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The combined impact of social networks and connectedness on anxiety, stress, and depression during COVID-19 quarantine: a retrospective observational study

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Introduction: The COVID-19 pandemic and associated quarantine measures have precipitated a surge in mental health disorders, particularly depression and anxiety. Government policies and restrictions on physical activity have contributed to this phenomenon, as well as diminished subjective social connectedness and exacerbated objective social isolation. As two dimensions of social isolation, it is worth noting that subjectively perceived social connectedness serves as a protective factor for mental health, whereas the decline in the size of objectively evaluated social networks poses a significant risk. However, research investigating the combined influence of these two dimensions remains limited.

Methods: This study used an online survey to collect data to investigate the effects of objective social connectedness and objective social networks on anxiety, stress, and depression during COVID-19 quarantine. A total of 485 participants were analyzed using statistical methods, including paired *t*-test, Pearson correlation analysis, linear regression, cluster analysis, ANOVA, and moderated mediated.

Results: The study found that anxiety and depression scores increased during the quarantine, with age, education, and social connectedness scores associated with the increase. Pre-quarantine anxiety and depression levels were strongly correlated with mental health status during quarantine. Cluster analysis, respectively, revealed three clusters for those without increasing anxiety and depression scores. The study also found that objective social network influences the impact of subjective social connectedness on pre-quarantine mental health, which in turn affects anxiety and depression levels during quarantine.

Conclusion: The study identified that quarantine increased anxiety and depression, with age being protective, and education and subjective social connectedness as risk factors. The study also emphasizes the comprehensive impact of objective and subjective social isolation. Although individuals perceive the same degree of social connectedness, those with smaller social networks are more prone to developing symptoms of anxiety and depression, which are also more likely to worsen during quarantine.

KEYWORDS

depression, anxiety, social isolation, moderated mediation, COVID-19, social connectedness

1 Introduction

The emergence of the COVID-19 pandemic in December 2019, which caused severe health implications and fatalities among those infected (1), has also had a profound impact on global mental health (2). Before the pandemic, the prevalence of major depressive disorder and anxiety disorders was 2.2% was 3.3% in China (3). People perceived stress in their daily lives, primarily including work pressures, school pressures, and family responsibilities. However, a staggering 27.6% increase in depression disorders and a 25.6% increase in anxiety disorders have been observed worldwide post the 2020 epidemic (4). Additionally, the COVID-19 pandemic created an environment that encompasses social restrictions, quarantine measures, closures of schools and businesses, loss of livelihoods, and reduced economic activity, which may severely impact the population's mental well-being (5). Economic uncertainties and disruptions became the new norm, intensifying anxiety. The inability to engage in usual social activities, coupled with fears of infection and unemployment, exacerbated stress levels. Quarantine and maintained social and physical distance can limit social interaction, triggering a host of negative consequences such as boredom, depression, feeling burdened, loneliness, and fear. These, in turn, pose risk factors for mental health problems, including anxiety, depression, suicide, and self-harm (6). Moreover, isolation measures coupled with a lack of interpersonal communication may exacerbate depression (7). Studies have suggested a major infectious disease can have many psychological effects on the public, which can be expressed as anxiety, fear, and worry (8). A cross-sectional study in China during the pandemic found prevalence rates of depression and anxiety of 20.1 and 18.2% (9). In these cases, it is necessary to safeguard the mental health of isolated populations and to identify and implement strategies and actions to promote mental health (10).

Social isolation consists of two separate structures, subjective social isolation, and objective social isolation (11, 12). Social connectedness, as subjective social isolation, is an important protective factor for psychosocial adjustment. It refers to an individual's subjective perception of maintaining close interpersonal relationships with society, including relationships with family, friends, community, school, and neighborhood (13). When individuals experience high levels of social connectedness, they tend to encounter a decrease in anxiety and depression, an increase in self-esteem, and an improvement in general population health (14). Conversely, individuals who lack social connectedness experience a pervasive sense of isolation and loneliness, which can be detrimental to their mental health (15). Reduced activity space and economic instability due to quarantine can increase loneliness (16). Research has found that social connectedness is associated with decreased anxiety, loneliness, suicidal ideation or attempts, and depression (17). An increase in social connectedness during the ongoing COVID-19 pandemic also has been shown to ameliorate mental health indicators (18).

Objective social isolation, measured by assessing the size of one's social network, is characterized by the lack or limitation of close personal contact with friends, family, and community ties (19, 20). The COVID-19 pandemic caused the death of family and friends, increased unemployment, and quarantine leading to a decrease in the activities of daily living, and these changes brought a reduction in the size of social networks (21). It has emerged as a growing public health problem with serious implications for both physical and mental

health. Indeed, objective social isolation may be considered an indication of compromised health and an unfavorable prognosis (22). The literature highlights that objective social isolation stands as a significant risk factor for diminished well-being, cognitive degeneration, and mortality within the general populace (23, 24). Social network is also associated with poor physical health and mental illnesses such as depressive symptoms (25, 26).

Objective social isolation limits opportunities for social interaction and may lead to feelings of loneliness, low self-esteem, and depression. Studies have found that higher loneliness scores are associated with lower levels of social connectedness (27). However, individuals experiencing smaller social networks may not necessarily feel subjective social isolation (28). Compared to males, some females may still perceive lower social connectedness despite having larger social network sizes (29). Older adults are particularly at risk for objective social isolation and subjective loneliness because of retirement, deaths of family members and friends, and declining quality of life (30). Based on our research, there have been limited previous studies that integrated both subjective and objective dimensions of social isolation to explore the impact on mental health. Therefore, the study was designed to explore changes in anxiety, stress, and depression as a result of experiencing quarantine, and simultaneously explore the combined impact of subjective social connectedness and objective social networks on these changes. In addition, we hypothesized that objective social networks would moderate the effect of subjective social connectedness on mental health status during the quarantine.

2 Methods

2.1 Participants

This study was completed from September 2022 to October 2022 in Chengdu, Sichuan Province, China, where all participants were undergoing a city-wide quarantine during the COVID-19 pandemic. All procedures were conducted in accordance with the ethical standards of the 1964 Declaration of Helsinki and its later amendments. The study was approved by the West China Hospital of Sichuan University Biomedical Research Ethics Committee on February 24, 2020 [Ethics Number: K2020006]. Retrospective data collection was based on an online web-based survey that collected demographic data, social networks, changes in anxiety, stress, and depression levels, and social connectedness of participants before and during the city-wide quarantine. All participants read informed consent before completing the questionnaire and were informed of the purpose of the study, the methods, and the risks and benefits they might derive from the study. Inclusion criteria: consent to participate in this questionnaire; quarantine status when completing the questionnaire. Exclusion criteria: previous diagnosis of novel coronavirus pneumonia; previous diagnosis of mental disorder. Because their mental health may be particularly vulnerable to the pandemic (31). Studies from different countries have found that individuals reporting COVID-19 symptoms, as well as those convalescing from acute COVID-19 illness exhibit higher levels of anxiety, depression, suicidal ideation, loneliness, and quality of life compared to healthy individuals (32-40). A total of 519 participants completed the survey. Finally, 485 participants were retained.

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2.2 Materials

2.2.1 Depression, anxiety and stress scale—Short form (DASS-21)

The DASS-21, a reliable and validated instrument, finds application within both clinical and non-clinical adult populations. Its purpose is to assess the perceived intensity of symptoms associated with depression, anxiety, and stress (41-43). It contains 21 items, with 7 items per subscale, answered on a four-point scale ranging from 0 (does not apply to me) to 3 (applies to me or most of the time), considering the extent to which each item has been applied to them in the past week. Standardized scores were the raw score multiplied by 2. Depressive symptoms were classified according to the following ranges: mild (10–15), moderate (14–20), severe (21–27), and extremely severe (\geq 28). Analogously, anxiety symptomatology fell into categories of mild (8, 9), moderate (10–14), severe (15–19), and extremely severe (\geq 20). Stress levels were assessed across the ranges of mild (15-18), moderate (19–25), severe (26–33), and extremely severe (\geq 34). The DASS-21 scale has good reliability and validity in mainland China and can be used as a valid tool for the evaluation of depression-anxiety-stress in adult residents (44). In our sample, before and after quarantine, the Cronbach's alpha coefficients for the total DASS-21 scale were 0.951/0.968, and for the three subscales of stress, anxiety, and depression, they were 0.887/0.926, 0.851/0.905, and 0.885/0.922, respectively.

2.2.2 Social connectedness scale-revised (SCS-R)

The SCS-R is a self-report scale consisting of 20 items that assess the degree to which individuals experience both intimacy and separation in interpersonal relationships (45, 46). Participants rated items using a six-point Likert scale ranging from 1 (strongly disagree) to 6 (strongly agree). The higher the score, the higher the degree of social connectedness, with an internal consistency coefficient of 0.916 and retest reliability of 0.845 for the Chinese version (47). Cronbach alpha coefficients for the SCS-R were 0.792/0.809 in our study.

2.2.3 Berkman-Syme social network index (SNI)

The SNI can be used to measure the objective social isolation in China (48, 49). The scale assesses social networks and has four self-reported subcomponents: married (no = 0; yes = 1); close friends and relatives (0–2 friends and 0–2 relatives = 0, all other scores = 1); group involvement (no = 0; yes = 1); and participation in religious gatherings or community service (\leq every few months=0; >once or twice a month = 1). Scores range from 0 to 4, with lower scores representing smaller social networks. Based on previous scoring conventions, scores of 0 and 1 were categorized as the most socially isolated (22).

2.3 Statistical analysis

We used absolute skewness values greater than 2 or absolute kurtosis (appropriate value) greater than 7 as reference values for determining severe non-normality (50). Continuous variables with normal distributions were presented using mean \pm standard deviation and non-normal distributions were presented using median (interquartile range). N (%) was used for categorical variables. Correlations of normally distributed continuous variables were analyzed using Pearson correlation analysis. Univariate linear regression was used to identify factors potentially associated with a

change in anxiety scores (anxiety.d.) and change in depression scores (depression.d.) during the quarantine. These factors with p < 0.1 were entered into a multiple linear regression to examine the effects of pre-quarantine levels of social connectedness (SCS_R.B.) and social networks (SNI) on anxiety and depression score changes (51).

After centering all continuous variables, the moderated mediating effects were assessed using Model 7 (the model assumes that the first half of the mediating path is moderated by the moderating variable) proposed by Hayes (52). Statistical analyses were performed using SPSS Statistics for Mac 26.0 and the "PROCESS" macro in SPSS (version 4.2).

Cluster analyses were performed using R (v4.1.2) to subdivide those whose anxiety and depressive symptoms do not worsen during quarantine. Pre-cluster evaluation and calculation of silhouette width were performed using the R package Factoextra (v1.0.7), using the Hopkins statistics to check whether the data has clusterable features and using the average silhouette width to evaluate the clustering effect (53). The final value of this indicator is between -1 and 1. The closer to 1, the more accurate the sample classification, and the less than 0, the sample may be misclassified. K-means cluster analyses were performed using the R package Cluster (v2.1.4) and ggplot2 (v3.4.1). Comparison of means between the three clusters after cluster analysis was performed by ANOVA and multiple comparison analysis using Scheffe's test due to the unequal sample sizes of the clusters.

3 Results

3.1 Demographic characteristics

In this study, 485 participants were eventually included in the final data analysis (Table 1). The majority of participants were female (69.28%), married status (56.49%), had a full-time job (67.62%), and had a monthly income >5,000 (64.33%). The primary quarantine mode in this quarantine was quarantine at home, and the median number of days of quarantine and the number of previous quarantines were 11 days and 2 times, respectively. The mean of the SNI was 1.67, which did not belong to the most socially isolated (SNI = 0/1).

3.2 The correlation analysis between mental state and the level of social connectedness and social isolation before and during the quarantine

After paired (*t*-tests, we found that anxiety (t=2.605, p=0.009) and depression (t=2.302, p=0.022) scores increased during the quarantine period compared to the pre-quarantine period, while stress scores and social connectedness scores before and during the quarantine did not show significant differences (Supplementary Table S1). Subsequently, performing correlation analysis revealed that the pre-quarantine levels of anxiety and depression were strongly correlated with the levels of anxiety and depression during the quarantine period. In addition, pre-quarantine anxiety and depression scores were positively correlated with pre-quarantine social connectedness scores (r=0.17, p<0.001; r=0.15, p<0.001) and negatively correlated with SNI scores (r=-0.23, p<0.001; r=-0.26, p<0.001). Notably, the difference in anxiety and depression scores exhibited a positive correlation with the

TABLE 1 Characteristics of study participants (N = 485).

Characteristic	Value				
Age	36.97±13.35				
Gender					
Female	336 (69.28%)				
Education	15.89±3.99				
Marital status					
Married	274 (56.49%)				
Employment state					
Full-time	328 (67.62%)				
Monthly income (RMB)*					
> 5,000	312 (64.33%)				
Smoking					
Yes	63 (12.99%)				
Drinking					
Yes	45 (9.28%)				
Physical Disorders					
Yes	35 (7.22%)				
Quarantine alone					
No	389 (80.21%)				
Quarantine mode					
Quarantine at home	428 (88.25%)				
The number of quarantine experiences	2 (1-2)				
Current number of days in quarantine	11 (10–12)				
SNI	1.67 ± 1.01				

Values are n (%), mean ± standard deviation or median (interquartile range). *1 RMB was equal to approximately 0.14 USD at the time of the study. SNI=Berkman-Syme social network index.

pre-quarantine social connectedness scores (r = 0.16, p < 0.001; r = 0.19, p < 0.001), implying that higher pre-quarantine social connectedness scores were associated with greater increases in anxiety and depression scores during quarantine (Figure 1).

3.3 Factors associated with changes in anxiety and depression scores before and during the quarantine

We found that age, Anxiety.B. significantly and negatively predicted the change in anxiety scores before and during the quarantine, and SCS_R.B. significantly and positively predicted the change in anxiety scores. Age, Depression.B. significantly and negatively predicted the change in depression scores before and during the quarantine, and SCS_R.B. and education significantly and positively predicted the change in depression scores (Table 2). We conducted a multiple covariance test and found that for both models for the change in anxiety scores and depression scores, all of the VIF values in the models were less than 5. This implies that neither model had a covariance problem. Additionally, the Durbin-Watson (D-W) values were 2.088 and 2.051, suggesting that the models were not autocorrelated. Consequently, there was no

correlation detected among the sample data, indicating that the models were robust.

3.4 Cluster analysis of people whose anxiety and depression did not deteriorate during the quarantine

During the quarantine, we found that the number of people whose anxiety scores did not increase (Anxiety.d. ≤ 0) was 369, and the number of people whose depression scores did not increase (Depression.d. ≤ 0) was 338. The variables that affected Anxiety.d. and Depression.d. were included in the cluster analysis, respectively. When the H value was higher than 0.5, it meant that there was a trend of clustering in the data at a 90% confidence level (H_{anxiety}=0.8661411; H_{depression}=0.7695719) (Figures 2A,B). Using the k-means cluster analysis method, the two groups were clustered separately by selecting different k values, and the clinical significance of the clustering results was finally determined by dividing each group into 3 clusters, with each cluster in each group having its own characteristics. The average silhouette widths of both groups were >0, which can be seen to have clustering accuracy (Figures 2C,D).

The three clusters of the groups were characterized as follows (Figures 3, 4). After ANOVA and multiple comparison analysis, in the group (Anxiety.d. \leq 0), in terms of age, cluster 2 was higher than cluster1 and cluster3, respectively; in terms of pre-quarantine anxiety scores, cluster1 was higher than cluster2 and cluster3, respectively; in terms of perceived social connectedness before quarantine, cluster3 was lower than cluster1 and cluster2, respectively (Supplementary Table S2). In the group (Depression.d. \leq 0), in terms of age, cluster 3 was higher than cluster 1 and cluster 2, respectively; in terms of pre-isolation depression scores, cluster 2 was higher than cluster 1 and cluster 3, respectively; in terms of per-isolation depression scores, cluster 2 was higher than cluster 1 and cluster3, respectively; in terms of perceived social connectedness before quarantine, cluster3, respectively; in terms of perceived social connectedness before quarantine, cluster1 was lower than cluster2 and cluster3, respectively; in terms of perceived social connectedness before quarantine, cluster1 was lower than cluster2 and cluster3, respectively; in terms of perceived social connectedness before quarantine, cluster1 was lower than cluster2 and cluster3, respectively (Supplementary Table S3).

3.5 Moderated mediation model

The degree of social connectedness affected not only pre-quarantine anxiety and depression status but also the status during the quarantine. We found that negative emotion before the quarantine was a potential candidate mediator, and research found that participants with higher baseline mental symptoms exhibited more severe symptoms after the blockade period (54). The size of social networks, another factor influencing mental health status, was associated with pre-quarantine anxiety and depression levels. Previous studies have also shown that social networks affect mental health, but we found no relationship between the size of social networks and changes in anxiety and depression resulting from quarantine. Besides, we found no significant differences in social connectedness scores under different sizes of social networks (Supplementary Table S4). We then hypothesized that anxiety and depression levels mediate between the degree of social connectedness before quarantine, and the anxiety and depression levels during the quarantine (Figure 5). The size of social networks acts as a moderator of the first half of the mediating pathway (the role of the degree of social connectedness on the pre-quarantine negative

	6M	Depre	ssion Antiet	3. ^{0.}	2.B.	H.A. Depre	ssion. stress	,A	2.A. Stress	B. Depte	Anxiet	&.
SNI	1.00		X	5	***	***	***	5	***	***	***	1
Depression.d.	0.02	1.00	***	***	***	***	***			*		- 0.8
Anxiety.d.	0.04	0.80	1.00	***	***	***	***					- 0.6
SCS_R.B.	-0.03	0.19	0.16	1.00	***	***	***	***	***	**	***	- 0.4
Anxiety.A.	-0.16	0.49	0.60	0.25	1.00	***	***		***	***	***	- 0.2
Depression.A.	-0.21	0.56	0.53	0.25	0.87	1.00	***	*	***	***	***	- 0
Stress.A.	-0.20	0.48	0.49	0.24	0.87	0.88	1.00	*	***	***	***	0.2
SCS_R.A.	-0.04	0.04	-0.02	0.73	0.07	0.11	0.10	1.00	**	*	*	0.4
Stress.B.	-0.22	-0.07	-0.03	0.17	0.64	0.67	0.76	0.12	1.00	***	***	0.6
Depression.B.	-0.26	-0.11	0.01	0.15	0.66	0.76	0.68	0.10	0.85	1.00	***	0.8
Anxiety.B.	-0.23	-0.05	-0.08	0.17	0.76	0.65	0.68	0.10	0.82	0.82	1.00	
												-1

FIGURE 1

Correlation matrix of the main variables (N=485). *p<0.05, **p<0.01, ***p<0.001. SNI = Berkman-Syme social network index; Depression.d. = Change in Depression Score During the Quarantine minus Pre-quarantine Depression Score; Anxiety. d. = Change in Anxiety Score During the Quarantine minus Pre-quarantine Levels of Social Connectedness Scale-Revised; Anxiety. A. = Anxiety Score During the Quarantine; Depression. A. = Depression Score During the Quarantine; Stress. A. = Stress Score During the Quarantine; SCS_R.A. = Levels of Social Connectedness Scale-Revised During the Quarantine; Anxiety. B.= Pre-quarantine Anxiety Score; Depression.B. = Pre-quarantine Depression Score; Stress. B. = Pre-quarantine Stress Score.

emotion). We speculated that the positive effect of the degree of subjective social connectedness on pre-quarantine anxiety and depression was stronger in individuals experiencing smaller social networks relative to those experiencing large social networks.

The mediating effect analysis with moderation (Table 3) showed a significant direct predictive effect of SCS_R.B. on Anxiety.A. and Depression.A. Further, Anxiety.B. and Depression.B. were included in the regression equation as mediating variables and SNI as a moderating variable, respectively. We found that SCS_R.B. had a significant positive predictive effect on Anxiety.B. and Depression. B. The upper and lower bounds of the boot 95% CI for the mediating effect of Anxiety.B. and Depression.B. did not include 0 when the SNI score was low and middle levels, indicating the presence of a mediating effect. Then, when SNI score was high level, the mediating effect did not exist. In addition, the interaction term of SCS_R.B. with SNI significantly and negatively predicted Anxiety.B. and Depression.B., indicating that the effect of SCS_R.B. on Anxiety.B. and Depression.B. was moderated by the degree of objective social isolation. In summary, the analysis showed that the mediating effect profile was inconsistent at different sizes of social networks, and there was a mediating effect with moderation (Table 4). To reveal how SNI moderates the effect of SCS_R.B. on Anxiety.B. and Depression.B., simple slope analysis plots were plotted for low and middle groupings based on the socres of SNI (Figure 6). The results showed that at low levels of SNI scores (the most socially isolated), SCS_R.B. significantly and positively predicted Anxiety.B. ($b_{simple} = 0.390$, p < 0.001), Depression.B. ($b_{simple} = 0.381, p < 0.001$), indicating that pre-quarantine social connectedness had a greater effect on anxiety and depression symptoms during quarantine, mediated by pre-quarantine anxiety and depressive symptoms when the mediating effects accounted for 66.0 and 58.3% of the respective total effects. The positive predictive effect on Anxiety.B. ($b_{simple} = 0.223, p < 0.001$) and Depression.B. ($b_{simple} = 0.218$, p < 0.001) remained significant but diminished when the SNI score was at middle levels, at which point the mediating effect accounted for 52.6 and 44.4% of the respective total effects. The result suggested that an increase in social networks would diminish the effect of the degree of social connectedness on pre-quarantine psychological status, which in turn would affect anxiety and depression levels during quarantine.

Variables		Anxiety	.d.	Depression.d.					
	Univariate	Multivari	ate	Univariate	Multiva	riate			
	<i>B</i> (95% CI)	Р	B (95% CI)	Р	<i>B</i> (95% CI)	Р	B (95% CI)	Р	
Age	-0.035 (-0.072, 0.002)	0.061	-0.045* (-0.082, -0.008)	0.017*	-0.046* (-0.088, -0.003)	0.035*	-0.051 (-0.093, -0.008)	0.020*	
Education	0.096 (-0.028, 0.219)	0.131			0.196** (0.055, 0.337)	0.007**	0.162 (0.021, 0.302)	0.024*	
Gender	0.487 (-0.582, 1.557)	0.372			-0.222 (-1.448, 1.004)	0.723			
Marital status	-0.131 (-1.127, 0.865)	0.796			-0.855 (-1.994, 0.284)	0.142			
Employment state	0.544 (-0.632, 1.719)	0.365			0.406 (-1.009, 1.821)	0.574			
Monthly income (RMB)	0.049 (-0.982, 1.080)	0.926			-0.388 (-1.568, 0.793)	0.520			
Smoking	0.159 (-1.310, 1.627)	0.832			0.186 (-1.497, 1.868)	0.829			
Drinking	-0.625 (-2.326, 1.076)	0.472			-0.389 (-2.339, 1.561)	0.696			
Physical disorders	-0.645 (-2.552, 1.262)	0.508			-0.531 (-2.717, 1.655)	0.634			
Quarantine mode	-0.370 (-1.903, 1.163)	0.636			-0.600 (-2.355, 1.156)	0.504			
Quarantine alone	0.949 (-0.288, 2.185)	0.133			0.393 (-1.026, 1.813)	0.588			
The number of quarantine experiences	0.152 (-0.298, 0.603)	0.507			0.246 (-0.270, 0.762)	0.351			
Current number of days in quarantine	-0.030 (-0.158, 0.098)	0.643			-0.015 (-0.161, 0.132)	0.844			
SNI	0.202 (-0.286, 0.689)	0.418			0.112 (-0.447, 0.671)	0.695			
SCS_R.B.	0.078** (0.036,0.120)	<0.001**	0.088 (0.046,0.130)	<0.001**	0.103** (0.056, 0.151)	<0.001**	0.120 (0.072, 0.167)	<0.001**	
Stress.B.	-0.019 (-0.075, 0.037)	0.511			-0.048 (-0.113, 0.016)	0.139			
Anxiety.B.	-0.063 (-0.135, 0.010)	0.090	-0.517 (-0.951, -0.084)	0.020*	-0.043 (-0.126, 0.040)	0.312			
Depression.B.	0.004 (-0.057, 0.065)	0.904			-0.087* (-0.156, -0.017)	0.015*	-0.120 (-0.190, -0.051)	0.001**	

TABLE 2 Factors associated with changes in anxiety and depression scores before and during the quarantine.

p* < 0.05 *p* < 0.01. SNI=Berkman-Syme social network index; Anxiety.B. = pre-quarantine anxiety score; Depression.B. = pre-quarantine depression score; SCS_R.B. = pre-quarantine levels of social connectedness scale-revised; Boot95%CI = the lower and upper limits of the 95% interval for bootstrap sampling. Depression.d.=Change in Depression Score During the Quarantine minus Pre-quarantine Depression Score; Anxiety.d.=Change in Anxiety Score During the Quarantine minus Pre-quarantine Anxiety Score.

4 Discussion

The COVID-19 pandemic and the resulting quarantine measures posed additional psychological challenges to the population. Not only did the COVID-19 pandemic increase anxiety and depression symptoms in the population, but the isolation measures adopted by the mass pandemic also increased anxiety and depression symptoms, which is consistent with the findings of Verma et al. (55). Previous studies have demonstrated that enforced quarantine measures increase the prevalence rates of anxiety and depression (56, 57). Loneliness, as an unintended consequence of enforced quarantine, is associated with high rates of depression and anxiety (57). There were more females in our sample (69.28%), and females were more likely to experience anxiety and depressive symptoms than males (58). The small increase in depression and anxiety symptoms in our study may be because the study population was in the COVID-19 pandemic and inherently had higher levels of anxiety and depression than before the pandemic. In a study of 56,679 participants from 34 provinces in China, 27.9% had symptoms of depression, 31.6% had symptoms of anxiety, and 24.4% had symptoms of acute stress during the coronavirus disease 2019 (COVID-19) outbreak (59). Secondly, the population in this investigation was basically in the second week of the quarantine days, and previous studies have shown that the highest levels of anxiety and depression occurred during the first week of quarantine and symptoms began to decline in the second week (60). According to a survey, individuals' mental health initially deteriorated during the COVID-19 pandemic, followed by stabilization as the pandemic persisted (61).

The study investigated the relationship between sociodemographic characteristics, degree of social connectedness, social networks, and changes in psychological status in people experiencing quarantine. Our sample was less older adult and predominantly middle-aged, which may explain why there was no significant change in subjective social



connectedness in our study. Our findings are consistent with previous studies in that age and educational attainment are strongly correlated with depression symptoms (62, 63), and age is also associated with anxiety symptoms (63). We found that anxiety and depression scores before quarantine negatively predicted changes in anxiety and depression scores from quarantine measures, possibly because people with more anxiety and depression symptoms before isolation would show a decrease in anxiety and depression during quarantine (64). Another study also found that school closures during quarantine were beneficial in reducing depression and anxiety symptoms in adolescents (65).

Previous research has indicated that subjective social connectedness has an impact on the mental health of transgender youth during the pandemic, with social connectedness and social support being significant predictors of depression and anxiety severity (66). In a prospective study of adolescent mental health during COVID-19, social connectedness was found to be a protective factor for poor mental health during follow-up (67). In contrast to previous literature, we found that higher social connectedness was associated with greater anxiety and depression symptoms during the pandemic and with greater increases in anxiety and depression scores associated with isolation measures. There are several possible reasons why our findings differ from previous studies.

The prevalence of loneliness increased to 51% during the pandemic (68). The mean social connectedness scores of our population were lower than those previously reported in the literature, which may be related to higher levels of loneliness. Amrish et al. found that social connectedness can affect the quality of life and well-being through loneliness (69). This may be another pathway through which the level of social connectedness influences anxiety and depressive symptoms in our study. Different measurement instruments: the methods used to measure social connectedness, social networks, and mental health status can affect the results. The Multidimensional Scale of Perceived Social Support (MSPSS) is commonly used for scales of social relationship support in previous studies, and the GAD-7 and the PHQ-9 are commonly used as anxiety and depression measurement scales in previous studies. Sample differences: differences in the study population can affect the results. Our study was voluntary and web-based, and people with more severe symptoms and those who do not use the web may have been excluded. Timing of measurements: the timing of measurements can be critical, especially during a pandemic when environmental and stress factors can change rapidly. We observed no significant change in social connectedness scores during isolation, possibly because it was not the first-time participants had experienced a quarantine when



we measured it and the population had been locked down for more than a week.

We did cluster analyses separately for those whose anxiety and depression scores did not increase, refining the population



FIGURE 4

Characteristics of the 3 clusters of people whose depression scores did not increase during the quarantine. 1 = cluster1; 2 = cluster2; 3 = cluster3. Depression. B. = Pre-quarantine Depression Score; SCS_R.B. = Pre-quarantine Levels of Social Connectedness Scale-Revised.



FIGURE 5

Moderated Mediation Model. The mediating role of mental states before quarantine and the moderating role of the score of SNI. SNI = Berkman-Syme social network index; SCS_R.B. = Pre-quarantine Levels of Social Connectedness Scale-Revised; Anxiety.B. = Pre-quarantine Anxiety Score; Depression. B. = Pre-quarantine Depression Score.

TABLE 3	Regression	analysis	of the	mediating	effect	of SNI	as moderator.
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	Anxiety.B.		Anxiety.A.		Depre	ssion.B.	Depression.A.		
	β	р	β	p	β	р	β	р	
SCS_R.B.	0.249	<0.001*	0.090	<0.001**	0.244	<0.001**	0.120	<0.001**	
SNI	4.572	0.017**			3.904	0.085			
SCS_R.B.*SNI	-0.083	0.002*			-0.081	0.011*			
Age	-0.046	0.059	-0.047	0.013*	-0.046	0.118	-0.051	0.020*	
Anxiety.B.			0.895	<0.001**					
Education					-0.142	0.114	0.162	0.024*	
Depression.B.							0.880	<0.001**	
R ²	0.105		0.590		0.108		0.606		
F	14	14.038		230.450		11.545		184.939	
P	<0.	<0.001**		<0.001**		<0.001**		<0.001**	

*p<0.05 **p<0.01. SNI=Berkman-Syme social network index; Anxiety.B. = pre-quarantine anxiety score; Depression.B. = pre-quarantine depression score; SCS_R.B. = pre-quarantine levels of social connectedness scale-revised; Boot95%CI = the lower and upper limits of the 95% interval for bootstrap sampling.

TABLE 4 Analysis of the moderating effect of SNI.

Mediator	Effect type	Level	SNI	Effect	SE/BootSE	95%CI / Boot95%CI	Explanatory power (%)
	Direct	-	-	0.090	0.021	0.048,0.132	-
Anxiety.B. Indirect	Low (M-1SD)	0.659	0.175	0.077	0.017,0.319	66.0	
	Indirect	Middle (M)	1.672	0.100	0.042	0.015,0.178	52.6
		High (M+1SD)	2.685	0.025	0.029	-0.030,0.084	0
	Direct	_	_	0.120	0.024	0.072,0.167	-
Depression.B.		Low (M-1SD)	0.659	0.168	0.077	0.019,0.319	58.3
	Indirect	Middle (M)	1.672	0.096	0.044	0.011,0.184	44.4
		High (M+1SD)	2.685	0.024	0.035	-0.041,0.099	0

SNI=Berkman-Syme social network index; Anxiety.B. = pre-quarantine anxiety score; Depression.B. = pre-quarantine depression score. Boot95%CI = the lower and upper limits of the 95% interval for bootstrap sampling.



FIGURE 6

Simple slope analysis of the interaction between the degree of social connectedness and social isolation on pre-quarantine mental health status. (A) The interaction on pre-quarantine anxiety; (B) The interaction on pre-quarantine depression; SCS_R.B. = Pre-quarantine Levels of Social Connectedness Scale-Revised; Anxiety. B. = Pre-quarantine Anxiety Score; Depression. B. = Pre-quarantine Depression Score.

classification. Each group was classified into 3 clusters, further exposing the respective characteristics of the relevant variables in the different clusters. Based on this classification, more targeted measures can be taken to help improve the mental health of the population.

Our study combines subjective social connectedness and objective social networks to explore the role of changes in mental health brought about by quarantine. The results of the mediation analysis suggest that pre-quarantine negative emotions mediated the relationship between the degree of pre-quarantine social connectedness and negative emotions during the quarantine. The results of this study further confirm previous evidence that pre-quarantine mental state is a significant predictor of mental state during quarantine (54). The poorer mental health status of the population during the pandemic, despite being in a non-quarantine period, was a major psychiatric consequence of COVID-19 (32, 70). Social connectedness not only played a direct role in the changes in mental status brought about by quarantine but also influenced anxiety and depression symptoms during the quarantine by affecting emotional status before the pandemic. Results from moderated mediation analyses suggested that an increase in SNI scores (expansion of the size of social networks) would buffer the effect of the level of social connectedness on pre-quarantine anxiety and depression. Previous research has also shown that small size social networks are associated with more severe physical and psychological problems (71). Interventions, such as enhanced community support programs designed to improve digital literacy for social use, could help to reduce loneliness and increase social connectedness (69). Psychological interventions and community outreach, such as community college for the older adult, can be designed for this population with the aim of increasing their frequency of social contact and helping them reduce symptoms of anxiety and depression during the pandemic.

Our study excluded individuals with previous COVID-19 infection because COVID-19 infection may influence the development of psychiatric disorders, including depression (72) and the potential neurotrophic properties of the virus (31, 73–75). This facilitated the reduction of the effect of confounding factors in the study. However, this study has several limitations. First, our sample was biased: we studied people who voluntarily participated in an online survey, yet people with more severe symptoms and those who are not skilled in the use of the internet may tend not to participate in the study. Second, all information in this study was retrospective and self-reported, increasing the potential for reporting bias. Additionally, we did not collect vaccination information from our participants. Vaccination reduces the risk of severe COVID-19 illness, alleviates the fear of infection, and decreases the stressor, which is associated with a significantly lower risk of psychotic disorder (76). Finally, there is limited evidence available to replicate the results of this study, and further studies with larger sample sizes and more robust methods (e.g., prospective longitudinal studies) are needed to replicate the results of this study.

5 Conclusion

Despite its limitations, our study revealed that quarantine increases anxiety and depressive symptoms. Increasing age was a protective factor against declining anxiety and depression during the quarantine, but increasing education and social connectedness were risk factors for declining depressive symptoms. Cluster analysis was conducted for those whose anxiety and depressive symptoms did not aggravate during the quarantine, revealing three distinct clusters in both populations, each with its own characteristics. The results of the moderated mediation analysis suggested that people experiencing smaller social networks when perceiving the same level of social connectedness may tend to suffer more severe psychological distress during quarantine, prompting us to focus on the most socially isolated people (SNI = 0/1). Interventions, including psychological interventions and community outreach, can be designed for this population with the aim of increasing their frequency of social contact and helping them reduce symptoms of anxiety and depression during the pandemic.

Data availability statement

The raw data supporting the conclusions of this article will be made available by the authors, without undue reservation.

Ethics statement

The studies involving humans were approved by the West China Hospital of Sichuan University Biomedical Research Ethics Committee. The studies were conducted in accordance with the local

References

1. Stein C, Cousin E, Machado ÍE, Felisbino-Mendes MS, Passos VMA, Sousa TM, et al. The COVID-19 pandemic in Brazil: Institute for Health Metrics and Evaluation projections and observed evolution, 2020. *Epidemiologia e Serviços de Saúde*. (2021) 30:30. doi: 10.1590/s1679-49742021000100017

2. Kola L, Kohrt BA, Hanlon C, Naslund JA, Sikander S, Balaji M, et al. COVID-19 mental health impact and responses in low-income and middle-income countries: reimagining global mental health. *Lancet Psychiatry*. (2021) 8:535–50. doi: 10.1016/S2215-0366(21)00025-0

3. Baxter AJ, Charlson FJ, Cheng HG, Shidhaye R, Ferrari AJ, Whiteford HA. Prevalence of mental, neurological, and substance use disorders in China and India: a systematic analysis. *Lancet Psychiatry*. (2016) 3:832–41. doi: 10.1016/S2215-0366(16)30139-0

4. Santomauro DF, Herrera AMM, Shadid J, Zheng P, Ashbaugh C, Pigott DM, et al. Global prevalence and burden of depressive and anxiety disorders in 204 countries and territories in 2020 due to the COVID-19 pandemic. *Lancet*. (2021) 398:1700–12. doi: 10.1016/S0140-6736(21)02143-7

legislation and institutional requirements. The participants provided their written informed consent to participate in this study.

Author contributions

HL: Writing – original draft. DL: Data curation, Methodology, Writing – review & editing. QT: Methodology, Writing – review & editing. ZN: Methodology, Writing – review & editing. JX: Writing – review & editing. JL: Writing – review & editing.

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Conflict of interest

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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Supplementary material

The Supplementary material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fpubh.2023.1298693/ full#supplementary-material

5. Pan A, Liu L, Wang C, Guo H, Hao X, Wang Q, et al. Association of public health interventions with the epidemiology of the COVID-19 outbreak in Wuhan, China. *JAMA*. (2020) 323:1915–23. doi: 10.1001/jama.2020.6130

6. Brooks SK, Webster RK, Smith LE, Woodland L, Wessely S, Greenberg N, et al. The psychological impact of quarantine and how to reduce it: rapid review of the evidence. *Lancet.* (2020) 395:912–20. doi: 10.1016/S0140-6736(20)30460-8

 Xiao C. A novel approach of consultation on 2019 novel coronavirus (COVID-19)related psychological and mental problems: structured letter therapy. *Psychiatry Investig.* (2020) 17:175. doi: 10.30773/pi.2020.0047

8. Cao W, Fang Z, Hou G, Han M, Xu X, Dong J, et al. The psychological impact of the COVID-19 epidemic on college students in China. *Psychiatry Res.* (2020) 287:112934. doi: 10.1016/j.psychres.2020.112934

9. Huang Y, Zhao N. Generalized anxiety disorder, depressive symptoms and sleep quality during COVID-19 outbreak in China: a web-based cross-sectional survey. *Psychiatry Res.* (2020) 288:112954. doi: 10.1016/j.psychres.2020.112954

10. Bao Y, Sun Y, Meng S, Shi J, Lu L. 2019-nCoV epidemic: address mental health care to empower society. *Lancet.* (2020) 395:e37–8. doi: 10.1016/S0140-6736(20) 30309-3

11. Cornwell EY, Waite LJ. Social disconnectedness, perceived isolation, and health among older adults. J Health Soc Behav. (2009) 50:31–48. doi: 10.1177/002214650905000103

12. Cornwell EY, Waite LJ. Measuring social isolation among older adults using multiple indicators from the NSHAP study. J Gerontol B Psychol Sci Soc Sci. (2009) 64:i38–46. doi: 10.1093/geronb/gbp037

13. Lee RM, Robbins SB. The relationship between social connectedness and anxiety, self-esteem, and social identity. *J Couns Psychol.* (1998) 45:338–45. doi: 10.1037/0022-0167.45.3.338

14. Uchino BN. Social support and health: a review of physiological processes potentially underlying links to disease outcomes. *J Behav Med.* (2006) 29:377–87. doi: 10.1007/s10865-006-9056-5

15. Lee RM, Robbins SB. Measuring belongingness: the social connectedness and the social assurance scales. *J Couns Psychol.* (1995) 42:232–41. doi: 10.1037/0022-0167.42.2.232

16. van Tilburg TG, Steinmetz S, Stolte E, van der Roest H, de Vries DH. Loneliness and mental health during the COVID-19 pandemic: a study among Dutch older adults. *J Gerontol B Psychol Sci Soc Sci.* (2021) 76:e249–55. doi: 10.1093/geronb/gbaa111

17. Malaquias S, Crespo C, Francisco R. How do adolescents benefit from family rituals? Links to social connectedness, depression and Anxiety. *J Child Fam Stud.* (2015) 24:3009–17. doi: 10.1007/s10826-014-0104-4

18. He Q, Fan B, Xie B, Liao Y, Han X, Chen Y, et al. Mental health conditions among the general population, healthcare workers and quarantined population during the coronavirus disease 2019 (COVID-19) pandemic. *Psychol Health Med.* (2022) 27:186–98. doi: 10.1080/13548506.2020.1867320

19. Morgan C, Burns T, Fitzpatrick R, Pinfold V, Priebe S. Social exclusion and mental health: conceptual and methodological review. *Br J Psychiatry*. (2007) 191:477–83. doi: 10.1192/bjp.bp.106.034942

20. Cacioppo JT, Cacioppo S, Capitanio JP, Cole SW. The neuroendocrinology of social isolation. *Annu Rev Psychol.* (2015) 66:733–67. doi: 10.1146/annurev-psych-010814-015240

21. Hsu C, Cruz S, Placzek H, Chapdelaine M, Levin S, Gutierrez F, et al. Patient perspectives on addressing social needs in primary care using a screening and resource referral intervention. *J Gen Intern Med.* (2020) 35:481–9. doi: 10.1007/s11606-019-05397-6

22. Pantell M, Rehkopf D, Jutte D, Syme SL, Balmes J, Adler N. Social isolation: a predictor of mortality comparable to traditional clinical risk factors. *Am J Public Health.* (2013) 103:2056–62. doi: 10.2105/AJPH.2013.301261

23. Patterson AC, Veenstra G. Loneliness and risk of mortality: a longitudinal investigation in Alameda County, California. *Soc Sci Med.* (2010) 71:181–6. doi: 10.1016/j.socscimed.2010.03.024

24. Akhter-Khan SC, Tao Q, Ang TFA, Itchapurapu IS, Alosco ML, Mez J, et al. Associations of loneliness with risk of Alzheimer's disease dementia in the Framingham heart study. *Alzheimers Dement*. (2021) 17:1619–1627. doi: 10.1002/alz.12327

25. Loades ME, Chatburn E, Higson-Sweeney N, Reynolds S, Shafran R, Brigden A, et al. Rapid systematic review: the impact of social isolation and loneliness on the mental health of children and adolescents in the context of COVID-19. J Am Acad Child Adolesc Psychiatry. (2020) 59:1218–1239.e3.

26. Wang J, Lloyd-Evans B, Giacco D, Forsyth R, Johnson S. Social isolation in mental health: a conceptual and methodological review. (2017) 52:1451–1461. doi: 10.1007/s00127-017-1446-1

27. Grover S, Avasthi A, Sahoo S, Lakdawala BM, Dan A, Nebhinani N, et al. Relationship of loneliness and social connectedness with depression in elderly: a multicentric study under the aegis of Indian Association for Geriatric Mental Health. *J Geriatric Mental Health.* (2018) 5:99–106. doi: 10.4103/jgmh.jgmh_26_18

28. Taylor HO, Taylor RJ, Nguyen AW, Chatters L. Social isolation, depression, and psychological distress among older adults. *J Aging Health*. (2018) 30:229–46. doi: 10.1177/0898264316673511

29. Bowling A. Social networks and social support among older people and implications for emotional well-being and psychiatric morbidity. *Intern Rev Psychiatry*. (1994) 6:41–58. doi: 10.3109/09540269409025242

30. Mcpherson M, Smith-Lovin L, Brashears ME. Social isolation in America: changes in core discussion networks over two decades SAGE Publications (2006) 71:353–375. doi: 10.1177/000312240607100301

31. Troyer EA, Kohn JN, Hong S. Are we facing a crashing wave of neuropsychiatric sequelae of COVID-19? Neuropsychiatric symptoms and potential immunologic mechanisms. *Brain Behav Immun.* (2020) 87:34–9. doi: 10.1016/j.bbi.2020.04.027

32. Huang C, Huang L, Wang Y, Li X, Cao B. Articles 6-month consequences of COVID-19 in patients discharged from hospital: a cohort study. *Lancet.* (2021) 397:220-232. doi: 10.1016/S0140-6736(20)32656-8

33. Mazza MGL, de Lorenzo R, Conte C, Poletti S, Vai B, Bollettini I, et al. Anxiety and depression in COVID-19 survivors: role of inflammatory and clinical predictors. *Brain Behav Immun.* (2020) 89:594–600. doi: 10.1016/j.bbi.2020.07.037

34. Hao F, Tam W, Hu X, Tan W, Jiang L, Jiang X, et al. A quantitative and qualitative study on the neuropsychiatric sequelae of acutely ill COVID-19 inpatients in isolation facilities. *Transl Psychiatry*. (2020) 10:355. doi: 10.1038/s41398-020-01039-2

35. Vindegaard N, Benros ME. COVID-19 pandemic and mental health consequences: systematic review of the current evidence - ScienceDirect. *Brain Behav Immun.* (2020) 89:531–42. doi: 10.1016/j.bbi.2020.05.048

36. Hyland P, Shevlin M, Mcbride O, Murphy J, Karatzias T, Bentall RP, et al. Anxiety and depression in the Republic of Ireland during the COVID-19 pandemic. *Acta Psychiatr Scand.* (2020) 142:249–56. doi: 10.1111/acps.13219

37. Iob E, Steptoe A, Fancourt D. Abuse, self-harm and suicidal ideation in the UK during the COVID-19 pandemic. *Br J Psychiatry*. (2020) 217:543–6. doi: 10.1192/bjp.2020.130

38. Shevlin M, Mcbride O, Murphy J, Miller JG, Anxiety BR. Depression, Traumatic stress, and COVID-19 related Anxiety in the UK general population during the COVID-19 pandemic. *BJPsych Open*. (2020) 6:e25. doi: 10.1192/bjo.2020.109

39. Li LZ, Wang S. Prevalence and predictors of general psychiatric disorders and loneliness during COVID-19 in the United Kingdom. *Psychiatry Res.* (2020) 291:113267 doi: 10.1016/j.psychres.2020.113267

40. Jacobs LG, Paleoudis EG, Bari LD, Nyirenda T, Aschner JL. Persistence of symptoms and quality of life at 35 days after hospitalization for COVID-19 infection. *PLoS One.* (2020) 15:e0243882. doi: 10.1371/journal.pone.0243882

41. Lovibond PF, Lovibond SH. The structure of negative emotional states: comparison of the depression Anxiety stress scales (DASS) with the Beck depression and Anxiety inventories. *Behav Res Ther.* (1995) 33:335–43. doi: 10.1016/0005-7967(94)00075-U

42. Wang K, Shi HS, Geng FL, Zou LQ, Tan SP, Wang Y, et al. Cross-cultural validation of the depression Anxiety stress Scale-21 in China. *Psychol Assess*. (2016) 28:e88–e100. doi: 10.1037/pas0000207

43. Antony MM, Bieling PJ, Cox BJ, Enns MW, Swinson RP. Psychometric properties of the 42-item and 21-item versions of the depression Anxiety stress scales in clinical groups and a community sample. *Psychol Assess.* (1998) 10:176. doi: 10.1037/1040-3590.10.2.176

44. Yi W, Daxing W, Xuejing L, Hangui L, Yuping Y. Psychometric properties of the Chinese short version of depression Anxiety and stress scale in Chinese adults. *Chin J Public Health.* (2012) 28:1436–1438. doi: 10.11847/zgggws2012-28-11-14

45. Lee RM, Dean BL, Jung K-R. Social connectedness, extraversion, and subjective well-being: testing a mediation model. *Personal Individ Differ*. (2008) 45:414–9. doi: 10.1016/j.paid.2008.05.017

46. Lee RM, Draper M, Lee S. Social connectedness, dysfunctional interpersonal behaviors, and psychological distress: testing a mediator model. *J Couns Psychol.* (2001) 48:310. doi: 10.1037/0022-0167.48.3.310

47. Wu C, Wang T, Duan W, Wang W, Sun Q. Reliability and validity of the Chinese version of the social connectedness scale. *Journal of Xi'an Jiaotong University*. (2022) 43:496–502. doi: 10.7652/jdyxb202204003

48. Berkman LF, Syme SL. Social networks, host resistance, and mortality: a nine-year follow-up study of Alameda County residents. *Am J Epidemiol.* (1979) 109:186–204. doi: 10.1093/oxfordjournals.aje.a112674

49. Zhong R, Zhang H, Chen Q, Guo X, Han Y, Lin W. Social isolation and associated factors in Chinese adults with epilepsy: a cross-sectional study. *Front Neurol.* (2021) 12:813698. doi: 10.3389/fneur.2021.813698

50. Hae-Young K. Statistical notes for clinical researchers: assessing normal distribution (2) using skewness and kurtosis. *Restorative Dent Endodont*. (2013) 38:52–4. doi: 10.5395/rde.2013.38.1.52

51. Tang Q, Wang Y, Li J, Luo D, Hao X, Xu J. Effect of repeated home quarantine on Anxiety, depression, and PTSD symptoms in a Chinese population during the COVID-19 pandemic: a cross-sectional study. *Front Psych.* (2022) 13:830334. doi: 10.3389/fpsyt.2022.830334

52. Hayes AF. Introduction to mediation, moderation, and conditional process analysis: a regression-based approach. Guilford publications, (2017).

53. Batool F, Hennig C. Clustering with the average silhouette width. Computational Statistics & Data Analysis. (2021) 158:107190. doi: 10.1016/j.csda.2021.107190

54. Shoshani A, Kor A. The mental health effects of the COVID-19 pandemic on children and adolescents: risk and protective factors. Psychological Trauma: Theory, Research, Practice, and Policy (2021).

55. Verma A, Mehta A. Social isolation in COVID-19: impact on mental health of Young adults. *Dentistry*. (2022) 10. doi: 10.5195/d3000.2022.185

56. Wang X, Chen J. Isolation and mental health: challenges and experiences from China. *Gen Psychiatr.* (2021) 34:e100565. doi: 10.1136/gpsych-2021-100565

57. Loades ME, Chatburn E, Higson-Sweeney N, Reynolds S, Shafran R, Brigden A, et al. Rapid systematic review: the impact of social isolation and loneliness on the mental health of children and adolescents in the context of COVID-19. *J Am Acad Child Adolesc Psychiatry.* (2020) 59:1218–1239.e3. doi: 10.1016/j.jaac.2020.05.009

58. Hou Z, Huang Y, Ma S, Feng H, Fu C, Li H, et al. Mental health symptoms and sleep quality of asymptomatic/mild SARS-CoV-2 infected individuals during the omicron wave of the COVID-19 pandemic in Shanghai China. *Brain Behav.* (2022) 12:e2803. doi: 10.1002/brb3.2803

59. Shi L, Lu ZA, Que JY, Huang XL, Liu L, Ran MS, et al. Prevalence of and risk factors associated with mental health symptoms among the general population in China during the coronavirus disease 2019 pandemic. *JAMA Netw Open*. (2020) 3:e2014053. doi: 10.1001/jamanetworkopen.2020.14053

60. Fancourt D, Steptoe A, Bu F. Trajectories of anxiety and depressive symptoms during enforced isolation due to COVID-19 in England: a longitudinal observational study. *Lancet Psychiatry*. (2021) 8:141–9. doi: 10.1016/S2215-0366(20)30482-X

61. Daly M, Sutin AR, Robinson E. Longitudinal changes in mental health and the COVID-19 pandemic: evidence from the UK household longitudinal study. *Psychol Med.* (2022) 52:2549–58. doi: 10.1017/S0033291720004432

62. Gregory MA, Legg NK, Senay Z, Barden J-L, Phiri P, Rathod S, et al. Mental health and social connectedness across the adult lifespan in the context of the COVID-19 pandemic. *Can J Aging*. (2021) 40:554–69. doi: 10.1017/S0714980821000477

63. Lavanya L, Iniyan Selvamani, Venkatraman Natarajan, Raman K. Prevalence of depression, anxiety and stress symptoms and their association with quality of sleep and loneliness in the general population during the COVID-19 pandemic in India. *Int J Res Pharm Sci.* (2020) 11:1819–29. doi: 10.26452/ijrps.v11iSPL1.4377

64. Haider S, Smith L, Markovic L, Schuch FB, Sadarangani KP, Lopez Sanchez GF, et al. Associations between physical activity, sitting time, and time spent outdoors with mental health during the first COVID-19 lock down in Austria. *IJERPH*. (2021) 18:9168. doi: 10.3390/ijerph18179168

65. Yang X, Harrison P, Huang J, Liu Y, Zahn R. The impact of COVID-19-related lockdown on adolescent mental health in China: a prospective study. *SSRN Electron J.* (2021) doi: 10.2139/ssrn.3792956

66. Tüzün Z, Başar K, Akgül S. Social connectedness matters: depression and anxiety in transgender youth during the COVID-19 pandemic. *J Sex Med.* (2022) 19:650–60. doi: 10.1016/j.jsxm.2022.01.522

67. Magson NR, Freeman JY, Rapee RM, Richardson CE, Oar EL, Fardouly J. Risk and protective factors for prospective changes in adolescent mental health during the COVID-19 pandemic. *J Youth Adolesc.* (2021) 50:44–57. doi: 10.1007/s10964-020-01332-9

68. Bu F, Steptoe A, Fancourt D. Who is lonely in lockdown? Cross-cohort analyses of predictors of loneliness before and during the COVID-19 pandemic. *Public Health.* (2020) 186:31–4. doi: 10.1016/j.puhe.2020.06.036

69. Soundararajan A, Lim JX, Ngiam NHW, Tey AJ, Tang AKW, Lim HA, et al. Smartphone ownership, digital literacy, and the mediating role of social connectedness and loneliness in improving the wellbeing of community-dwelling older adults of low socio-economic status in Singapore. *PLoS One.* (2023) 18:e0290557. doi: 10.1371/journal.pone.0290557

70. del Rio C, Collins LF, Malani P. Long-term health consequences of COVID-19. J Am Med Assoc. (2020) 324:1723. doi: 10.1001/jama.2020.19719

71. Leigh-Hunt N, Bagguley D, Bash K, Turner V, Turnbull S, Valtorta N, et al. An overview of systematic reviews on the public health consequences of social isolation and loneliness. *Public Health*. (2017) 152:157–71. doi: 10.1016/j.puhe.2017.07.035

72. Haapakoski R, Mathieu J, Ebmeier KP, Alenius H, Kivimki M. Cumulative metaanalysis of interleukins 6 and 1 β , tumour necrosis factor α and C-reactive protein in patients with major depressive disorder. *Brain Behav Immun.* (2015) 49:206–15. doi: 10.1016/j.bbi.2015.06.001

73. Almeria M, Cejudo JC, Sotoca J, Deus J, Krupinski J. Cognitive profile following COVID-19 infection: clinical predictors leading to neuropsychological impairment. *Brain Behav Immun.* (2020) 9:100163. doi: 10.1016/j.bbih.2020.100163

74. Ianiro G, Mullish BH, Kelly CR, Sokol H, Kassam Z, Ng SC, et al. Screening of faecal microbiota transplant donors during the COVID-19 outbreak: suggestions for urgent updates from an international expert panel. *Lancet Gastroenterol Hepatol.* (2020) 5:430–2. doi: 10.1016/S2468-1253(20)30082-0

75. Costela-Ruiz VJ, Illescas-Montes R, Puerta-Puerta JM, Ruiz C, Melguizo-Rodríguez L. SARS-CoV-2 infection: the role of cytokines in COVID-19 disease. *Cytokine Growth Factor Rev.* (2020) 54:62–75. doi: 10.1016/j.cytogfr.2020.06.001

76. Taquet M, Dercon Q, Harrison PJ. Six-month sequelae of post-vaccination SARS-CoV-2 infection: a retrospective cohort study of 10,024 breakthrough infections. *Brain Behav Immun.* (2022) 103:154–62. doi: 10.1016/j.bbi.2022.04.013