and data management (see Appendix A.2).

### 1.2.3. Personalization to Facilitate User Perception and Lower Adoption Barriers

Personalization plays a crucial role in optimizing interactions between service providers and users; thus, it is a growing management trend [42]. Personalization, understood as the ability of an organization to customize its services according to one's own needs and preferences [43], increases the viability of the digital vaccination service for the user and thus should lower related notions of innovation. Moreover, it increases the perceived value of the new vaccination service and eventually lowers the value barrier so that a potential user finds the proposed innovation of the vaccination service attractive [27]. Users with the option of personalization will use it to increase one's own usability and to overcome the fear of security risks. Pearson et al. [44] cite personalization as one of the drivers of online-based usability. Finally, the barrier of technology anxiety relates to an irrational fear when confronting an innovation such as the digital vaccination service [36]. Most anxiety management approaches rely on letting individuals engage with the object of the anxiety in a limited, controlled fashion. For the digital vaccination service designed for usability, we expect a mitigating impact of personalization on technology anxiety. To sum up, we propose:

**H2.1.** Personalization reduces the usability barrier (perceived complexity) in the digital platform service.

- **H2.2.** Personalization reduces the value barrier (perceived price) in the digital platform service.
- **H2.3.** *Personalization reduces the security risk barrier in the digital platform service.*
- **H2.4.** Personalization reduces the technological anxiety barrier in the digital platform service.

#### 1.2.4. Communication Providing Targeted Information to Mitigate Adoption Barriers

An adequate information basis is required to mitigate any suspicions concerning new technologies or service innovations [45]. In terms of the offering of the digital vaccination service, its potential and outcome have to be evaluated by individuals and compared to the status quo, which requires a high level of transparency of the potential changes [46], in particular in the risk-avoidance culture of the healthcare context [47]. Heidenreich and Kraemer [48] demonstrated that employing mental simulation can reduce innovation resistance and, accordingly, information might alleviate biased perceptions regarding the image of the digital vaccination service and dispel prior stereotypes. In general, innovations are associated with certain identities, such as a product category, brand, or country of origin [29], which might foster innovation resistance [31]. The image barrier is triggered when identities run counterpoint to the substituted product or context. In the case of health services, the stereotyped insecure digital services and traditional healthcare interactions, often romanticized as trust-based [49], could such counterpoints. Closely connected to this, the tradition barrier can occur, referring to the fear of changes in socially learned values, beliefs, behaviors, and routines [50]. If a tradition, such as the need for human interactions in healthcare systems, is questioned by a new, anonymous digital service, communication might trigger sociopsychological processes to overcome this barrier and

thus promote the adoption of the innovative vaccination service [51]. On a deeper level, the provision of information concerning the involved service processes might reduce technological vulnerability, perceived technological dependence as well as technological anxiety [27]. According to the attribution theory, the perceived technological dependence is an attributional mechanism that enables people to experience and express their skepticism about a new technology-based service, such as for the vaccination. Ratchford and Barnhart [52] (p. 1212) describe this perception as "a sense of being overly dependent on, and a feeling of being enslaved by, technology". Communicating targeted information about the object of the technological anxiety, i.e., the vaccination service, is described as one possible path to

mitigate these fears by giving the individual the possibility to engage with it on a cognitive level. While digital services today differ from physical-centered computer hardware, a study of 187 participants by Igbaria and Chakrabarti [53] found that education was able to significantly reduce computer-related anxiety and inertia of students, indicating a positive impact of structured information. To sum up, we propose the following hypotheses:

**H3.1.** Communication mitigates the image barrier (self-image incongruence) in the digital platform service.

**H3.2.** *Communication mitigates the tradition barrier (need for human interaction) in the digital platform service.* 

**H3.3.** Communication mitigates the perceived technological dependence barrier in the digital platform service.

H3.4. Communication mitigates the technological anxiety in the digital platform service.

H3.5. Communication mitigates the inertia (SBQ) barrier in the digital platform service.

1.2.5. Data Management to Ensure Service Speed and Reduce Adoption Barriers

Users of innovations are easily deterred by reactions that do not conform to their expectations regarding typical interaction patterns or quality levels of the chosen innovation [54]. Insufficient capacity is detrimental to the success of service providers [55], where capacity of a provider is defined as "highest quantity of output possible in a given time period with a predefined level of staffing, facilities, and equipment" [55] (p. 26). Different from physical services, instant responses are expected for digital services because the offer is compared to heavily standardized and AI-supported services by industry leaders, such as search engines or social networks. Perceived delays or mistakes are not as easily forgiven, especially if users disclose and submit sensitive healthcare information. A systematic data management is required to ensure service speed and short reaction times and thus avoid the fostering of adoption barriers against the vaccination service. This is supported by an analysis of the responses of 453 Korean healthcare service users, finding that an interactive quality was deemed a significant factor for patient satisfaction [56]. A reliable and speedy response is a precursor for the perceived value of digital services [57]. Sound data management should ensure a higher sense of usability and a lower sense of experienced security risk due to quick fixes, when the need might arise, and general responsiveness. Reliable data management should alleviate technological anxiety since smooth interaction reduces the risk of unforeseen events due to errors and worrying thoughts during waiting times. In summary, we propose the following hypotheses:

H4.1. Data Management reduces the value barrier (perceived price) in the digital platform service.

**H4.2.** Data Management reduces the usability barrier (perceived complexity) in the digital platform service.

H4.3. Data Management reduces the security risk barrier in the digital platform service.

**H4.4.** Data Management reduces the technological anxiety in the digital platform service.

#### 2. Research Design

#### 2.1. Federal State with Highest Vaccination Rate in Germany as Research Area

To answer our research question of which platform configuration works best to overcome adoption barriers, the federal state with the highest vaccination rate in Germany, i.e., Saarland, was chosen (see Table A1 and Figure A1). Each federal state in Germany had to build up vaccination services according to the "National Vaccination Strategy' from the German government in October 2020. The federal state of Saarland decided on a digital vaccination platform for the approximately one million inhabitants and chose the company samedi after a selection process on 27 November 2020. The specialized company, samedi, founded in 2008 in Germany, is a leading provider of e-health software for patient portal and care management solutions which is used by more than 40,000 individual healthcare providers for the coordination over 30 million patients in Germany, Austria, and Switzerland (www.samedi.com (accessed on 23 March 2022)). The digital health platform, samedi, was customized for the vaccination process with the top-level domain "www.impfen-saarland.de (accessed on 23 March 2022)", further load-balancers to manage the traffic, and configurations to manage the following services: (1) vaccination appointment booking (registration), (2) invitation e-mail (with QR code) and short message reminder, (3) security QR code check-in, (4) admission management (check-in forms), (5) waiting list with data security compliant patient calls, (6) vaccination cabin allocation, (7) monitoring list, (8) vaccination documentation with vaccination batch and employee code scan, and (9) government data reporting. Nevertheless, the available vaccination slots were instantly booked, which led to stress, frustration, and anger of the citizens. For this reason, a vaccination preregistration list was set up and implemented in January 2021. Citizens registered with their preferences (i.e., vaccination location, daytime, weekday, and partner code), and after collecting registrations for two weeks, all registrations were randomized and, according to a smart algorithm, allocated according to the given preferences. The first randomization allocation took place on 27 January 2021, with an official notarization so that a fair and just allocation process was guaranteed. In April 2021, the German government amended the vaccination strategy and included 65,000 medical doctors in the vaccination process who vaccinated independently in their own practices. From the start of vaccinations in December until April, Saarland ranked number one in Germany in terms of vaccination rate (see Appendix A.3).

#### 2.2. Understanding the Adoption by Means of a Survey of Vaccinated People

For the evaluation of the digital vaccination management, the public administration of the federal state of Saarland was approached with the research project together with the University of Saarland on 8 June 2021. The survey was approved by the federal minister of health on 12 August 2021 and went until 30 September 2021. The survey was set up with the software Unipark (Version EFS Survey 2021) and was advertised in the vaccination centers of Saarland with posters and flyers. The survey was anonymous and voluntary and consisted of 46 questions (see Appendix A.4 for the original German version and Appendix A.5 for the translated English version). The survey started with nine questions about control and context factors (e.g., gender, age, and education) and then continued for the items measuring the evaluation of the platform services and intention to adopt future digital health services. Respondents indicated their approval to the statements on a seven-point Likert scale, from totally disagree to totally agree (i.e., scale scores of 1–3 are negative, 4 is neutral, 5–7 are positive). For the operationalization of the model, the dependent variable of "adoption intention" is defined as the intention to adopt digital health services and is operationalized using a reflective, first-order construct, adapted from Heidenreich et al. [58] for the healthcare context. Following the approach of Mani and Chouk (2018), it is categorized in functional, psychological, and individual barriers, which in turn are operationalized in reflective, first-order constructs for their respective barriers. To assess communication provision, the operationalization of Auh et al. [59], in the form of a reflective, first-order construct, was utilized to estimate how expedient the information

provision of the service was perceived. Analogous, personalization is based on the scale of Burnham et al. [60], which gauges the degree of personalization in a service. Data management reflects the capability of the digital platform to possess enough resources to react reliability and swiftly to user demands [61]. The items of both constructs are reflective and are united in first-order constructs.

The basis population is exceptionally well suited to address the research question because the German population was instructed early on to use the technology to gain access to the COVID-19 vaccination. Thus, the sample is less subject to the pro-change bias prevalent in innovation studies, namely, that mainly individuals participate in change and innovation with a positive attitude [46]. Data were collected of 404 valid respondents (see Supplementary File S1). Strict confidentiality of the answers was guaranteed to the participants, mitigating the risk of a social desirability bias. To reduce the probability of common method bias, a full collinearity assessment approach was chosen to check for pathological collinearity. The results of the variance inflation factors (VIFs) of the full collinearity test were below 3.3. Hence, the findings indicate a low probability of common method bias in the model. For assessing the research model and the associated hypotheses, the dataset was analyzed using a component-based structural equation model due to its advantages concerning the sample distribution and size [62]. The model was calculated using SmartPLS 3.0 with path-weighing calculations and a case-wise replacement missing algorithm. A nonparametric bootstrapping with 5000 replications and individual level changes were used for the standard error calculations [63].

### 3. Results

The survey was answered by 411 participants (with 404 valid responses) in an average time of 12 min, whereof two-thirds of the respondents was female and one-third was male. The age distribution is distributed with 40% under 46 years, 50% between 46 and 67 years, and 10% older than 68 years. A total of 26% of the respondents were healthcare workers and 50% had a university degree. The vaccination reason, based on the national vaccination categorization, was 40% health-related and 35% because of age. In terms of satisfaction with the federal state of Saarland as the vaccination provider, 86% were positive or neutral and 85% would also (positive/neutral) use digital health services in the future. A total of 10% found the digital vaccination platform not easy to use, but also 11% classified themselves as biased with technological anxiety. Regarding digital platform configuration areas, 83% (positive/neutral) for keeping them well-informed (communication), and 76% (positive/neutral) for being quick responding (data management). Most of the respondents very highly appreciated the digital vaccination platform in the configuration areas of personalization (by 52%) and communication (by 53%) (see Table 1).

To validate our adoption model, the quality of the measurement constructs was evaluated by testing them without structural connections. An exploratory principal component analysis was then conducted for the constructs. The indicator loadings consistently exceeded 0.708, suggesting indicator reliability for all constructs. Moving on, Cronbach's alpha was computed for the constructs to determine the respective construct's reliability. The results surpassed 0.7, indicating adequate reliability [64]. Examining convergent validity and the discriminant, the average variance extracted (AVE) was calculated, which surpassed the minimum level of 0.5. The comparison with the squared intercorrelation of the constructs also resulted in adequate results [65]. Looking at the structural model, the path coefficients and significances according to the proposed research model were computed (see Table 2).

Variable	Description	Μ	SD	Explanation
Duration	Time to fill out survey.	706	435	Average was 11.8 min (3.6 min–55 max)
Age	(1-4) <46, (5-6) 46-67, (7-8) >67	4.69	1.64	40% 18-45, 50% 46-67, 10% >67 years
Gender	(1) male, , (5) female	3.67	1.88	32% male, 66% female
Education	(1-5) school/job, (6-7) B./Master	4.84	1.53	49% school/job, 41% bachelor's/master's
Healthcare w.	1 (yes), 2 (no)	1.74	0.44	26% yes, 74% no
Priorisat. Group	(1–4) age, (5) care, (6) health, (7) job	4.91	1.59	35% age, 15% care, 40% health, 8% job
Satis 3	Satisfied with vaccination process	5.61	1.89	78% positive, 8% neutral, 14% negative
_ Intent_Adopt_2	intend to use dig service in future	5.45	1.88	72% positive, 13% neutral, 15% negative
Usabilit_Barr_1	digital portal was easy to use	1.95	1.62	86% positive, 4% neutral, 10% negative
Te_Anx_Barr_2	not using d. tech. to avoid errors	1.67	1.29	11% agree, 9% neutral, 80% disagree
Personal_1	portal appropriate for concern	5.65	1.86	77% positive, 6% neutral, 16% negative
Commun_1	portal keeps me well informed	5.63	1.99	76% positive, 7% neutral, 15% negative
Data_R_Man_1	portal responded quickly	4.88	2.04	64% positive, 12% neutral, 24% negative

Table 1. D	escriptive	Results of	f Digital <b>'</b>	Vaccination 1	Management Survey.

Notes: Healthcare w. = healthcare worker; Priorisat. Group = prioritization group, according to National Vaccination Guideline; Satis\_3 = satisfaction variable 3; Intent\_Adopt\_2 = adoption intention variable 2; Usabilt\_Barr\_1/2 = usability barrier variable 1/2; Te-Anx\_Barr\_2 = technology anxiety barrier variable 2; Person\_1 = personalization (configuration) variable 1; Commun\_1 = communication (configuration) variable 1; Data\_R\_Man\_1 = data and resource management (configuration) variable 1.

	Image Barr	Individual Inertia	Perceived Dependence B.	Perceived Value Barrier	Security Risk Barr	Technology Anxiety Barr	Tradition Barr	Usability Barr	Intention Adopt
Communication	-0.195	-0.110	-0.234	-0.088	0.006	-0.167	0.046	-0.153	
Data Management	-0.109	-0.006	-0.024	-0.444	-0.092	-0.172	0.113	-0.233	
Personalization	0.134	-0.199	0.128	-0.186	-0.127	0.131	0.097	-0.429	
Intention to adopt	-0.248	0.028	-0.104	-0.262	0.101	0.080	-0.046	-0.361	
Age									-0.02
Education									-0.22
Gender									-0.09
Vaccination Timing									0.01

The measured  $\mathbb{R}^2$  demonstrates an appropriate fit between the data and the model, with values ranging from 0.10 to 0.51. Contemplating the presence of multicollinearity at the structural level, the VIFs were estimated, but all fell in the required parameters of below five. Eventually, the model fit was assessed by calculating the standardized root-mean-square residual (SRMR = 0.08). While the quality of this indicator is not yet fully verified for PLS-based structural equation modeling, the value is adequate with the more conservative threshold for covariance-based structural equation modeling. For the first set of hypotheses, we tested the functional, psychological, and individual barriers on the intention to adopt (ItA) digital vaccination services (see Table 3).

**Table 3.** Results from hypothesis H1 set about adoption barriers.

Hypothesis	Structural Relation	Original Sample	М	SD	t	p
H1.1	Usability Barrier (Rev) -> ItA	-0.361	-0.354	0.064	5.616	0.000 ***
H1.2	P. Value Barrier -> ItA	-0.262	-0.191	0.191	1.375	0.169
H1.3	Security Risk Barrier -> ItA	-0.101	-0.102	0.038	2.629	0.009 **
H1.4	Image Barrier (Rev) -> ItA	-0.248	-0.249	0.045	5.454	0.000 ***
H1.5	Tradition Barrier -> ItA	-0.045	-0.045	0.043	1.037	0.300
H1.6	P. Depend. Barrier -> ItA	-0.104	-0.103	0.065	1.596	0.111
H1.7	Tech. Anxiety Barrier -> ItA	0.080	0.080	0.054	1.469	0.142
H1.8	Individual Inertia -> ItA	0.028	0.009	0.043	0.657	0.511

*Notes*: ItA = intention to adopt; P. = personal; Tech. = technology; M = mean, SD = standard deviation, t/p = t-/p-value, \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.00.

From the eight adoption barriers, only the usability barrier (*t*-Stat 5.6, p < 0.00), the security risk barrier (*t*-Stat 2.6, p < 0.01), and the image barrier (*t*-Stat 5.5, p < 0.00) could be proven to be statistically significant.

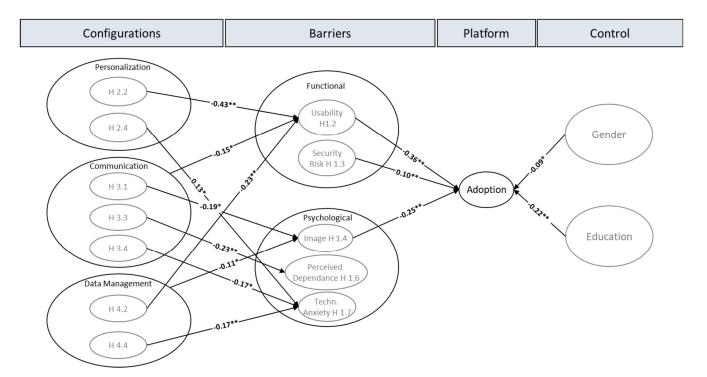
The hypotheses about the platform configuration areas were tested as the construct factors for personalization, communication, and data management were measured on the adoption barriers (see Table 4).

Hypothesis	Structural Relation	Original Sample	Μ	SD	t	p
Cu	stomization					
H2.1	Usability Barrier (Rev)	-0.427	-0.426	0.074	5.799	0.000 ***
H2.2	Perceived Value Barrier	-0.186	-0.148	0.135	1.376	0.169
H2.3	Security Risk Barrier	-0.127	-0.120	0.073	1.743	0.082
H2.4	Techn. Anxiety Barrier	-0.167	-0.128	0.060	2.175	0.030 *
Cor	nmunication					
H3.1	Image Barrier (Rev)	-0.195	-0.191	0.082	2.385	0.017 *
H3.2	Tradition Barrier	0.046	0.046	0.077	0.602	0.548
H3.3	P. Dependence Barrier	-0.234	-0.233	0.075	3.139	0.002 **
H3.4	Tech. Anxiety Barrier	-0.167	-0.164	0.079	2.116	0.035 *
H3.5	Inertia (SQB)	-0.110	-0.072	0.127	0.869	0.385
Data	Management					
H4.1	Value	-0.444	-0.343	0.290	1.534	0.125
H4.2	Usability Barrier (Rev)	-0.233	-0.235	0.049	4.724	0.000 ***
H4.3	Security Risk Barrier	-0.092	-0.091	0.057	1.604	0.109
H4.4	Tech. Anxiety Barrier	-0.172	-0.171	0.061	2.798	0.005 **

Table 4. Results from the H2, H3, and H4 sets about effect on adoption barriers.

*Notes*: (Rev) = reverted scale of variable; P. = personal; Tech. = technology; SQB = status-quo barrier; M = mean; SD = standard deviation; t/p = t-/p-value, \* p < 0.05, \*\* p < 0.01, \*\*\* p < 0.00.

Based on the given results, personalization only has a significant effect on the usability barrier (*t*-Stat 5.8, p < 0.00) and on the technological anxiety (*t*-Stat 2.2, p < 0.04), whereas the influence on value and perceived dependence is not strong enough, though the direction shows as expected by the model. Communication has a significant correlation with the image (*t*-Stat 2.4, p < 0.02), perceived dependence (*t*-Stat 3.1, p < 0.01), and technological anxiety (*t*-Stat 2.1, p < 0.04) barriers but no significance with the tradition and inertia barriers. Moreover, a significant effect of communication was found on the usability barrier (*t*-Stat 2.4, p < 0.02). The directions of the effects are all negative, as expected by the model. Data management has significant effects on the usability (*t*-Stat 4.7, p < 0.00) and technological anxiety (*t*-Stat 2.8, p < 0.01) barriers but no significance with perceived value and security risk barriers. A significant effect of data management was also found on the image barrier (*t*-Stat 2.4, p < 0.02). For an overview of the significant results, see Figure 2.



**Figure 2.** Significant factors in the adoption Model for digital platform services to manage the COVID-19 vaccination. Notes: \*\* p < 0.01, \* p < 0.05.

#### 4. Discussion

#### 4.1. Platform Services for Vaccination Processes—Implications for Further Research

The resistance model of Mani and Chouk [27] has been originally developed for measuring the acceptance of new technologies in consumer-goods markets, so this study proposed an adjusted adoption model explaining platform services for vaccination services, and in general, for new digital health services. This study gives empirical evidence for the applicability of the model. Eight barriers were identified that coin the acceptance of digital vaccination services based on the three platform configuration areas: personalization, communication and data management (see Figure 2). Most of the factor loadings confirm the model. Above all, the usability barrier has the highest effect on adoption intention and should be marked as the top influence factor. This study eventually supports the results of Ram and Sheth [31]. The significant image barrier, as the second most important factor, substantiates the findings of, for example, Laukkanen [34], stating that if the identity does not fit to the proposed function of a digital innovation, individuals may shun it. However, image, especially in the context of marketing communication, is often understood as a network of different associations from which expectations arise, which are not necessarily linked to one's own self-concept [66]. Further studies are needed to clarify the role of image on innovation acceptance. Interestingly, only image has a significant effect in our model, and neither tradition nor technological vulnerabilities (perceived dependence and technological anxiety).

The insignificant role of value is quite striking. This stands in contrast to studies covering consumer-goods markets, in which the perceived value, as a lack of monetary and performance value of an innovation, has been shown as one of the key drivers in terms of adoption [29]. In addition, studies on digital technologies tackling COVID-19 showed the expected performance (as a proxy for value) as the strongest factor regarding technology adoption [18]. A possible reason is that the benefit of the vaccination is utmost high (given the risk of death from COVID-19 and given the regained freedom of economic activity) and that there is no substitute available (though COVID-19 testing may be a temporary substitute). Hence, the value in the original sense of a price–benefit ratio plays a minor

role here. An alternative reason is related to the characteristics of the mandatory German healthcare system, where prices for treatments, drugs, vaccines, etc., are not shown to the patients and thus are not anchored in patients' minds.

Though inertia, has shown to be a leading factor influencing the adoption of innovations [38], there has been no significant effect found in this study. During the COVID-19 pandemic, there have been repeated calls from politicians and experts to motivate the latecomers and vaccine defaulters to vaccinate to significantly increase vaccination rates. This inertia in terms of vaccine hesitancy [67] is not reflected in our study. It remains to be tested in future studies whether this result can be replicated in the healthcare system in general or whether it can be attributed specifically to, for example, the subjective perceived lethality of COVID-19 in the general population [68].

In addition, our study shows remarkable results on the influence of age and education on the adoption of digital platform services. Especially as many older people had to be vaccinated first (categorization in Germany started with the older 80 years old citizens in contrast to other countries such as the United States) where human service, tradition, and technological anxiety would have been to be expected quite relevant, it was shown that even 80% of the vaccination booking were completed online as the vaccination started in Saarland [69]. Assumingly, older people were supported by family or care personal, but the results from our study have shown that 85% booked by themselves online. Supporting this finding, age as a control factor did not influence the adoption intention. Nevertheless, we consider it necessary to investigate in further research what level of digital literacy is needed among vulnerable groups, such as the elderly, people living in rural areas or in developing countries, to facilitate these groups' access to digital health services in general and digital services for vaccination management. Moreover, and in line with the metaanalysis by Byrnes et al. [70], which showed that men are more likely to take risks than women, our study also had a negative relation form gender on adoption, confirming the women were more restrictive to further use of digital platform services. Interestingly, the control factor of education also had a negative effect on intention to adopt, showing that a higher education tends to lead to a more conservative and careful behavior regarding the future use of platform services. Further research needs to clarify the counter-intuitive finding since professions with high educational requirements play a key role in healthcare systems and women constitute the majority workforce in many healthcare systems.

#### 4.2. Platform Services for Vaccination Processes—Implications for Management and Policy

For pandemic managers and policy makers, an important question is how to handle a pandemic and how to maximize the rapid adoption of related health services. This study proposes a digital vaccination service model as a helpful approach to manage vaccination processes. When introducing those services, the configuration areas of personalization, communication, and data management are useful concepts to be considered, since all had a significant effect on the adoption barriers. Though not all barriers were significant for the adoption intention of vaccination candidates, the compound effect of all barriers may not be neglected.

According to our study, functionality and ease of use are of major importance. The usability had the highest effect on the adoption intention and should be marked as the top influence factor for configurating platform services. The click flow (see Appendix A.6) seems decisive to determine the conversion or bouncing of users on digital health platforms. Therefore, following a patient-centered approach, the guidance throughout the digital vaccination journey is an eminently important design and management aspect. The influence of personalization on the usability is the strongest in the whole model. Thus, personalization should be priority number one for policy makers and pandemic-fighting officers—the ability to structure a service according to the needs and preferences of the subjects increases its viability for the user and thus should lower related notions of innovation resistance [71].

Communication, as the second area of platform configuration, has the highest number of effects on the adoption barriers, namely, usability, image, perceived dependence, and technological anxiety. As healthcare industries display a dominant risk-avoidance culture [47], information processing on platform services is critical to the vaccination management. This concerns information preparation as well as its distribution and updating. Detailed information enables individuals to judge the value of an innovation since its characteristics become understandable and the comparison to the detrimental status quo is possible [46]. Communication provides targeted information to lower barriers (i.e., usability), to map user preferences with the platform setup (i.e., addressing the image barrier), and to reduce the fear of technological vulnerabilities (i.e., minimizing technological dependence and anxiety barriers). It has a high influence on the psychological perception of how the digital service is accepted or rejected. In the federal state of Saarland, the information process was delivered not only on the federal health ministry site but also on the special site, www.impfen-saarland.de (accessed on 23 March 2022), with explanation and guidance, as well as an ongoing process with e-mail reminders, information attachments, route direction, SMS reminders, and a check list for the vaccination process in the dedicated vaccination centers.

Data management, as the third area of platform configuration, had an impact on usability and technology anxiety, which have already been shown in the literature about user churn due to insufficient capacity [55]. The management of vaccines and the management of related services must be thoughtfully differentiated as their perceived values have different sources of success. Partnerships between government organizations and the private sector, such as public–private partnerships or outsourcing models, can promote higher vaccination rates. For instance, the federal state of Saarland did not rely on their servers but hired a private e-health company with extensive experience and expertise. Moreover, with the engagement of this private partner, the federal state of Saarland followed an agile data management approach, including the setup of an additional upstream infrastructure with extra load balancers in front of the digital applications, such as scheduling and documentation, to ensure a smooth operation and a speedy and responsive experience with the digital vaccination platform. This approach is also in line with recent research calls to proactively promote organizational agility and flexibility to be able to act quickly in the event of unforeseen crises or changes [72].

#### 5. Conclusions

#### 5.1. Limitations

This study is located in Germany, an industrialized, developed country where enough vaccination doses can be ordered without any significant financial restrictions. Other countries and societies differ from this capability and are additionally coined by different social and cultural patterns. For instance, a striking difference was discovered between value and performance appreciation in the developing country of Nigeria [18] and the usability appreciation as top factor in Germany. Even in Europe, pandemic management was executed in different ways. Future research may even disclose differences in the countries. Another limitation is the focus on the COVID-19 vaccination campaign, which might be different for other (public) health services with less media attention and with less perceived threat and social restriction. In addition, the timing of this study is also special since it represents a comparatively large number of vaccination candidates who decided to be vaccinated comparatively early. At this point, we recommend the investigation of the groups of persons who decided for a later vaccination or who are vaccine-hesitant.

#### 5.2. Summary

This study bridges existing adoption and acceptance theories and models from consumer markets to the public health sector and delivers conceptualization and guidance for policy makers and pandemic managers. Based on the presented adjusted adoption model, policy makers have a framework of the challenges and barriers in managing public health services, such as vaccination offerings. As a further contribution, this study provides an orientation on how to prioritize the right platform configuration for digital health services. In this sense, we highlight three key learnings: (1) The usability barrier is the most important barrier that harms adoption, whereas value does not play a dominant role in contrast to consumer markets. This barrier can be managed by all three digital platform configuration areas of personalization, communication, and data management. (2) Personalization is the most important factor for managing the usability barrier by optimizing the best click flow on the digital health platform to address the needs, preferences, and situations of the citizens as users. (3) Inertia is often stressed as a problem within public discussion. It is said that latecomers and vaccine defaulters harm positive vaccination rates. Future research may evaluate these findings and the overall adjusted adoption model for digital platform services to manage COVID-19 vaccination in other organization forms and cultural areas to contribute to the goal of improving the management of future pandemic settings.

**Supplementary Materials:** The following supporting information can be downloaded at: https://www.mdpi.com/article/10.3390/vaccines11040750/s1, File S1: Digital-Vaccination-Adoption-Saarland-2021.

**Author Contributions:** Conceptualization, A.A., B.S. and C.W.; methodology, B.S.; software, B.S.; validation, B.S.; formal analysis, B.S.; investigation, A.A.; resources, A.A.; data curation, B.S.; writing—original draft preparation, A.A., B.S. and C.W.; writing—review and editing, A.A., B.S. and C.W.; visualization, A.A. and B.S.; supervision, A.A., B.S. and C.W.; project administration, A.A. All authors have read and agreed to the published version of the manuscript.

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Informed Consent Statement: Included in the questionnaire.

Data Availability Statement: The data set can be downloaded at Supplementary File S1.

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Conflicts of Interest: The authors declare no conflict of interest.

#### Appendix A

#### Appendix A.1 Literature Review

The research database Ex Libris Primo (Ex Libris Primo covers hundreds of millions of articles, see https://gm.primo.wrlc.org (accessed on 23 March 2022) showed 35 articles with the search strings "COVID-19 management" and "digital tools". We clustered the articles according to the general patient supply of care management (Sowell RL, Grier J. Integrated case management: the AID Atlanta Model. *J Case Manag*. 1995;4(1):15–21.): Level 1 (early intervention): eighteen articles concentrating on general information (e.g., webinars and education tools); Level 2 (low-need intervention): fourteen articles dealing with prevention (e.g., tracking and safety tools, referring also to the abbreviation "CDTT", as for COVID-19 digital tackling technologies, such as tracking and contact tracing, social distance monitoring, temperature screening, diagnosing, and symptom tracking (Akinnuwsi et al., 2022)); Level 3 (high-need intervention): three articles, putting a focus on diagnosis and treatment (which is also our research focus with vaccination management).

#	Author	Journal	Title
	1 (early intervention	n)	
1	Bolislis, Winona Rei; de Lucia, Maria Lucia; Dolz, Felipe; Mo, Runyi; Nagaoka, Makoto; Rodriguez, Heraclio; Woon, May Li; Yu, Wei; and Kühler, Thomas C.	Clinical therapeutics, 2021-01, Vol. 43 (1), p. 124–139	Regulatory Agilities in the Time of COVID-19: Overview, Trends, and Opportunities
2	Bouarroudj, Wissem; Boufaida, Zizette; and Bellatreche, Ladjel	Knowledge and information systems, 2022-01-03, Vol. 64 (2), p. 325–351	Named entity disambiguation in short texts over knowledge graphs
3	Emmerichs, Lars; Welter, Virginia Deborah Elaine; and Schlüter, Kirsten	Education sciences, 2021-11-30, Vol. 11 (12), p. 776	University Teacher Students' Learning in Times of COVID-19
4	Gourret Baumgart, Jade; Kane, Hélène; El-Hage, Wissam; Deloyer, Jocelyn; Maes, Christine; Lebas, Marie-Clotilde; Marazziti, Donatella; Thome, Johannes; Fond-Harmant, Laurence; and Denis, Frédéric	International journal of environmental research and public health, 2021-07-29, Vol. 18 (15), p. 8034	The Early Impacts of the COVID-19 Pandemic on Mental Health Facilities and Psychiatric Professionals
5	Griffith, Evan F.; Pius, Loupa; Manzano, Pablo; and Jost, Christine C.	Pastoralism: research, policy and practice, 2020-10-13, Vol. 10 (1), p. 22	COVID-19 in pastoral contexts in the greater Horn of Africa: Implications an recommendations
6	Khandelwal, Sudhir	Indian journal of social psychiatry: official publication of Indian Association for Social Psychiatry, 2020-10-01, Vol. 36 (5), p. 64–83	Debating the process, impact, and handling of social and health determinants of the COVID-19 pandemic
7	Langelotz, Lill and Mahon, Kathleen	Studies in continuing education, Vol. ahead-of-print (ahead-of-print), p. 1–16	Risk for professional learning when the academic community is forced online
8	Nyarko, Jacob; Serwornoo, Michael Yao Wodui; and Azanu, Benedine	Journal of African media studies, 2021-06-01, Vol. 13 (2), p. 159–175	Communication lapses to combating COVID-19 pandemic: Evaluating Ghana's COVID-19 campaign
9	Osseni, Issideen Ayinla	Tropical medicine and health, 2020-01-01, Vol. 48 (1), p. 1–48	COVID-19 pandemic in sub-Saharan Africa: preparedness, response, and hidden potentials
10	Peña-Ramos, José Antonio; Recuero-López, Fátima; Sánchez-Bayón, Antonio; and Sastre, Francisco Javier	International journal of environmental research and public health, 2021-12-07, Vol. 18 (24), p. 12907	Evaluation of Spanish Health System during the COVID-19 Pandemic: Accountability and Wellbeing Results
11	Piccarozzi, Michela; Silvestri, Cecilia; and Morganti, Patrizio	Sustainability (Basel, Switzerland), 2021-03-29, Vol. 13 (7), p. 3791	COVID-19 in Management Studies: A Systematic Literature Review
12	Sakurai, Mihoko and Chughtai, Hameed	European journal of information systems, 2020-09-02, Vol. 29 (5), p. 585–594	Resilience against crises: COVID-19 an lessons from natural disasters
13	Snowdon, Anne W. and Saunders, Michael J.	Healthcare management forum, 2022-03, Vol. 35 (2), p. 62–70	Supply chain integration as a strategy t strengthen pandemic responsiveness i Nova Scotia
14	The Innovation Research Interchange	Research technology management, 2020-11-19, Vol. 64 (1), p. 20–32	2021 R&D Trends Forecast: Results from the Innovation Research Interchange's Annual Survey
15	Tomčíková, Ľuba; Svetozarovová, Nella; Cocuľová, Jana; and Daňková, Zuzana	GeoJournal of tourism and geosites, 2021-06-30, Vol. 35 (2), p. 525–530	The Impact of the Global COVID-19 Pandemic on the Selected Practices of Human Resources Management in the Relationship to the Performance of Tourism Companies
16	van Olmen, Josefien	International journal of environmental research and public health, 2022-01-26, Vol. 19 (3), p. 1360	The Promise of Digital Self-Management: A Reflection abou the Effects of Patient-Targeted e-Healt Tools on Self-Management and Wellbeing

## Table A1. Literature Review.

Table A1. Cont.

#	Author	Journal	Title
	1 (early intervention	ı)	
17	Wai, Kyaw San; Khine, Wai Yee Krystal; Lim, Jane Mingjie; Neo, Pearlyn Hui Min; Tan, Rayner Kay Jin; and Ong, Suan Ee	Round table (London), 2021-01-02, Vol. 110 (1), p. 84–98	Malaysia, Myanmar, and Singapore: common threads, divergences, and lessons learned in responding to the COVID-19 pandemic
	2 (low-level intervent	ion)	
1	Acevedo-Flores, Jessica; Morillo, John; and Neyra-Rivera, Carlos	Advances in Emerging Trends and Technologies, 2020-12-19, p. 275–289	Industry 4.0 Technologies in the Contro of COVID-19 in Peru
2	Breeher, Laura; Boon, Ashton; Hainy, Caitlin; Murad, M. Hassan; Wittich, Christopher; and Swift, Melanie	Caitlin; Murad, M. Hassan; Wittich, 95 (7) p 1432–1444	
3	Chung, Sheng-Chia; Marlow, Sushila; Tobias, Nicholas; Alogna, Alessio; Alogna, Ivano; You, San-Lin; Khunti, Kamlesh; McKee, Martin; Michie, Susan; and Pillay, Deenan		Lessons from countries implementing find, test, trace, isolation, and support policies in the rapid response of the COVID-19 pandemic: a systematic review
4	Hansen, Stine Thestrup; Ehrari, Humira; Kristiansen, Susanne; Olsen, Lotte Schelde; Jensen, Rasmus Stig; Kjær, Troels Wesenberg; and Beck, Malene	Digital health, 2021-10, Vol. 7, p. 205520762110455–20552076211045590	User perspectives and preferences regarding a mobile health cough application: A qualitative study durin the coronavirus disease pandemic in Denmark
5	Jian, Shu-Wan; Cheng, Hao-Yuan; Huang, Xiang-Ting; and Liu, Ding-Ping		
6	Kuhlmann, Sabine and Franzke, Jochen	Local government studies, Vol. ahead-of-print (ahead-of-print), p. 1–23	Multi-level responses to COVID-19: crisis coordination in Germany from a intergovernmental perspective
7	Majam, Mohammed; Msolomba, Vanessa; Venter, François; Scott, Lesley Erica; Kahamba, Trish; Stevens, Wendy Susan; Rademeyer, Michael; van Tonder, Tanya; Karim, Sanjida; Kadam, Rigveda; and Akugizibwe, Paula	Diagnostics (Basel), 2022-02-03, Vol. 12 (2), p. 402	Monitored Implementation of COVID-19 Rapid Antigen Screening a Taxi Ranks in Johannesburg, South Africa
8	Mbiine, Ronald, Nakanwagi, Cephas; Lekuya, Herve Monka; Aine, Joan; Hakim, Kawesi; Nabunya, Lilian; and Tomusange, Henry	JMIR formative research, 2021-12-17, Vol. 5 (12), p. e27521–e27521	An Early Warning Mobile Health Screening and Risk Scoring App for Preventing In-Hospital Transmission COVID-19 by Health Care Workers: Development and Feasibility Study
9	Montagni, Ilaria; Roussel, Nicolas; Thiébaut, Rodolphe; and Tzourio, Christophe	Journal of medical Internet research, 2021-03-03, Vol. 23 (3), p. e26399–e26399	Health Care Students' Knowledge of and Attitudes, Beliefs, and Practices Toward the French COVID-19 App: Cross-sectional Questionnaire Study
10	Prata- Linhares, Martha Maria; Cardoso, Thiago da Silva Gusmão; Lopes-Jr, Derson S; and Zukowsky-Tavares, Cristina	Journal of education for teaching: JET, 2020-08-07, Vol. 46 (4), p. 554–564	Social distancing effects on the teachin systems and teacher education programmes in Brazil: reinventing without distorting teaching
11	Rasheed, Jawad; Jamil, Akhtar; Hameed, Alaa Ali; Al-Turjman, Fadi; and Rasheed, Ahmad	Interdisciplinary sciences: computational life sciences, 2021-04-22, Vol. 13 (2), p. 153–175	COVID-19 in the Age of Artificial Intelligence: A Comprehensive Review
12	Simmhan, Yogesh; Rambha, Tarun; Khochare, Aakash; Ramesh, Shriram; Baranawal, Animesh; George, John Varghese; Bhope, Rahul Atul; Namtirtha, Amrita; Sundararajan, Amritha; Bhargav, Sharath Suresh; Thakkar, Nihar; and Kiran, Raj	Journal of the Indian Institute of Science, 2020-11-11, Vol. 100 (4), p. 623–646	GoCoronaGo: Privacy Respecting Contact Tracing for COVID-19 Management

Table A1. Cont.

#	Author	Journal	Title
	1 (early intervention	1)	
13	Subramanian, Malliga; Shanmuga Vadivel, Kogilavani; Hatamleh, Wesam Atef; Alnuaim, Abeer Ali; Abdelhady, Mohamed; and V. E., Sathishkumar	Expert systems, 2021-10-06	The role of contemporary digital tools and technologies in COVID-19 crisis: Ar exploratory analysis
14	Syed Abdul, Shabbir; Ramaswamy, Meghna; Fernandez-Luque, Luis; John, Oommen; Pitti, Thejkiran; and Parashar, Babita	JMIR public health and surveillance, 2021-12-08, Vol. 7 (12), p. e31645–e31645	The Pandemic, Infodemic, and People's Resilience in India: Viewpoint
15	Yen, Wei-Ting	Asian politics & policy, 2020-07, Vol. 12 (3), p. 455–468	Taiwan's COVID-19 Management: Developmental State, Digital Governance, and State-Society Synerg
	3 (high-level intervent	ion)	
1	Anil, Krithika; Freeman, Jennifer A; Buckingham, Sarah; Demain, Sara; Gunn, Hilary; Jones, Ray B; Logan, Angela; Marsden, Jonathan; Playford, Diane; Sein, Kim; and Kent, Bridie	BMJ open, 2021-08-12, Vol. 11 (8), p. e049603–e049603	Scope, context and quality of telerehabilitation guidelines for physica disabilities: a scoping review
2	Müller, Alison; Cau, Alessandro; Semakula, Muhammed; Lodokiyiia, Peter; Abdullahi, Osman; Bullock, Miriam; Hayward, Andrew; and Lester, Richard	JMIR formative research, 2021-10-08	Digital mHealth and Virtual Care Use i Pandemics: A Rapid Landscape Revie of Interventions Used Internationally During COVID-19 in 4 Countries
3	Ummer, Osama; Scott, Kerry; Mohan, Diwakar; Chakraborty, Arpita; and LeFevre, Amnesty Elizabeth	BMJ global health, 2021-07-26, Vol. 6 (Suppl. 5), p. e005355	Connecting the dots: Kerala's use of digital technology during the COVID- response

Appendix A.2 Platform Configuration Categories

Table A2. Platform Configuration Categories.

Category	Dimensions	Platform Configuration for Vaccination	Theoretical Foundation	
Portal Design	Care Sector Target, Portal Specialization, Activity Monitoring, Patient Target	Personalization	Service Personalization Effort—Marketing Scale Handbook 5 Item 575, p. 861ff.	
Management	Appointment Booking, Prescription Renewal, Portal Customizability			
Communication	E-Consult, System Notifications,	Communication	Seigyoung et al. (2007)	
Instruction	Patient Education, Therapy Instructions	Communication	6, <u>8</u> ( ( ) ,	
Self-Management	Health-Monitoring, Visit Preparation		d and focused vaccination-processes (in rmany)	
Self-Determination	Declaration of Will, Second Opinion, Study Sign-Up			
Data Management	Record Access, Records Management, Health Data Amend, Health Data Upload	Data Management	Web interactivity/Speed of response—Johnson, Grace J., "The Dimensionality of Interactivity and Its effect on Key Consumer Variables," unpublished doctoral dissertation, Southern Illinois University, Carbondale, Illinois.	

Notes: platform configuration areas based on TOPCOP patient portal model (in accordance with Glöggler and Ammenwerth, 2021b).

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# Appendix A.3 Vaccination Rate in Germany

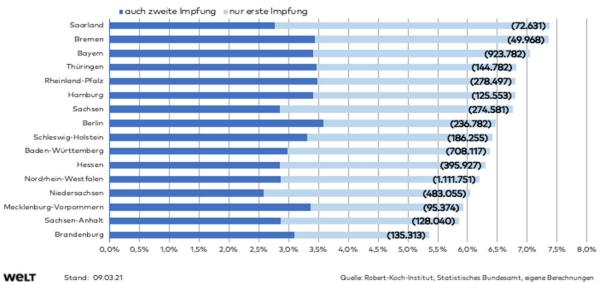
Rank	Federal State	Vaccination (in Thousands)	Population (in Million)	Vaccination Quota
1	Saarland	211.1	1.0	22%
2	Mecklenburg- Vorpommern	344.7	1.6	21%
3	Nordrhein- Westfalen	3614.5	17.9	20%
4	Bremen	132.6	0.7	19%
5	Rheinland-Pfalz	791.9	4.1	19%
6	Sachsen-Anhalt	413.7	2.2	19%
7	Niedersachsen	1479.3	8.0	18%
8	Bayern	2420.4	13.1	18%
9	Thüringen	388.3	2.1	18%
10	Baden- Württemberg	2008.6	11.1	18%
11	Hamburg	331.6	1.9	18%
12	Schleswig- Holstein	513.9	2.9	18%
13	Sachsen	713.0	4.1	18%
14	Hessen	1099.8	6.3	17%
15	Berlin	614.2	3.7	17%
16	Brandenburg	409.5	2.5	16%

Table A3. Vaccination quota in Germany on 30 April 2021.

(Source: [73]).

# Corona-Impfungen im Ländervergleich

Impfungen in Prozent der Bevölkerung (absolute Zahl der Erstimpfungen in Klammern)





Quelle: Robert-Kach-Institut, Statistisches Bundesamt, eigene Berechnungen

Figure A1. German newspaper "Welt" on vaccination rate of 16 federal states.

#### Appendix A.4 Survey Questionnaire (Original German Version) Teil 1 Allgemeine Informationen Bitte beantworten Sie die folgenden, auf Ihre Person bezogenen Fragen. 1. Welche Rolle nehmen Sie im Rahmen der COVID-19-Impfkampagne ein? (Bei mehreren Möglichkeiten, wählen Sie bitte die involvierteste Rolle.) Impfling/Zu impfende Person 0 Impfende(r) Ärztin bzw. Arzt 0 Medizinisches Fachpersonal zur Impfunterstützung 0 Nicht-medizinisches Fachpersonal zur Impfunterstützung 0 Freiwillige(r) Helfer\*in 0 0 Sonstige 2. Sind Sie beruflich im Gesundheitswesen tätig? 0 => Falls ja: ÷ Wie lange sind Sie bereits im Gesundheitswesen tätig? (Jahre) Wie lange engagieren Sie sich bereits im Rahmen der COVID 19 Impfkampagne? (Monate) Ļ Wie würden Sie ihre Position beschreiben? • Obere Führungsebene • Mittlere Führungsebene • Nachwuchsführungskraft • Angestellter • Sonstiges 3. Mit welchem Geschlecht identifizieren Sie sich (männlich, weiblich, andere/verschiedene)? 4. Welches Alter haben Sie? (Jahre)

- 5. Was ist der höchste Bildungsabschluss, welchen Sie abgeschlossen haben?
- o Kein Schulabschluss
- o Grundschule
- o Weiterführende Schule-Abschluss (Gymnasium, Realschule, etc.)
- o Bachelor Abschluss
- o Master/Diplom/MBA (oder Äquivalent)
- o Dr./PhD
- o Sonstiges
- 6. Wie haben Sie Ihren Impflisteneintrag erstellt:
- o Eigenständig online über die Impfliste
- o Über einen Angehörigen, der Sie online auf die Impfliste eingetragen hat
- o Eigenständig telefonisch über das Call-Center
- o Über einen Ängehörigen, der Sie telefonisch über das Call-Center für den Impftermin angemeldet hat
- 7. Über welche Kategorie haben Sie sich für den Impftermin angemeldet:
- o Kategorie 1 (Über 80jährige)
- o Kategorie 2 (70–80jährige)
- o Kategorie 3 (60–70-Jährige)
- o Kategorie 3 (Kontaktperson für Pflegebedürftige)
- o Kategorie 3 (Priorisierungscode aufgrund Vorbelastung)
- o Kategorie 3 (Priorisierungscode Berufs-bedingt)
- o Ohne Priorisierungscode (im Alter von 18–59)
- o Ohne Priorisierungscode (im Alter von 12–17)
- 8. Wie haben Sie den konkreten Impftermin erhalten:
- o Per E-Mail mit automatischer Terminvergabe
- o Per Post mit automatischer Terminvergabe
- o Online über die Impfliste für einen kurzfristig freien Impftermin
- o Online mittels Verschiebung des Impftermins über das Online-Impfportal
- Teil 2 Angaben zum Impfprozess

Bitte beantworten Sie inwiefern die folgenden Fragen auf Sie zu treffen (1-stimme überhaupt nicht zu; -7 stimme voll zu).

- (A) Digitale Impfprozess-Lösung Beschreibung
- 9. Das digitale Impfportal wurde so " eingerichtet", so dass ich es für mein persönliches Anliegen für die Impfung passend nutzen konnte.
- 10. Man hat sich Mühe gegeben, die digitale Impfprozess-Unterstützung an persönliche Bedürfnisse anzupassen.
- 11. Die Impfportal-Software ist soweit möglich auf meine allgemeine Situation eingegangen.
- 12. Die Lösung zum digitalen Impfmanagement hält mich gut auf dem Laufenden bezüglich der Erst- und Zweitimpfung.

- 13. Die Lösung zum digitalen Impfmanagement hat auch den Impfablauf im Impfzentrum gut vorbereitet und auf sinnvolle Weise erklärt.
- 14. Die Impfplattform-Software hat mich sinnvoll über den Impfprozess informiert.
- Bitte bewerten Sie die Geschwindigkeit, mit der die Webseiten auf Ihre Befehle reagiert haben.
- 15. Jedes Mal, wenn Sie die Impfprozess Software-Lösung genutzt haben, wie schnell hat diese reagiert?
- 16. Wenn Sie eine Aktion auf der Webseite durchgeführt haben, was war Ihr Eindruck davon, wie viel Verzögerung es gab, eine Antwort zu erhalten?
- 17. Bitte bewerten Sie die generelle Reaktionsgeschwindigkeit der Impfportal-Software.
- Bitte bewerten Sie wie die digitalen Dienste sich im Laufe der COVID-19-Situation verändert haben.
- 18. Die digitalen Lösungen zur Impfunterstützung wurden über die Zeit vom Bundesland Saarland verbessert.
- 19. Die Impfportal-Software wurde über die Zeit den aktuellen politischen Entwicklungen und Vorgaben angepasst.
- 20. Digitale Begleitung des Impfprozesses Evaluation
- 21. Ich bin mit generell zufrieden mit der Erfahrung, welche ich in der Impfanmeldung gemacht habe.
- 22. Insgesamt bin ich mit der digitalen Anmeldung zum Impfprozess zufrieden.
- 23. Ich bin mit generell mit dem Impfablauf des Bundesland Saarland zufrieden.
- 24. Ich bin mit generell mit der Kommunikation des Bundesland Saarland zum Impfablauf zufrieden.
- 25. Ich beabsichtige, in naher Zukunft digitale Dienste im Gesundheitswesen wie die Online-Impfanmeldung nutzen.
- 26. Ich werde, wenn möglich digitale Dienste zur Impfprozess-Begleitung nutzen, wenn ich das nächste Mal mich impfen lasse.
- 27. Generell verursacht die Nutzung von digitalen Lösungen im Impfprozess Probleme, die ich nicht brauche.
- 28. Die digitalen Lösungen im Impfprozess sind nichts für mich.
- 29. Die digitale Impfportal-Software (Anmeldung, etc.) war für mich einfach zu bedienen.
- 30. Es war einfach, das von mir gewünschte Ziel des Impftermins bei der Nutzung der Impfportal-Software (Anmeldung, etc.) zu erhalten.
- 31. Ich denke, dass mein Aufwand in der Nutzung der digitalen Impfportal-Software gering ist.
- 32. Ich denke, dass mein Aufwand in der Benutzung der digitalen Impfportal-Software größer als mein Nutzen ist.
- 33. Das Risiko des Missbrauchs von Nutzungsinformationen ist hoch bei der Nutzung der Impfportal-Software.
- 34. Das Risiko für den Missbrauch von persönlichen Informationen ist hoch bei der Anwendung von Impfportal-Software.
- 35. Ich bin der Meinung, dass die Nutzung der digitalen Impfportal-Software Risiken für meine Gesundheit birgt.
- 36. Die Nutzung der digitalen Impfunterstützung-Lösung kann meiner Meinung nach gesundheitlichen Risken beinhalten.
- 37. Ich identifiziere mich als typischer Nutzer von digitalen Diensten.
- 38. Ich passe zu dem Bild eines Nutzers von digitalen Lösungen.
- 39. Ich habe Angst, von der Technologie abhängig zu werden
- 40. Die Technologie wird meine eigene Freiheit und Eigenständigkeit einschränken
- 41. Ich meide digitale Technik, weil sie mir fremd ist.
- 42. Ich zögere, die meisten Formen von digitaler Technologie zu verwenden, aus Angst, Fehler zu machen, die ich nicht korrigieren kann.
- 43. Ich bin skeptisch gegenüber digitalen Lösungen.
- 44. Ich bezweifle, dass neue digitale Lösungen tatsächlich mehr erreichen können, als wie es bisher organisiert wurde.
- 45. Der menschliche Kontakt bei der Bereitstellung von Dienstleistungen macht den Prozess für den Kunden angenehm.
- 46. Persönliche Betreuung durch Servicemitarbeiter ist für mich sehr wichtig.
- 47. Ich betrachte Veränderungen oftmals als negativ.
- 48. Meiner Meinung nach waren die bisherigen technologischen Lösungen in der Gesundheitsversorgung vor COVID 19 bisher zufriedenstellend.

Appendix A.5 Survey Questionnaire (Translated English Version)

Part 1: General information.

 $ID \rightarrow Item \rightarrow Answer options/Anchor.$ 

- 1. What is your role in the COVID-19 vaccination campaign? (If more than one option, please choose the most involved role).
- Vaccinee/person to be vaccinated.
- Vaccinating physician(s).
- Medical personnel for vaccination support.
- Nonmedical personnel for vaccination support.
- $\bigcirc$  Volunteer(s).
- $\bigcirc$  Other.
- 1. Are you professionally active in the healthcare sector?
- 2. Yes/No—If yes: How long have you been working in healthcare? (years).

How long have you been involved in the COVID-19 immunization campaign? (months). How would you describe your position?

- Upper management level.
- Middle management.
- Junior executive.
- Salaried employee.
- Other.
- 3. With which gender do you identify  $\rightarrow$  male, female, other/different.
- 4. What age are you?  $\rightarrow$  # finished years.
- 5. What is the highest level of education you have completed?
- No high school diploma.
- Elementary school.
- Secondary school degree (Gymnasium, Realschule, etc.).
- $\bigcirc$  Bachelor's degree.
- Master's/Diploma/MBA (or equivalent).
- O Dr./PhD.
- Other.
- 6. How did you create your immunization list entry:
- On your own online via the immunization list.
- Via a relative who entered you on the vaccination list online.
- Independently by telephone via the call center.
- Via a relative who registered you for the vaccination appointment by telephone via the call center.
- 7. Through which category did you register for the vaccination appointment:
- Category 1 (over 80 years old).
- $\bigcirc$  Category 2 (70–80 years old).
- $\bigcirc$  Category 3 (60–70 years old).
- Category 3 (contact person for care recipients).
- Category 3 (prioritization code due to pre-existing condition).
- Category 3 (prioritization code due to occupation).
- $\bigcirc$  Without prioritization code (aged 18–59).
- Without prioritization code (age 12–17).
- 8. How did you get the specific vaccination date:
- O By e-mail with automatic appointment allocation.
- By mail with automatic appointment allocation.
- Online via the vaccination list for a short-term free vaccination appointment.
- Online by postponing the vaccination appointment via the online vaccination portal.
- 9. Please state your vaccination date.  $\rightarrow mm/dd/yy$ .
  - Part 2: Details of the vaccination process.
- (A) Digital vaccination process solution Description.
- 10. The digital vaccination portal was "set up" so that I could use it appropriately for my personal concern for vaccination. Please answer to what extent the following questions apply to you (1—strongly disagree; 7—strongly agree).
- 11. Effort has been made to customize the digital immunization process support to personal needs.  $\rightarrow$  see above.
- 12. The vaccination portal software has addressed my general situation as much as possible.  $\rightarrow$  see above.
- 13. The digital vaccination management solution keeps me well informed regarding first and second vaccinations.  $\rightarrow$  see above.
- 14. The digital vaccination management solution has also prepared me for the vaccination process in the vaccination center well and explained it in a meaningful way.  $\rightarrow$  see above.
- 15. The vaccination platform software provided me with useful information about the vaccination process.  $\rightarrow$  see above.

- 16. Each time you have used the vaccination process software solution, how quickly has it responded? → see above.
- 17. If you took an action on the website, what was your impression of how much delay there was in getting a response?  $\rightarrow$  see above.
- 18. Please evaluate the general response speed of the vaccination portal software.  $\rightarrow$  see above.
- 19. Digital solutions for immunization support have been improved over time by the federal state of Saarland.  $\rightarrow$  see above.
- 20. The vaccination portal software has been adapted over time to current political developments and requirements.  $\rightarrow$  see above.
- 21. I am generally satisfied with the experience I had in the vaccination registration.  $\rightarrow$  see above.
- (B) Digital support of the vaccination process–evaluation.
- 22. Overall, I am satisfied with the digital registration for the vaccination process.  $\rightarrow$  see above.
- 23. I am generally satisfied with the vaccination process of the federal state of Saarland.  $\rightarrow$  see above.
- 24. I am generally satisfied with the communication of the Federal State of Saarland regarding the vaccination process.  $\rightarrow$  see above.
- 25. I intend to use digital healthcare services such as online vaccination registration in the near future.  $\rightarrow$  see above.
- 26. If possible, I will use digital services to accompany healthcare services, such as the vaccination process, the next time.  $\rightarrow$  see above.
- 27. In general, the use of digital solutions in the vaccination process causes problems that I do not need.  $\rightarrow$  see above.
- 28. Digital solutions in the vaccination process are not for me.  $\rightarrow$  see above.
- 29. The digital vaccination portal software (registration, etc.) was easy for me to use.  $\rightarrow$  see above.
- 30. It was easy to get the goal of the vaccination appointment I wanted when using the vaccination portal software (registration, etc.).  $\rightarrow$  see above.
- 31. I think my effort in using the digital vaccination portal software is low.  $\rightarrow$  see above.
- 32. I think my effort in using the digital vaccination portal software is greater than my benefit.  $\rightarrow$  see above.
- 33. The risk of misuse of utilization information is high in using the vaccination portal software.  $\rightarrow$  see above.
- 34. The risk for misuse of personal information is high when using vaccination portal software.  $\rightarrow$  see above.
- 35. I believe that using digital immunization portal software poses risks to my health.  $\rightarrow$  see above.
- In my opinion, using the digital immunization support solution may pose risks to my health. → see above.
- 37. I identify myself as a typical user of digital services.  $\rightarrow$  see above.
- 38. I fit the image of a user of digital solutions.  $\rightarrow$  see above.
- 39. I am afraid of becoming dependent on the technology.  $\rightarrow$  see above.
- 40. Technology will limit my own freedom and autonomy see above.
- 41. I avoid digital technology because it is alien to me.  $\rightarrow$  see above.
- 42. I am reluctant to use most forms of digital technology for fear of making mistakes that I cannot correct.  $\rightarrow$  see above.
- 43. I am skeptical of digital solutions.  $\rightarrow$  see above.
- 44. I doubt that new digital solutions can actually achieve more than how it has been organized so far. → see above.
- 45. Human contact in the provision of services makes the process pleasant for the customer. → see above.
- 46. Personal attention from service staff is very important to me.  $\rightarrow$  see above.

- 47. I often view change as negative.  $\rightarrow$  see above.
- 48. In my opinion, previous technological solutions in healthcare before COVID-19 have been satisfactory. → see above.

Appendix A.6 Click Flow/Usability of Vaccination Portal of Federal State Saarland

#### www.impfen-saarland.de samedi How can we contact you? DE EN Registration for COVID-19 Registration for COVID-19 E-Mail Registration for COVID-19 vaccination vaccination vaccination Patient data To a vaccination cente se select in which vaccination center you could you can register as a prioritized person for the D-19 vaccination list. You will then automatically e your vaccination appointments by e-mail. ve neither an e-mail address nor a cell ph Impfzentrum Saarlouis portant: Initially, appointments can only be assign-people who meet the prioritization criteria. Please elect which group you belong to! Impfzentrum Saarbrücken Impfzentrum Neunkircher I am 80 years or older I confirm that I am entitled to vaccination Germany according to the vaccination I belong to a prioritized professional group □ I have read and accept the Privacy Policy. I agree to the transmission of my personal dat the Ministry of Social Affairs, Health, Women a Family of the Saarland as well as to the third parties commissioned with the operation of the ccination center, the ID card, health e card (if available) and proof of prioritizatio from the employer (with prioritization code) presented. Mi, 16 Dez 2020 07:00 Mi, 6 Jan 2021 07:00 e opera Mi, 16 Dez 2020 Mi, 6 Jan 2021 Please also remember your immunization card and medication list, if applicable. on to be contacted nt, e.g. for ap Mi, 16 Dez 2020 Mi, 6 Jan 2021 Mi, 16 Dez 2020 Mi, 6 Jan 2021 Mi, 16 Dez 2020 Mi, 6 Jan 2021

Figure A2. Illustration of the vaccination portal of Saarland ant its userflow.

# References

- 1. Saw, Y.E.; Tan, E.Y.Q.; Liu, J.S.; Liu, J.C. Predicting Public Uptake of Digital Contact Tracing During the COVID-19 Pandemic: Results from a Nationwide Survey in Singapore. *J. Med. Internet Res.* **2021**, *23*, e24730. [CrossRef] [PubMed]
- Smith, I.M.; Bayliss, E.; Salisbury, H.; Wheeler, A. Operations management on the front line of COVID-19 vaccination: Building capability at scale via technology-enhanced learning. *BMJ Open Qual.* 2021, 10, e001372. [CrossRef]
- Kis, Z.; Kontoravdi, C.; Shattock, R.; Shah, N. Resources, Production Scales and Time Required for Producing RNA Vaccines for the Global Pandemic Demand. *Vaccines* 2021, 9, 3. [CrossRef] [PubMed]
- 4. Kim, D.; Lee, Y.J. Vaccination strategies and transmission of COVID-19: Evidence across advanced countries. *J. Health Econ.* 2022, *82*, 102589. [CrossRef] [PubMed]
- 5. Kitagawa, T.; Wang, G. Who should get vaccinated? Individualized allocation of vaccines over SIR network. *J. Econom.* 2021, 232, 109–131. [CrossRef]
- 6. Radonjic-Simic, M.; Mahrt, C.; Niemand, S.; Speck, A.; Windrich, M. Decentralized Open Platform for Vaccination—A German Example: COVID-19-Vacc. J. Open Innov. Technol Mark. Complex. 2021, 7, 186. [CrossRef]
- Xu, Z.; Qu, H.; Ren, Y.; Gong, Z.; Ri, H.J.; Zhang, F.; Chen, X.; Zhu, W.; Shao, S.; Chen, X. Update on the COVID-19 Vaccine Research Trends: A Bibliometric Analysis. *Infect. Drug Resist.* 2021, 14, 4237–4247. [CrossRef] [PubMed]
- 8. Asadullah, A.; Faik, I.; Kankanhalli, A. Digital Platforms: A Review and Future Directions. In Proceedings of the 22nd Pacific Asia Conference on Information Systems, PACIS 2018, Yokohama, Japan, 26–30 June 2018; p. 248.
- 9. Hermes, S.; Riasanow, T.; Clemons, E.K.; Böhm, M.; Krcmar, H. The digital transformation of the healthcare industry: Exploring the rise of emerging platform ecosystems and their influence on the role of patients. *Bus Res.* **2020**, *13*, 1033–1069. [CrossRef]
- Collis, A.; Garimella, K.; Moehring, A.; Rahimian, M.A.; Babalola, S.; Gobat, N.H.; Shattuck, D.; Stolow, J.; Aral, S.; Eckles, D. Global survey on COVID-19 beliefs, behaviours and norms. *Nat. Hum. Behav.* 2022, *6*, 1310–1317. [CrossRef] [PubMed]
- 11. Fagherazzi, G.; Goetzinger, C.; Rashid, M.A.; Aguayo, G.A.; Huiart, L. Digital Health Strategies to Fight COVID-19 Worldwide: Challenges, Recommendations, and a Call for Papers. *J. Med. Internet Res.* **2020**, *22*, e19284. [CrossRef] [PubMed]
- Woldeyohannes, H.O.; Ngwenyama, O.K. Factors Influencing Acceptance and Continued Use of mhealth Apps. In HCl in Business, Government and Organizations. Interacting with Information Systems; Nah, F.F.H., Tan, C.H., Eds.; Lecture Notes in Computer Science; Springer: Berlin/Heidelberg, Germany, 2017; pp. 239–256. [CrossRef]

- 13. Rasheed, J.; Jamil, A.; Hameed, A.A.; Al-Turjman, F.; Rasheed, A. COVID-19 in the Age of Artificial Intelligence: A Comprehensive Review. *Interdiscip. Sci. Comput. Life Sci.* 2021, 13, 153–175. [CrossRef]
- 14. Syed Abdul, S.; Ramaswamy, M.; Fernandez-Luque, L.; John, O.; Pitti, T.; Parashar, B. The Pandemic, Infodemic, and People's Resilience in India: Viewpoint. *JMIR Public Health Surveill.* **2021**, *7*, e31645. [CrossRef] [PubMed]
- 15. Mbiine, R.; Nakanwagi, C.; Lekuya, H.M.; Aine, J.; Hakim, K.; Nabunya, L.; Tomusange, H. An Early Warning Mobile Health Screening and Risk Scoring App for Preventing In-Hospital Transmission of COVID-19 by Health Care Workers: Development and Feasibility Study. *JMIR Form Res.* 2021, *5*, e27521. [CrossRef] [PubMed]
- Han, S.; Cai, J.; Yang, J.; Zhang, J.; Wu, Q.; Zheng, W.; Shi, H.; Ajelli, M.; Zhou, X.H.; Yu, H. Time-varying optimization of COVID-19 vaccine prioritization in the context of limited vaccination capacity. *Nat. Commun.* 2021, *12*, 4673. [CrossRef] [PubMed]
- Chowdhury, S. Exclusion by Design: A Systematic Assessment of Community Engagement in COVID-19 Mobile Apps. Icahn School of Medicine at Mount Sinai. 2022. Available online: https://www.proquest.com/openview/0cf7e84eae2c056603f94299ce6 d2c8b/1?pq-origsite=gscholar&cbl=18750&diss=y (accessed on 12 June 2022).
- Akinnuwesi, B.A.; Uzoka, F.M.E.; Fashoto, S.G.; Mbunge, E.; Odumabo, A.; Amusa, O.O.; Okpeku, M.; Owolabi, O. A modified UTAUT model for the acceptance and use of digital technology for tackling COVID-19. *Sustain. Oper. Comput.* 2022, *3*, 118–135. [CrossRef]
- 19. Davis, F.D. A Technology Acceptance Model for Empirically Testing New End-User Information Systems: Theory and Results. Ph.D. Thesis, Massachusetts Institute of Technology, Cambridge, MA, USA, 1986.
- 20. Davis, F.D. Perceived Usefulness, Perceived Ease of Use, and User Acceptance of Information Technology. *MIS Q.* **1989**, *13*, 319–340. [CrossRef]
- 21. Ajzen, I. The theory of planned behavior. Organ. Behav. Hum. Decis. Process. 1991, 50, 179–211. [CrossRef]
- Venkatesh, V.; Morris, M.G.; Davis, G.B.; Davis, F.D. User Acceptance of Information Technology: Toward a Unified View. MIS Q. 2003, 27, 425–478. [CrossRef]
- 23. Amberg, M.; Hirschmeier, M.; Wehrmann, J. The Compass Acceptance Model for the analysis and evaluation of mobile services. *Int. J. Mob. Commun.* **2004**, *2*, 248–259. [CrossRef]
- Venkatesh, V.; Thong, J.Y.L.; Xu, X. Consumer Acceptance and Use of Information Technology: Extending the Unified Theory of Acceptance and Use of Technology. MIS Q. 2012, 36, 157–178. [CrossRef]
- Heidenreich, S.; Handrich, M. What about Passive Innovation Resistance? Investigating Adoption-Related Behavior from a Resistance Perspective. J. Prod. Innov. Manag. 2015, 32, 878–903. [CrossRef]
- 26. Ram, S. A Model of Innovation Resistance. Adv. Consum. Res. 1987, 14, 208-212.
- 27. Mani, Z.; Chouk, I. Consumer Resistance to Innovation in Services: Challenges and Barriers in the Internet of Things Era. J. Prod. Innov. Manag. 2018, 35, 780–807. [CrossRef]
- Kim, H.W.; Chan, H.C.; Gupta, S. Value-based Adoption of Mobile Internet: An empirical investigation. *Decis. Support. Syst.* 2007, 43, 111–126. [CrossRef]
- Laukkanen, T.; Sinkkonen, S.; Kivijärvi, M.; Laukkanen, P. Innovation resistance among mature consumers. J. Consum. Mark. 2007, 24, 419–427. [CrossRef]
- 30. Williamson, O.E. Markets and Hierarchies: Analysis and Antitrust Implications; Free Press: New York, NY, USA, 1975.
- Ram, S.; Sheth, J.N. Consumer Resistance to Innovations: The Marketing Problem and its solutions. J. Consum. Mark. 1989, 6, 5–14. [CrossRef]
- Kleijnen, M.; de Ruyter, K.; Wetzels, M. An assessment of value creation in mobile service delivery and the moderating role of time consciousness. J. Retail. 2007, 83, 33–46. [CrossRef]
- Shin, D.H.; Park, Y.J. Understanding the Internet of Things ecosystem: Multi-level analysis of users, society, and ecology. *Digit. Policy Regul. Gov.* 2017, 19, 77–100. [CrossRef]
- Laukkanen, T. Consumer adoption versus rejection decisions in seemingly similar service innovations: The case of the Internet and mobile banking. J. Bus. Res. 2016, 69, 2432–2439. [CrossRef]
- 35. Ng, I.C.L.; Wakenshaw, S.Y.L. The Internet-of-Things: Review and research directions. Int. J. Res. Mark. 2017, 34, 3–21. [CrossRef]
- 36. Venkatesh, V. Determinants of Perceived Ease of Use: Integrating Control, Intrinsic Motivation, and Emotion into the Technology Acceptance Model. *Inf. Syst. Res.* 2000, *11*, 342–365. [CrossRef]
- 37. Shu, Q.; Tu, Q.; Wang, K. The Impact of Computer Self-Efficacy and Technology Dependence on Computer-Related Technostress: A Social Cognitive Theory Perspective. *Int. J. Hum.-Comput. Interact.* **2011**, *27*, 923–939. [CrossRef]
- Polites, G.L.; Karahanna, E. Shackled to the Status Quo: The Inhibiting Effects of Incumbent System Habit, Switching Costs, and Inertia on New System Acceptance. *MIS Q.* 2012, 36, 21–42. [CrossRef]
- 39. Agarwal, R.; Gaule, P. What drives innovation? Lessons from COVID-19 R&D. J. Health. Econ. 2022, 82, 102591. [PubMed]
- 40. Tiwana, A. Platform Ecosystems: Aligning Architecture, Governance, and Strategy; Morgan Kaufmann: Burlington, MA, USA, 2014.
- Glöggler, M.; Ammenwerth, E. Improvement and Evaluation of the TOPCOP Taxonomy of Patient Portals: Taxonomy-Evaluation-Delphi (TED) Approach. J. Med. Internet Res. 2021, 23, e30701. [CrossRef] [PubMed]
- 42. Glushko, R.J.; Nomorosa, K.J. Substituting Information for Interaction: A Framework for Personalization in Service Encounters and Service Systems. J. Serv. Res. 2013, 16, 21–38. [CrossRef]
- Murthi, B.P.S.; Sarkar, S. The Role of the Management Sciences in Research on Personalization. *Manag. Sci.* 2003, 49, 1344–1362. [CrossRef]

- 44. Pearson, J.M.; Pearson, A.; Green, D. Determining the importance of key criteria in web usability. *Manag. Res. News.* 2007, 30, 816–828. [CrossRef]
- 45. Frambach, R.T.; Barkema, H.G.; Nooteboom, B.; Wedel, M. Adoption of a service innovation in the business market: An empirical test of supply-side variables. *J. Bus. Res.* **1998**, *41*, 161–174. [CrossRef]
- Talke, K.; Heidenreich, S. How to Overcome Pro-Change Bias: Incorporating Passive and Active Innovation Resistance in Innovation Decision Models. J. Prod. Innov. Manag. 2014, 31, 894–907. [CrossRef]
- 47. Annandale, E. Working on the Front-Line: Risk Culture and Nursing in the New NHS. Sociol. Rev. 1996, 44, 416–451. [CrossRef]
- 48. Heidenreich, S.; Kraemer, T. Passive innovation resistance: The curse of innovation? Investigating consequences for innovative consumer behavior. *J. Econ. Psychol.* 2015, *51*, 134–151. [CrossRef]
- Gilson, L. Trust and the development of health care as a social institution. *Soc. Sci. Med.* 2003, *56*, 1453–1468. [CrossRef] [PubMed]
   Naor, M.; Bernardes, E.S.; Druehl, C.T.; Shiftan, Y. Overcoming barriers to adoption of environmentally-friendly innovations
- through design and strategy: Learning from the failure of an electric vehicle infrastructure firm. *Int. J. Oper. Prod. Manag.* 2015, 35, 26–59. [CrossRef]
- Talwar, S.; Talwar, M.; Kaur, P.; Dhir, A. Consumers' Resistance to Digital Innovations: A Systematic Review and Framework Development. *Australas Mark J.* 2020, 28, 286–299. [CrossRef]
- 52. Ratchford, M.; Barnhart, M. Development and validation of the technology adoption propensity (TAP) index. J. Bus. Res. 2012, 65, 1209–1215. [CrossRef]
- 53. Igbaria, M.; Chakrabarti, A. Computer anxiety and attitudes towards microcomputer use. *Behav. Inf. Technol.* **1990**, *9*, 229–241. [CrossRef]
- 54. Goode, M.R.; Dahl, D.W.; Moreau, C.P. Innovation Aesthetics: The Relationship between Category Cues, Categorization Certainty, and Newness Perceptions. *J. Prod. Innov. Manag.* 2013, 30, 192–208. [CrossRef]
- Lovelock, C. Seeking synergy in service operations: Seven things marketers need to know about service operations. *Eur. Manag. J.* 1992, 10, 22–29. [CrossRef]
- Um, K.H.; Lau, A.K.W. Healthcare service failure: How dissatisfied patients respond to poor service quality. Int. J. Oper. Prod. Manag. 2018, 38, 1245–1270. [CrossRef]
- 57. Pearson, A.; Tadisina, S.; Griffin, C. The Role of E-Service Quality and Information Quality in Creating Perceived Value: Antecedents to Web Site Loyalty. *Inf. Syst. Manag.* **2012**, *29*, 201–215. [CrossRef]
- Heidenreich, S.; Spieth, P.; Petschnig, M. Ready, Steady, Green: Examining the Effectiveness of External Policies to Enhance the Adoption of Eco-Friendly Innovations. J. Prod. Innov. Manag. 2017, 34, 343–359. [CrossRef]
- 59. Auh, S.; Bell, S.J.; McLeod, C.S.; Shih, E. Co-production and customer loyalty in financial services. *J. Retail.* 2007, *83*, 359–370. [CrossRef]
- 60. Burnham, T.A.; Frels, J.K.; Mahajan, V. Consumer Switching Costs: A Typology, Antecedents, and Consequences. J. Acad. Mark. Sci. 2003, 31, 109–126. [CrossRef]
- 61. Johnson, G.J.; Bruner, I.I.G.C.; Kumar, A. Interactivity and its Facets Revisited: Theory and Empirical Test. J. Advert. 2006, 35, 35–52. [CrossRef]
- 62. Chin, W.W.; Newsted, P.R. Structural equation modeling analysis with small samples using partial least squares. In *Statistical Strategies for Small Sample Research*; Hoyle, R.H., Ed.; Sage Publications: Thousand Oaks, CA, USA, 1999; pp. 307–341.
- 63. Tenenhaus, M.; Vinzi, V.E.; Chatelin, Y.M.; Lauro, C. PLS path modeling. Comput. Stat. Data Anal. 2005, 48, 159–205. [CrossRef]
- 64. Nunnally, J.C.; Bernstein, I.H. *Psychometric Theory*, 3rd ed.; McGraw-Hill: New York, NY, USA, 1994.
- 65. Fornell, C.; Larcker, D.F. Structural Equation Models with Unobservable Variables and Measurement Error: Algebra and Statistics. J. Mark Res. 1981, 18, 382–388. [CrossRef]
- 66. Zhang, Y. The Impact of Brand Image on Consumer Behavior: A Literature Review. Open J. Bus. Manag. 2015, 3, 58-62. [CrossRef]
- Neumann-Böhme, S.; Varghese, N.E.; Sabat, I.; Barros, P.P.; Brouwer, W.; van Exel, J.; Schreyögg, J.; Stargardt, T. Once we have it, will we use it? A European survey on willingness to be vaccinated against COVID-19. *Eur. J. Health Econ.* 2020, 21, 977–982. [CrossRef] [PubMed]
- 68. Wang, J.; Fan, Y.; Palacios, J.; Chai, Y.; Guetta-Jeanrenaud, N.; Obradovich, N.; Zhou, C.; Zheng, S. Global evidence of expressed sentiment alterations during the COVID-19 pandemic. *Nat. Hum. Behav.* **2022**, *6*, 349–358. [CrossRef] [PubMed]
- 69. Samedi. Saarland Startet als Eines der Ersten Bundesländer Digitale Terminkoordination der Corona-Schutzimpfungen mit samedi/Saarland Is One of the First Federal States to Start Digital Appointment Coordination for Corona Vaccinations with Samedi. Published January 13, 2021. Available online: https://www.samedi.de/downloads/presse/2021-01-13\_samedi-PM\_ Saarland\_Corona-Impfzentren.pdf (accessed on 25 May 2021).
- 70. Byrnes, J.P.; Miller, D.C.; Schafer, W.D. Gender differences in risk taking: A meta-analysis. *Psychol. Bull.* **1999**, *125*, 367–383. [CrossRef]
- Guo, Y.; Salvendy, G. Factor Structure of Content Preparation for E-Business Web Sites: A Survey Results of Industrial Employees in P.R. China. In *Human-Computer Interaction. Interaction Design and Usability*; Jacko, J.A., Ed.; Springer: Berlin/Heidelberg, Germany, 2007; Volume 4550, pp. 784–795. [CrossRef]

- 72. Vargo, S.L.; Peters, L.; Kjellberg, H.; Koskela-Huotari, K.; Nenonen, S.; Polese, F.; Sarno, D.; Vaughan, C. Emergence in marketing: An institutional and ecosystem framework. *J. Acad. Mark Sci.* **2022**, *51*, 2–22. [CrossRef]
- 73. Digitales Impfquotenmonitoring zur COVID-19-Impfung/Digital Vaccination Rate Monitoring for COVID-19 Vaccination—German Government. Available online: https://www.rki.de/DE/Content/InfAZ/N/Neuartiges\_Coronavirus/Daten/Impfquoten-Tab.html (accessed on 21 March 2022).

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