https://doi.org/10.1186/s12877-021-02087-z

Shi et al. BMC Geriatrics

Open Access

Check for

Sex differences in the association between latent class of lifestyle and disability among older adults in China

Zaixing Shi^{1,2†}, Jianlin Lin^{2†}, Jian Xiao² and Ya Fang^{1,2*}

(2021) 21:188

Abstract

Background: A healthy lifestyle may prevent disability for older adults. But research to date is limited to a single lifestyle behavior and ignore sex difference in the lifestyle-disability association. This study aimed at identifying sex-specific latent classes of lifestyle and their relationship with disability among older Chinese adults.

Methods: Data were obtained from adults aged 65 years or above in the 2018 Chinese Longitudinal Healthy Longevity Survey, a nationally representative sample of older adults in China. We used latent class analysis to categorize participants into subgroups based on three dimensions of lifestyle factors: health behaviors, psychological wellbeing, and social engagement. Disability was assessed by the activities of daily living (ADL). Multivariable logistic regression was used to evaluate the associations between the latent lifestyle classes and disability.

Results: A total of 15,771 older adults were included in this analysis, of whom 56% were women and 66% aged 80 years or above. We identified four latent lifestyle classes among older women: "Health Promoting" (28%), "Isolated and Health Harming" (34%), "Restless and Dismal" (21%), and "Restless" (17%). A different set of four lifestyle classes were identified in older men: "Health Promoting" (21%), "Isolated and Health Harming" (26%), "Restless and Dismal" (21%), "Isolated and Health Harming" (26%), "Restless and Dismal" (20%), and "Discordant" (33%). Compared with the "Health Promoting" class, the "Isolated and Health Harming" class (OR = 1.88, 95% CI: 1.46–2.43) and the "Restless and Dismal" class (OR = 1.67, 95% CI: 1.27–2.20) had higher risk of disability in women. The "Discordant" class had lower risk of disability in men (OR = 0.52, 95% CI: 0.37–0.72).

Conclusions: Our analyses revealed different lifestyle patterns for older women and men in China. Sex differences in the associations between lifestyle and disability need to be considered when formulating interventions to prevent disability.

Keywords: Aging, Disability, Lifestyle, Sex differences, Latent class analysis

* Correspondence: fangya@xmu.edu.cn

[†]Zaixing Shi and Jianlin Lin contributed equally to this work.

¹State Key Laboratory of Molecular Vaccinology and Molecular Diagnostics,

School of Public Health, Xiamen University, Xiamen, China

²Key Laboratory of Health Technology Assessment of Fujian Province, School of Public Health, Xiamen University, Xiamen, China



[©] The Author(s). 2021 **Open Access** This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, with http://creativecommons.org/licenses/by/4.0/. The Creative Commons.Public Domain Dedication waiver (http://creativecommons.org/publicdomain/zero/1.0/) applies to the data made available in this article, unless otherwise stated in a credit line to the data.

Background

Disability refers to temporary or permanent loss of physical or mental function, according to the World Health Organization (WHO) [1]. Disability is a major challenge for healthy aging in China. It is estimated that the disability rate of the middle-aged and older adults in China was 21.7% in 2014, higher than the prevalence in the United States (16.5%), Austria (13.7%) and other western countries [2]. By 2050, there would be 91.4 million disabled adults aged over 65 years in China, with a disability rate of 26.44% [3]. Previous studies among older Chinese adults suggest that disability is associated with socioeconomic status, living arrangement, self-rated health, and lifestyle [4-6]. Recently, various lifestyle factors have been associated with preventing functional decline for older adults [7]. For example, non-smoking, moderate but not heavy drinking, physical activity, and a healthy weight are important promoters of functional independence in older adults [8]. Psychological and social factors are also associated with disability. For example, depression is a risk factor for declining psychological functions in older adults [9] and that less social support and social engagement are risk factors for worsening social functions [10]. Collectively, these evidence suggest that lifestyle as a whole may affect daily functioning.

However, previous studies are generally limited to a single health behavior or a few behaviors that are traditionally considered as "lifestyle factors," such as smoking, alcohol drinking, and exercise, while the psychological and social aspects of lifestyle are often ignored. A single lifestyle behavior may have little impact on disability and is not informative for developing targeted lifestyle intervention. For example, people who smoke and drink alcohol are at increased risk of disability, but there may be groups who do not smoke and drink but have poor psychological status, who are also at increased risk of disability. Therefore, it is important to identify the combination patterns of different lifestyles to develop comprehensive strategies to improve lifestyle and prevent disability. The WHO's International Classification of Functioning, Disability, and Health (ICF) [1] suggests that a broad range of personal factors, such as exercise and alcohol drinking, and social factors, such as social engagement, may affect an individual's physical function. The ICF provides a framework for understanding lifestyle patterns associated with disability.

Several studies have started to understand the distinct patterns of lifestyle in older adults. For example, a previous study categorized retirees into a group with a healthy lifestyle and a group with a less healthy lifestyle according to their diet, alcohol consumption, cigarette smoking, physical activity, and TV viewing behaviors, and explored the relationship between lifestyle patterns and sociodemographic characteristics [11]. Another Brazilian study divided older adults into three latent classes: "Healthy", "Poor diet and physical activity", "Smoking and binge drinking", according to their fruits and vegetable consumption, alcohol drinking, cigarette smoking, physical activity, and TV viewing behaviors [12].

However, few studies have considered sex differences when exploring latent classes of lifestyle, although previous studies have found differences in lifestyle between men and women [13]. Moreover, few studies have evaluated the relationship between different lifestyle patterns and the risk of disability among older adults. To fill in this gap, this analysis aimed to 1) identify the latent classes of lifestyle among older women and men in China based on a nationally representative sample, and 2) analyze the associations between the latent lifestyle classes and disability by sex. The findings will facilitate the development of interventions to promote active and healthy aging in older adults.

Methods

Data source

We used the 2018 wave of the Chinese Longitudinal Healthy Longevity Survey (CLHLS), with 15,874 participants. The CLHLS is the first study to investigate factors that impact the health of older adults in China from a multidimensional perspective, which has national representation. Detailed study design of the CLHLS has been reported in a previous report [14]. A total of 15,771 participants aged \geq 65 years were included in this study, after excluding those with missing lifestyle indicators.

Measures

We derived latent lifestyle classes based on 16 lifestyle factors reflecting health behaviors, psychological wellbeing, and social engagement (Supplemental Table 1, Additional File 1). These lifestyle factors were considered predictors of disability according to ICF [1]. All data were collected through face-to-face interview by trained personnel with medical background using a standard questionnaire.

Health behaviors

Measures of health behaviors included the following items: sleep quality, sleep duration, consumption of vegetables, consumption of fruits, alcohol drinking, smoking, exercise, physical examination, frequency of tooth brushing per day, and chronic disease management. Specifically, sleep quality was self-reported, categorized as good, moderate, and bad. Sleep duration records the usual number of hours of sleep and was categorized as less than 7 h, 7 to 8 h, and more than 8 h. Consumption of fruits and vegetables were categorized

as sufficient (quite often, every day, or almost every day) and insufficient (occasionally, rarely, or never). Alcohol drinking, smoking, exercise, and regular physical examination, were categorized as binary variables (yes or no). The frequency of tooth brushing measures how often older adults brush their teeth and was categorized as less than twice per day and twice or more per day. Chronic disease management was evaluated by the diagnosis and treatment status of three common chronic diseases, including hypertension, diabetes, and dyslipidemia (not diagnosed, diagnosed but not taking medicine, and diagnosed and taking medicine).

Psychological wellbeing

The indicators of psychological wellbeing were evaluated by the Chinese version of the Center for Epidemiologic Studies Depression Scale (CES-D) [15] and the Generalized Anxiety Disorder Questionnaire (GAD-7) Scale [16]. The CES-D has 9 items, including "Are you bothered by things that don't usually bother you?", "Do you have trouble focusing on what you were doing?", "Do you feel sad, blue, or depressed?", "Do you feel the older you get, the more useless you are, and have trouble doing anything?", "Do you feel hopeful about the future?", "Do you often feel fearful or anxious?", "Are you as happy as when you were younger?", "Do you often feel lonely and isolated?", and "Do you feel you could not get going?" Each item was categorized as never, seldom, sometimes, often, and always. The CES-D scale showed good internal consistency in the current sample, with a standardized Cronbach's α of 0.82. A score ranging from 1 to 5 was assigned to each response, adding up to a total score of 45, with a higher score suggesting more depressive symptoms. Depression was categorized as no (score < 27) and yes (score \ge 27), according to the 60th percentile.

The GAD-7 scale has 7 items, including "Feeling uneasy, worried and annoyed", "Can't stop or can't control worry", "Is worried too much about all kinds of things", "Is very nervous and it is difficult to relax", "Is very anxious, so you can't sit still", "Becomes easy to get annoyed or easily irritated", and "Feels like something terrible happens". Each item was categorized as never, for several days, more than half of days, and almost every day. A score ranging from 1 to 4 was assigned to each response, adding up to a total of 28. Anxiety was categorized as no (score < 14) and yes (score \ge 14), according to the 50th percentile. The GAD-7 scale demonstrated excellent internal consistency in this sample, with a standardized Cronbach's α of 0.92.

Social engagement

Social engagement was evaluated by structural and functional relationships [17]. The structural relationships were measured by five items: in marriage (1 = "yes", 0 = "no"), having children (1 = "yes", 0 = "no or otherwise"), playing cards and/or mah-jongg (1 = " \geq once per month", 0 = "otherwise"), attending social activities (1 = 2) once per month", 0 = "otherwise"), and visiting and interacting with friends $(1 = " \ge \text{ once per month"}, 0 = "otherwise")$. The total score of structured social interaction is a sum of 5, and the lack of structural relationships was defined as a score ≤ 2 . The functional relationships were evaluated by 3 items: "To whom do you usually talk most frequently in daily life?", "To whom do you talk first when you need to tell something of your thoughts?" and "Who do you ask first for help when you have problems/difficulties?" For the first item, participants could select up to three persons from ten types of relationships (kinship and friends/neighbors), but for the second and third items, participants could select up to two persons. For each item, the first, second, and third selections were assigned a score of 3 to 1, respectively. The total score of the three items ranges from 0 to 16, which was categorized as lacking a functional relationship (score ≤ 10) or not (score > 10).

Covariates

Sociodemographic characteristics were included as covariates, including age (65-79, 80+), marital status (in marriage, not in marriage), residence (urban, rural), living status (alone, with others), education (illiterate, literate or primary school, and junior high and above), occupation before age 60 (agriculture, professional/managerial, and others), household income (lower than 6000 Yuan, 6000–19,999 Yuan, 20,000–39,999 Yuan and higher than 40,000 Yuan), and self-rated health (very bad, bad, average, good, and very good). Cognitive function was evaluated by the Chinese version of the minimental state examination (MMSE; 0-30 scores) [18, 19], which showed excellent internal consistency in this sample (standardized Cronbach's α = 0.87). Cognitive impairment was defined as an MMSE score \leq 19 for illiterate participants, MMSE score ≤ 22 for those who were literate or only attended primary school, and MMSE score \leq 26 for those with a junior high school education or above [20].

Disability

Disability was assessed by the Chinese version of the Katz's activities of daily living (ADL) scale [21, 22], which showed excellent internal consistency in this sample (standardized Cronbach's $\alpha = 0.91$). The scale assessed one's capability of bathing, dressing, toilet, indoor transfer, continence, and eating. Participants were asked if they need assistance in performing the 8 activities. Disability was defined as requiring assistance in any of the ADLs [23, 24].

Statistical analyses

First, latent class analysis (LCA) was used to identify the latent classes according to lifestyle factors among older adults. The LCA estimates the distribution of latent lifestyle classes and conditional probabilities of lifestyle variables for each latent class [25]. We assumed that data were missing at random in this sample. The expectationmaximization algorithm makes it possible to estimate latent classes when some lifestyle variables had missing values [26]. The latent classes of lifestyle of older adults were named according to the distinctive conditional probability of lifestyle variables in each latent class. LCA models with 2 to 10 classes were performed to find the best-fitting model. Model selection was based on the Bayesian information criterion (BIC), adjusted BIC (aBIC), Akaike's information criterion (AIC), and consistent Akaike's information criterion (cAIC), with a lower value indicating better fit [27]. In addition to the model-fitting metrics, the simplicity and interpretability of the model were also considered.

Second, we tested measurement invariance of LCA across sex. Measurement invariance assumes that the latent classes are comparable across different subpopulations. In the test of measurement invariance, models with equal and unequal parameters were fitted respectively and compared using the χ^2 test [25]. If the assumption of measurement invariance is valid, the distribution of latent classes and conditional probabilities will be equal between sex. Otherwise, LCA should be performed for men and women separately.

Finally, multivariable logistic regression model was used to examine the associations of latent lifestyle classes with disability. The multivariable logistic regressions controlled for potential confounders that have been associated with both lifestyle and disability [11, 28], including age, marital status, residence, living status, education, main occupation before 60, household income, and self-rated health (Molde 1). As the study is focusing on older adults, it is possible that a proportion of respondents had some form of cognitive impairment such as dementia. Cognitive impairment may confound the association between lifestyle and disability as it could be associated with a) a person's everyday functioning or disability, b) lifestyle factors such as smoking and drinking [29-31], and c) the reliability of survey results. Therefore, we additionally adjusted for cognitive impairment status to assess its impact on the observed association between lifestyle classes and disability (Model 2). Due to the low response rate to the MMSE scale (59.7%) responded), we conducted multiple imputation for missing MMSE score to avoid potential selection bias if participants with missing cognitive assessment data were excluded from analyses. Following Rubin's approach [32], we generated 50 imputed datasets and fitted the Model 2 on each imputed dataset, which were then averaged to estimate the summary coefficients and standard errors of Model 2. Furthermore, because the literacy rate is low among the oldest old in China [33], the next generation may have higher education. To evaluate the robustness of our results across populations with varying literacy rates, we performed sensitivity analyses to evaluate the association between lifestyle and disability according to age groups (65–74, 75–84, and 85+ years). Data collection and management were conducted in R version 4.0.2. LCA was performed in SAS (version 9.4) [34]. Multiple imputation was performed using R package "mice" [35, 36]. P < 0.05 was regarded as statistically significant.

Results

Sample characteristics

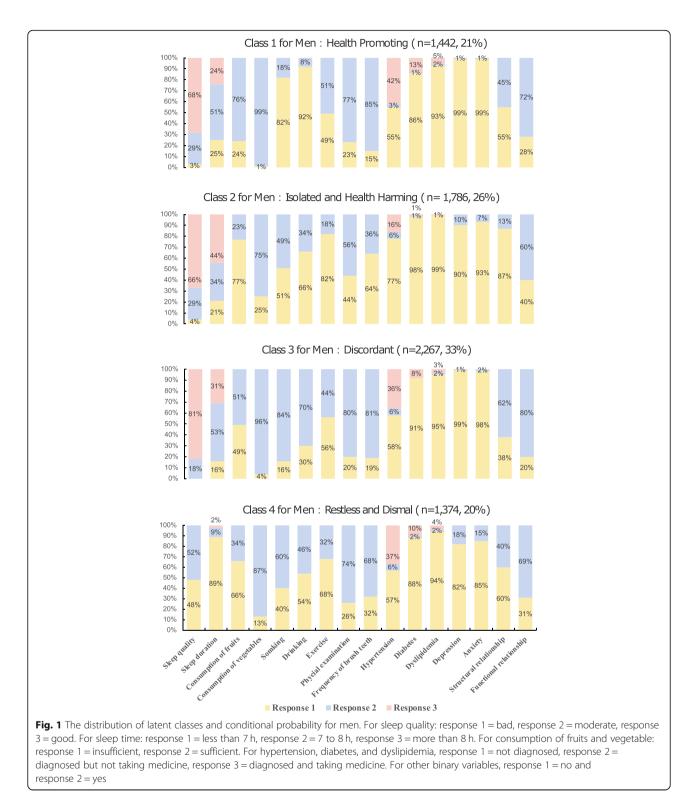
Of the 15,771 participants, 6869 (44%) were men and 8902 (56%) were women. The majority of participants aged 80 years or above (66%), illiterate or only attended primary education (81%), and reported an annual house-hold income of less than 40,000 Chinese Yuan, or approximately 5800 US dollars (69%) (Supplemental Table 2, Additional File 1). More than 28% of older adults met the criteria for disability.

Identification of latent classes of lifestyle

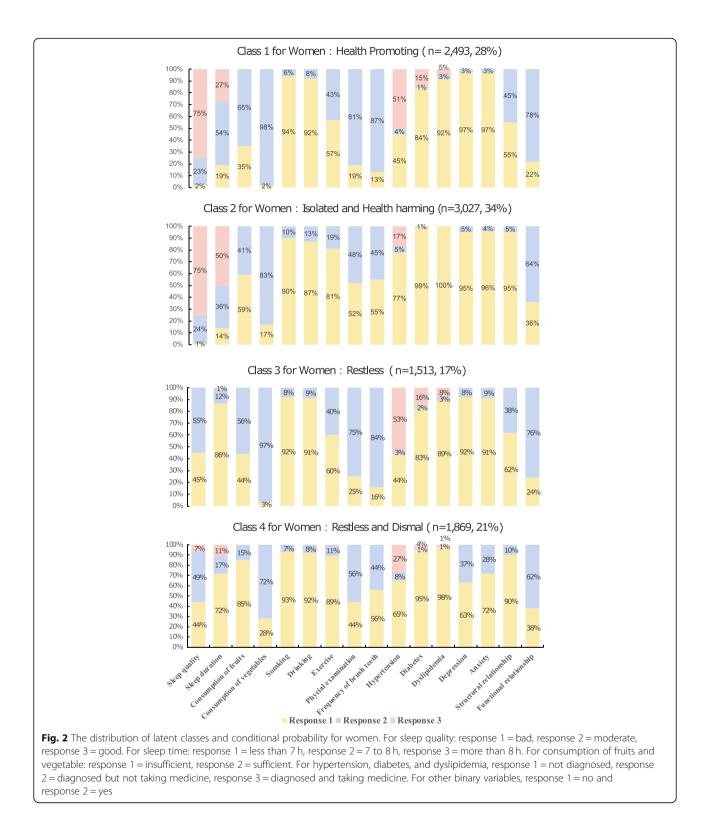
Among models with 2 to 10 classes, a four-class model was selected (Supplemental Table 3, Additional File 1) for both women and men. The results of measurement invariance show that the conditional probability of life-style indicators between men and women was not equal (Supplemental Table 4, Additional File 1). Therefore, the LCA was implemented for men and women separately.

The latent lifestyle classes were named according to the most distinctive conditional probability of lifestyle variables in each class (Fig. 1 and Fig. 2). For women, the first class (n = 2493, 28%) tended to report good sleep quality, exercise, regular physical examination, good structural relationship and function relationship. Thus, the first class was labeled as "Health Promoting". The second class (n = 3027, 34%) was more likely to report smoking and alcohol drinking, and lacked structural relationships. Thus, the second class was labeled as "Isolated and Health Harming". The third class (n = 1513, 17%) had poorer sleep quality and shorter sleep time, thus was labeled as "Restless". The last class (n = 1869, 21%) was similar to the "Restless" class but also reported higher depression and anxiety. Thus, to distinguish from those with poor sleep only, the fourth class was labeled as "Restless and Dismal."

For men, the first class (n = 1442, 21%) was more likely to exercise, brushing teeth, receiving physical examination, and had good function relationship.



Thus, the first class was labeled as "Health Promoting". The second class (n = 1786, 26%) was more likely to report insufficient consumption of fruits and vegetables, and lacked structural relationships. Thus, the second class was labeled as "Isolated and Health Harming." The third class (n = 2267, 33%) tended to have higher probabilities of smoking, alcohol drinking, and no exercise, but was less likely to have depression or anxiety, and reported better structural relationship and functional relationship.



Thus, the third class was labeled as "Discordant." The fourth class (n = 1374, 20%) was characterized by poor sleep quality, short sleep duration, depression and anxiety. Thus, the fourth class was labeled as "Restless and Dismal".

Characteristics of latent lifestyle classes

The sociodemographic characteristics according to latent lifestyle classes are shown in Table 1 and Table 2. There were significant differences in age, marital status, education, main occupation before 60, household

Disability

No

Yes

Variables	Total (<i>N</i> = 6869)	Health Promoting (N = 1442)	lsolated and Health Harming (N = 1786)	Discordant (<i>N</i> = 2267)	Restless and Dismal (N = 1374)	P-value
	N(%)	N(%)	N(%)	N(%)	N(%)	
Age						< 0.001
65–79	2698 (39)	352 (20)	1264 (55)	495 (38)	587 (40)	
≥ 80	4171 (61)	1431 (80)	1050 (45)	804 (62)	886 (60)	
Residence area						< 0.001
Rural area	2978 (43)	865 (49)	997 (43)	446 (34)	670 (45)	
Urban area	3891 (57)	918 (51)	1317 (57)	853 (66)	803 (55)	
Current marital status						< 0.001
Not in marriage	2813 (39)	1154 (20)	596 (55)	491 (38)	572 (40)	
In marriage	3948 (61)	582 (80)	1693 (45)	798 (62)	875 (60)	
Living status						< 0.001
Alone	227 (4)	65 (5)	40 (2)	72 (6)	50 (4)	
With others	5585 (96)	1346 (95)	2009 (98)	1068 (94)	1162 (96)	
Education						< 0.001
Illiterate	1574 (27)	647 (44)	356 (18)	216 (20)	355 (29)	
Literate or primary school	2504 (43)	631 (43)	905 (46)	432 (39)	536 (44)	
Junior high or above	1681 (29)	203 (14)	689 (35)	458 (41)	331 (27)	
Main occupation before age 60						< 0.001
Agriculture	3194 (57)	1016 (71)	1022 (54)	415 (39)	741 (62)	
Professional/managerial	980 (18)	124 (9)	379 (20)	318 (30)	159 (13)	
Others	1396 (25)	288 (20)	479 (25)	335 (31)	294 (25)	
Household income						< 0.001
< 6000 Yuan	1254 (25)	422 (32)	349 (20)	148 (18)	335 (30)	
6000–19,999 Yuan	1033 (21)	306 (23)	345 (20)	153 (19)	229 (21)	
20,000–39,999 Yuan	1068 (21)	284 (21)	403 (24)	176 (21)	205 (19)	
≥ 40,000 Yuan	1626 (33)	327 (24)	617 (36)	347 (42)	335 (30)	
Self-rated health						< 0.001
Very bad	73 (1)	22 (1)	14 (1)	5 (0)	32 (2)	
Bad	748 (12)	196 (13)	153 (7)	87 (7)	312 (22)	
Average	2443 (38)	573 (38)	784 (34)	421 (34)	665 (46)	
Good	2396 (37)	569 (38)	957 (42)	525 (42)	345 (24)	
Very good	796 (12)	137 (9)	369 (16)	212 (17)	78 (5)	
Cognitive impairment						
MMSE score, mean (SD)	27.3 (3.7)	27.9 (3.1)	25.7 (4.9)	28.1 (2.7)	27.0 (3.8)	< 0.001
No	3471 (90)	897 (93)	831 (85)	1677 (96)	956 (91)	< 0.001
Yes	397 (10)	70 (7)	142 (15)	96 (4)	89 (9)	

619 (36) * P-values were obtained from the Chi-square test. For comparison of MMSE score, P-value was obtained from the analysis of variance

1097 (64)

2017 (90)

218 (10)

1015 (81)

237 (19)

1127 (79)

302 (21)

5256 (79)

1376 (21)

< 0.001

Variables	Total (<i>N</i> = 8902)	Health Promoting (N = 2493)	lsolated and Health Harming (N = 3027)	Restless (N = 1513)	Restless and dismal (N = 1869)	P-value
	N (%)	N (%)	N (%)	N (%)	N (%)	
Age						< 0.001
65–79	2654 (30)	385 (12)	1257 (52)	713 (45)	299 (18)	
≥80	6248 (70)	2806 (88)	1181 (48)	856 (55)	1405 (82)	
Residence area						< 0.001
Rural area	4056 (46)	1585 (50)	997 (41)	590 (38)	884 (52)	
Urban area	4846 (54)	1606 (50)	1441 (59)	979 (62)	820 (48)	
Current marital status						< 0.001
Not in marriage	6367 (30)	2797 (12)	1258 (52)	941 (45)	1371 (18)	
In marriage	2389 (70)	298 (88)	1162 (48)	614 (55)	315 (82)	
Living status						< 0.001
Alone	345 (5)	99 (4)	105 (5)	86 (7)	55 (4)	
With others	6830 (95)	2457 (96)	1936 (95)	1174 (93)	1263 (96)	
Education						< 0.001
Illiterate	5216 (68)	2244 (82)	1036 (48)	717 (52)	1219 (83)	
Literate or primary school	1691 (22)	372 (14)	703 (33)	404 (29)	212 (14)	
Junior high and above	820 (11)	104 (4)	420 (19)	257 (19)	39 (3)	
Main occupation before 60						< 0.001
Agriculture	5064 (67)	1970 (74)	1227 (58)	782 (57)	1085 (75)	
Professional/managerial	443 (6)	70 (3)	221 (10)	131 (10)	21 (1)	
Others	2092 (28)	636 (24)	666 (32)	451 (33)	339 (23)	
Household income						< 0.001
< 6000 Yuan	1789 (27)	639 (27)	357 (21)	287 (26)	506 (38)	
6000–19,999 Yuan	1322 (20)	519 (22)	319 (19)	178 (16)	306 (23)	
20,000–39,999 Yuan	1520 (23)	596 (25)	392 (23)	264 (24)	268 (20)	
≥ 40,000 Yuan	1913 (29)	632 (26)	649 (38)	363 (33)	269 (20)	
Self-rated health						< 0.001
Very bad	119 (2)	28 (1)	21 (1)	16 (1)	54 (4)	
Bad	1095 (14)	259 (10)	188 (8)	247 (16)	401 (27)	
Average	3145 (40)	904 (36)	829 (35)	732 (48)	680 (46)	
Good	2704 (34)	1009 (40)	976 (41)	431 (28)	288 (20)	
Very good	832 (11)	312 (12)	357 (15)	110 (7)	53 (4)	
Cognitive impairment						
MMSE score, mean (SD)	25.7 (4.7)	27.3 (3.5)	24.1 (5.4)	26.8 (3.8)	24.0 (5.2)	0.11
No	4899 (88)	1805 (93)	1223 (81)	1135 (92)	736 (83)	< 0.001
Yes	654 (12)	128 (7)	283 (19)	93 (8)	150 (17)	
Disabled						< 0.001
No	5774 (67)	1612 (53)	1950 (83)	1231 (81)	981 (59)	
Yes	2812 (33)	1453 (47)	404 (17)	284 (19)	671 (41)	

Table 2 Sociodemographic characteristics of latent lifestyle classes for women (N = 8902)

income, self-rated health across latent lifestyle classes. Participants with and without disability also showed significant differences in these sociodemographic characteristics (Supplemental Tables 5, Additional File 1).

Association between latent lifestyle classes and disability

The relationship between lifestyle classes and disability is shown in Table 3. In Model 1, women in the "Isolated and Health Harming" (OR = 1.77, 95% CI: 1.41–2.22) and "Restless and Dismal" (OR = 1.56, 95% CI: 1.21– 2.02) classes showed higher disability risks compared with those in the "Health Promoting" class, after accounting for age, marital status, residence, living status, education, occupation before 60, household income, and self-rated health (Table 3). For men, compared with the "Health Promoting" class, the "Isolated and Health Harming" class (OR = 1.43, 95% CI: 1.05–1.95) showed higher risk of disability while the "Discordant" class had lower risk (OR = 0.53, 95% CI: 0.38–0.73) (Table 3).

In Model 2 that additionally adjusted for cognitive impairment status, the magnitude of the associations between lifestyle classes and disability was lessened (Table 3). Nevertheless, the risk of disability remained statistically higher in women who were in the "Isolated and Health Harming" class (OR = 1.88, 95% CI: 1.46-2.43) and "Restless and Dismal" class (OR = 1.67, 95% CI: 1.27-2.20) relative to the "Health Promoting" class. The risk of disability was lower in men who were in the "Discordant" class compared to the "Health Promoting" class (OR = 0.52, 95% CI: 0.37-0.72), after additionally adjusting for cognitive impairment (Table 3). Also, younger participants tended to have higher education (Supplemental Tables 6, Additional File 1). In sensitivity analyses stratified by age, the associations between lifestyle classes and disability were numerically stable across age groups, with the strongest associations in the 75-84 years group for women and the 65-74 years group for men (Supplemental Tables 7, Additional File 1).

Discussion

In this analysis, we identified four latent classes of lifestyle for older women and men based on 16 lifestyle factors in a nationally representative sample of older adults in China. We included a broad range of lifestyle factors that have been associated with disability [1]. By including factors in the behavioral, mental and social domains of lifestyle, our analysis is capable of distinguishing among people who maintain a healthy lifestyle in all aspects and those who simply perform well in one or two domains. In addition, we advance previous research on lifestyle patterns by showing that the lifestyle patterns were significantly associated with the risk of disability among older Chinese adults. The findings can deepen our understanding of the common lifestyle patterns in older adults, and provide important evidence for developing interventions to prevent disability.

In our study, the four latent classes of lifestyle patterns for women were "Health Promoting", "Isolated and Health Harming", "Restless" and "Restless and Dismal"; the latent classes for men were "Health Promoting", "Isolated and Health Harming", "Discordant" and "Restless and Dismal". Our results are consistent with previous studies that have also shown that different patterns exist in lifestyle, health beliefs, and behaviors for men and women [13]. The different latent classes of lifestyles in men and women may be strongly influenced by social contexts that moderate people's perception and maintenance of health behaviors, especially diet and physical activity [37, 38]. Education and prevention programs for lifestyle need to consider sex differences in lifestyles.

For instance, among people who tended to follow health-harming behaviors, men were more likely to show good social engagement ("Discordant" class) compared to women ("Isolated and Health Harming" class). Our finding is consistent with a study in Taiwan, which suggests that social engagement is positively correlated with alcohol consumption in men [39]. In addition, women are more likely to have mental health problems compared with men [40]. Previous studies have shown that substance use, such as smoking and alcohol drinking, increases when people are lonely or depressed [41]. Also, women tended to be more concerned about health issues than men [42].

As 81% of the current sample was illiterate or only attended primary school, the influence of education on lifestyle choices needs to be considered when extrapolating our findings to other populations. While it is generally believed that people with higher education are more likely to follow healthier lifestyles, their relationship is not necessarily causative. For instance, a study in the Philippines (n = 1064) showed that it is not the years of education, but health knowledge, that promotes a healthy lifestyle [43]. Moreover, a British study (n = 9003) showed that the improvement in education following education reform did not significantly improve health knowledge [44]. In our analyses, despite the stark differences in education across age groups, the observed association between lifestyle and disability was generally comparable in younger and older participants. Our findings suggest that lifestyle factors may exert an independent effect on physical functioning of older adults, irrespective of education level. Therefore, it is important to promote health knowledge in older adults of all education levels to reduce or delay disability.

For women, a lifestyle characterized by social isolation was strongly associated with disability. Although previous studies have found that social relations and social support are associated with disability in older adults, it is not clear whether social support directly leads to Table 3 Multivariable logistic regression of the association between latent lifestyle classes and disability, stratified by sex

Variables	Model 1		Model 2		
	Men	Women	Men	Women	
Lifestyle class for men					
Health Promoting	ref		ref		
Isolated and Health Harming	1.43* (1.05, 1.95)		1.34 (0.98, 1.83)		
Discordant	0.53** (0.38, 0.73)		0.52** (0.37, 0.72)		
Restless and Dismal	0.91 (0.65, 1.27)		0.88 (0.63, 1.23)		
Lifestyle class for women					
Health Promoting		ref		ref	
Isolated and Health Harming		1.77** (1.41, 2.22)		1.88** (1.46, 2.43	
Restless		0.91 (0.69, 1.21)		1.11 (0.84, 1.47)	
Restless and Dismal		1.56** (1.21, 2.02)		1.67** (1.27, 2.20	
Age					
65–79	ref	ref	ref	ref	
≥80	4.24** (3.18, 5.72)	6.36** (4.81, 8.49)	3.99** (2.97, 5.35)	5.97** (4.49, 7.94	
Residence area					
Rural area	ref	ref			
Urban area	1.26* (1.01, 1.57)	1.29** (1.09, 1.53)	1.25 (1.00, 1.56)	1.29** (1.09, 1.53	
Current marital status					
Not in marriage	ref	ref	ref	ref	
In marriage	0.41** (0.33, 0.52)	0.39** (0.31, 0.50)	0.43** (0.34, 0.54)	0.41** (0.32, 0.52	
Living status					
Alone	ref	ref	ref	ref	
With others	0.69 (0.42, 1.14)	0.58** (0.38, 0.86)	0.69 (0.42, 1.14)	0.58** (0.39, 0.87	
Education					
Illiterate	ref	ref	ref	ref	
Literate or primary school	0.65** (0.51, 0.82)	0.66** (0.52, 0.83)	0.68** (0.53, 0.86)	0.68** (0.54, 0.86	
Junior high and above	0.57** (0.40, 0.80)	0.61* (0.38, 0.96)	0.50** (0.35, 0.71)	0.54* (0.34, 0.87)	
Main occupation before 60					
Agriculture	ref	ref	ref	ref	
Professional/managerial	2.48** (1.72, 3.58)	1.68 (0.98, 2.86)	2.54** (1.75, 3.68)	1.72* (1.00, 2.94)	
Others	1.77** (1.36, 2.30)	1.60** (1.32, 1.94)	1.72** (1.32, 2.25)	1.61** (1.32, 1.95	
Household income					
< 6000 Yuan	ref	ref	ref	ref	
6000–19,999 Yuan	1.15 (0.82, 1.60)	1.31* (1.02, 1.69)	1.16 (0.83, 1.63)	1.36* (1.06, 1.76)	
20,000–39,999 Yuan	0.97 (0.70, 1.35)	1.07 (0.85, 1.36)	0.98 (0.70, 1.37)	1.10 (0.86, 1.40)	
≥ 40,000 Yuan	1.04 (0.76, 1.42)	1.10 (0.87, 1.38)	1.07 (0.78, 1.46)	1.14 (0.90, 1.44)	
Self-rated health					
Very bad	ref	ref	ref	ref	
Bad	0.36** (0.16, 0.78)	0.59 (0.30, 1.12)	0.34** (0.16, 0.74)	0.58 (0.30, 1.13)	
Average	0.17** (0.08, 0.37)	0.26** (0.13, 0.49)	0.18** (0.08, 0.38)	0.26** (0.14, 0.49	
Good	0.12** (0.05, 0.25)	0.21** (0.11, 0.40)	0.12** (0.06, 0.26)	0.21** (0.11, 0.40	
Very good	0.12** (0.05, 0.28)	0.22** (0.11, 0.43)	0.13** (0.06, 0.29)	0.22** (0.11, 0.44	

Variables	Model 1		Model 2	Model 2		
	Men	Women	Men	Women		
Cognitive impairment						
No	-	-	ref	ref		
Yes	_	_	2.45** (1.72, 3.50)	2.14** (1.67, 2.74)		

Table 3 Multivariable logistic regression of the association between latent lifestyle classes and disability, stratified by sex (Continued)

Values were odds ratios with 95% confidence interval in brackets

P* < 0.05; *P* < 0.01; ****P* < 0.001

disability [21, 45]. Our study found that older adults with poor social relations tend to have health-harming behaviors, such as smoking, alcohol drinking, and nonexercise, which may increase the risk of disability. Thus, appropriate health interventions can be tailored to socially isolated groups, such as advocating abstinence and exercise, to reduce the risk of disability and improve the quality of life for older adults.

For men, the class of "Discordant" had a lower risk of disability compared to the class of "Health Promoting". A plausible explanation is that health-promoting behaviors such as exercise and good social engagement may carry positive effects that offset the negative effects of smoking and drinking. In addition, compared with the class of "Health Promoting", the class of "Discordant" was younger, which may lead to a lower risk of disability in the class of "Discordant". However, in multivariable analyses adjusting for age, the "Discordant" class still showed lower risk of disability compared to the "Health Promoting" class. Another possible explanation is that the disabled older adults may be motivated to change unfavorable lifestyles to delay the process of disability, leading to a higher risk of disability in the class of "Health Promoting" than in the class of "Discordant".

Compared with men, women with poorer mental health and sleep quality may be at higher risk of disability. Previous studies have shown that a normal mental state is a protective factor for disability in older adults, and depression may aggravate the degree of disability [46]. Depression tended to associate with chronic diseases such as diabetes and hypertension, which may increase the risk of disability [47, 48]. Further, depression aggravates functional disability in patients with chronic diseases and affects the ability of daily instrumental activities in varying degrees [49]. Therefore, it is necessary to take social and psychological intervention measures, such as providing opportunities based on the abilities and preferences of older adults to participate in meaningful social activities, to reduce the psychological problems of older adults.

To the best of our knowledge, this study is one of the first to analyze the relationship between multidimensional lifestyle patterns and disability. However, our study suffers from several limitations. First, as this study is a cross-sectional study, the causal relationship between lifestyle and disability is not clear. Second, we cannot assess the impact of lifestyle changes on disability. For example, since smoking, alcohol drinking and exercise data were assessments of recent conditions, the effects of quitting smoking and alcohol cessation on disability cannot be evaluated. Third, the observed association could be due to reverse causation, that is, the disabled older adults may be more motivated to change their lifestyle, leading to an association between a healthier lifestyle and higher risk of disability. Since the effects of lifestyle are likely cumulative, more years of data should be collected to assess the impact of lifestyle and its change on disability. Fourth, cognitive impairment may confound the observed association as it may be associated with both lifestyle and disability, and may introduce measurement errors in lifestyle factors. In analyses adjusting for cognitive impairment, lifestyle classes were still associated with disability albeit reduced magnitude of association. However, it is possible that unmeasured confounding may have contributed to the observed association. Fifth, since the majority of the sample was illiterate or only attended primary education, our findings may not be generalizable to other populations with higher education levels. Lastly, the impact of measurement errors cannot be completely ignored, even if the survey was conducted face-to-face by trained personnel. Furthermore, using binary values to indicate alcohol consumption and exercise poses a significant limitation as a person who walks 15 min once per week could tick "yes" for exercise, which would obviously differ greatly from someone else who did a combination of weightbearing and aerobic exercise multiple times per week. Future research needs more objective lifestyle measurements to identify lifestyle classes and assess the association between lifestyle and disability.

Conclusions

In conclusion, we identified different lifestyle patterns in men and women over 65 years old in China. An unhealthy lifestyle characterized by health-harming behaviors and poor mental and social functioning was associated with a higher risk of disability. For women, the class of "Isolated and Health Harming" and the class of "Restless and Dismal" had higher risk of disability, while the class of "Discordant" had lower risk of disability in men. These results suggest that education and interventions for disability prevention should not only focus on health behaviors but also promote mental health and social engagement. In addition, sex differences in lifestyle pattern need to be considered when formulating interventions to prevent disability.

Supplementary Information

The online version contains supplementary material available at https://doi. org/10.1186/s12877-021-02087-z.

Additional file 1: Supplemental Table 1. Categorization of lifestyle variables for latent class analysis. Supplemental Table 2. Sample characteristics of the analytical sample (*N*= 15,771). Supplemental Table 3. Model fitting statistics for group number selection. Supplemental Table 4. Test of measurement invariance for lifestyle latent classes between women and men. Supplemental Table 5. Sociodemographic characteristics by sex and disability status (*N*= 15,771). Supplemental Table 6. Distribution of education levels by age groups. Supplemental Table 7. Multivariable logistic regression of the association between latent lifestyle classes and disability, stratified by age groups.

Abbreviations

CLHLS: Chinese Longitudinal Healthy Longevity Survey; WHO: World Health Organization; ICF: International Classification of Functioning, Disability, and Health; CES-D: Center for Epidemiologic Studies Depression Scale; GAD: Generalized anxiety disorder; MMSE: Mini-mental state examination; ADL: Activities of daily living; LCA: Latent class analysis; EM: Expectationmaximization algorithm; BIC: Bayesian information criterion; aBIC: Adjusted BIC; AIC: Akaike's information criterion; cAIC: Consistent Akaike's information criterion

Acknowledgments

Data used in this analysis were provided by the CLHLS study, which was coordinated by the Center for Healthy Ageing and Development Studies, Peking University. The authors would like to thank CLHLS participants and researchers for their contributions to this important study.

Authors' contributions

ZS, JL, and YF conceived and designed the study; ZS and JL performed statistical analyses; YF supervised the data analyses; ZS, JL, JX and YF contributed to manuscript writing. All authors have read and approved the final manuscript.

Funding

This work was supported by the National Natural Science Foundation of China (Grant number 81973144). The funding body had no role in the design of the study and collection, analysis, and interpretation of data and in writing the manuscript.

Availability of data and materials

The analytical dataset used in this study is a publicly available dataset released by the CLHLS. Information about the data source and available data are found at https://www.icpsr.umich.edu/icpsrweb/DSDR/studies/36179. Researchers can obtain these data after submitting a data use agreement to the CLHLS team.

Ethics approval and consent to participate

The Chinese Longitudinal Healthy Longevity Survey (CLHLS) was approved by the Institutional Review Board, Duke University (Pro00062871), and the Biomedical Ethics Committee, Peking University (IRB00001052–13074). Permissions are required to access the raw data from the CLHLS. This study obtained the CLHLS data by submitting a data use agreement, which was approved by Zheng Zhenzhen, Executive Associate Director of Center for Healthy Aging and Family Studies, Peking University.

Consent for publication

Not applicable.

Competing interests

The authors declare that they have no competing interests.

Received: 12 October 2020 Accepted: 15 February 2021 Published online: 18 March 2021

References

- Organization WH. The international classification of functioning. Disability and Health-ICF: World Health Organization; 2001.
- Lee J, Lau S, Meijer E, Hu P. Living longer, with or without disability? A global and longitudinal perspective. J Gerontol A Biol Sci Med Sci. 2020; 75(1):162–7.
- Zhang LW, Fu SJ, Fang Y. Prediction of the Number of and Care Costs for Disabled Elderly from 2020 to 2050: A Comparison between Urban and Rural Areas in China. Sustainability. 2020;12(7). https://doi.org/10.3390/su12 072598.
- Yiengprugsawan V, D'Este C, Byles J, Kendig H. Geographical variations in self-rated health and functional limitations among older Chinese in eight WHO-SAGE provinces. BMC Geriatr. 2019;19(1):10.
- Feng Q, Hoenig HM, Gu D, Yi Z, Purser JL. Effect of new disability subtype on 3-year mortality in Chinese older adults. J Am Geriatr Soc. 2010;58(10): 1952–8.
- Yu R, Wong M, Chang B, Lai X, Lum CM, Auyeung TW, et al. Trends in activities of daily living disability in a large sample of community-dwelling Chinese older adults in Hong Kong: an age-period-cohort analysis. BMJ Open. 2016;6(12):e013259.
- Jacob ME, Yee LM, Diehr PH, Arnold AM, Thielke SM, Chaves PH, et al. Can a healthy lifestyle compress the disabled period in older adults? J Am Geriatr Soc. 2016;64(10):1952–61.
- Peel NM, McClure RJ, Bartlett HP. Behavioral determinants of healthy aging. Am J Prev Med. 2005;28(3):298–304.
- Bowen ME, Ruch A. Depressive symptoms and disability risk among older white and Latino adults by nativity status. J Aging Health. 2015;27(7):1286– 305.
- Mendoza-Nunez VM, Gonzalez-Mantilla F, Correa-Munoz E, Retana-Ugalde R. Relationship between Social Support Networks and Physical Functioning in Older Community-Dwelling Mexicans. Int J Environ Res Public Health. 2017; 14(9). https://doi.org/10.3390/ijerph14090993.
- Sodergren M, Wang WC, Salmon J, Ball K, Crawford D, McNaughton SA. Predicting healthy lifestyle patterns among retirement age older adults in the WELL study: a latent class analysis of sex differences. Maturitas. 2014; 77(1):41–6.
- de Mello GT, da Silva KS, da Costa BG, Borgatto AF. Patterns of risk behaviors in Brazilian older adults: a latent class analysis. Geriatr Gerontol Int. 2019;19(3):245–8.
- 13. Deeks A, Lombard C, Michelmore J, Teede H. The effects of gender and age on health related behaviors. BMC Public Health. 2009;9:213.
- Goodkind D, Poston DL. Healthy longevity in China: demographic, socioeconomic, and psychological dimensions. Popul Stud J Demography. 2009;63(3):312–3.
- Lenore S. Radloff. The CES-D scale: a self-report depression scale for research in the general population. Appl Psychol Meas. 1977;1(3):385–401.
- Spitzer RL, Kroenke K, Williams JB, Lowe B. A brief measure for assessing generalized anxiety disorder: the GAD-7. Arch Intern Med. 2006;166(10): 1092–7.
- 17. Li T, Zhang Y. Social network types and the health of older adults: exploring reciprocal associations. Soc Sci Med. 2015;130:59–68.
- 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;12(3):189–98.
- Zeng Y, Feng Q, Hesketh T, Christensen K, Vaupel JW. Survival, disabilities in activities of daily living, and physical and cognitive functioning among the oldest-old in China: a cohort study. Lancet. 2017;389(10079):1619–29.
- Zhang ZX, Zahner GE, Roman GC, Liu XH, Wu CB, Hong Z, et al. Sociodemographic variation of dementia subtypes in China: methodology and results of a prevalence study in Beijing, Chengdu, Shanghai, and Xian. Neuroepidemiology. 2006;27(4):177–87.
- Gao M, Sa Z, Li Y, Zhang W, Tian D, Zhang S, et al. Does social participation reduce the risk of functional disability among older adults in China? A survival analysis using the 2005-2011 waves of the CLHLS data. BMC Geriatr. 2018;18(1):224.

- Katz S, Ford AB, Moskowitz RW, Jackson BA, Jaffe MW. Studies of illness in the aged. The index of Adl: a standardized measure of biological and psychosocial function. JAMA. 1963;185:914–9.
- 23. Su P, Ding H, Zhang W, Duan G, Yang Y, Chen R, et al. The association of multimorbidity and disability in a community-based sample of elderly aged 80 or older in Shanghai. China BMC Geriatr. 2016;16(1):178.
- Hou C, Ping Z, Yang K, Chen S, Liu X, Li H, et al. Trends of activities of daily living disability situation and association with chronic conditions among elderly aged 80 years and over in China. J Nutr Health Aging. 2018;22(3): 439–45.
- 25. Ghosh JK. Latent class and latent transition analysis: with applications in the social, behavioral, and health sciences. Canada. 2010;78:449–50.
- Linzer DA, Lewis JB. poLCA: an R package for Polytomous variable latent class analysis. J Statal Software. 2011;42:1–29.
- Nylund KL, Asparoutiov T, Muthen BO. Deciding on the number of classes in latent class analysis and growth mixture modeling: a Monte Carlo simulation study. Structural Equation Modeling-a Multidisciplinary J. 2007; 14(4):535–69.
- Qi SG, Wang ZH, Wang LM, Wang H, Zhang H, Li ZX. Incidence of activities of daily living disability and related factors in community-dwelling older adults in China. Zhonghua Liu Xing Bing Xue Za Zhi. 2019;40(3):272–6.
- Dhana K, Evans DA, Rajan KB, Bennett DA, Morris MC. Healthy lifestyle and the risk of Alzheimer dementia: findings from 2 longitudinal studies. Neurology. 2020;95(4):e374–e83.
- Clare L, Wu YT, Teale JC, MacLeod C, Matthews F, Brayne C, et al. Potentially modifiable lifestyle factors, cognitive reserve, and cognitive function in later life: a cross-sectional study. PLoS Med. 2017;14(3):e1002259.
- 31. Dong L, Xiao R, Cai C, Xu Z, Wang S, Pan L, et al. Diet, lifestyle and cognitive function in old Chinese adults. Arch Gerontol Geriatr. 2016;63:36–42.
- 32. Rubin DB. Multiple imputation for nonresponse in surveys. Hoboken: Wiley; 2004.
- Ye L, Luo J, Shia BC, Fang Y. Heterogeneous health classes for older adults and their regional disparities in China: based on multidimensional health. Public Health. 2020;178:15–22.
- Lanza ST, Collins LM, Lemmon DR, Schafer JL. PROC LCA: A SAS procedure for latent class analysis. Struct Equ Model. 2007;14(4):671–94.
- van Buuren S, Groothuis-Oudshoorn K. mice: Multivariate Imputation by Chained Equations in R. 2011. 2011;45(3):67.
- Shah A. Multiple imputation using MICE and random Forest [R package CALIBERrfimpute version 0.1-6]. Physiol Behav. 1989;46(4):743–6.
- Hernandez EM, Margolis R, Hummer RA. Educational and gender differences in health behavior changes after a gateway diagnosis. J Aging Health. 2018; 30(3):342–64.
- O'Neil A, Scovelle AJ, Milner AJ, Kavanagh A. Gender/sex as a social determinant of cardiovascular risk. Circulation. 2018;137(8):854–64.
- Chuang YC, Chuang KY. Gender differences in relationships between social capital and individual smoking and drinking behavior in Taiwan. Soc Sci Med. 2008;67(8):1321–30.
- Wang S, Li B, Ungvari GS, Ng CH, Chiu HF, Kou C, et al. Poor mental health status and its associations with demographic characteristics and chronic diseases in Chinese elderly. Soc Psychiatry Psychiatr Epidemiol. 2016;51(10): 1449–55.
- Wootton RE, Greenstone HSR, Abdellaoui A, Denys D, Verweij KJH, Munafo MR, et al. Bidirectional effects between loneliness, smoking and alcohol use: evidence from a Mendelian randomization study. Addiction. 2020. https:// doi.org/10.1111/add.15142.
- 42. Siegrist M, Keller C, Kiers HA. A new look at the psychometric paradigm of perception of hazards. Risk Anal. 2005;25(1):211–22.
- Hoffmann R, Lutz SU. The health knowledge mechanism: evidence on the link between education and health lifestyle in the Philippines. Eur J Health Econ. 2019;20(1):27–43.
- Johnston DW, Lordan G, Shields MA, Suziedelyte A. Education and health knowledge: evidence from UK compulsory schooling reform. Soc Sci Med. 2015;127:92–100.
- 45. van Hees SGM, van den Borne BHP, Menting J, Sattoe JNT. Patterns of social participation among older adults with disabilities and the relationship with well-being: a latent class analysis. Arch Gerontol Geriatr. 2020;86:103933.
- Friedrich MJ. Depression is the leading cause of disability around the world. JAMA. 2017;317(15):1517.
- 47. Zhang Y, Chen Y, Ma L. Depression and cardiovascular disease in elderly: current understanding. J Clin Neurosci. 2018;47:1–5.

Page 13 of 13

- Read JR, Sharpe L, Modini M, Dear BF. Multimorbidity and depression: a systematic review and meta-analysis. J Affect Disord. 2017;221:36–46.
- Kiosses DN, Klimstra S, Murphy C, Alexopoulos GS. Executive dysfunction and disability in elderly patients with major depression. Am J Geriatr Psychiatry. 2001;9(3):269–74.

Publisher's Note

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

Ready to submit your research? Choose BMC and benefit from:

- fast, convenient online submission
- thorough peer review by experienced researchers in your field
- rapid publication on acceptance
- support for research data, including large and complex data types
- gold Open Access which fosters wider collaboration and increased citations
- maximum visibility for your research: over 100M website views per year

At BMC, research is always in progress.

Learn more biomedcentral.com/submissions

