

Title: Inequalities in Internet Access and the Impact of the COVID-19 Pandemic on Older Adults' Social Capital and Health: A Longitudinal Cohort Study

Luca Guido Valla, Michele Rossi, Alessandra Gaia, Antonio Guaita, Elena Rolandi

Submitted to: Journal of Medical Internet Research
on: June 07, 2024

Disclaimer: © The authors. All rights reserved. This is a privileged document currently under peer-review/community review. Authors have provided JMIR Publications with an exclusive license to publish this preprint on its website for review purposes only. While the final peer-reviewed paper may be licensed under a CC BY license on publication, at this stage authors and publisher expressly prohibit redistribution of this draft paper other than for review purposes.

Table of Contents

Original Manuscript.....	5
---------------------------------	----------

Preprint
JMIR Publications

Title: Inequalities in Internet Access and the Impact of the COVID-19 Pandemic on Older Adults' Social Capital and Health: A Longitudinal Cohort Study

Luca Guido Valla¹ PhD, MA, BSc; Michele Rossi² BSc; Alessandra Gaia³ PhD, MSc, BSc; Antonio Guaita² MD; Elena Rolandi^{2,4} BSc, MSc

¹Department of Statistical Sciences University of Padua Padova IT

²Fondazione Golgi Cenci Corso S. Martino, 10 20081 Abbiategrasso (MI) IT

³Centre for Longitudinal Studies UCL Social Research Institute London GB

⁴Department of Brain and Behavioral Sciences University of Pavia Pavia IT

Corresponding Author:

Alessandra Gaia PhD, MSc, BSc

Centre for Longitudinal Studies

UCL Social Research Institute

Room 101

55-59 Gordon Square

London

GB

Abstract

Background: During the COVID-19 pandemic, information and communication technology (ICT) became crucial for staying connected with loved ones and accessing health services. In this scenario, disparities in ICT use may have exacerbated other forms of inequality, especially among older adults who were less familiar with technology and more vulnerable to severe COVID-19 health consequences.

Objective: This study investigated changes in ICT use, psychological and physical health, and social capital before and after the pandemic among the oldest old population (aged 80 years or older after the pandemic) and explored how internet use influenced these changes.

Methods: We leveraged data from the InveCe.Ab study, a population-based longitudinal cohort of people born between 1935 and 1939 and living in Abbiategrasso, a municipality on the outskirts of Milan, Italy. Participants underwent multidimensional assessment at baseline (2010) and after 2, 4, 8 and 12 years. We restricted our analysis to cohort members who participated in the last wave (i.e., 2022) and who did not have a diagnosis of dementia (N=391). We used linear mixed models to assess the impact of COVID-19 and time on changes in social capital, physical and psychological health, and ICT use in a discontinuity regression design while controlling for age, sex, education and income satisfaction. Then, we assessed the influence of internet use and its interaction with COVID-19 on these changes.

Results: COVID-19 had a significant impact on social relationships ($\beta=-4.35$, 95% CI 6.38 – -2.32, $P<0.001$), cultural activities ($\beta=-0.56$, 95% CI -0.76 – -0.37, $P<0.001$), cognitive functioning ($\beta=-1.00$, 95% CI -1.28 – -0.72, $P<0.001$), depressive symptoms ($\beta=0.42$, 95% CI 0.10 – 0.74, $P=0.009$), physical health ($\beta=0.07$, 95% CI 0.04 – 0.10, $P<0.001$) and ICT use ($\beta=-0.11$, 95% CI -0.18 – -0.03, $P=0.008$). Internet use predicts greater social relationships ($\beta=3.34$, 95% CI 0.61 – 6.07, $P=0.017$), cognitive functioning ($\beta=0.70$, 95% CI 0.33 – 1.06, $P<0.001$) and reduced depressive symptoms ($\beta=-0.49$, 95% CI -0.91 – -0.06, $P=0.025$) over time. The interaction term of internet use * COVID-19 was significant for cultural activities ($\beta=-0.73$, 95% CI -1.22 – -0.24, $P=0.003$) and cognitive functioning ($\beta=1.36$, 95% CI 0.67 – 2.05, $P<0.001$).

Conclusions: The pandemic had adverse effects on older adults' health and social capital. Contrary to expectations, even ICT use dropped significantly after the pandemic. Internet users maintained higher social relationships and psychological health regardless of time and COVID-19 status. However, COVID-19 was associated with a steeper decline in cognitive functioning among internet nonusers. Policymakers may develop initiatives to encourage ICT adoption among older adults or strengthen their digital skills. Clinical Trial: NCT01345110

(JMIR Preprints 07/06/2024:62824)

DOI: <https://doi.org/10.2196/preprints.62824>

Preprint Settings

1) Would you like to publish your submitted manuscript as preprint?

✓ **Please make my preprint PDF available to anyone at any time (recommended).**

Please make my preprint PDF available only to logged-in users; I understand that my title and abstract will remain visible to all users.

Only make the preprint title and abstract visible.

No, I do not wish to publish my submitted manuscript as a preprint.

2) If accepted for publication in a JMIR journal, would you like the PDF to be visible to the public?

✓ **Yes, please make my accepted manuscript PDF available to anyone at any time (Recommended).**

Yes, but please make my accepted manuscript PDF available only to logged-in users; I understand that the title and abstract will remain visible to all users.

Yes, but only make the title and abstract visible (see Important note, above). I understand that if I later pay to participate in <http://www.jmir.org>, I will be able to access the full text of my article.

Original Manuscript

Title: Inequalities in Internet Access and the Impact of the COVID-19 Pandemic on Older Adults' Social Capital and Health: A Longitudinal Cohort Study

Abstract:

Background: During the COVID-19 pandemic, information and communication technology (ICT) became crucial for staying connected with loved ones and accessing health services. In this scenario, disparities in ICT use may have exacerbated other forms of inequality, especially among older adults who were less familiar with technology and more vulnerable to severe COVID-19 health consequences.

Objective: This study investigated changes in ICT use, psychological and physical health, and social capital before and after the pandemic among the oldest old population (aged 80 years or older after the pandemic) and explored how internet use influenced these changes.

Methods: We leveraged data from the InveCe.Ab study, a population-based longitudinal cohort of people born between 1935 and 1939 and living in Abbiategrasso, a municipality on the outskirts of Milan, Italy. Participants underwent multidimensional assessment at baseline (2010) and after 2, 4, 8 and 12 years. We restricted our analysis to cohort members who participated in the last wave (i.e., 2022) and who did not have a diagnosis of dementia (N=391). We used linear mixed models to assess the impact of COVID-19 and time on changes in social capital, physical and psychological health, and ICT use in a discontinuity regression design while controlling for age, sex, education and income satisfaction. Then, we assessed the influence of internet use and its interaction with COVID-19 on these changes.

Results: COVID-19 had a significant impact on social relationships ($\beta = -4.35$, 95% CI 6.38 – -2.32, $P = <0.001$), cultural activities ($\beta = -0.56$, 95% CI -0.76 – -0.37, $P = <0.001$), cognitive functioning ($\beta = -1.00$, 95% CI -1.28 – -0.72, $P = <0.001$), depressive symptoms ($\beta = 0.42$, 95% CI 0.10 – 0.74, $P = 0.009$), physical health ($\beta = 0.07$, 95% CI 0.04 – 0.10, $P = <0.001$) and ICT use ($\beta = -0.11$, 95% CI -0.18 – -0.03, $P = 0.008$). Internet use predicts greater social relationships ($\beta = 3.34$, 95% CI 0.61 – 6.07, $P = 0.017$), cognitive functioning ($\beta = 0.70$, 95% CI 0.33 – 1.06, $P = <0.001$) and reduced depressive symptoms ($\beta = -0.49$, 95% CI -0.91 – -0.06, $P = 0.025$) over time. The interaction term of internet use * COVID-19 was significant for cultural activities ($\beta = -0.73$, 95% CI -1.22 – -0.24, $P = 0.003$) and cognitive functioning ($\beta = 1.36$, 95% CI 0.67 – 2.05, $P = <0.001$).

Conclusions: The pandemic had adverse effects on older adults' health and social capital. Contrary to expectations, even ICT use dropped significantly after the pandemic. Internet users maintained higher social relationships and psychological health regardless of time and COVID-19 status. However, COVID-19 was associated with a steeper decline in cognitive functioning among internet nonusers. Policymakers may develop initiatives to encourage ICT adoption among older adults or strengthen their digital skills.

Trial registration: NCT01345110

Keywords: older adults, ICT use, COVID-19, social capital, health

Introduction

In the last few decades, the use of information and communications technology (ICT) has become pervasive and consistently more frequent at all ages [1,2]. The digitalisation of public services has made it necessary for citizens to develop a certain degree of confidence in using digital devices [3]. In addition to population ageing and contextual factors, this situation has contributed to an increase in the number of older adults who use ICT [4].

A growing number of studies have focused on different aspects of older individuals' use of ICT, including social media [5], smartphones [6], and computers [7]. Concurrently, the concept of the "digital divide", i.e., the difference between those who have access to and use (effectively) digital media and those who do not [8], has become highly relevant in the literature on ICT use among older adults [9,10].

One key area of investigation is the relationship between digital inequalities, access to health services, and social capital formation and maintenance, which is often fuelled by "virtual" interactions. Given recent research [11] that has advocated for the adoption of a multidimensional perspective in the study of inequalities, this study focuses on the interrelation between digital inequalities and inequalities in health and social capital in the context of the COVID-19 pandemic using longitudinal data on the oldest old segments of the population (over 80 years) living in the area of Abbiategrosso (Italy).

This study's context is particularly interesting in the context of research on older adults' habits and health as well as the impact of COVID-19 on these dimensions. Indeed, Italy has one of the oldest populations in the world. Abbiategrosso is in Lombardy, a region that was among the first to be affected by the COVID-19 pandemic in the West, with dramatic consequences on the mortality rate, health, and social life of older adults.

Social Capital and ICT Use among Older Adults

The relationship between ICT use and social capital is bidirectional. On the one hand, the possibility of staying connected with others is one of the main motives for the use of ICT among the general population and in old age. On the other hand, building and maintaining social relationships, especially intergenerational relationships, is crucial to helping older adults improve their digital skills. However, the vast literature on the relationship between ICT use and social capital in old age (for a review, see [12]) has numerous limitations due to a lack of consensus in the operationalisation of social capital, lack of identification of mechanisms that drive the formation and maintenance of social capital in old age, and limited focus on the oldest old people (those aged 80+).

An additional level of difficulty is related to the role of ICT in the formation and maintenance of social capital among older adults. With the increasingly widespread use of digital media, the very concept of social capital may change [13] to include forms of socialisation other than physical meetings and in-person participation in groups. Accordingly, research on this topic has considered the role of ICT use in these new forms of social capital [14]. The influence of ICT in stimulating face-to-face interactions (and other forms of social capital in its "traditional" sense, as presented above) has been widely investigated [15,16]. In addition, research has explored the effects of ICT use on dimensions of social capital, such as social participation, social exclusion, and loneliness [17]. Nonetheless, additional research is needed not only to validate and replicate prior research results but also to reflect on how, in the post-pandemic context, continuously evolving digital technologies and new forms of digital interactions may foster social capital.

Health and ICT Use among Older Adults

The relationship between ICT use and health in older individuals seems complex. This is due not only to the multifaceted nature of health but also to the diverse ways ICT can be used in the context of health care, ranging from telehealth to the online booking of medical appointments to searches for health-related information online.

Research on cognitive function shows that non-daily users of digital tools have overall lower cognitive performance than daily users [18], highlighting the beneficial effects of the use of digital tools on memory processes [19]. With respect to psychological health, research shows that people who use ICT experience fewer depressive symptoms and greater well-being [20–23].

The effects of ICT use on physical health in older adults have been studied less extensively. The literature mostly focuses on rehabilitation protocols using digital tools such as mobile apps. In this respect, the use of digital devices has proven to be effective in improving older people's autonomy in daily activities [24] and recovery from falls [25], which are a likely occurrence in old age [26].

Since multimorbidity is a relatively frequent condition in old age [27], studying the impact of ICT use on the management of related symptoms is a particularly interesting endeavour. Research has shown that the use of digital technologies by older people with two or more long-term health conditions can help them face day-to-day issues related to symptom management and self-reported perceptions of health conditions [28]. Overall, it seems that the use of digital technologies has positive effects on managing symptoms of co-existing pathologies and their perceived severity in old age.

The Impact of the COVID-19 Pandemic on Older Adults' Social Capital, Health and ICT Use

The COVID-19 pandemic had a remarkable impact on all the dimensions of interest in this research: social capital, health, and ICT use. First, social distancing measures limited older people's ability to meet with family members and friends and hindered the possibility of participating in face-to-face volunteer work, associations and activities within the local community [29].

Several activities have been moved to the online sphere. Older people seem to have shifted traditional face-to-face relationships to nonphysical contact through video calls, social messaging and social media [30]. In this respect, the pandemic seems to have accelerated the digitalisation of society and, in fact, the importance of access to and the ability to proficiently use digital technologies in day-to-day activities from socialising to accessing health services. Indeed, recent research has documented large amount of ICT adoption among the elderly population during the pandemic. It seems that the shift from in-person to online activities during the most acute phase of the pandemic encouraged older adults to start or continue using digital technologies [31].

With respect to health, the COVID-19 pandemic clearly had important direct and indirect effects on the physical and mental health of older people. First, as widely documented, the severity of symptoms and the COVID-19-related mortality rate increase with age [32]. However, the pandemic may also have had a strong indirect impact on the health and well-being of older people [33,34]. In particular, the congestion of several nations' health services due to the unprecedented demand for healthcare resulted in delays in diagnostic and therapeutic medical visits for health conditions other than those strictly related to COVID-19. This circumstance may have led medical conditions that required attention to be overlooked.

Other studies have examined the role of ICT use in recovery from the SARS-CoV-2 infection. On

this matter, existing protocols, which are regularly under evaluation [35], show that the use of digital devices to recover from COVID-19 is favoured by patients [36] and allows more personalised treatment plans [37]. While limited evidence exists to date, it is reasonable to anticipate a growing body of research in this area in the future.

Research Questions and Hypotheses

The evidence discussed above shows a multifaceted state of the art. While the number of studies investigating this topic has recently increased, existing research still suffers from numerous potential shortcomings that this study aims to address.

First, limited research has been conducted on the effects of ICT use on health and social capital in adults aged 80 and older, a rapidly growing portion of the population with unique health and social care needs. However, this topic has rarely been studied by researchers. We believe that this methodological choice might lead to an incomplete understanding of the issue. This research aims to fill this gap by studying the effects of ICT use with data from a sample of people around and over eighty years old.

Second, most existing studies were cross-sectional [38,39]. This type of research design is suitable for studying the associations between different dimensions, but it is not optimal for drawing conclusions on the direction of these associations. One limitation that affects the literature on the relationship between ICT use and health is a lack of assessment of the direction of the association between these two dimensions. While some of the aforementioned studies seem to suggest that ICT use drives better health outcomes, good health could be seen as a prerequisite (and a driver) for the acquisition of digital skills and digital technology adoption. Accordingly, longitudinal studies provide a favourable environment to establish the order of events (whether ICT adoption is associated with subsequent health outcomes), aiding in the assessment of causation [40].

Conversely, analysing prospective longitudinal cohort data is appropriate for capturing changes over time, which is crucial for studying a rapidly growing and dynamic phenomenon such as ICT use in older individuals.

Third, many studies on this topic have been conducted using qualitative research designs [41,42]. The advantages of these designs include a deeper investigation of subjective experiences and the possibility of investigating complex concepts without being bound to a predefined set of possible responses. However, qualitative studies lack standardised measurement, which is crucial for tracking evolution over time and assessing the magnitude of effects.

Furthermore, most existing studies have focused on only some of the dimensions considered in this study, namely, the effects of ICT use on cognitive functioning [43] and social relationships [38]. However, to our knowledge, no study to date has explored the evolution of ICT use, cognitive functions, and social relationships concurrently over time while adopting a multidimensional and multidisciplinary approach.

Considering the above, this research's objective is twofold. First, this study assesses the effects of the COVID-19 pandemic on changes in the ICT use, social capital, and physical and psychological health of the oldest old population. Second, this study aims to investigate whether ICT use plays a role in mitigating the impact of the COVID-19 pandemic on the aforementioned dimensions.

Specifically, two research questions (RQs) guided the investigation presented in this work.

RQ1: Is there any change in ICT use, psychological and physical health, and social capital before and after the pandemic among the oldest old population?

RQ2: Do higher levels of ICT use have an impact on psychological and physical health and social capital over time in the context of the COVID-19 pandemic?

In light of current knowledge on this topic, we hypothesised that during the COVID-19 pandemic, health and social capital deteriorated while ICT increased. We also hypothesised that pre-pandemic ICT use is positively associated with social capital and health as it facilitates interpersonal communication, promotes social gatherings, and facilitates recovery from health issues.

Methods

Study Context

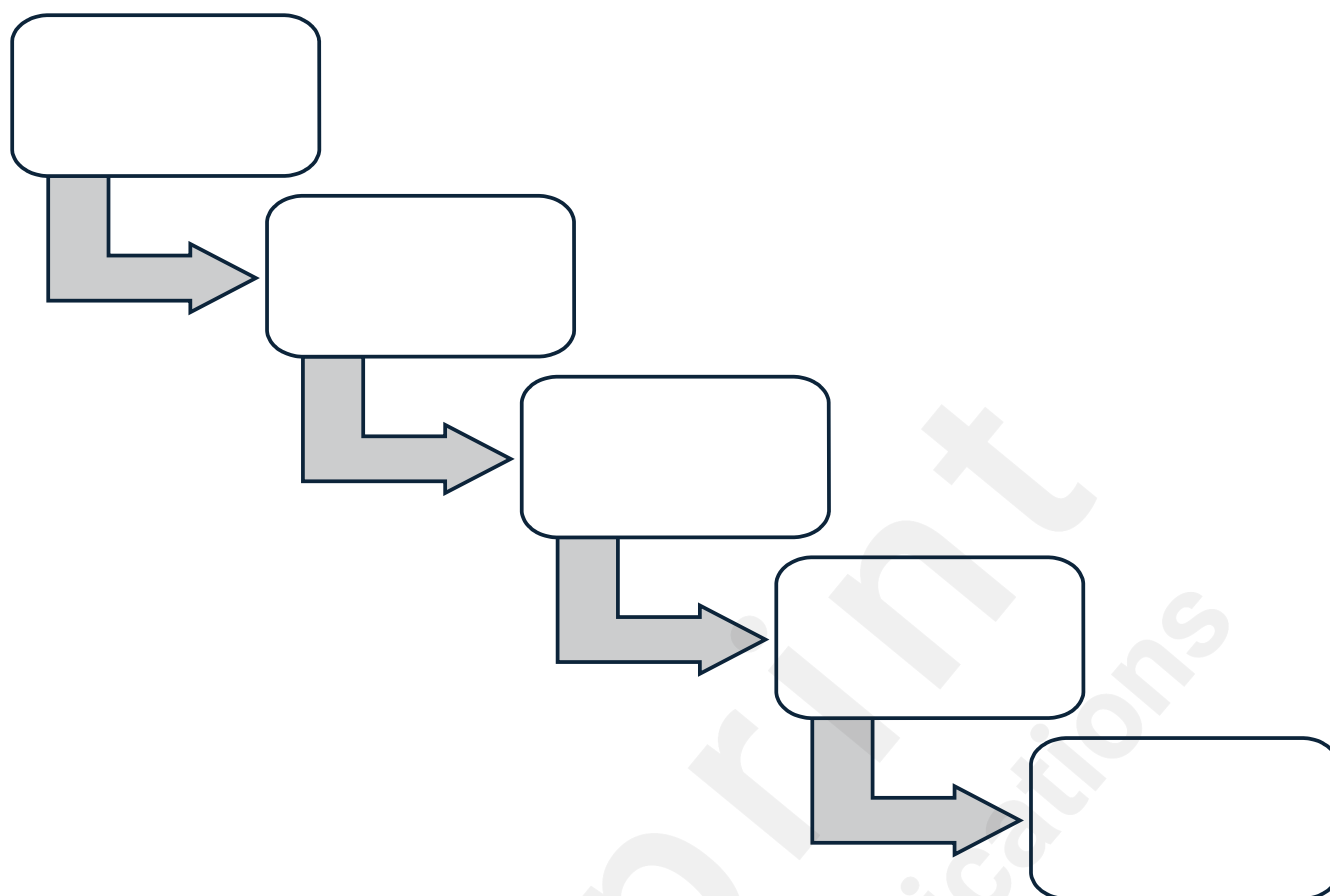
The data used in this research were collected as part of the study InveCe.Ab [44], a population-based cohort study conducted in Abbiategrasso, a municipality on the outskirts of the Metropolitan City of Milan (Italy). This study aimed to analyse the effects of ageing on cerebral functions and the biological, social, clinical, and neuropsychological factors related to the onset of dementia. The data were collected in five waves (2010, 2012, 2014, 2018, and 2022). The target population included older adults born between 1935 and 1939 who resided in Abbiategrasso on the prevalence day (1 November 2009). Data in each wave were collected through a multidimensional assessment that included a social and lifestyle questionnaire, a medical visit, a neuropsychological evaluation, and the collection of anthropometric measures and blood samples.

The study procedures were in accordance with the principles outlined in the Declaration of Helsinki of 1964 and the subsequent amendments. The InveCe.Ab study protocol was approved by the Ethics Committee of the University of Pavia on 6 October 2009 (Committee report 3/2009).

Participants

The baseline sample of the InveCe.Ab study included 1,321 people. In this work, we analysed data from a subsample composed of people who participated in the 2022 wave, who were not diagnosed with any form of dementia and who completed the full version of the questionnaire on social and lifestyle variables in the post-pandemic wave in 2022 ($N = 393$). Data from two participants were not included in the analyses because some of the variables considered in this study were not collected for these individuals. A visual representation of the case selection process is provided in Figure 1. We excluded sample members diagnosed with dementia from the analysis because we assumed that cognitive impairment could lead to measurement errors in self-reported health and social relationships as well as endogeneity. Moreover, we excluded data collected through a shortened version of the social and lifestyle questionnaire since it did not include some of the variables considered in this study.

Figure 1. Study participants selection



Measures

In the following, we describe the measures used in the analysis.

ICT Use. ICT use was measured with the following three questions: “Do you use a mobile phone?”, “Do you use a computer?”, and “Do you use the internet?”. The answer options were “yes”, “no”, and “I don’t know”. A derived variable was computed as the sum of the three questions.

Social Capital. To capture the multidimensional nature of social capital as much as possible, we computed two variables, namely, “Social relationships” and “Cultural activities”. The former was the product of the monthly frequency of in-person contact with family, friends, and colleagues, ranging from 0 (“there are none or not living together”) to 2 (“we meet frequently (four or more times a month)”), and self-reported satisfaction with these contacts, ranging from 0 (“not at all satisfied”) to 4 (“very satisfied”).

The “Cultural activities” variable was computed as the sum of cultural activities (in the last year) that entailed contact with other people. These included going to the cinema or the theatre, attending courses, volunteering, participating in associations or groups, and playing cards. Responses ranged from 0 (no involvement) to 2 (frequent involvement).

Physical Health. This dimension was quantified with the Cumulative Illness Rating Scale (CIRS) [45], a 14-category measure of clinical and functional acuteness. The first 13 elements of the CIRS scale were averaged to form the CIRS severity index.

Psychological Health. The assessment of psychological health comprised two dimensions: cognitive functioning and mood. The former was explored with the administration of the Mini-Mental State Examination (MMSE), which is a screening test used to detect cognitive impairment [46]. The latter was assessed with the Geriatric Depression Scale (GDS), a self-reported measure of depressive symptoms in old age [47].

Time. The passing of time was measured with a variable that could take five values (2010,

2012, 2014, 2018 and 2022) corresponding to the years the InveCe.Ab waves took place.

COVID-19. The presence or absence of the COVID-19 pandemic in a specific wave was operationalised with a dichotomous variable that took a value of 1 in 2022 and 0 in all other years.

Sociodemographic Variables. Age at baseline, sex, education, and the perception of the adequacy of one's income were considered relevant confounding factors due to their established association with ICT adoption and use.

Statistical Analysis

Power

To determine the minimum sample size required for the analyses, we conducted a power analysis with G*Power version 3.1.9.7 [48]. Under the linear multiple regression–random model group, we set the effect size at $f^2 = 0.05$, the significance criterion at $\alpha = 0.05$ and the power at $= 0.80$. Our sample size was sufficiently large to conduct the analyses.

Data analysis

Inferential analysis was conducted using R [49] and RStudio [50].

To investigate the effects of the pandemic on changes in the dimensions of interest (RQ1), we ran a series of linear mixed models (LMMs) with social capital, physical and psychological health, and ICT use as the outcomes and time and COVID-19 as the predictors in a discontinuity regression design [51]. Age, sex, education and the perception of the adequacy of one's income were included as controls. To further assess the impact of the COVID-19 pandemic in a discontinuity regression framework, we compared the predicted values of the post-pandemic wave (2022) based on the prespecified models considering the first four waves (2010-2018) and compared them with the observed values measured in 2022 with paired-sample *t* tests.

To address RQ2, we used the same approach but included internet use and the interactions between internet use and time and between internet use and Covid-19 as predictors and time, COVID-19, age, sex, education, and the perception of the adequacy of one's income as covariates. We adopted internet use as a predictor (rather than the abovementioned ICT use-derived variable) because online activities are likely to have a greater impact on the variables of interest than other forms of ICT use. Thus, this model included a time-varying predictor (internet use) and time-varying covariates.

Results

Sample Features

Descriptive statistics are reported in Table 1. On average, the participants were 72 years old when the InveCe.Ab study started and had an average education level of 7 years. The majority of the sample was composed of females (57%). Most people perceived their income as adequate or just enough. In the pre-pandemic wave conducted in 2018, approximately 7% of the participants reported that they did not use any ICT devices, while approximately 22% were internet users.

Table 1. Descriptive statistics

<u>Variables</u>	<u>Study sample (N=391)</u>
<u>Sociodemographic characteristics</u>	
Age at baseline	72.0 ± 1.3
Sex, female	57.0%
Education	7.4 ± 3.3
<i>Perceived adequacy of one's income:</i>	

Not adequate	7.5%
Just enough	40.6%
Adequate	51.9%
<u>Variables of interest</u>	
Social relationships	51.5 ± 16.8
Cultural activities	6.6 ± 1.9
Physical health (CIRS severity index)	1.5 ± 0.3
Cognitive functioning (MMSE)	27.8 ± 2.3
Depressive symptoms (GDS)	2.3 ± 2.6
<u>ICT use at baseline:</u>	
Internet use	13.0%
Computer use	18.4%
Mobile phone use	89.5%

Note: Values denote means and standard deviations for continuous variables and percentages for categorical variables. Abbreviations: CIRS = Cumulative Illness Rating Scale; GDS = Geriatric Depression Scale; ICT = Information and Communication Technology; MMSE = Mini Mental State Examination.

The Impact of the COVID-19 Pandemic

Table 2 shows the results of the LMM models used to evaluate the effect of COVID-19 on the longitudinal changes in the measures of interest.

COVID-19 appears to have reduced social capital ($Conditional R^2=0.58$), cultural activities ($Conditional R^2=0.68$), cognitive functioning ($Conditional R^2=0.57$), and ICT use ($Conditional R^2=0.77$) and increased depressive symptoms ($Conditional R^2=0.58$) and multi-morbidity ($Conditional R^2=0.57$). These effects were independent of time, sex, age, education, and perception of the adequacy of one's income.

These results were further supported by paired-sample t tests showing that the participants' social relationships (mean difference = -4.37, $P < 0.001$), cultural activities (mean difference = -0.56, $P < 0.001$), cognitive functioning (mean difference = -1.01, $P < 0.001$), and ICT use (mean difference = -0.10, $P < 0.001$) after the spread of the COVID-19 pandemic were significantly lower than expected. Concurrently, multimorbidity (mean difference = 0.07, $P < 0.001$) and depression (mean difference = 0.43, $P < 0.001$) were significantly greater than expected.

Table 2. Linear mixed models (LMMs) estimating the effect of COVID-19 on social relationships, cultural activities, cognitive functioning, depressive symptoms, physical health, and ICT use.

	Social relationships	Cultural activities	Cognitive functioning	Depressive symptoms	Physical Health	ICT use
COVID-19						
Estimates (SE)	-4.35 (1.04)	-0.56 (0.10)	-1.00 (0.14)	0.42 (0.16)	0.07 (0.02)	-0.11 (0.04)
95% CI	-6.38 -- -2.32	-0.76 -- 0.37	-1.28 -- 0.72	0.10--0.74	0.04--0.10	-0.18 -- 0.03
P	<0.001	<0.001	<0.001	0.009	<0.001	0.008

ICC	0.53	0.62	0.45	0.50	0.54	0.69
-----	------	------	------	------	------	------

Note: Standard errors are shown in parentheses. The confidence intervals were computed using the Wald method. The control variables are time, sex, age, education, and income adequacy. *P* values <0.05 are shown in italics.

The Role of Internet Use

Table 3 shows the results of the LMM models assessing the effect of internet use on the longitudinal changes in the measures of interest. Figure 2 shows the changes in the measures of interest stratified by internet use.

We found that internet use had a significant effect on social relationships ($Conditional R^2=0.58$), cognitive functioning ($Conditional R^2=0.58$), and depressive symptoms. The interaction term between internet use and time was not significant, indicating that the effects of internet use on the measures of interest were stable across waves. However, the interaction between internet use and COVID-19 was significant for cultural activities ($Conditional R^2=0.68$) and cognitive functioning, thus indicating that the effect of internet use on the measures of interest was modified by the pandemic, resulting in a steeper decline for internet users in cultural activities and a steeper decline in cognitive functioning for internet nonusers (see Figure 2). These effects were independent of time, COVID-19 status, sex, age, education and the perception of the adequacy of one's income.

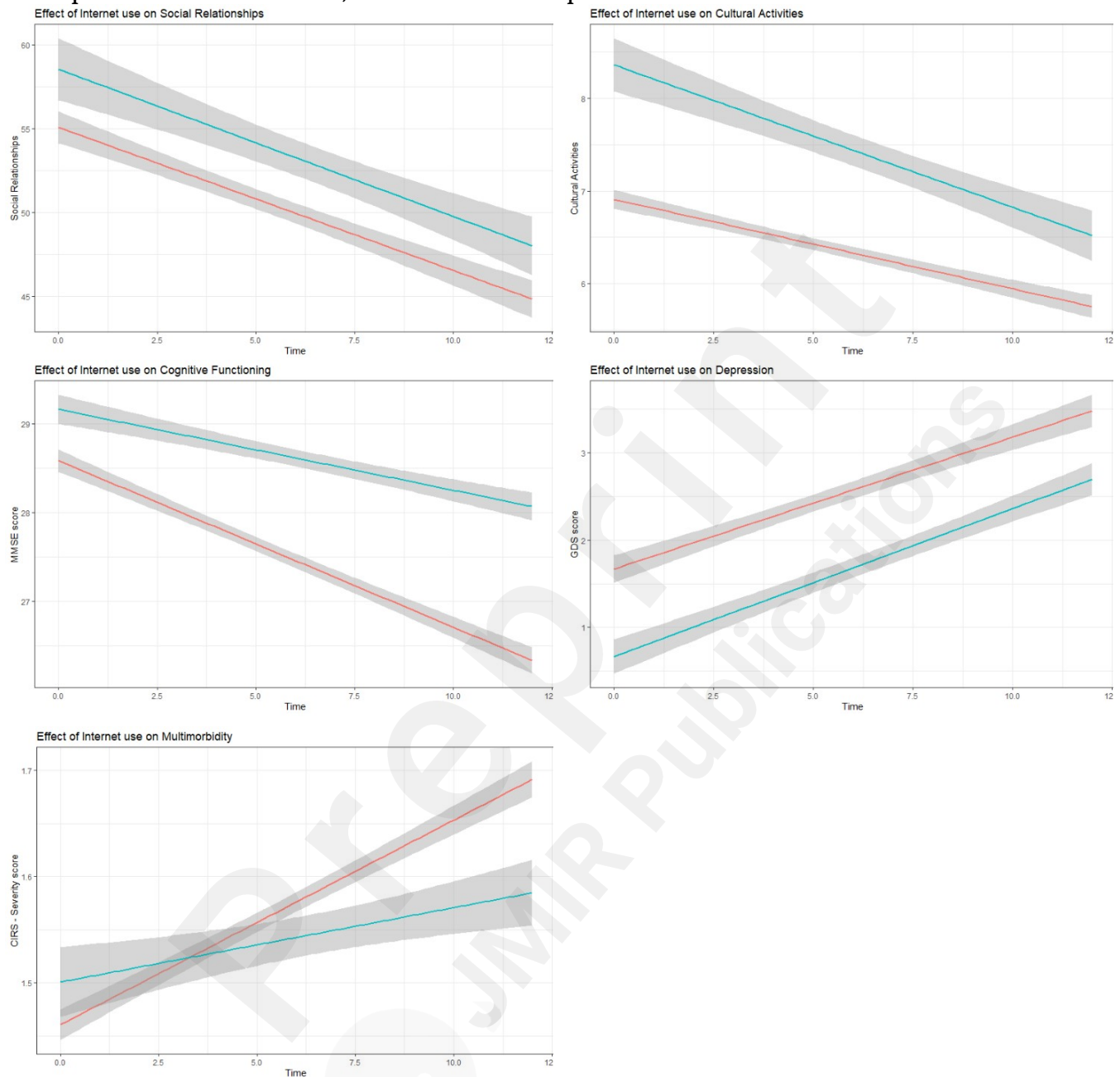
Table 3. Linear mixed models (LMMs) estimating the effect of internet use on social relationships, cultural activities, cognitive functioning, depressive symptoms, and physical health during the COVID-19 pandemic.

	Social relationships	Cultural activities	Cognitive functioning	Depressive symptoms	Physical Health
Internet use					
Estimates (SE)	3.34 (1.39)	- 0.08 (0.14)	0.70 (0.19)	-0.49 (0.22)	0.03 (0.02)
95% CI	0.61–6.07	-0.35–0.19	0.33–1.06	-0.91 – - 0.06	-0.07–0.01
<i>P</i>	<i>0.017</i>	0.571	<0.001	<i>0.025</i>	0.188
Internet use * time					
Estimates (SE)	0.10 (0.26)	-0.00 (0.03)	-0.00 (0.04)	-0.04 (0.04)	-0.01 (0.00)
95% CI	-0.41–0.62	-0.05–0.05	-0.07–0.07	-0.09–0.07	-0.01–0.00
<i>P</i>	0.692	0.946	0.989	0.738	0.183
Internet use*COVID-19					
Estimates (SE)	-0.22 (2.58)	-0.73 (0.25)	1.36 (0.35)	0.30 (0.40)	-0.07 (0.04)

95% CI	-5.28–4.84	-1.22 – - 0.24	0.67–2.05	-0.49–1.09	-0.15–0.01
<i>P</i>	0.932	<i>0.003</i>	<i><0.001</i>	0.456	0.084
ICC	0.53	0.62	0.45	0.50	0.55

Note: standard errors are shown in parentheses. The confidence intervals were computed using the Wald method. The control variables are time, sex, age, education, and income adequacy. *P* values <0.05 are shown in *italics*.

Figure 2. Visual representation of linear mixed models (LMMs) (research question 2). The blue line represents internet users, and the red line represents nonusers.



Discussion

Principal results

This study explored the impact of the COVID-19 pandemic on social capital, health and ICT use among older adults (research question one) and investigated the effects of internet use on older adults' social capital and health throughout time and in the context of the COVID-19 pandemic (research question two).

With regard to research question one, our results largely confirmed our hypotheses. In particular, the COVID-19 pandemic predicted reduced social capital in terms of social relationships and cultural activities that entail contact with other people. In addition, the results indicated that the pandemic was predictive of worsened physical condition. Consistently, we found that the pandemic predicted lower levels of psychological health, which was assessed through the MMSE and GDS to capture different aspects of this dimension, namely, cognitive functioning and depression. With respect to ICT use, we expected that the COVID-19 pandemic would predict heightened ICT use. This hypothesis has roots in the body of knowledge showing that the pandemic yielded higher levels of usage of digital technologies among older adults to stay connected with family and friends as a result of restrictions on in-person contact imposed by authorities. However, this hypothesis was not confirmed by the study results. In contrast, we found that the pandemic predicted a lower level of ICT use.

With respect to research question two, the results partially confirmed the hypotheses. More specifically, internet use was found to be predictive of stronger social relationships. However, internet use did not predict the number of cultural activities that involve contact with other people, such as attending courses and participating in associations. This may be because training and associateship still follow channels other than digital channels. Interestingly, the relationship between internet use and cultural activities was modified by the pandemic and showed a greater reduction in cultural activities related to internet use. During the COVID-19 pandemic, cultural activities that entailed contact with other people were significantly limited and not recommended, especially for older adults. We therefore speculate that the impact was greater for those who were habitually more involved in these kinds of activities. Although the participants' sociodemographic characteristics were accounted for in our models, we cannot rule out the possibility that internet users might have a sociodemographic profile that entails greater involvement in cultural activities that imply contact with other people. This is confirmed by internet users' higher levels in this dimension at the baseline, as Figure 2 suggests.

We also expected internet use to be positively associated with older adults' psychological health. Our results confirmed this hypothesis. Internet use positively predicted global cognition and was inversely related to depressive symptoms over time. Additionally, we found that COVID-19 modified the relationship between internet use and cognitive functioning, with nonusers showing a steeper decline in cognitive functioning during the pandemic.

Finally, internet use did not affect physical health. A possible explanation for this result is that the oldest-old segments of the population might use the internet mainly for communicating and may lack the digital skills required to access healthcare services online.

Comparisons with previous work

With regard to research question one, our results align with the findings of previous studies on the negative effects of the COVID-19 pandemic on social activities [52,53]. In relation to physical health, our results are in line with those of other studies showing that older adults are more vulnerable than other age groups to COVID-19 symptoms [54]. This outcome is consistent

with existing evidence regarding older people's health susceptibility to unfavourable consequences of viral infections [55]. Regarding the adverse impact of the pandemic on psychological health, our results reflect existing knowledge on the topic that highlights the adverse impact of the pandemic on older adults' health, such as lower cognitive functioning [56] and higher levels of depression [57]. With respect to the negative effect on ICT use, this finding might be explained by the return to in-person contact after the pandemic (in 2022, when our post-pandemic data were collected) and the resulting lower levels of digital technology use by older adults. Another aspect should be considered when interpreting these results: given the unexpected and extraordinary nature of the pandemic, older people may have faced these challenging times with the skills and tools that they had already mastered, which did not necessarily include ICT devices. Indeed, in our sample, only 13% of older adults used the internet at baseline, and 22.3% used it in the last wave before the pandemic (i.e., 2018). Rather than increasing ICT take-up, this age group may have turned to alternative sources of support. Finally, a possible decline in participants' physical and cognitive conditions may have led to a lower level of ICT use.

Moving to research question two, the predictive effect of internet use on stronger social relationships aligns with the current literature, which shows a positive effect of ICT use on social capital in older adults [58]. Other studies have demonstrated that ICT use in older adults contributes to reducing social isolation and loneliness [59]. Accordingly, internet use in older people promotes regular meetings with peers [60]. These effects might be explained by the greater number of remote contacts through digital devices who became in-person contacts at the end of the pandemic.

In relation to the effects of internet use on psychological health, our results are consistent with existing studies that show an overall positive effect of ICT use on older adults' psychological and cognitive health [61]. The effects of internet use on cognitive functioning may have different interpretations. Several studies have shown that the use of technology fosters cognitive function since it requires several cognitive skills. For instance, Choi and colleagues [62] reported that greater ICT use is associated with better performance in tasks related to episodic memory and executive functions. Similarly, Yeung and colleagues [63] demonstrated that higher levels of ICT use are associated with increased working memory and visuospatial ability. On the other hand, we cannot exclude reverse causality, with increased cognitive decline due to COVID-19 explaining a reduction in internet use.

The lack of effects of internet use on physical health is consistent with prior research that highlighted the sense of helplessness and insecurity of older adults in accessing digitally led healthcare [64]. Such concerns are greater in rural areas, where older adults show even lower levels of digital literacy and technology acceptance associated with healthcare [65]; hence, these findings may also apply to the suburban context of Abbiategrasso. Further research should explore different types of internet usage among the oldest old people.

In summary, our results integrated the current understanding of the topic and add new layers of knowledge. The longitudinal research design allowed us to explore the medium- to long-term effects of the dimensions considered herein, namely, older adults' ICT use, social capital and health. In addition, we studied the impact of the COVID-19 pandemic on these dimensions. Overall, the pandemic seemed to have a widespread negative impact on all of these aspects. Nonetheless, internet use seemed to predict greater social relationships and better psychological health levels over time. Thus, internet use is a protective factor as people age, independent of sociodemographic characteristics and the effect of COVID-19. We also found that COVID-19 modulated the relationships between internet use and several cultural activities and cognitive functioning, although in opposite directions.

This work has several strengths. First, to our knowledge, this is the first work that analyses ICT

use, social capital, and health in the oldest old population (80+ years old) and is based on probability-based longitudinal data and multidimensional assessments collected over a twelve-year period. In particular, medical and neuropsychological evaluations were combined with a self-reported appraisal of social activities and lifestyles to provide detailed information on each dimension.

Second, participants from a limited geographical area were included in this study, which limited the potential biases that might arise when the sample comprises individuals from different communities. Moreover, the fact that the data collection waves were conducted before and after the most acute phase of the COVID-19 pandemic allowed us to compare the impact of this event on the dimensions of interest.

Finally, by adopting a longitudinal design, we could observe ICT usage at baseline and outcomes of interest at later time points. This allowed us to overcome one key methodological limitation of the literature, which has adopted cross-sectional designs and failed to identify the direction of associations between the usage of technologies, health, and social capital.

Limitations

This research has several limitations. First, since this was an observational study and did not entail the experimental manipulation of the variables of interest, the exploration of the direction of causal inferences suffers from a certain degree of ambiguity. Additionally, ICT was measured as a dichotomous variable that assessed only use/nonuse. A more refined approach would capture nuances in the frequency of ICT usage. Furthermore, the longitudinal data were limited to one wave after the most acute phase of the pandemic. Future research may replicate this analysis should additional survey waves become available. Finally, the generalisability of our results to populations with different sociodemographic characteristics is limited. Future studies may address this issue by conducting similar research in different contexts and among populations with more heterogeneous characteristics.

Conclusions

The present study assessed the impact of the pandemic on older adults' health and social capital and explored the role of inequalities in ICT access by leveraging a population-based sample of older adults followed by multidimensional assessment over a 12-year period.

We believe our results will be of interest not only to the scientific community but also to policymakers by assisting them in assessing the importance of fostering ICT use in old age and drafting policy measures accordingly. First, the pandemic significantly affected multiple dimensions of older adults' lives. Measures aimed at aiding older people are particularly necessary in areas most significantly affected by the pandemic. As internet use seems to have beneficial effects on social capital maintenance and psychological and cognitive health in older adults, policymakers may develop initiatives that encourage the adoption of digital devices among older adults or strengthen their digital skills. Such initiatives may include, but are not limited to, intergenerational educational programmes through which young adults act as "cyber tutors" for older people [66,67] and courses to improve digital literacy in old age [68].

This work seeks to enrich the current body of knowledge on the effects of ICT use on older adults' social capital and health. This study provides direct evidence on the longitudinal trajectory of these relevant dimensions in a population-based sample of older adults residing in a specific context during the COVID-19 pandemic. Future research may address the limitations of this study and further develop a thorough understanding of these rapidly changing topics.

Disclosure of Interests. The authors have no competing interests to declare that are relevant to the content of this article.

References

1. Borgonovi F, Pokropek M. The evolution of the association between ICT use and reading achievement in 28 countries. *Computers and Education Open* 2021 Dec;2. doi: 10.1016/j.caeo.2021.100047
2. Monachesi P. Sustainable Development and ICT Use Among Elderly: A Comparison Between the Netherlands and Italy. 2019. p. 450–462. doi: 10.1007/978-3-030-22012-9_33
3. Nevado-Peña D, López-Ruiz V-R, Alfaro-Navarro J-L. Improving quality of life perception with ICT use and technological capacity in Europe. *Technol Forecast Soc Change* 2019 Nov;148:119734. doi: 10.1016/j.techfore.2019.119734
4. Li W, Ornstein KA, Li Y, Liu B. Barriers to learning a new technology to go online among older adults during the COVID-19 pandemic. *J Am Geriatr Soc* 2021 Nov 29;69(11):3051–3057. doi: 10.1111/jgs.17433
5. Nam S-J. Mediating effect of social support on the relationship between older adults' use of social media and their quality-of-life. *Current Psychology* 2021 Sep 11;40(9):4590–4598. doi: 10.1007/s12144-019-00399-3
6. Busch PA, Hausvik GI, Ropstad OK, Pettersen D. Smartphone usage among older adults. *Comput Human Behav* 2021 Aug;121:106783. doi: 10.1016/j.chb.2021.106783
7. Zhang S, Boot WR, Charness N. Does Computer Use Improve Older Adults' Cognitive Functioning? Evidence From the Personal Reminder Information and Social Management Trial. *Gerontologist* 2022 Aug 12;62(7):1063–1070. doi: 10.1093/geront/gnab188
8. Van Dijk J. The digital divide. John Wiley & Sons; 2020.
9. Chee SY. Age-related digital disparities, functional limitations, and social isolation: unraveling the grey digital divide between baby boomers and the silent generation in senior living facilities. *Aging Ment Health* 2023 Jul 10;1–12. doi: 10.1080/13607863.2023.2233454
10. Zhao Y, Zhang T, Dasgupta RK, Xia R. Narrowing the age-based digital divide: Developing digital capability through social activities. *Information Systems Journal* 2023 Mar 14;33(2):268–298. doi: 10.1111/isj.12400
11. Anand P, Chiappero-Martinetti E, Corneo G, Mcknight A, Moro E, O'Brien D, Peragine V, Stuhler J. Multidimensional perspectives on inequality: conceptual and empirical challenges. Publications Office of the European Union; 2020.
12. Warburton J, Cowan S, Bathgate T. Building social capital among rural, older Australians through information and communication technologies: A review article. *Australas J Ageing* 2013 Mar 11;32(1):8–14. doi: 10.1111/j.1741-6612.2012.00634.x
13. Ragnedda M, Ruiu ML. Social capital and the three levels of digital divide. *Theorizing digital divides* Routledge; 2017. p. 21–34.
14. Van Leeuwen C, Jacobs A, Mariën I. Catching the Digital Train on Time: Older Adults, Continuity, and Digital Inclusion. *Soc Incl* 2023 Jun 29;11(3). doi: 10.17645/si.v11i3.6723
15. Lee OE-K, Kim D-H, Beum KA. Factors affecting information and communication technology use and eHealth literacy among older adults in the US and South Korea. *Educ Gerontol* 2020 Sep 1;46(9):575–586. doi: 10.1080/03601277.2020.1790162
16. Zhou S, Ogihara A, Nishimura S, Jin Q. Analyzing the changes of health condition and social capital of elderly people using wearable devices. *Health Inf Sci Syst* 2018 Dec 20;6(1):4. doi: 10.1007/s13755-018-0044-2
17. Srivastava SK, Panigrahi PK. Social Participation among the Elderly: Moderated Mediation Model of Information and Communication Technology (ICT). *Communications of the Association for Information Systems* 2019;698–717. doi: 10.17705/1CAIS.04433
18. Wu Y-H, Lewis M, Rigaud A-S. Cognitive Function and Digital Device Use in Older Adults Attending a Memory Clinic. *Gerontol Geriatr Med* 2019 Jan 2;5:233372141984488. doi:

- 10.1177/2333721419844886
19. Chan MY, Haber S, Drew LM, Park DC. Training Older Adults to Use Tablet Computers: Does It Enhance Cognitive Function? *Gerontologist* 2016 Jun;56(3):475–484. doi: 10.1093/geront/gnu057
 20. Francis J, Kadylak T, Cotten SR, Rikard R V. When It Comes to Depression, ICT Use Matters: A Longitudinal Analysis of the Effect of ICT Use and Mattering on Depression Among Older Adults. 2016. p. 301–306. doi: 10.1007/978-3-319-40542-1_49
 21. Heo J, Chun S, Lee S, Lee KH, Kim J. Internet Use and Well-Being in Older Adults. *Cyberpsychol Behav Soc Netw* 2015 May;18(5):268–272. doi: 10.1089/cyber.2014.0549
 22. Nedeljko M, Bogataj D, Kaučič BM. The use of ICT in older adults strengthens their social network and reduces social isolation: Literature Review and Research Agenda. *IFAC-PapersOnLine* 2021;54(13):645–650. doi: 10.1016/j.ifacol.2021.10.524
 23. Sims T, Reed AE, Carr DC. Information and Communication Technology Use Is Related to Higher Well-Being Among the Oldest-Old. *J Gerontol B Psychol Sci Soc Sci* 2016 Oct 4;gbw130. doi: 10.1093/geronb/gbw130
 24. Ehn M, Eriksson LC, Åkerberg N, Johansson A-C. Activity Monitors as Support for Older Persons' Physical Activity in Daily Life: Qualitative Study of the Users' Experiences. *JMIR Mhealth Uhealth* 2018 Feb 1;6(2):e34. doi: 10.2196/mhealth.8345
 25. Hawley-Hague H, Tacconi C, Mellone S, Martinez E, Ford C, Chiari L, Helbostad J, Todd C. Smartphone Apps to Support Falls Rehabilitation Exercise: App Development and Usability and Acceptability Study. *JMIR Mhealth Uhealth* 2020 Sep 28;8(9):e15460. doi: 10.2196/15460
 26. Rubenstein LZ. Falls in older people: epidemiology, risk factors and strategies for prevention. *Age Ageing* 2006 Sep 1;35(suppl_2):ii37–ii41. doi: 10.1093/ageing/afl084
 27. Salive ME. Multimorbidity in Older Adults. *Epidemiol Rev* 2013 Jan 1;35(1):75–83. doi: 10.1093/epirev/mxs009
 28. Mateo-Abad M, Fullaondo A, Merino M, Gris S, Marchet F, Avolio F, Graps E, Ravic M, Kovac M, Benkovic V, Stevanovic R, Zwiefka A, Davies D, Mancin S, Forestiero A, Stafylas P, Hurtado M, D'Angelantonio M, Daugbjerg S, Pedersen CD, Hammerschmidt R, Stroetmann V, Azkargorta L, Giné A, Verdoy D, Soto-Gordoa M, Mora J, Mar J, Vergara I, De Manuel Keenoy E, CareWell project group O behalf of the. Impact Assessment of an Innovative Integrated Care Model for Older Complex Patients with Multimorbidity: The CareWell Project. *Int J Integr Care* 2020 May 22;20(2):8. doi: 10.5334/ijic.4711
 29. Shimokihara S, Maruta M, Hidaka Y, Akasaki Y, Tokuda K, Han G, Ikeda Y, Tabira T. Relationship of Decrease in Frequency of Socialization to Daily Life, Social Life, and Physical Function in Community-Dwelling Adults Aged 60 and Over after the COVID-19 Pandemic. *Int J Environ Res Public Health* 2021 Mar 4;18(5):2573. doi: 10.3390/ijerph18052573
 30. Arpino B, Pasqualini M, Bordone V. Physically distant but socially close? Changes in non-physical intergenerational contacts at the onset of the COVID-19 pandemic among older people in France, Italy and Spain. *Eur J Ageing* 2021 Jun 26;18(2):185–194. doi: 10.1007/s10433-021-00621-x
 31. Freedman VA, Hu M, Kasper JD. Changes in Older Adults' Social Contact During the COVID-19 Pandemic. *The Journals of Gerontology: Series B* 2022 Jul 5;77(7):e160–e166. doi: 10.1093/geronb/gbab166
 32. Ferroni E, Giorgi Rossi P, Spila Alegiani S, Trifirò G, Pitter G, Leoni O, Cereda D, Marino M, Pellizzari M, Fabiani M, Riccardo F, Sultana J, Massari M. Survival of Hospitalized COVID-19 Patients in Northern Italy: A Population-Based Cohort Study by the ITA-COVID-19 Network. *Clin Epidemiol* 2020 Dec;Volume 12:1337–1346. doi: 10.2147/CLEPS271763
 33. De Pue S, Gillebert C, Dierckx E, Vanderhasselt M-A, De Raedt R, Van den Bussche E. The impact of the COVID-19 pandemic on wellbeing and cognitive functioning of older adults. *Sci Rep* 2021

- Feb 25;11(1):4636. doi: 10.1038/s41598-021-84127-7
34. Zaninotto P, Iob E, Demakakos P, Steptoe A. Immediate and Longer-Term Changes in the Mental Health and Well-being of Older Adults in England During the COVID-19 Pandemic. *JAMA Psychiatry* 2022 Feb 1;79(2):151. doi: 10.1001/jamapsychiatry.2021.3749
 35. Hyde L, Simpson AJ, Nettleton M, Shepherdson J, Killingback C, Marshall P, Crooks MG, Green A. Tele-rehabilitation for patients who have been hospitalised with Covid-19: a mixed-methods feasibility trial protocol. *Physical Therapy Reviews* 2022 May 4;27(3):230–238. doi: 10.1080/10833196.2022.2028963
 36. Killingback C, Thompson M, Nettleton M, Hyde L, Marshall P, Shepherdson J, Crooks MG, Green A, Simpson AJ. Telerehabilitation for patients who have been hospitalised with covid-19: a qualitative study. *Disabil Rehabil* 2024 Jan 2;46(1):150–158. doi: 10.1080/09638288.2022.2159075
 37. Komilova DR qizi, Khusainboyev JD, Rustamov TR. Home-based rehabilitation for COVID-19 patients: a vital step towards recovery. *Proceedings of International Conference on Scientific Research in Natural and Social Sciences* 2023.
 38. Cotten SR, Anderson WA, McCullough BM. Impact of Internet Use on Loneliness and Contact with Others Among Older Adults: Cross-Sectional Analysis. *J Med Internet Res* 2013 Feb 28;15(2):e39. doi: 10.2196/jmir.2306
 39. Talmage CA, Knopf RC, Wu T, Winkel D, Mirchandani P, Candan KS. Decreasing Loneliness and Social Disconnectedness among Community-Dwelling Older Adults: The Potential of Information and Communication Technologies and Ride-Hailing Services. *Act Adapt Aging* 2021 Apr 3;45(2):89–117. doi: 10.1080/01924788.2020.1724584
 40. Learning Hub. Strengths of longitudinal data.
 41. Berg T, Winterton R, Petersen M, Warburton J. 'Although we're isolated, we're not really isolated': The value of information and communication technology for older people in rural Australia. *Australas J Ageing* 2017 Dec 22;36(4):313–317. doi: 10.1111/ajag.12449
 42. Quan-Haase A, Mo GY, Wellman B. Connected seniors: how older adults in East York exchange social support online and offline. *Inf Commun Soc* 2017 Jul 3;20(7):967–983. doi: 10.1080/1369118X.2017.1305428
 43. Kim YK, Han SH. Internet Use and Cognitive Functioning in Later Life: Focus on Asymmetric Effects and Contextual Factors. *Gerontologist* 2022 Mar 28;62(3):425–435. doi: 10.1093/geront/gnab149
 44. Guaita A, Colombo M, Vaccaro R, Fossi S, Vitali SF, Forloni G, Polito L, Davin A, Ferretti VV, Villani S. Brain aging and dementia during the transition from late adulthood to old age: design and methodology of the "Invece.Ab" population-based study. *BMC Geriatr* 2013 Dec 24;13(1):98. doi: 10.1186/1471-2318-13-98
 45. Parmelee PA, Thuras PD, Katz IR, Lawton MP. Validation of the Cumulative Illness Rating Scale in a Geriatric Residential Population. *J Am Geriatr Soc* 1995 Feb 27;43(2):130–137. doi: 10.1111/j.1532-5415.1995.tb06377.x
 46. Folstein MF, Folstein SE, McHugh PR. "Mini-mental state". A practical method for grading the cognitive state of patients for the clinician. *J Psychiatr Res* 1975 Nov;12(3):189–198. doi: 10.1016/0022-3956(75)90026-6
 47. Yesavage JA, Brink TL, Rose TL, Lum O, Huang V, Adey M, Leirer VO. Development and validation of a geriatric depression screening scale: A preliminary report. *J Psychiatr Res* 1982 Jan;17(1):37–49. doi: 10.1016/0022-3956(82)90033-4
 48. Faul F, Erdfelder E, Lang A-G, Buchner A. G*Power 3: A flexible statistical power analysis program for the social, behavioral, and biomedical sciences. *Behav Res Methods* 2007;39(2):175–191.
 49. R Core Team. R: A Language and Environment for Statistical Computing. Vienna, Austria: R

- Foundation for Statistical Computing; 2023.
50. Posit team. RStudio: Integrated Development Environment for R. Boston, MA: Posit Software, PBC; 2023.
 51. Bor J, Moscoe E, Mutevedzi P, Newell M-L, Bärnighausen T. Regression Discontinuity Designs in Epidemiology. *Epidemiology* 2014 Sep;25(5):729–737. doi: 10.1097/EDE.0000000000000138
 52. Choi EY, Farina MP, Wu Q, Ailshire J. COVID-19 Social Distancing Measures and Loneliness Among Older Adults. *The Journals of Gerontology: Series B* 2022 Jul 5;77(7):e167–e178. doi: 10.1093/geronb/gbab009
 53. Krendl AC, Perry BL. The Impact of Sheltering in Place During the COVID-19 Pandemic on Older Adults' Social and Mental Well-Being. *The Journals of Gerontology: Series B* 2021 Jan 18;76(2):e53–e58. doi: 10.1093/geronb/gbaa110
 54. Zhou F, Yu T, Du R, Fan G, Liu Y, Liu Z, Xiang J, Wang Y, Song B, Gu X, Guan L, Wei Y, Li H, Wu X, Xu J, Tu S, Zhang Y, Chen H, Cao B. Clinical course and risk factors for mortality of adult inpatients with COVID-19 in Wuhan, China: a retrospective cohort study. *The Lancet* 2020 Mar;395(10229):1054–1062. doi: 10.1016/S0140-6736(20)30566-3
 55. Thompson WW, Shay DK, Weintraub E, Brammer L, Cox N, Anderson LJ, Fukuda K. Mortality Associated With Influenza and Respiratory Syncytial Virus in the United States. *JAMA* 2003 Jan 8;289(2):179. doi: 10.1001/jama.289.2.179
 56. Sardella A, Chiara E, Alibrandi A, Bellone F, Catalano A, Lenzo V, Quattropiani MC, Basile G. Changes in Cognitive and Functional Status and in Quality of Life of Older Outpatients during the COVID-19 Pandemic. *Gerontology* 2022;68(11):1285–1290. doi: 10.1159/000525041
 57. Briggs R, McDowell CP, De Looze C, Kenny RA, Ward M. Depressive Symptoms Among Older Adults Pre- and Post-COVID-19 Pandemic. *J Am Med Dir Assoc* 2021 Nov;22(11):2251–2257. doi: 10.1016/j.jamda.2021.09.003
 58. Barbosa Neves B, Fonseca JRS, Amaro F, Pasqualotti A. Social capital and Internet use in an age-comparative perspective with a focus on later life. *PLoS One* 2018 Feb 26;13(2):e0192119. doi: 10.1371/journal.pone.0192119
 59. Ekoh PC, George EO, Ezulike CD. Digital and Physical Social Exclusion of Older People in Rural Nigeria in the Time of COVID-19. *J Gerontol Soc Work* 2021 Aug 18;64(6):629–642. doi: 10.1080/01634372.2021.1907496
 60. Lelkes O. Happier and less isolated: internet use in old age. *Journal of Poverty and Social Justice* 2013 Feb;21(1):33–46. doi: 10.1332/175982713X664047
 61. Fang Y, Chau AKC, Wong A, Fung HH, Woo J. Information and communicative technology use enhances psychological well-being of older adults: the roles of age, social connectedness, and frailty status. *Aging Ment Health* 2018 Nov 2;22(11):1516–1524. doi: 10.1080/13607863.2017.1358354
 62. Choi S, Hart PS. The influence of different efficacy constructs on energy conservation intentions and climate change policy support. *J Environ Psychol Elsevier Ltd*; 2021;75(May):101618. doi: 10.1016/j.jenvp.2021.101618
 63. Yeung DY, Chow LC, Ho AKK, Chung EKH. The effect of information and communications technology use on the well-being of older Hong Kong Chinese adults. *Educ Gerontol* 2023 Aug 3;49(8):710–725. doi: 10.1080/03601277.2022.2160131
 64. Raja M, Uhrenfeldt L, Galvin KT, Kymre IG. Older adults' sense of dignity in digitally led healthcare. *Nurs Ethics* 2022 Sep 20;29(6):1518–1529. doi: 10.1177/09697330221095140
 65. Park HK, Chung J, Ha J. Acceptance of technology related to healthcare among older Korean adults in rural areas: A mixed-method study. *Technol Soc* 2023 Feb;72:102182. doi: 10.1016/j.techsoc.2022.102182
 66. Casanova G, Zaccaria D, Rolandi E, Guaita A. The Effect of Information and Communication Technology and Social Networking Site Use on Older People's Well-Being in Relation to

- Loneliness: Review of Experimental Studies. J Med Internet Res 2021 Mar 1;23(3):e23588. doi: 10.2196/23588
67. Rolandi E, Sala E, Colombo M, Vaccaro R, Guaita A. Designing an Innovative Intergenerational Educational Program to Bridge the Digital Divide: The Cyber School for Grandparents Initiative. 2022. p. 398–412. doi: 10.1007/978-3-031-05654-3_28
68. Martin A. Digital literacy for the third age: Sustaining identity in an uncertain world. ELearning Papers 2009;12:1–15.

