Does Aging at Home Make Older Adults Healthy:

Evidence from Medicaid Home and Community-Based Services

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#### Abstract

The Medicaid Home and Community-Based Services (HCBS) subsidize long-term care to satisfy the increasing desire to age at home among older adults. The HCBS program may improve health outcomes of this population by allowing them to age in place, but less quality and quantity of home-based care comparing to nursing home care could offset some of the potential benefits. We use plausibly exogenous policy expenditure across states over time linked with detailed health information from the restricted Health and Retirement Study (HRS) to identify the causal effects of HCBS on general health, physical health, and mental health of older adults. Overall, our findings suggest that HCBS is beneficial to health: a \$1,000 increase in HCBS per older person improves health status by 6 percent, mitigates functional mobility limitations by 5 percent, and reduces negative psychological feelings by 17 percent. The HCBS program improves health outcomes mainly through three mechanisms: decreasing risk behavior on drinking, increasing healthcare use, and spending more time accompanying with family.

Keywords: Medicaid HCBS, Long-Term Care, Health, Aging

JEL classification: I12, I18, I30

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# **1** INTRODUCTION

The need for long-term care (LTC) in the United States has increased dramatically as its population ages (Kemper et al. 2005; Brown and Finkelstein 2008; National Center for Health Statistics 2009; Hagen 2013; Johnson 2017). To meet the elderly's increasing demand for LTC without raising the government's financial burden in covering the costly nursing home care services, Medicaid implemented the Home and Community-Based Services (HCBS) program in the mid-1980s, and expanded its coverage rapidly since the early 1990s (Kaye et al. 2009; Ng et al. 2010).<sup>1</sup> As people generally prefer to age in their own homes and communities, the HCBS program works by encouraging older people to delay entering nursing homes or rely less on nursing home care (Wilmoth and Chen 2003; Muramatsu et al. 2007; Miller 2011; Guo et al. 2015; Segelman et al. 2017; Aguila et al. 2020).

Despite its cost attractiveness, whether the expansion of HCBS improves health outcomes for the older population remains unclear. On the one hand, a large body of literature demonstrates that aging-in-place can improve health by creating senses of belonging and self-control of lives, reducing feelings of loneliness, and facilitating social relationships (Nair 2004; Oswald and Wahl 2004; Wiles 2005; Grabowski 2006; Rojo-Pérez et al. 2007; Stancliffe et al. 2009; Prieto-Flores et al. 2011; Sereny and Gu 2011). On the other hand, compared to nursing home care, there is typically less oversight of quality and quantity of home-based care (Kane et al. 2007; Dick et al. 2019), which may reduce health outcomes for the affected population. For example, there is evidence that the training and skills of HCBS staff are inadequate for particular groups, such as people with dementia, who are at risk of being inaccurately evaluated and given unsuitable care (Sands et al. 2008; Cherry 2012). Furthermore, older people who receive home-based care may have less contact with medical professionals than in a nursing home. In this case, some of their illnesses may go undiagnosed, even if their underlying health has deteriorated. Thus, the

<sup>&</sup>lt;sup>1</sup>Many OECD countries have shifted resources toward providing more affordable home-based care to reduce the costs of providing long-term institutional care (Landers et al. 2016).

overall effect of Medicaid HCBS on health of older people demands detailed investigation.

This paper examines empirically how the HCBS program affects older Americans' health outcomes. Using the restricted data of the Health and Retirement Study (HRS) and detailed data on state-level policy spending from 1998 to 2014, we demonstrate how the HCBS benefits older people's health condition in three dimensions. First, we demonstrate that a \$1,000 increase in HCBS expenditure per older person decreases the probability of reporting worse health status by 6 percent. The self-reported health improvement effect is more significant for older people with limited financial resources who are more likely to be enrolled in HCBS. Second, we evaluate how the HCBS program affects the older population on physical health. Our findings show that a \$1,000 increase in HCBS expenditure is associated with a 5 percent decrease in the probability of individuals reporting mobility limitation. Third, our estimates also confirm that HCBS generosity improves mental health by reducing the probability of negative emotional feelings by 17 percent and increasing cognitive skills by 1 percent. The estimates above are robust across different specifications.

We further explore the mechanisms through which HCBS improves the health outcomes of older adults. First, we find that HCBS leads to changes in risky behavior. An increase in HCBS generosity reduces the likelihood of drinking among older people by 2 percentage points (5 percent with a mean of 0.43). HCBS also decreases drinking intensity by 8 percentage points weekly (8 percent with a mean of 1) and 6 percentage points daily (12 percent with a mean of 0.5). These changes are nontrivial taking the fact that it is harder for older adults to change long-maintaining habits. Second, we show that the HCBS expansion is associated with an increase in healthcare use. HCBS increases the probability of using inpatient services by about 6 percent and the probability of regularly taking medications by 1 percent. Third, we provide suggestive evidence that HCBS significantly improves the chances of older people to interact with family members. Specifically, Liu and Zai (2022) show that HCBS generosity substantially increases informal caregiving to older adults by their children and increases more incidents of co-residency with family members. In addition, we also find that HCBS improves the likelihood of older adults to be taken care of by either paid home aids or informal caregivers by about 13 percent. HCBS also increases the daily care provided to older people by 0.4 days (or hourly care by 2.4 hours) during the past month of the interview date.

This paper is related to several branches of literature. First, the results are related to the research on how HCBS affects care arrangements and well-being of older people. A large part of this literature focuses on analyzing how HCBS affects home stay or home/community return, nursing home entry, length of nursing home stay, and use of hospitals (Miller et al. 1998; Alecxih et al. 2006; Radke et al. 2006; Muramatsu et al. 2007; Miller 2011; Guo et al. 2015; Wang et al. 2020). This line of work finds that the expansion of HCBS allows older people to stay at home/community longer and return to home after being discharged from nursing homes and hospitals. In addition, HCBS generosity decreases nursing home care use and the duration in nursing facilities. Another part of this literature shows that participants in HCBS are at a higher risk of hospitalization than nursing home residents (Sands et al. 2008; Wysocki et al. 2014; Konetzka et al. 2020). A few papers on analyzing health effects find that HCBS generosity is associated with more patients of functional and cognitive impairments at home (Kane et al. 2013; Wang et al. 2020). To our best knowledge, this paper is the first to examine the extensive health effects of HCBS and hence contributes to the discussion of benefits of HCBS. We present convincing estimates by using the longitudinal HRS with a large representative sample of aging people in the United States linked with statelevel demographic and economic variables that allow for identification assumption tests and detailed robustness checks.

Second, the findings in this paper are broadly connected to the literature that estimates the benefits of public policy on health. Studies of other Medicaid program find that the Affordable Care Act (ACA) expansion improves self-reported health and the psychological health of low-income adults as well as infant health (Currie and Gruber 1996a;b; Finkelstein et al. 2012; McMorrow et al. 2017; Simon et al. 2017; Kuka 2020). Studies of Medicare show that Medicare benefits are associated with an improvement in self-reported health among older people (Khwaja 2006; Card et al. 2008). Studies of government welfare and nutrition programs also find an improvement in self-reported health status (Bitler et al. 2005; Hoynes et al. 2011; Evans and Garthwaite 2014; Kuka 2020). Our findings adds this line of research showing that government policy can effectively enhance people's health conditions.

Third, the study is related to a smaller literature that evaluates the cost-effectiveness of HCBS. Many studies show that the HCBS program increases the overall Medicaid expenditure on LTC (Kemper 1988; Levine and Barry 2003; Grabowski 2006; Kane et al. 2013). Our findings provide evidence that HCBS could save Medicaid health care spending by improving health of older people. The potential savings from health improvement justifies the increasing investment in HCBS from the policy perspective.

The paper is organized as follows. Section 2 introduces the institutional background of HCBS. Section 3 describes the data, explains some key health outcomes, and presents summary statistics. Section 4 introduces the empirical model and potential threats to identification. Section 5 reports the effects of HCBS on a variety of health outcomes, explores mechanisms, presents robustness checks, and analyzes heterogeneous effects. Section 6 concludes.

# 2 MEDICAID HCBS

After its initial launch in 1960s, LTC for older people funded by Medicaid was only available in institutional settings, such as nursing homes. Because nursing home care is costly, Medicaid's LTC expenditure expanded significantly over the years. In an effort to contain the massive growth in LTC expenditure, and in the meanwhile, to satisfy older people's expressed preferences for receiving LTC at home, Medicaid implemented the HCBS program in the early 1980s. The mission of HCBS is to provide LTC for older adults at home, and thus to improve their quality of life by allowing them to age in place. Since 1999, the program has expanded substantially, in response to court-ordered mandates of serving people with disabilities in home or community-based settings, as shown in Appendix Figure A1.<sup>2</sup> Our working sample covers the period 1998-2014, from the expansion of HCBS to the most recent year with policy information available. In section 4, we also use the pre-expansion period 1992-1998 to test our identification assumptions.

Medicaid HCBS funds three major programs for older adults: a mandatory home health state plan, an optional personal care state plan, and optional aging waivers.<sup>3</sup> The state plans are available to every Medicaid-eligible person with limited resources and the aging waiver is only for Medicaid-eligible people aged 65 and above.<sup>4</sup> Specifically, the home health state plan mainly covers in-home services provided by nurses and professionals; the personal care state plan provides additional services such as personal care and assistance with household activities at home, in the workplace, in foster care, and in an assisted living facility; the aging waiver focuses on services such as round-the-clock help and similar personal care services in the personal care state plan to assist older participants with difficulties in daily activities. Appendix Table A1 describes the services offered under each HCBS subprogram in detail. Notice that there are some overlap between these programs. For example, the home-based services such as personal care and help with household chores are covered in all of the subprograms of HCBS.

Figure 1 shows a large variation in HCBS spending per capita across states. There are several reasons to explain why each state spends HCBS funding differently. First, states have full discretion to determine the scope of services covered in aging waivers. For example, 85

 $<sup>^{2}\</sup>mathrm{Per}$  Americans with Disabilities Act (ADA)'s community integration mandate, Supreme Court's Olmstead decision promotes HCBS to cover for people with disabilities.

<sup>&</sup>lt;sup>3</sup>Medicaid HCBS also includes other state plan programs, such as Community First Choice, which provides supplementary services for people who prefer to stay at home; and Section 1915(i), which supports intellectually or developmentally disabled people. In 2018, about \$62.5 billion was spent on waivers, accounting for 58 percent of total Medicaid expenditure; another \$20.6 billion was spent on state plans, representing 23 percent of total Medicaid expenditure; while the Community First Choice program was much smaller, accounting for around 9 percent of total Medicaid expenditure.

<sup>&</sup>lt;sup>4</sup>For most states, the Medicaid eligibility limit is around \$2,313 per month in incomes and \$2,000 in assets. For details about the eligibility rules in each state, see: https://www.medicaidplanningassistance.org/medicaid-eligibility/.

percent waivers spend HCBS dollars on home-based services, 70 percent waivers cover nursing therapy services, 40 percent waivers include round-the-clock services, and 27 percent waivers provide mental health services. Second, states decide their own spending of each service covered under waivers. Figure 2 demonstrates the cross-state variation on the spending of each service in waivers per enrollee in 2014. For example, for home-based services, Oregon spent only \$826 per participant, Florida spent \$4,404 per enrollee, North Carolina spent \$11,531 per person, and New Jersey spent \$43,066 per participant in HCBS waivers. Third, states are allowed to set their own eligibility limits in incomes and assets in aging waivers. The majority of these waivers (79%) use the standard Medicaid eligibility cutoffs (300%)SSI in incomes and \$2,000 in assets). Some waivers set more restrictive requirements by setting the income limit to be below 100% SSI (5 percent), or 101% to 299% SSI (16%), and by setting the asset limit to be below 1,600 (4%) in 2018. Eight percent of waivers have more generous asset limit of \$2,500-4,000 and 1 percent waivers do not have asset cutoffs.<sup>5</sup> Fourth, states have flexibility to allocate dollars in different programs of HCBS. Some states rely on traditional state plans to serve older people in need such as Missouri, Connecticut, North Carolina, Texas, and California, and some states allocate more resources on optional waivers to better target older people such as Oregon, Minnesota, Washington, and Wisconsin. Appendix Figures A2 to A7 plot the spending per capita for each program in detail over the period 1998-2014 in each state. In summary, the HCBS expenditure varies considerably across states and time. In section 4, we show that the variation of HCBS spending is uncorrelated with state-level current or lagged economic and demographic characteristics and it comes mainly from long-standing institutional features of those states.

<sup>&</sup>lt;sup>5</sup>See the Kasier Family Foundation Report on HCBS in 2018 for more details.

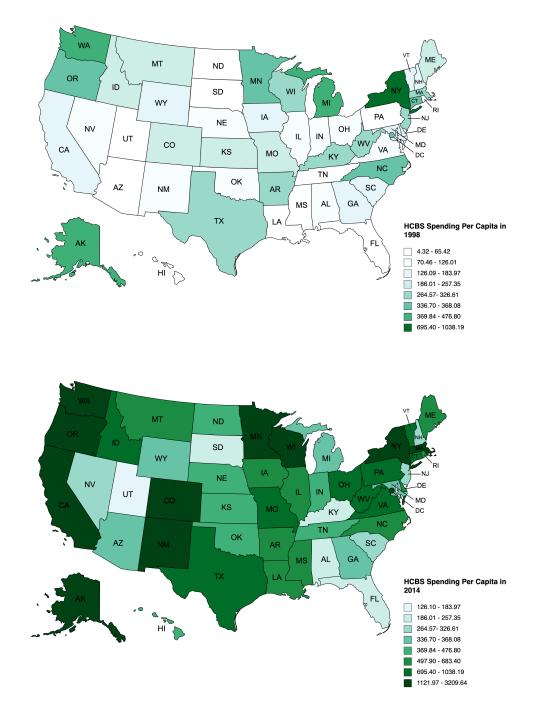
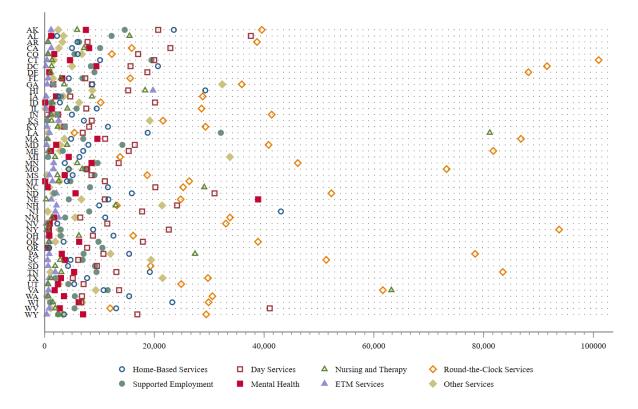


Figure 1: State Variation in HCBS Expenditure Per Older Person in 1998 and 2014

Notes: Bins represent the deciles of the distribution for the state's average HCBS spending for people aged over 65 in 1998 and 2014. The darker the color on the map, the higher the per capita HCBS spending in the state.

Figure 2: Variation in Spending per Enrollee for Each Service of Waivers in 2014



Notes: The plot displays the variation of spending per enrollee for each service covered under waivers across states. The x-axis is the dollars spent per participant in waivers. The y-axis is the abbreviation of each state.

# 3 DATA

Our first data source is the Medicaid HCBS policy information for older adults in 1996 to 2014 from the Centers for Medicare Medicaid Services (CMS).<sup>6</sup> It includes annual reports of expenditure and enrollment on home health state plans, personal care state plans, and aging waivers for older people.<sup>7</sup> Our main independent variable is the HCBS expenditure per capita, which is calculated using the population aged 65 and older.

Our second data source is the Health and Retirement Study (HRS), a longitudinal dataset representative of Americans aged 51 and older which began in 1992 and surveys

<sup>&</sup>lt;sup>6</sup>2014 is the recent year that has consistent policy variables publicized by the CMS.

<sup>&</sup>lt;sup>7</sup>The annual expenditure data can be downloaded at https://www.medicaid.gov/. The enrollment report is collected by Kaiser Family Foundation and publicly available on its website.

every other year. The survey includes different cohorts due to new entrants of those who turned eligible during the survey period. The core cohort, the HRS cohort, has been followed and interviewed since 1992. Since 1993, the HRS has added the Study of Assets and Health Dynamics Among the Oldest Old (AHEAD) cohort born before 1924; the Children of the Depression Age (CODA) cohort born between 1924 and 1930; and the War Babies (WB) cohort born between 1942 and 1947. An additional Early Baby Boomers (EBB) cohort born between 1948 and 1953 was included to the HRS in 2004, and the Mid-Baby Boomers (MBB) cohort born between 1954 and 1959 was added in 2010. The survey administrators send out a detailed questionnaire in person or via telephone that collects respondents' information regarding their demographic characteristics, health outcomes, employment status, financial situation, and intergenerational transfers.

We use the restricted-access HRS which includes the state of residence for each respondent, and merge it with the HCBS policy information at the state level. We restrict the main sample to respondents aged over 65, the eligibility age for the HCBS againg waiver program. The resulting dataset includes around 21,400 unique individuals with 98,000 observations from 1998 to 2014.<sup>8</sup>

We also supplement with other data to address possible threats to our identification assumption since the changes in HCBS spending within states are correlated to other state-level confounders that also affect health outcomes. First, we use economic information about state-level unemployment rates and employment rates from the Bureau of Labor Statistics (BLS) 1999-2014. In addition, we collect information on GDP, personal income (PI), personal consumption expenditure (PCE) and PCE details from the Bureau of Economic Analysis (BEA) Regional Economic Accounts in 1998-2014. Second, we construct state-level demographic characteristics such as education, poverty level, racial/ethnic percentage, and marriage rate at the state level in 2004 to 2014 from the

 $<sup>^{8}</sup>$ We start from 1998 in that we use the average of policy spending in 1998 and 1997 as the treatment value in HRS survey year 1998. See section 4 for details.

American Community Survey (ACS).<sup>9</sup> The population data in 1998-2014 are from the Census Bureau. These state-level economic and demographic characteristics are utilized to test the plausible randomness of HCBS in section 4.

### 3.1 Key Variables

We use information about health status to estimate how HCBS affects the well-being of older people. The HRS asks respondents to self-report their general health status where 1 is for excellent, 2 for very good, 3 for good, 4 for fair, and 5 for poor. We create a subjective poor health indicator, which equals one if self-reported health is fair or poor, and zero otherwise.<sup>10</sup> While the self-reported health might be subjective and prone to recall errors, it has been proved to be a good predictor of health outcomes such as mortality (Idler and Benyamini 1997; DeSalvo et al. 2006; Kuka 2020). We also report estimates from an alternative health indicator in section 5.2.

We also use objective measures on physical health conditions. The HRS has detailed information about functional limitations. Specifically, the mobility difficulty index refers to whether respondents have any problem in walking 1 block, walking several blocks, walking across a room, climbing 1 flight of stairs, and climbing several flights of stairs. The HRS also provides indexes about physical limitations of Activities of Daily Living (ADLs) and Instrumental Activities of Daily Living (IADLs). The ADLs include items such as bathing, eating, dressing, getting in or out of bed, and walking across a room. The IADLs assess difficulties in using the phone, managing money, taking medications, shopping for groceries, and preparing hot meals. These mobility/ADL/IADL indexes all range from 0 to 5. For example, an index with a value of 5 means that an individual has difficulties with all of the functional limitations, while a value of zero means that the individual has no issues related to physical health. We create some dichotomous indicators that equal one if an individual has

<sup>&</sup>lt;sup>9</sup>See Liu and Zai (2022) for detailed description of these variables.

<sup>&</sup>lt;sup>10</sup>The same procedure is also employed in Dave et al. (2006) using the HRS, in Eibich (2015) using the German Socio-Economic Panel Study (SOEP), and in Kuka (2020) using the Survey of Income and Program Participation (SIPP).

a certain number of limitations and zero, otherwise. Section 5.2 reports our main estimates using the indicator with at least 2 items of limitations since majority of individuals report less than 2 items of functional limitations.<sup>11</sup> The results on other indicators are also shown in section 5.2.<sup>12</sup>

We further use information about mental and cognitive health to evaluate the impact of HCBS. The HRS asks respondents about their mental health using the Center for Epidemiologic Studies Depression (CESD) score. The CESD score captures the number of negative sentiments experienced by the respondent most of the time in the past two years including, whether the individual was depressed, felt alone, felt sad, had restless sleep, felt everything was an effort, could not get going, felt unhappy, and did not enjoy life. The CESD scale has been validated to identify major depression in older adults (Irwin et al. 1999). We create a depressed indicator that equals one if an individual reported at least 6 items of negative feelings and zero otherwise. We also show estimates from other depressed indicators in section 5.2. Besides, the cognition summary score calculates an individual's total score on word recall and mental status tests, with values from 0 to 35. The word recall test, which is widely used to measure cognitive skills, asks respondents to listen to a list of words, and then to recall them immediately and with a delay (Bonsang et al. 2012; Mazzonna and Peracchi 2012). The mental status test assesses an individual's abilities on serial 7s, counting backwards from 20, naming objects, recalling dates, and naming the president or the vice-president. These cognitive tests are important tools to evaluate the mental health of older adults, as the aging process is strongly associated with a decline in the ability to perform cognitive tasks (Souchay et al. 2000; Anderson and Craik 2000; Prull et al. 2000; Dixon 2004; Hertzog et al. 2008).

<sup>&</sup>lt;sup>11</sup>See section 3.2 for details on summary statistics.

 $<sup>^{12}</sup>$ More details on the construction of these measures can be found in Chien et al. (2015). Full results are available upon request.

### **3.2** Sample Statistics

Table 1 presents the summary statistics of our sample – HRS respondents who are aged 65 and older. About 58 percent of the sample are female since women in general live longer than men. The average educational attainment of respondents is high school. On average, each individual has about two siblings. The majority of respondents are white, and 13 percent are black. The average age of respondents is about 75 years. While 58 percent of respondents are married or living with a partner, approximately 30 percent have lost their spouse or partner in our sample.

For health outcomes, on average, individuals assess their health status as good and report 1 to 2 items of limitations in mobility. The average ADL/IADL limitation index value is close to one, which indicates that an individual has one limitation of the activities of daily living. The average CESD depression score is 1.5 out of 8. The average cognition score is close to 21.

# 4 ESTIMATION

We estimate the health effects of HCBS among the older individuals with the following specification:

$$Y_{ist} = \alpha_0 + \delta HCBS_{s\bar{t}} + \alpha_i + \mu_t + \eta_s + \boldsymbol{X}'_{ist}\boldsymbol{\beta} + \epsilon_{ist}$$
(1)

where  $Y_{ist}$  is a health outcome of an individual *i* in state *s* surveyed in year *t*.  $HCBS_{s\bar{t}}$  is the average expenditure of Medicaid HCBS per older person in state *s* in year *t* and t - 1. For example, the health outcome in survey year 2000 is regressed on HCBS expenditure averaged in 2000 and 1999. The construction of policy variable takes into account that the HRS survey is conducted every two years. The individual fixed effect,  $\alpha_i$ , controls for the unobservable individual-level time invariant facotrs. The year fixed effect,  $\mu_t$ , controls for common temporal shocks across states that could affect health outcomes. The state fixed effect,  $\eta_s$ , controls for unobserved time-invariant state characteristics.  $X_{ist}$  is a set of time-

Variable	Mean	S.D.	Unique individuals	Obs.
Time-invariant demographics				
Female	0.58	0.49	$21,\!421$	$98,\!116$
Education	11.97	3.40	$21,\!406$	$98,\!087$
Siblings	2.31	2.23	$21,\!199$	97,776
Race/ethnicity				
White	0.83	0.37	$21,\!409$	$98,\!091$
Black/African	0.13	0.34	$21,\!409$	$98,\!091$
Other	0.03	0.18	$21,\!409$	$98,\!091$
$Time\text{-}varying \ demographics$				
Age	75.33	7.51	$21,\!421$	$98,\!116$
Marital status				
Married/partnered	0.58	0.49	$21,\!420$	98,060
Separated/divorced	0.09	0.28	$21,\!420$	$98,\!060$
Widowed	0.31	0.46	$21,\!420$	98,060
Never married	0.03	0.16	$21,\!420$	$98,\!060$
$Heath \ variables$				
Self-reported health	3.00	1.11	$21,\!417$	$98,\!027$
Mobility limitation	1.39	1.62	$21,\!534$	$99,\!412$
ADL limitation	0.51	1.16	$21,\!409$	$98,\!040$
IADL limitation	0.50	1.19	$21,\!406$	$98,\!023$
CESD scores	1.47	1.90	$19,\!975$	88,184
Cognition scores	21.28	5.39	$19,\!951$	87,999

Table 1: Summary Statistics of the Sample

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older. The definitions of these variables can be found in Appendix Table A2.

varying demographic characteristics of individuals, such as age, age squared, the number of living siblings, and marital status. The standard errors are clustered at the state level.

The coefficient of interest,  $\delta$ , measures the impact of HCBS spending on individuals' health outcomes. As suggested by Callaway et al. (2021), two assumptions are needed to interpret this coefficient as causal. First, we assume that states with higher HCBS expenditure in 1998did not expand HCBS spending differently for non-HCBS-expansion-related reasons. That is, states with different HCBS expenditure in 1998 are on parallel pre-expansion trends. Second, we assume that older people in each state receive the same treatment effect for an extra dollar spent, even if they are not paid the same amount initially. That is, we assume homogeneous treatment effects across states. We test our assumptions in 4.1. Then, we estimate equation (1) with the most demanding specification that includes individual fixed effects. This specification takes advantage of the within-individual variation in HCBS expenditure across years that may come from HCBS expenditure change in their state of residence or cross-state migration.

### 4.1 Threats to Identification

Our main identification assumption relies on that the within-state variation of HCBS generosity over years is not correlated with other unobservable confounders that might also affect the health outcomes of interest. One might be concerned that states chose HCBS expansion during the 1990s based on the health status of their residents. For example, states could expand HCBS if health or other related well-being factors of older adults was worse or if they think home or community-setting can benefit older adults more on health. One might also be worried that individuals changed health-related behavior in anticipation of the HCBS expansion. To mitigate these possible concerns, we estimate the effect of pre-expansion HCBS spending in 1998 on a range of health-related outcomes for the period 1992-1998 in a simple linear regression (Bailey and Goodman-Bacon 2015).

Table 2 demonstrates the estimates of the per capita HCBS generosity in 1998 on a battery of health-related outcomes. Column 1 reports the estimates in a simple OLS without any controls. Column 2 adds the controls in the baseline specification 1. Panel A tests the relationship between initial HCBS generosity on health outcomes of interest in the paper and Panel B further shows the tests on related health care use outcomes. The generosity of HCBS is negatively correlated with the probability of having poor health and positively correlated with the probability of having poor health and positively correlated with the probability of having a dentist in a simple univariate regression. The signs of these coefficients change after controlling for demographics of individuals and become statistically insignificant except for the coefficient on mobility limitations. However, the coefficients on all health outcomes are not consistently positive or negative, which supports that there is no

systematic correlation between the HCBS expansion and health outcomes of interest. Likely, the variation of HCBS is more to be driven by institutional features rather than economic or social environment.

	(1)	(2)	(3)
Dependent Variable	Mean in 1998	Univariate HCBS in 1998	Multivariate HCBS in 1998
	Panel A: F	Iealth outcomes	(1992-1998)
Poor health status (0-1)	0.315	-0.046**	-0.017
		(0.019)	(0.240)
Mobility limitation (0-1)	0.264	-0.016	$0.542^{*}$
		(0.035)	(0.271)
ADL limitation (0-1)	0.092	-0.010	0.424
		(0.029)	(0.253)
IADL limitation (0-1)	0.080	0.062	-0.007
		(0.054)	(0.396)
Mental depression (0-1)	0.066	0.003	0.089
		(0.015)	(0.162)
	Panel B: ]	Health care use (	1992-1998)
Drugs	0.728	-0.049	-0.042
		(0.045)	(0.308)
Doctor visit	0.932	-0.012	-0.054
		(0.033)	(0.171)
Nurse home stay	0.033	-0.005	0.046
		(0.014)	(0.160)
Dentist visit	0.619	0.175***	-0.444
		(0.050)	(0.357)

Table 2: Relationship Between HCBS in 1998 and Pre-Expansion Health Variables

Notes: The data used are from HRS 1992-1998 of individuals who are aged 65 and older. The HCBS in 1998 is per capita spending of older population. The first column reports the mean of each dependent variable. Column 2 estimates the univariate relationship between HCBS in 1998 and health outcomes. Column 3 estimates the multivariate version with controls from specification 1. Standard errors are clustered at the state level and shown in parentheses. \*\*\* p < 0.01, \*\* p < 0.05, \* p < 0.10.

One might also be worried that HCBS generosity is correlated with the economic condition, which in turn impacts individual health. To address this issue, we construct a state-year panel from 1999 to 2014 using different sources of economic variables such as unemployment rate, employment rate, GDP per capita, personal income (PI) per capita, and personal consumption expenditure (PCE) per capita. These state economic measures are regressed on the HCBS spending controlling for state and year fixed effects. We allow flexible functional form of these economic variables and the results are reported in Table 3. For the first four columns, we use flexible functions of unemployment rate and employment rate. We then further add different income and consumption variables.

	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Unemployment rate	-19.815**	-36.451			-71.490	-79.548	-63.966	-80.971
	(8.442)	(49.515)			(56.412)	(59.791)	(59.326)	(64.207)
Unemployment rate $^{2}$		0.325			5.116	5.710	4.206	5.970
		(6.585)			(7.705)	(7.480)	(7.698)	(7.310)
Unemployment rate $^{3}$		0.051			-0.116	-0.132	-0.079	-0.144
		(0.303)			(0.341)	(0.323)	(0.330)	(0.294)
Employment rate			15.043*	-838	-1,026	-1,142	-1,072	-1,095
			(8.084)	(778)	(825)	(882)	(888)	(882)
Employment rate <sup>2</sup>				14.551	17.879	19.801	18.594	19.040
				(12.896)	(13.767)	(14.701)	(14.744)	(14.655)
$Employment rate^3$				-0.082	-0.102	-0.112	-0.106	-0.108
				(0.071)	(0.077)	(0.082)	(0.081)	(0.081)
GDP per capita					-6,037			-3,375
					(5,418)			(7, 897)
PI per capita						-0.012		-0.010
						(0.013)		(0.026)
PCE per capita							-0.010	0.004
							(0.035)	(0.053)
Observations	816	816	816	816	816	816	816	816
Adjusted R-squared	0.958	0.958	0.958	0.958	0.958	0.958	0.958	0.958

Table 3: Effect of State Economic Conditions on HCBS

Notes: The data used are a state-year panel from 1999 to 2014. The unemployment and employment level is from BLS, the state population is from Census Bureau, the GDP, personal income (PI), personal consumption expenditure (PCE) is from the Bureau of Economic Analysis Regional Analysis Accounts. The dependent variable is per capita HCBS spending. Each cell reports estimates from a separate specification. All regressions include state, year fixed effects and weighted using the state population. Standard errors are clustered at the state level and shown in parentheses. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

Overall, the results show that state-specific economic variables are not correlated with HCBS. The employment rate is positively related to HCBS and the unemployment rate is negatively related to HCBS, as we expect in columns 1 and 3. These relationships, however, are not statistically significant once we allow quadratic or cubic form and add in more economic controls such as income and expenditure. One might also worry that the HCBS size could be correlated with lagged economic conditions. For example, if states experienced high unemployment rates, the size of HCBS for older population could be decreased if state legislators are constrained by fiscal resources. Appendix Table A3 reports the results of lagged economic conditions on HCBS spending. As predicted in column 1, states with high unemployment rate in the last year have less HCBS spending and the estimate is statistically significant. When we further allow flexible unemployment rate format and add more state-level economic controls, the relationship between lagged economic factors and HCBS generosity becomes nonexistent. Nonetheless, we check the sensitivity of our results after controlling for state-level factors in section 5.4.

Another possible concern could be that the health change of older individuals might be driven by other contemporaneous social programs. We use the detailed consumer spending expenditure from Bureau Economic Analysis on health-related products to address this concern. Specifically, we explore the relationship between HCBS generosity and health care spending, net health insurance spending, and life insurance spending which are mostly relevant to health of the older population. Appendix Table A4 shows the estimates of the respective spending in each column. All specifications control for state-economic factors including unemployment/employment rate, income, and expenditure in each state. The relationships of HCBS with other health care spending, health insurance and life insurance spending are not obvious and statistically insignificant, which is assuring to our results.

One may also challenge that our results might be driven by spending on an alternative setting, nursing homes, for the older population. This worry seems implausible as we show in Liu and Zai (2022) that the spending on nursing homes is stable across years and does not drop significantly due to the increase in HCBS. In addition, we find neither the number of nursing homes nor the capacity of nursing homes such as nursing beds or occupancy rates is correlated with the HCBS expansion.

## 5 RESULTS

In this section, we show how HCBS spending, in total and in each sub-program (state plans and aging waivers), increase enrollment, respectively, as our first-stage results. Then, we estimate the effects of these programs on health outcomes among the older population.

### 5.1 HCBS Effect on Enrollment

Figure 3 depicts HCBS spending and its enrollment using the raw data 1998-2014. The topleft figure shows that the HCBS expenditure per older people and its enrollment increased steadily and simultaneously over the period, except for 2013 when the enrollment saw a slight drop. The top-right figure demonstrates that the trend of enrollment in the aging waiver program is almost parallel with its expenditure despite a slight decline in spending in 2010. The bottom-left figure exhibits the pattern for home health state plan regarding its spending and enrollment. The spending was generally increasing, whereas its enrollment started to fall in 2004, with a strong recover in 2014, the last year of our sample period. The bottomright figure shows that overall, the increasing trend of enrollment follows the increasing trend of spending for personal care state plans except in 2005 and after 2013. Overall, for most of the years in our working period, the spending of HCBS and its sub-programs positively correlates with its enrollment.

As discussed in section 2, states have discretion to allocate HCBS resources. To estimate the effect of HCBS on enrollment, we regress the program spending on its enrollment after controlling for state and year fixed effects. Table 4 reports the estimates of the impact of HCBS spending on enrollment with different specifications in each column. Column 1 shows

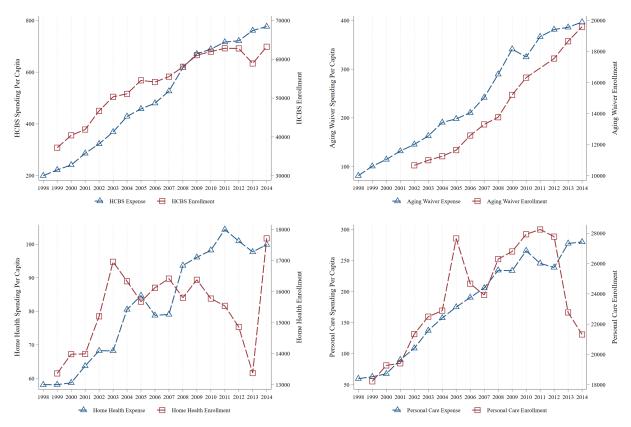


Figure 3: HCBS Spending and Enrollment 1998-2014

Notes: The data used are from CMS about enrollment in the HCBS programs. Each sub-plot shows the spending for a program and its enrollment over the period 1998-2014. The left y-axis corresponds to spending and the right y-axis corresponds to enrollment.

the estimate only with state and year fixed effects. Column 2 adds additional control of demographic variables at the state level such as poverty, education, percentage white, and percentage married. Column 3 further includes unemployment rate and employment rate to account for state-level economic conditions. Column 4 adds GDP per capita, personal income per capita, and personal consumption per capita to control for economic changes at the state level. Column 5 adds lagged unemployment rate, GDP, consumption, together with their respective quadratic and cubic forms to flexibly reflect any shocks to the economy in each state. Overall, one dollar increase in HCBS spending per older person is significantly correlated with an increase in HCBS enrollment by 40 to 60, which is an approximate 8 to 12 participants per 10,000 people. The estimates are robust with different demographic

and flexible economic controls at the state level. Appendix Tables A5 to A7 further report the estimates of HCBS sub-programs on enrollment, respectively. The results suggest an approximate increase in 9 enrollment for aging waivers, 5 enrollment for home health state plans, and 24 enrollment for personal care state plans with a dollar increase in their respective program spending.<sup>13</sup> Overall, we conclude that the number of participants in HCBS increases with its size of spending.

	Dep	pendent Va	riable: HC	BS Enrollr	ment		
	(1)	(2)	(3)	(4)	(5)		
HCBS expenditure per older person	67.927	$56.248^{*}$	$60.045^{*}$	$61.834^{*}$	43.312**		
	(42.340)	(33.271)	(32.466)	(30.864)	(21.431)		
Mean of dependent variable	53797	54634	54634	54634	57078		
Observations	816	762	762	762	660		
Adjusted R-squared	0.961	0.968	0.969	0.969	0.978		
State $+$ Year FE	Y	Υ	Υ	Υ	Υ		
Demographics		Υ	Υ	Υ	Υ		
Employment rate			Υ	Υ	Υ		
GDP and consumption				Υ	Υ		
Lag economic conditions Y							

Table 4: The Effect of HCBS Spending on Enrollment

Notes: The data used are from CMS about enrollment in the HCBS programs from 1999 to 2014. Each cell reports estimates from a separate specification, weighted by state populations. Column 1 shows the simple estimate only with state and year fixed effects. Column 2 adds demographic variables at the state level such as poverty, education, percentage white, and percentage married. Column 3 further includes unemployment rate and employment rate to account for state-level economic conditions. Column 4 adds GDP per capita, personal income per capita, and personal consumption per capita to further control for economic changes at the state level. Column 5 adds lagged economic conditions on unemployment rate, GDP, consumption as well as its quadratic and cubic forms to flexibly reflect any shocks of economic situation in each state. The standard errors are clustered by state. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

### 5.2 HCBS Effect on Health

Table 5 shows the health effect of HCBS by estimating equation 1 with different health outcomes. Specifically, a \$1,000 increase in HCBS expenditure per older person is

<sup>&</sup>lt;sup>13</sup>One enrollee can participate in multiple sub-programs of HCBS.

associated with an approximate 2 percentage points decrease in the probability of reporting worse health conditions (column 1). Given the sample average of outcome, 0.33, the

	(1)	(2)	(3)	(4)	(5)	(6)
	Poor health	Mobility	ADL	IADL	Depression	Cognitive score
HCBS per capita ( $$1,000$ )	-0.018**	-0.018*	-0.000	0.001	-0.011**	0.233
	(0.008)	(0.009)	(0.011)	(0.013)	(0.005)	(0.180)
Mean of dependent variable	0.325	0.367	0.122	0.119	0.058	21.4
Number of individuals	18,200	$18,\!183$	$18,\!196$	$18,\!194$	$16,\!676$	$16,\!658$
Observations	94,637	94,600	$94,\!657$	94,643	84,747	84,567
Adjusted R-squared	0.488	0.515	0.455	0.471	0.323	0.676

Table 5: Results of HCBS on Health

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older. Each cell reports estimates using equation 1 for each dependent variable. Poor health is an indicator showing that an individual self-assesses his or her general health status as fair or poor. Mobility/ADL/IADL is an indicator of having at least 2 items of mobility/ADL/IADL limitations. Depression is an indicator of feeling at least 6 negative emotions. Cognitive score is continuous values from 0 to 35. The mean of HCBS expenditure per older person is around \$500. All models control for state, year, individual fixed effects, and demographics of individuals such as age, age squared, marital status, and number of siblings of individuals. Standard errors are clustered at the state level. The detailed definition of these variables can be referred to Appendix Table A2. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

estimated effect size corresponds to a reduction in the probability of reporting poor health status by 6 percent. Column 2 shows that the HCBS program expenditure is negatively correlated with the probability of individuals reporting mobility limitations. The improvement in mobility-related health is about 2 percentage points with statistical significance, which is approximately 5 percent with a sample mean at 0.37, given a \$1,000 increase in HCBS generosity. The HCBS effect on ADL/IADL limitations is close to null and not statistically significant as shown in columns 3 to 4. Column 5 reports that HCBS is beneficial to improve mental health. A \$1,000 increase in HCBS per older person decreases the probability of individuals reporting negative emotional feelings by 1 percentage point (17 percent given the outcome mean at 0.06). The estimate on cognitive score in column 6 is positive but statistically insignificant. The HCBS increases the cognitive score of older people by 0.2 point, which is approximately 1 percent increase with an average score of 21. Appendix Table A8 reports the effects of HCBS on health outcomes with other cutoffs. The magnitudes are similar to our main estimates despite that some estimates lose statistical significance while the magnitudes are similar to our main estimates. We do not find any relationships between HCBS and other health outcomes or morbidity events such as cancer, lung disease, heart disease, and strokes (Appendix Table A9).

To explore the impact of sub-programs of HCBS on health, we further report how state plans and aging waivers affect the health outcomes in Table 6. Estimates in column 1

	(1)	(2)	(3)	(4)	(5)	(6)
	Poor health	Mobility	ADL	IADL	Depression	Cognitive score
Aging waiver per person (\$1,000)	-0.026	-0.018	-0.005	-0.000	-0.006	0.467**
	(0.017)	(0.015)	(0.017)	(0.017)	(0.005)	(0.174)
State plan per person (\$1,000)	-0.015	-0.018**	0.002	0.001	-0.013**	0.139
	(0.009)	(0.009)	(0.010)	(0.013)	(0.005)	(0.158)
Mean of dependent variable	0.325	0.367	0.122	0.119	0.058	21.4
Number of individuals	18,200	18,183	$18,\!196$	18,194	$16,\!676$	$16,\!658$
Observations	94,637	94,600	94,657	94,643	84,747	84,567
Adjusted R-squared	0.488	0.515	0.455	0.471	0.323	0.676

Table 6: Results of Aging Waivers and State Plans on Health

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older. Each cell reports estimates using equation 1 for each dependent variable. Poor health is an indicator showing that an individual self-assesses his or her general health status as fair or poor. Mobility/ADL/IADL is an indicator of having at least 2 items of mobility/ADL/IADL limitations. Depression is an indicator of feeling at least 6 negative emotions. Cognitive score is continuous values from 0 to 35. The mean of aging waiver expenditure per older person is around \$200. The mean of state plan expenditure per person is around \$200. All models control for state, year, individual fixed effects, and demographics of individuals such as age, age squared, marital status, and number of siblings of individuals. Standard errors are clustered at the state level. The detailed definition of these variables can be referred to Appendix Table A2. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

show that both aging waivers and state plans contribute to the decreased probability of individuals reporting poor health. Estimates in column 2 find that the mitigating effect on mobility limitations comes from both programs and the effect from state plans is statistically significant. Columns 3 to 4 confirm that the HCBS program does not correlate with ADL/IADL improvement. Column 5 reports that the effect on reducing depression is mainly from state plans, which leads to about 1 percentage point decrease in negative emotional feelings. Column 6 shows that although the cognitive effect of total HCBS is close to null, the aging waivers contribute significantly to an improvement in cognitive ability among older individuals by around 0.5 point. In summary, HCBS and its sub-programs benefit older adults consistently on improving health status, mitigating functional limitations and mental depression.

### 5.3 Mechanisms

We explore three channels through which HCBS might improve health outcomes: risky behaviors, healthcare use, and family companionship. First, we show how HCBS affects risky behaviors of older people such as drinking and smoking. Table 7 reports the estimates of HCBS on different behavioral outcomes in the baseline model. Specifically, HCBS

	(1)	(2)	(3)	(4)	(5)	(6)
	Drink	Drink days	Drink number per day	Smoke	Smoke number	Obesity
HCBS per capita ( $$1,000$ )	-0.021**	-0.075	-0.060	-0.000	0.004	0.006
	(0.009)	(0.050)	(0.037)	(0.000)	(0.007)	(0.008)
Mean of dependent variable	0.435	1.007	0.501	0.566	0.091	0.241
Number of individuals	18,203	18,195	18,185	18,049	18,140	18,204
Observations	94,709	94,531	94,502	93,891	94,115	94,726
Adjusted R-squared	0.658	0.711	0.608	0.988	0.772	0.692

 Table 7: Results of HCBS on Risky Behavior

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older. Each cell reports estimates using equation 1 for each dependent variable. The mean of HCBS expenditure per older person is around \$500. All models control for state, year, individual fixed effects, and demographics of individuals such as age, age squared, marital status, and number of siblings of individuals. Standard errors are clustered at the state level. The detailed definition of these variables can be referred to Appendix Table A2. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

significantly reduces the probability of picking up drinking. A 1000 dollar increase in HCBS spending leads to approximately 2 percentage points decrease in the likelihood of drinking. HCBS weakly reduces drinking intensity. With a more generous HCBS policy, individuals

reduce drinking days per week by about 8 percentage points and the number of drinks per day by about 6 percentage points, although the estimates are statistically insignificant. We do not find that HCBS affects other health behaviors such as smoking and gaining weights.

Second, we demonstrate that HCBS increases healthcare use among older people. Appendix Table A10 reports the correlation between HCBS spending and different healthcare use. The findings show that HCBS is significantly correlated with increased use of inpatient services and medication. More generous HCBS spending is associated with about 2 percentage points increase in inpatient service (6 percent relative to a mean of 0.33) and 1 percentage point increase in medication taking (1 percent relative to a mean of 0.87). In addition, HCBS spending is positively correlated with the frequency of hospital visits, although the estimated coefficients are not statistically significant.

Third, we explore whether family members play a role in health improvements through HCBS. As shown in Liu and Zai (2022), HCBS not only increases the probability of older adults getting care from their children but also increases the chances of them living with their family members. The extra time spent with family members can potentially improve older people's mental health and overall health. Appendix Table A11 reports the correlation between HCBS and helpers (informal and formal) received by older adults. Informal care accounts for the majority of help (70 percent). A 1000 dollar in HCBS spending is positively correlated with the increase in the number of available helpers by 4 percentage points. In addition, HCBS increases the likelihood to receive paid help by about 3 percentage points and is weakly associated with the care intensity: 0.4 day and 2.4 hours increase in help reception in the last month despite statistical insignificance.

### 5.4 Robustness

In this section, we report a series of robustness checks on the health impact of HCBS. First, one might be concerned that our main estimates are driven by omitted socio-economic status of older people. Since the socio-economic status determines the eligibility for HCBS and also affects health, we do not include any proxies in our main specification. Another possible concern about our results might come from the correlation between state-level characteristics and HCBS spending as discussed in section 4.1. Even though the results in Table 3 show no evidence on such relationship, one might still be interested in how our health results change when we further control for some state-level demographic variables such as percentage of people with high school education, percentage of female, birth rate, fertility rate, and unemployment rate. Appendix Table A12 shows that overall, our main estimates are robust across these specifications with different controls. The estimate on mobility limitation outcome become statistically insignificant in the model with both income and state-level covariates.

Second, as discussed in section 4, our identification variation comes from HCBS expenditure change over years within states. However, one may be concerned about the endogenous variation coming from individuals who move across states in our study period. Individuals could move to states with more generous HCBS if they are more self-aware of their health conditions or they value health more than others. Appendix Table A13 shows that the main health estimates do not change much when removing the moving observations.

Third, one might be concerned about the sensitivity of our results with sample restrictions. In the main regressions, we use the sample of individuals aged 65 and above, who are potentially eligible for HCBS. However, one might argue that people who potentially benefit these in-home services of HCBS should be even older. Appendix Table A14 shows the results by limiting the sample to individuals who are at least 70. The sample size shrinks by about 30 percent. The magnitude of the estimates is similar to that in the main results. However, some coefficients lose the statistical significance due to the greater standard errors associated with a smaller sample. The coefficient on cognitive score becomes statistically significant, which suggests that HCBS can potentially improve cognitive ability among older population.

# 6 CONCLUSION

In this paper, we explore how Medicaid HCBS affects health outcomes among people aged 65 and older. First, we find that a \$1,000 increase in HCBS spending per capita increases its enrollment by about 1 percent. Then, we show that HCBS is beneficial for health of older people aging in place. The HCBS program significantly increases the probability of individuals to self-report better health, mitigates the likelihood to experience mobility limitations, and improves mental health. These health effects are reasonable considering the enrollment effect of HCBS. We also present three potential mechanisms through which HCBS is beneficial to older adults: decreasing risk behavior on drinking, increasing healthcare use such as doctor visits and inpatient use, and spending more time with family members by living together and receiving more informal care.

The findings of this study have several policy implications. First, the results are informative for the development of long-term care policy. During the 2020 pandemic, CMS changed the implementation rules for the aging waiver program. States were permitted to loosen quality requirements for home health care providers in order to ensure that services would continue to be provided to HCBS clients. In addition, some states increased pay rates in order to attract more providers and to compensate providers for the increased risk of entering homes during the pandemic. Understanding the detailed effects of the program on health outcomes is essential, as the federal government is planning for the eventual return to regular operations. The results of this study can inform policy debates about what share of home health services should be covered, and what types of care are more efficient in improving the quality of life of older people aging in place. Moreover, strategies aimed at better coordinating the incentives of home care providers, patients, family caregivers, and social workers can further increase the efficiency of care delivery. Second, the benefits of HCBS shown in the paper justify the \$400 billion expansion of the American Jobs Plan to increase HCBS coverage by the Biden Administration at the end of March 2021.

Third, improving the quality of care provided by home health agencies is a leading priority of CMS while reducing costs by shifting resources to home- or community-based settings. While each state HCBS program has minimum requirements for the certification of service providers that are guided by the federal government, these requirements vary across states. In addition, states are responsible for surveying and monitoring home health agencies to ensure that they are providing care services of a high standard. However, with so many individuals being served by thousands of agencies, it is difficult to monitor their activities, and to ensure that all patients are treated fairly. The findings in this paper provide direct evidence on health effects of HCBS, which can be discussed in depth, and be used to create better quality indicators to regulate home health care providers.

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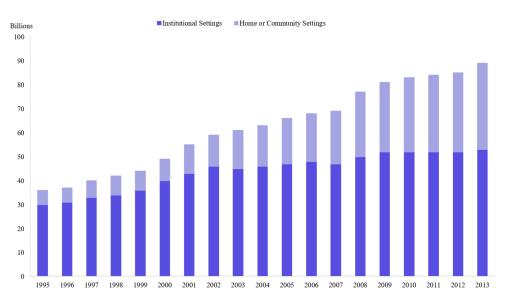


Figure A1: Medicaid LTC Spending by Service Settings

Notes: The graph shows Medicaid LTC spending by service settings, i.e., institutional settings and home or community-based settings, between 1995 and 2013. While spending on institutional settings dominated for much of this period, spending on home or community-based settings rose dramatically in later years. The data source is annual CMS 64 forms

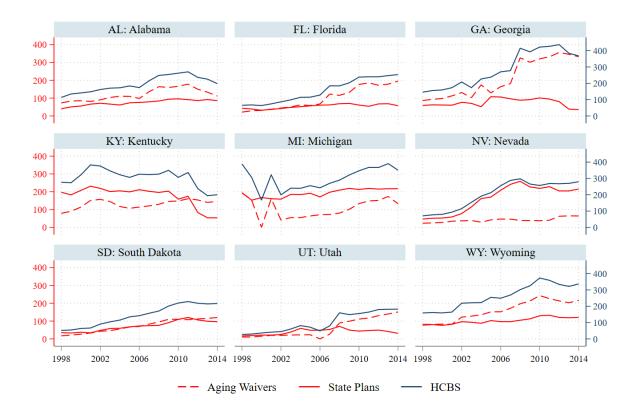
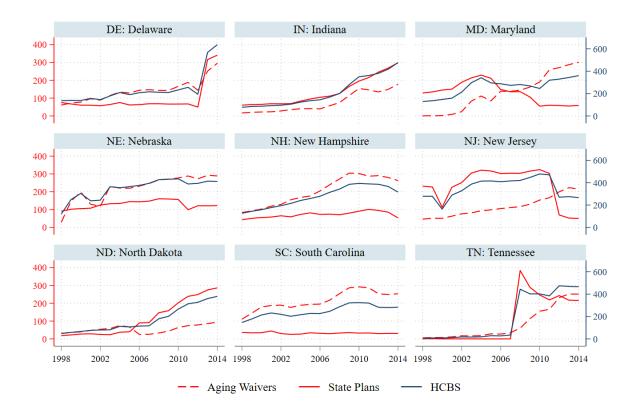


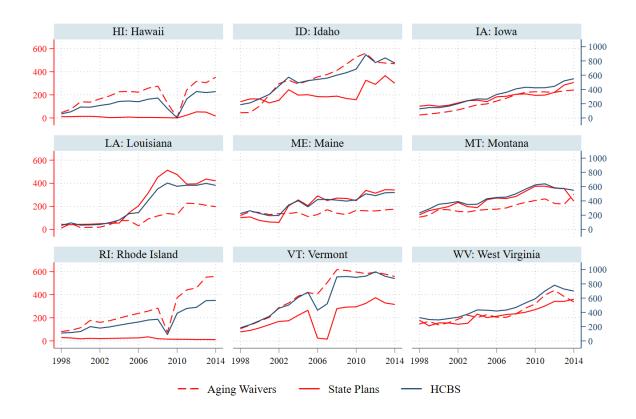
Figure A2: Medicaid HCBS Spending for Older People by Program

Notes: The graph shows Medicaid HCBS spending for older people by program: aging waivers, state plans of personal care and home health plans. The left y-axis is for each sub-program and the right y-axis is for the total HCBS spending per capita. The data source is annual CMS report for policy expenditure.



## Figure A3: Medicaid HCBS Spending for Older People by Program

Notes: The graph shows Medicaid HCBS spending for older people by program: aging waivers, state plans of personal care and home health plans. The left y-axis is for each sub-program and the right y-axis is for the total HCBS spending per capita. The data source is annual CMS report for policy expenditure.



### Figure A4: Medicaid HCBS Spending for Older People by Program

Notes: The graph shows Medicaid HCBS spending for older people by program: aging waivers, state plans of personal care and home health plans. The left y-axis is for each sub-program and the right y-axis is for the total HCBS spending per capita. The data source is annual CMS report for policy expenditure.

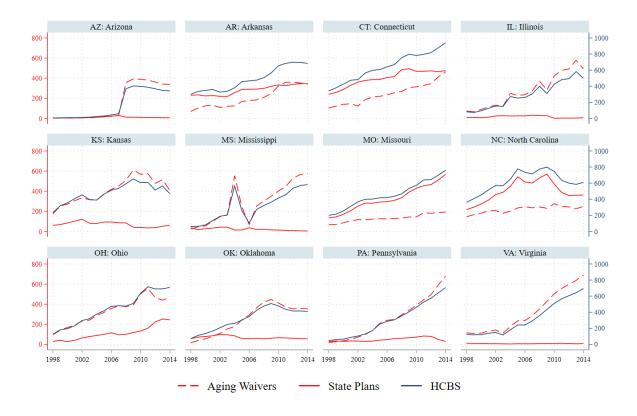


Figure A5: Medicaid HCBS Spending for Older People by Program

Notes: The graph shows Medicaid HCBS spending for older people by program: aging waivers, state plans of personal care and home health plans. The left y-axis is for each sub-program and the right y-axis is for the total HCBS spending per capita. The data source is annual CMS report for policy expenditure.

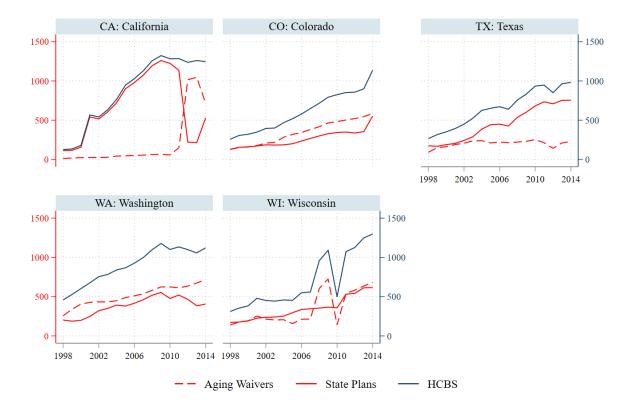


Figure A6: Medicaid HCBS Spending for Older People by Program

Notes: The graph shows Medicaid HCBS spending for older people by program: aging waivers, state plans of personal care and home health plans. The left y-axis is for each sub-program and the right y-axis is for the total HCBS spending per capita. The data source is annual CMS report for policy expenditure.

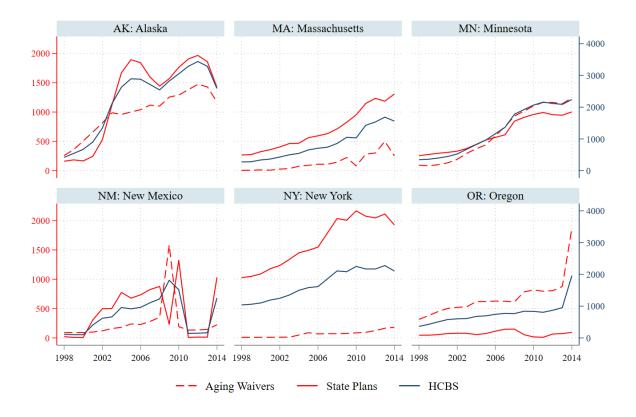


Figure A7: Medicaid HCBS Spending for Older People by Program

Notes: The graph shows Medicaid HCBS spending for older people by program: aging waivers, state plans of personal care and home health plans. The left y-axis is for each sub-program and the right y-axis is for the total HCBS spending per capita. The data source is annual CMS report for policy expenditure.

### Table A1: Medicaid HCBS Programs

Home Health State Plan (every resident is eligible) Nursing services Home health aide services Medical supplies, equipment and appliances Optional therapy services like physical, occupational and speech pathology therapy *Personal Care State Plan (every resident is eligible)* Assistance with self-care (e.g., bathing, dressing) Household activities (e.g., preparing meals)

Cueing or monitoring

Injections by nurses

Work sites, foster care or assisted living facilities

Aging Waivers (people age 65+)

Round-the-clock services (in-home residential rehabilitation)

Home-based services like personal care, assistance with household chores, and respite care

Day services (day rehabilitation and adult day care services)

Case management services

Notes: The table shows in detail the services covered under each Medicaid HCBS authority. Mandatory home health state plans mainly cover home-based aide services and professional services for all Medicaid-qualified participants. Personal care state plans mainly provide assistance to eligible people with ADL and IADL limitations. Aging waivers provide intensive round-the-clock services, as well as assistance to individuals with ADL and IADL limitations. The information is adjusted from the annual Kaiser Family Foundation Waiver Program Survey.

Variable	Definition
Heath variables	
Self-reported health	Respondent's self-reported general health status, one for excellent, two for very good, three
	for good, four for fair, and five for poor.
Mobility difficulty	Index of mobility difficulties ranging from $0$ to 5, indicating respondents having any problem
	in walking 1 block, walking several blocks, walking across a room, climbing 1 flight of stair
	and climbing several flights of stairs
ADL difficulty	Index of difficulties in Activities of Daily Living (ADL) ranging from zero to five, indicatin
	whether respondents are having any difficulties in bathing, eating, getting dressed, getting
	in/out of bed, and walking across a room
IADL difficulty	Index of difficulties in Instrumental Activities of Daily Living (IADL) ranging from zero t
	five, indicating whether respondents having any difficulties in using the phone, managing
	money, taking medications, shopping for groceries, and preparing hot meals
Depression scores	Index of mental health ranging from zero to eight based on the score on the Center for
	Epidemiological Studies Depression (CESD) scale, which represents the sum of five negative
	indicators minus two positive indicators. The negative indicators measure sentiments all o
	most of the time: depression, everything is an effort, restless sleep, feeling alone, sad, an
	cannot get going. The positive indicators measure whether respondents feel happy and enjoy
	life
Cognition scores	The total cognition score is the sum of the total word recall and mental status test score
	ranging from zero to 35. The word recall index sums the immediate and delayed word reca
	test scores. The mental status index includes the scores for serial 7's, counting backward
	from 20, naming objects, recalling dates, and naming the president/vice-president
Cancer diagnosis	Dichotomous indicator of whether respondents have ever been diagnosed with a cancer or
	malignant tumor of any kind
Lung diagnosis	Dichotomous indicator of whether respondents have ever been had a lung-related disease
Heart diagnosis	Dichotomous indicator of whether respondents have ever been told by a doctor that the
	have had a heart attack, coronary heart disease, angina, congestive heart failure, or othe
	heart problems
Stroke	Dichotomous indicator of whether respondents have ever had a stroke
Smoke now	Dichotomous indicator of whether respondents were smoking at the time of being surveyed
Smoke ever	Dichotomous indicator of whether respondents have ever smoked
Drink ever	Dichotomous indicator of whether respondents have ever drank alcohol
Drink days	The number of days per week respondents have had any alcohol to drink in the last three
	months, for example, beer, wine, or any drink containing liquor
Drink number	The number of drinks per day respondents have consumed in the last three months on the
	days they have been drinking

# Table A2: Definitions of Variables

Unemployment rate lag 1	(1) -32.093** (12.755)	(2) -22.273	(3)	(4)	(5)	(6)	(7)	(8)	(9) -25.561
Unemployment rate lag $1^2$	(12.755)	(64.547) -2.339							(51.984) -1.210
		(9.436)							(7.689)
Unemployment rate lag $1^3$		0.131							0.086
		(0.386)							(0.333)
Unemployment rate lag 2			-29.028	-47.526					-95.720
			(18.049)	(72.417)					(83.220)
Unemployment rate lag $2^2$				3.088					11.088
				(10.269)					(11.517)
Unemployment rate lag $2^3$				-0.147					-0.441
				(0.423)					(0.445)
Employment rate lag 1 $$					13.761	-1,084			-1,350
					(10.654)	(1,046)			(973)
Employment rate lag $1^2$						18.843			21.319
						(17.244)			(16.216)
Employment rate lag $1^3$						-0.107			-0.112
						(0.095)			(0.090)
Employment rate lag 2 $$							10.705	-241.748	-18.742
							(10.606)	(1,273)	(1,090)
Employment rate lag $2^2$								5.969	2.870
								(20.352)	(17.386)
Employment rate lag $2^3$								-0.042	-0.029
								(0.108)	(0.093)
Observations	765	765	714	714	765	765	714	714	714
Adjusted R-squared	0.961	0.961	0.965	0.965	0.960	0.960	0.964	0.965	0.966

Table A3: Effect of Lagged State Economic Conditions on HCBS

Notes: The data used are a state-year panel from 1999 to 2014. The unemployment and employment level is from BLS, the state population is from Census Bureau, the GDP, personal income (PI), personal consumption expenditure (PCE) is from the Bureau of Economic Analysis Regional Analysis Accounts. The dependent variable is per capita HCBS spending. Each cell reports estimates from a separate specification. The last column includes lagged income controls such as GDP per capita, PI per capita, and PCE per capita. All regressions include state, year fixed effects and weighted using the state population. Standard errors are clustered at the state level and shown in parentheses. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

	(1)	(2)	(3)
	Health care per capita	Net health insurance per capita	Life insurance per capita
HCBS per capita (\$1,000)	-0.001	-0.001	0.001
	(0.005)	(0.001)	(0.001)
Observations	816	816	816
Adjusted R-squared	0.997	0.973	0.953
Mean Y	471.9	40.28	24.15
Mean HCBS	498.98	498.98	498.98

Table A4: Effect of HCBS on Other Spending

Notes: The data used are a state-year panel from 1999 to 2014. The health care, net health insurance, and life insurance spending is from the Bureau of Economic Analysis Regional Analysis Accounts. All regressions include state, year fixed effects and weighted using the state population. Standard errors are clustered at the state level and shown in parentheses. \*\*\* p < 0.01, \*\* p < 0.05, \* p < 0.10.

Dependent Variable: Aging Waiver Enrollment							
	(1)	(2)	(3)	(4)	(5)		
Expenditure per older person	8.099	8.170	8.267	9.580	13.038*		
	(10.745)	(9.132)	(8.973)	(8.684)	(7.249)		
Mean of dependent variable	14163	14113	14113	14113	14113		
Observations	576	573	573	573	573		
Adjusted R-squared	0.822	0.837	0.837	0.845	0.858		
State $+$ Year FE	Υ	Υ	Υ	Υ	Υ		
Demographics		Υ	Υ	Υ	Υ		
Employment rate			Υ	Υ	Y		
GDP and consumption				Υ	Y		
Lag economic conditions					Υ		

Table A5: The Effect of Aging Waiver Spending on Enrollment

Notes: The data used are from CMS about enrollment in the HCBS programs from 1998 to 2014. Each cell reports estimates from a separate specification, weighted by state populations. Column 1 shows the simple estimate only with state and year fixed effects. Column 2 adds demographic variables at the state level such as poverty, education, percentage white, and percentage married. Column 3 further includes unemployment rate and employment rate to account for state-level economic conditions. Column 4 adds GDP per capita, personal income per capita, and personal consumption per capita to further control for economic changes at the state level. Column 5 adds lagged economic conditions on unemployment rate, GDP, consumption as well as its quadratic and cubic forms to flexibly reflect any shocks of economic situation in each state. The standard errors are clustered by state. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

	Depender	nt Variable	: Home He	ealth State	Plan Enrollment
	(1)	(2)	(3)	(4)	(5)
Expenditure per older person	50.730	44.111	26.647	28.481	7.719
	(31.148)	(28.445)	(21.256)	(18.318)	(13.763)
Mean of dependent variable	15463	15595	15595	15595	15892
Observations	814	760	760	760	658
Adjusted R-squared	0.905	0.909	0.917	0.920	0.959
State $+$ Year FE	Υ	Υ	Υ	Y	Y
Demographics		Υ	Υ	Υ	Y
Employment rate			Υ	Y	Y
GDP and consumption				Υ	Υ
Lag economic conditions					Υ

### Table A6: The Effect of Home Health Spending on Enrollment

Notes: The data used are from CMS about enrollment in the HCBS programs from 1998 to 2014. Each cell reports estimates from a separate specification, weighted by state populations. Column 1 shows the simple estimate only with state and year fixed effects. Column 2 adds demographic variables at the state level such as poverty, education, percentage white, and percentage married. Column 3 further includes unemployment rate and employment rate to account for state-level economic conditions. Column 4 adds GDP per capita, personal income per capita, and personal consumption per capita to further control for economic changes at the state level. Column 5 adds lagged economic conditions on unemployment rate, GDP, consumption as well as its quadratic and cubic forms to flexibly reflect any shocks of economic situation in each state. The standard errors are clustered by state. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

	Depender	nt Variable:	Personal (	Care State Pl	an Enrollment
	(1)	(2)	(3)	(4)	(5)
Expenditure per older person	$63.613^{*}$	60.696**	66.974**	71.414***	60.957***
	(34.402)	(28.281)	(26.486)	(20.488)	(16.316)
Mean of dependent variable	23945	24256	24256	24256	25004
Observations	524	493	493	493	434
Adjusted R-squared	0.916	0.933	0.944	0.944	0.963
State $+$ Year FE	Υ	Υ	Υ	Υ	Y
Demographics		Υ	Y	Υ	Y
Employment rate			Υ	Y	Y
GDP and consumption				Υ	Y
Lag economic conditions					Y

### Table A7: The Effect of Personal Care Spending on Enrollment

Notes: The data used are from CMS about enrollment in the HCBS programs from 1998 to 2014. Each cell reports estimates from a separate specification, weighted by state populations. Column 1 shows the simple estimate only with state and year fixed effects. Column 2 adds demographic variables at the state level such as poverty, education, percentage white, and percentage married. Column 3 further includes unemployment rate and employment rate to account for state-level economic conditions. Column 4 adds GDP per capita, personal income per capita, and personal consumption per capita to further control for economic changes at the state level. Column 5 adds lagged economic conditions on unemployment rate, GDP, consumption as well as its quadratic and cubic forms to flexibly reflect any shocks of economic situation in each state. The standard errors are clustered by state. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

	(1)	(2)	(3)	
	Panel A	A: Health		
	Poor	Main		
HCBS per capita (\$1,000)	-0.007	-0.018**		
	(0.007)	(0.008)		
Mean	0.101	0.325		
	Panel B	: Mobility li	imitation	
	$\leq 1$	Main	$\leq 3$	
HCBS per capita (\$1,000)	-0.006	-0.018*	-0.015	
	(0.010)	(0.009)	(0.010)	
Mean	0.567	0.367	0.235	
	Panel C: ADL limitation			
	$\leq 1$	Main	$\leq 3$	
HCBS per capita (\$1,000)	0.000	0.000	0.007	
	(0.013)	(0.011)	(0.010)	
Mean	0.219	0.122	0.078	
	Panel I	D: IADL lin	nitation	
	$\leq 1$	Main	$\leq 3$	
HCBS per capita (\$1,000)	-0.005	0.006	0.005	
	(0.014)	(0.011)	(0.007)	
Mean	0.139	0.069	0.035	
	Pan	el E: Depre	ssion	
	$\leq 5$	Main	$\leq 7$	
HCBS per capita (\$1,000)	-0.011	-0.011**	-0.007*	
	(0.009)	(0.005)	(0.004)	
Mean	0.095	0.058	0.030	

Table A8: The Effects of HCBS on Health With Other Cutoffs

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older. Each cell reports estimates using equation 1 for each health outcome with different cutoffs. The mean of HCBS expenditure per older person is around \$500. All models control for state, year, individual fixed effects, and demographics of individuals such as age, age squared, marital status, and number of siblings of individuals. Standard errors are clustered at the state level. \*\*\* p < 0.01, \*\* p < 0.05, \* p < 0.10.

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
	Gross	Fine ability	Large muscle	Cancer	Lung	Heart	Stroke
HCBS per capita (\$1,000)	-0.009	0.01	-0.003	0.004	-0.011	-0.004	-0.002
	(0.007)	(0.009)	(0.011)	(0.012)	(0.009)	(0.009)	(0.008)
Mean	0.194	0.069	0.444	0.195	0.148	0.381	0.123
Number of individuals	$18,\!196$	18,196	18,193	$18,\!196$	18,198	$18,\!198$	18201
Observations	94,661	94,655	94,618	94,640	94,640	94,613	94645
Adjusted R-squared	0.490	0.371	0.454	0.602	0.426	0.412	0.452

Table A9: Results of HCBS on Other Health Outcomes

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older. Each cell reports estimates using equation 1 for each dependent variable. Gross motor skills limitation of column 1 includes items of walking one block, walking across a room, climbing one flight of stairs, getting in or out of bed, and bathing activities. Fine motor skills limitation of column 2 includes items of picking up a dime, eating, and dressing activities. Large muscle limitation of column 3 includes items of sitting for 2 hrs, getting up from a chair, stooping, kneeling or crouching, and pushing or pulling large objects activities. Columns 4 to 7 are dichotomous dependent variables indicating whether individuals have been diagnosed with cancer, lung, heart disease, and stroke. The mean of HCBS expenditure per older person is around \$500. All models control for state, year, individual fixed effects, and demographics of individuals such as age, age squared, marital status, and number of siblings of individuals. Standard errors are clustered at the state level. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

	(1)	(2)	(3)	(4)	(5)
	Inpatient Service	Medication	Hospital Stays	Nights at Hospitals	Doctor Visits
HCBS (\$1,000)	0.016*	0.013**	0.022	0.151	0.213
	(0.009)	(0.006)	(0.021)	(0.134)	(0.427)
Mean	0.33	0.87	0.60	3.03	11.30
Observations	97,738	97,972	97,439	96,886	92,350

Table A10: Correlation Between HCBS Spending and Healthcare Use

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older. Each cell reports estimates on dependent variables of healthcare use. Inpatient service means whether a respondent has ever visited a hospital in the previous two years. Medication use indicates whether a respond regularly takes medications in the past two years. Hospital stays and nights is the number of hospital use and doctor visits is number of visiting a doctor in the previous two years. The mean of each dependent variable is summarized in the mean row. All models control for state and year fixed effects. The standard errors are clustered at the state level. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

	(1)	(2)	(3)	(4)	(5)
	Number of Helpers	Helpers Last Month	Days Helped	Hours Helped	Paid Helpers
HCBS (\$1,000)	0.040*	0.040*	0.405	2.373	0.027
	(0.024)	(0.020)	(0.347)	(2.557)	(0.032)
Mean	0.34	0.31	5.24	27.37	0.26
Observations	87,336	87,293	87,209	86,204	16,196

Table A11: Correlation Between HCBS Spending and Helper Use

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older. Each cell reports estimates on dependent variables of helpers. Column 1 shows the number of helpers ever helped in the last two years; column 2, the number of helpers helped in the last month; column 3, total days got helped last month; column 4, total hours got helped last month; column 5, total number of helped paid to help last month. The mean of each dependent variable is summarized in the mean row. All models control for state and year fixed effects. The standard errors are clustered at the state level. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

	(1)	(2)	(3)
	Panel	A Outcome	e: Poor health
HCBS dollars per capita ( $$1,000$ )	-0.018**	-0.018**	-0.015*
	(0.010)	(0.013)	(0.009)
	(0.008)	(0.008)	(0.009)
Mean	0.325	0.325	0.325
Observations	94,637	$94,\!637$	94,637
	Panel B	Outcome: N	Iobility limitation
HCBS dollars per capita ( $$1,000$ )	-0.018*	-0.018*	-0.008
	(0.009)	(0.009)	(0.008)
Mean	0.367	0.367	0.367
Observations	94,600	94,600	94,600
	Pane	l C Outcom	e: Depression
HCBS dollars per capita ( $$1,000$ )	-0.011**	-0.011**	-0.011**
	(0.005)	(0.005)	(0.005)
Mean	0.058	0.058	0.058
Observations	84,747	84,747	84,747
Income controls		Y	Y
State controls			Y

Table A12: Robustness Effects of HCBS With Different Controls

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older. Each column reports an estimate corresponding to a specification. Column 1 is the baseline specification with state, year, individual fixed effects, and individual demographic controls. Column 2 adds income controls such as earnings, pensions, and annuities. Column 3 adds state level controls such as percentage high school education, percentage female, birth rate, fertility rate, and unemployment rate. \*\*\* p < 0.01, \*\* p < 0.05, \* p < 0.10.

	(1)	(2)	(3)	(4)	(5)	(6)
	Poor health	Mobility	ADL	IADL	Depression	Cognitive score
HCBS per capita (\$1,000)	-0.017**	-0.020**	0.001	0.001	-0.009*	0.214
	(0.008)	(0.008)	(0.010)	(0.011)	(0.005)	(0.168)
Mean of dependent variable	0.328	0.367	0.123	0.119	0.059	21.35
Number of individuals	16,889	16,873	$16,\!885$	16,883	$15,\!433$	15,416
Observations	86,557	86,514	86,568	86,557	77,461	77,294
Adjusted R-squared	0.49	0.516	0.46	0.476	0.324	0.678

## Table A13: Results of HCBS on Health Without Moving Sample

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 65 and older without individuals who move over years. Each cell reports estimates using equation 1 for each dependent variable. Poor health is an indicator showing that an individual self-assesses his or her general health status as fair or poor. Mobility/ADL/IADL is an indicator of having at least 2 items of mobility/ADL/IADL limitations. Depression is an indicator of feeling at least 6 negative emotions. Cognitive score is continuous values from 0 to 35. The mean of HCBS expenditure per older person is around \$500. All models control for state, year, individual fixed effects, and demographics of individuals such as age, age squared, marital status, and number of siblings of individuals. Standard errors are clustered at the state level. The detailed definition of these variables can be referred to Appendix Table A2. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.

	(1)	(2)	(3)	(4)	(5)	(6)
	Poor health	Mobility	ADL	IADL	Depression	Cognitive score
HCBS per capita (\$1,000)	-0.018	-0.020*	-0.004	-0.002	-0.013**	$0.287^{*}$
	(0.012)	(0.011)	(0.016)	(0.016)	(0.006)	(0.169)
Mean of dependent variable	0.345	0.403	0.143	0.146	0.0583	20.72
Number of individuals	14,711	14,693	14,707	14,706	13,313	13,316
Observations	68,778	68,737	68,792	68,782	60,589	$60,\!598$
Adjusted R-squared	0.470	0.513	0.455	0.479	0.315	0.672

Table A14: Results of HCBS on Health With Sample 70+

Notes: The data used are from HRS 1998 to 2014 of individuals who are aged 70 and older. Each cell reports estimates using equation 1 for each dependent variable. Poor health is an indicator showing that an individual self-assesses his or her general health status as fair or poor. Mobility/ADL/IADL is an indicator of having at least 2 items of mobility/ADL/IADL limitations. Depression is an indicator of feeling at least 6 negative emotions. Cognitive score is continuous values from 0 to 35. The mean of HCBS expenditure per older person is around \$500. All models control for state, year, individual fixed effects, and demographics of individuals such as age, age squared, marital status, and number of siblings of individuals. Standard errors are clustered at the state level. The detailed definition of these variables can be referred to Appendix Table A2. \*\*\* p<0.01, \*\* p<0.05, \* p<0.10.