

## RESEARCH ARTICLE

# Neurocognitive profiles are associated with subsequent brain integrity in a sample of Hispanics/Latinos: Findings from the SOL-INCA-MRI study (HCHS/SOL)

Shraddha Sapkota<sup>1</sup> | Pauline Maillard<sup>1</sup> | Ariana M. Stickel<sup>2</sup> | Wassim Tarraf<sup>3</sup> | Kevin A. Gonzalez<sup>4</sup> | Vladimir Ivanovic<sup>5</sup> | Alejandra Morlett-Paredes<sup>4</sup> | Jianwen Cai<sup>6</sup> | Carmen R. Isasi<sup>7</sup> | Richard B. Lipton<sup>7</sup> | Martha Daviglus<sup>8</sup> | Fernando Daniel Testai<sup>8</sup> | Melissa Lamar<sup>9</sup> | Linda C. Gallo<sup>2</sup> | Gregory A. Talavera<sup>2</sup> | Christian Agudelo<sup>10</sup> | Alberto R. Ramos<sup>10</sup> | Hector M. González<sup>4</sup> | Charles DeCarli<sup>1</sup>

<sup>1</sup>Department of Neurology, University of California, Davis, California, USA

<sup>2</sup>San Diego State University, San Diego, California, USA

<sup>3</sup>Wayne State University, Detroit, Michigan, USA

<sup>4</sup>University of California, San Diego, California, USA

<sup>5</sup>Medical College of Wisconsin, Milwaukee, Wisconsin, USA

<sup>6</sup>The University of North Carolina, Chapel Hill, North Carolina, USA

<sup>7</sup>Albert Einstein College of Medicine, Bronx, New York, USA

<sup>8</sup>University of Illinois, Chicago, Illinois, USA

<sup>9</sup>Rush University, Chicago, Illinois, USA

<sup>10</sup>University of Miami, Coral Gables, Florida, USA

## Correspondence

Shraddha Sapkota, PhD, Department of Neurology, University of California, 1590 Drew Ave, Unit #100, Davis, CA 95618, USA.  
Email: [sapkota@ucdavis.edu](mailto:sapkota@ucdavis.edu)

## Abstract

The Hispanic/Latino population is one of the largest and most diverse ethnorracial groups in the United States at high risk for dementia. We examined cognitive constructs and associations with subsequent hippocampal volume (HV) and white matter hyperintensity volume (WMHV). Participants were from the Hispanic Community Health Study/Study of Latinos–Magnetic Resonance Imaging Study ( $n = 2029$ ). We examined confirmatory factor analysis and longitudinal invariance using neurocognitive scores at Visits 1 (2008–2011) and 2 (2014–2018) and path analyses. We obtained a longitudinally invariant two-factor episodic memory (EM) and working memory (WM) construct. Lower EM profile at both visits was associated with greater WMHV and smaller HV at Visit 2. Lower WM profile at both visits was associated with larger WMHV and smaller HV at Visit 2. Neurocognitive profiles were associated with subsequent neurodegeneration in a sample of Hispanics/Latinos. Identifying neurocognitive risk profiles may lead to early detection and intervention, and significantly impact the course of neurodegeneration.

## KEYWORDS

aging, cognition, Hispanic, Latino, magnetic resonance imaging, neurodegeneration

## Highlights

- Cognitive profiles predict brain integrity up to 10 years later.
- We observed two-factor latent memory constructs and longitudinal invariance.
- These findings were observed in a Hispanic/Latino cohort.

This is an open access article under the terms of the [Creative Commons Attribution-NonCommercial-NoDerivs](https://creativecommons.org/licenses/by-nc-nd/4.0/) License, which permits use and distribution in any medium, provided the original work is properly cited, the use is non-commercial and no modifications or adaptations are made.

© 2024 The Author(s). Alzheimer's & Dementia: Diagnosis, Assessment & Disease Monitoring published by Wiley Periodicals LLC on behalf of Alzheimer's Association.

## 1 | BACKGROUND

Exponential growth in global dementia incidence<sup>1</sup> particularly among Hispanics/Latinos, coupled with inequalities in dementia diagnosis and treatment, has augmented the burden of disease for this ethnora- cial group within the United States.<sup>2</sup> Hispanic/Latino older adults are highly diverse and are predicted to make up the largest group at elevated risk for Alzheimer's disease and related dementias (ADRD) over the next 40 years.<sup>3</sup> Ongoing longitudinal studies in this group describe an earlier age for mild cognitive impairment (MCI) onset and signs of neurodegeneration, but lower rates of amyloid positivity compared to non-Hispanic Whites.<sup>3</sup> Recent work also observed that the widely accepted biological cascade<sup>4</sup> composed of amyloid, tau, and neurodegeneration (AT[N]) may be differentially represented between non-Hispanic White and Mexican American groups.<sup>5</sup> Specifically, neurodegeneration in the Mexican American cohort was seen before deficits in other biomarkers and was uniquely associated with diabetes and sociocultural factors.<sup>5</sup>

Although neurocognitive decline and neurodegeneration associa- tions have been well-described for non-Hispanic White populations,<sup>6,7</sup> similar research in Hispanic/Latino communities is more limited.<sup>8</sup> In this study, we examined whether cognitive performance at two visits (~7 years apart) is associated with structural magnetic resonance imag- ing (MRI) measures assessed 10 years later in a large Hispanic/Latino population cohort of middle-aged and older adults. Neurodegenera- tion signs and symptoms may vary significantly across and within ethnora- cial groups.<sup>9</sup> Thus, understanding differences between cogni- tive trajectories and subsequent MRI measures in these groups will likely contribute to our understanding of the underlying mechanisms leading to dementia onset. Such emerging ethnora- cial differences in key dementia biomarkers emphasize the need to focus on both group and person-specific heterogeneity.

Cognitive development varies significantly across the lifespan.<sup>10</sup> This variability is driven largely by biological factors and environ- mental influences,<sup>11</sup> particularly in minoritized ethnora- cial groups.<sup>12</sup> Although increasing age in concert with common brain patholo- gies plays a fundamental role in all late-life cognitive processes,<sup>13</sup> cognitive trajectories are also dependent on individual-specific risk factors including those leading to Alzheimer's disease (AD).<sup>14,15</sup> Max- imally attained ability, coupled with normative and non-normative (illness-related) factors contribute toward an individual's cognitive performance at any given time.<sup>16</sup> Given that "normal aging" is often accompanied by diseases that affect brain health as measured by MRI,<sup>17</sup> cognition across the lifespan may be a promising marker associated with differences in structural brain measures at a later date (see Figure 1). Cognitive screening may also be more cost- effective and easily accessible than structural MRI to identify indi- viduals with high dementia risk profiles. Prior research has focused primarily on whether neurodegeneration predicts future cognitive per- formance and decline.<sup>18</sup> To our knowledge, studies that associate cognitive function with subsequent MRI measures have rarely been conducted. We examine this relationship to better understand the neu-

robiological underpinnings between cognitive and brain trajectories in aging.

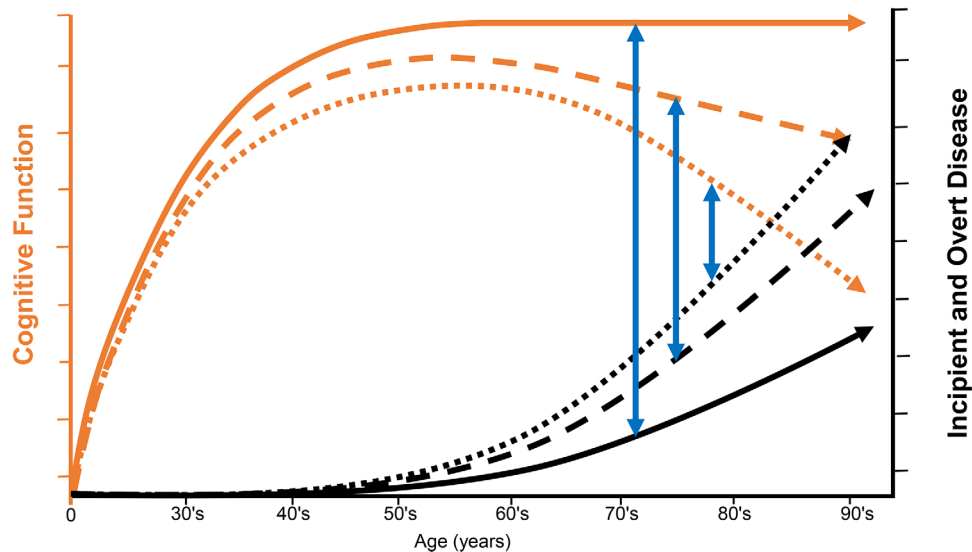
We examine whether cognitive performance at two separate visits is associated with subsequent MRI measures. Specifically, two common age-related MRI phenotypes were examined, white matter hyperinten- sity volume (WMHV) and hippocampal volume (HV). Larger WMHVs have been linked to accelerated cognitive decline,<sup>19</sup> and this associa- tion is stronger in cognitively healthy adults and those with MCI versus those with dementia.<sup>20</sup> Studies also show that larger HV is positively associated with memory performance across the lifespan in cognitively normal adults.<sup>21</sup> Based on the availability of neuropsychological mea- sures in our cohort, we examine seven cognitive scores representing the memory domain. Specifically, our cognitive test scores measured aspects of episodic memory (EM) and working memory (WM).

We had two sequential research aims. First, we aimed to estab- lish a latent cognitive factor and longitudinal invariance<sup>22</sup> using seven manifest variables from three cognitive tests administered at both the first and second cognitive visits. We expected to observe a one- or two-factor latent memory construct at both visits and longitudinal invariance. Second, we examined the association between the derived latent cognitive scores at both visits and subsequent structural MRI measures. We hypothesized that lower memory factor scores at Vis- its 1 and 2 would be independently associated with subsequent larger WMHVs and smaller HVs as evidence of poorer brain health, and that this association would be strongest for the neurocognitive tests at the second visit based on its greater proximity to the MRI visit.

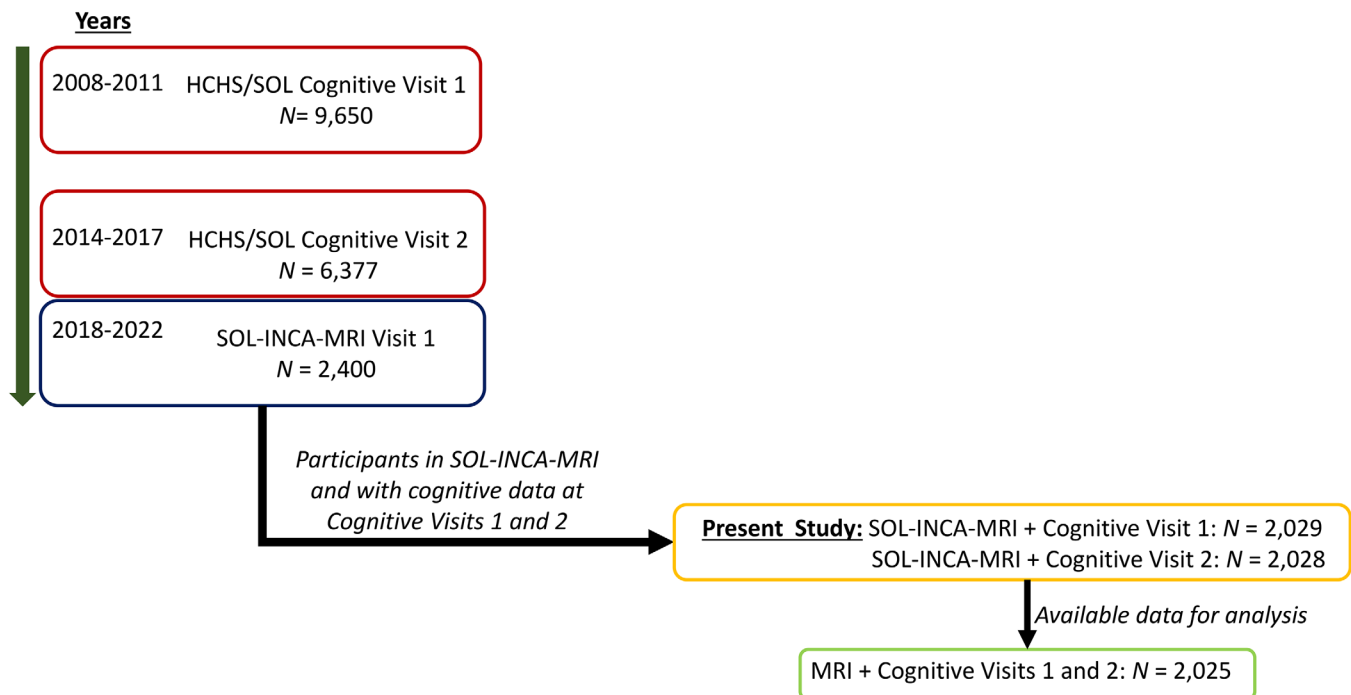
## 2 | METHODS

### 2.1 | Participants

We used data from the Hispanic Community Health Study/Study of Latinos (HCHS/SOL), an ongoing prospective cohort study of His- panic/Latino adults from four U.S. metropolitan areas (Bronx, NY; Chicago, IL; Miami, FL; and San Diego, CA).<sup>23</sup> General information regarding recruitment, methodological details, and participant sam- ples are available elsewhere.<sup>24,25</sup> Participants for the present study are from the Study of Latino-Investigation of Neurocognitive Aging- Magnetic Resonance Imaging (SOL-INCA-MRI) study, which includes participants from the HCHS/SOL cohort and those with neurocogni- tive data from the SOL-INCA, an ancillary study focused on cognitive performance of adults  $\approx$ 50 years and older.<sup>8</sup> Written informed con- sent was obtained for all participants. SOL-INCA-MRI and all present data procedures are in full and certified compliance with prevailing human/institutional research ethnics guidelines. SOL-INCA-MRI is an ongoing longitudinal sub-study using brain morphometry to under- stand how vascular risk burden influences cerebrovascular pathology and AD risk. All participants in SOL-INCA-MRI were 50 years and older, received neuropsychological testing at Visit 2 v, and were willing to undergo MRI. All subjects identified as having MCI were approached as well as a random sample of cognitively normal individuals. For



**FIGURE 1** Conceptual model for cognition and incipient disease across the lifespan. As individuals age, cognitive function and incipient and overt diseases are positively correlated. Once a threshold is reached, cognitive function will show an exponential decline and incident disease will show an exponential increase. The vertical bidirectional arrows indicate the potential differences in magnetic resonance imaging (MRI) measures that could reflect this process. The dotted lines represent examples of individual trajectories of cognitive function (orange lines) and overt diseases (black lines).



**FIGURE 2** Flow chart displaying the sequence of visits leading up to present study sample based on the years that cognitive and magnetic resonance imaging (MRI) data were collected in the Hispanic Community Health Study/Study of Latinos (HCHS/SOL) and Study of Latino-Investigation of Neurocognitive Aging-Magnetic Resonance Imaging (SOL-INCA-MRI).

the present study, we included all available participants with cognitive data at Visits 1 and 2 and MRI data  $\approx 10$ -years after Visit 1 as of July 1, 2023 (see Figure 2). Accordingly, we included  $n = 2029$  older adults (mean cognitive Visit 1 age (SD) = 54.19 (6.75) years

old, age range = 43- to 74-years-old, 69.5% women; see Table 1). The difference in participant numbers at Visits 1 and 2 and the MRI visit reflects only those participants with complete cognitive and MRI data.

**TABLE 1** Participant demographic characteristics by neurocognitive and magnetic resonance imaging (MRI) visits.

	Neurocognitive Visit 1 (2008–2011)	Neurocognitive Visit 2 (2014–2017)	MRI visit (2018–2022)
N	2029	2028	2025
Age (years)	54.19 (6.75)	61.15 (6.85)	64.39 (6.85)
Sex (F/M)	1407/618	–	–
Education (1/2/3)	782/423/817	–	–
Background	7.8% Dominican/12.9% Central American/15.4% Cuban/36.6% Mexican/16.3% Puerto Rican/8.8% South American/1.3% More than one heritage/0.8% Other	–	–
B-SEVLT 1	5.25 (1.76)	5.31 (1.78)	–
B-SEVLT 2	8.33 (2.23)	8.33 (2.32)	–
B-SEVLT 3	9.94 (2.37)	9.97 (2.43)	–
B-SEVLT recall	8.84 (2.73)	8.62 (2.99)	–
Word Fluency (Letter A)	9.56 (3.99)	8.91 (3.92)	–
Word Fluency (Letter F)	9.44 (3.96)	9.32 (4.07)	–
Digit symbol substitution	35.56 (13.00)	33.24 (12.87)	–
Episodic memory factor score	–0.003 (0.95)	0.004 (0.99)	–
Working memory factor scores	0.007 (0.94)	–0.013 (0.96)	–
Hippocampal volume (residual cc)	–	–	0.001 (0.58)
WMHV (log residual cc)	–	–	–0.005 (1.51)

Note: F = female; M = male; education levels: 1 = less than high school, 2 = up to high school, 3 = greater than high school; MRI = magnetic resonance imaging; B-SEVLT = Brief Spanish-English Verbal Learning Test; cc = cubic centimeter; WMHV = white matter hyperintensity volume.

## 2.2 | MRI acquisition protocols and processing

Structural MRI scans were obtained using 3T MRI scanner (GE 3T 750, three sites; or Phillips 3T Achieva TX, one site). A combination of high-resolution T1-weighted structural (1 mm<sup>3</sup>) and three-dimensional fluid-attenuated inversion recovery (3D-FLAIR) images were examined in the current study. All images were processed at the Imaging of Dementia & Aging Laboratory at University of California, Davis (UC Davis). Regarding the sequence parameters, high-resolution, 3D T1 image acquisitions consisted of Inversion Recovery Spoiled Gradient Echo or Magnetization Prepared Rapid Gradient Echo at 1 × 1 × 1 mm voxel size. FLAIR sequences were also acquired in 3D with 1 × 1 × 3 mm voxel size. The analysis pipeline included a number of steps, including (1) removal of non-brain tissues using neural net method<sup>26</sup> and quality control; (2) image intensity inhomogeneity correction; (3) gray and white matter and cerebrospinal fluid measurement and segmentation, (4) WMH assessment using a modified Bayesian probability structure<sup>27</sup>; and (5) automatic hippocampal segmentation. Complete details on acquisition and image processing are available elsewhere.<sup>23</sup> In the present study, we examined measures of WMHV and HV collected between 2018 and 2022, regressed against total cranial volume (TCV). All WMHV values were natural log-transformed prior to TCV correction to account for non-normal distribution. This approach results in a nearly normal residual distribution, strengthening the statistical inference.

## 2.3 | Neuropsychological assessments

SOL-INCA neurocognitive data collected across two visits were used in the present study. All neurocognitive assessments were offered in both English and Spanish and administered by bilingual personnel. At SOL-INCA-MRI Visit 1 there were  $n = 2029$  participants tested between 2008 and 2011 and at Visit 2,  $n = 2028$  participants were tested between 2014 and 2017. In the present study, we used seven cognitive scores based on three distinct neurocognitive tests to evaluate for the best memory latent factor model. Specifically, the Brief Spanish-English Verbal Learning Test (B-SEVLT) words recalled from trials 1–3 (as three separate variables) and B-SEVLT delayed recall, as well as the digit symbol substitution, phonemic word fluency letter A, and word fluency letter F were used.<sup>28</sup> Additional details regarding the psychometric properties of the battery are available elsewhere.<sup>8</sup>

## 2.4 | Statistical analysis

Baseline participant characteristics by neurocognitive and MRI visits were examined. Continuous measures were summarized using means and SDs, whereas categorical measures were summarized using counts and percentages. We used structural equation modeling (SEM) for all analyses in Mplus Version 8.6.<sup>29</sup> All missing values were assumed to be missing at random and were estimated using maximum likelihood.

Cases with missing predictor values were removed using list-wise deletion in Mplus 8.6. The mean lag time between MRI measurements and neuropsychological assessment for cognitive Visit 1 was 10.21 (1.34) years and for cognitive Visit 2 was 3.25 (1.14) years.

#### 2.4.1 | Confirmatory factor analysis (CFA)

We used confirmatory factor analysis (CFA) to determine the best latent cognitive construct(s). Specifically, we examine loadings of all seven manifest variables (B-SEVLT trials 1–3, B-SEVLT delayed recall, digit symbol substitution, and word fluency letters A and F) on the predicted latent variable. The first model examined all cognitive scores on one latent variable. We subsequently examined solutions with two latent variables. The best-fitting model was determined with several model-fit statistics. The chi-square test of model ( $\chi^2$ ;  $p > 0.05$ ) allowed for an overall indication of model fit. Additional absolute/comparative fit indices were also examined to determine model fit to the data.<sup>30</sup> The root-mean-square error of approximation (RMSEA  $\leq 0.05$ ), comparative fit index (CFI  $\geq 0.95$ ), and the standardized root-mean-square residual (SRMR  $\leq 0.08$ ) were used.

#### 2.4.2 | Longitudinal measurement invariance

We tested for longitudinal invariance across the two cognitive visits for the best factor solution. Additional details are included in the supplementary materials.<sup>30</sup>

#### 2.4.3 | Path analyses

Separate path analyses were performed to test the association between performance at cognitive Visits 1 and 2 and subsequent brain morphometry measures (WMHV, HV). Specifically, WMHV and HV were regressed on cognitive factor scores at Visit 1, and we repeated the same set of analyses for Visit 2. All models controlled for age at each visit, sex, education, Hispanic/Latino background, and cognitive-MRI lag time. Education was categorized into three levels (1 = no high school, 2 = up to high school, and 3 = greater than high school diploma). This path analysis was run for each cognitive construct and brain integrity measure at Visit 1 and again at Visit 2. A total of eight path analyses were examined.

We repeated path analyses using cognitive tertiles to test the association between cognitive profiles and subsequent brain morphometry. Specifically, for each cognitive latent construct, tertiles consisted of equal groupings in ascending order using the total sample. Specifically, the low-, intermediate-, and high-performing groups consisted of  $\approx 676$  individuals each based on their latent factor score rankings in ascending order. Cognitive tertiles were examined to identify how overall cognitive profiles in addition to specific test scores are associated with subsequent brain integrity measures. As supplementary analyses, we ran weighted analyses that account for the non-probability sampling

design and survey regression methods, which include the stratification and clustering of observations. This allows for appropriate inferences to the overall HCHS/SOL target population.<sup>23</sup>

### 3 | RESULTS

Descriptive baseline characteristics of study participants by cognitive and MRI visits are displayed in Table 1.

#### 3.1 | CFA

The one-factor parsimonious cognitive model resulted in poor model fit at both cognitive Visits 1 and 2. We then tested two factors and found that the seven indicators were best represented across two memory factors at both visits. Specifically, B-SEVLT trials 1–3 and B-SEVLT delayed recall loaded on a factor representing verbal learning and memory (henceforth EM) and word fluency letter A, word fluency letter F, and digit symbol substitution loaded on a factor representing working memory (WM) (cognitive Visit 1:  $\chi^2(df) = 166.197$  (13),  $p < 0.001$ , RMSEA = 0.076 (0.066–0.087), CFI = 0.975, SRMR = 0.042; cognitive Visit 2:  $\chi^2(df) = 245.734$  (13),  $p < 0.001$ , RMSEA = 0.094 (0.084–0.104), CFI = 0.965, SRMR = 0.044) (Table 2). Based on the availability of neuropsychological test scores in our cohort, we did not examine other cognitive domains such as executive function or visuospatial ability.

#### 3.2 | Longitudinal measurement invariance

We obtained partial scalar longitudinal invariance across the two cognitive visits (see Table 2) for the two-factor memory model. Obtaining invariance at this level means there are no differences in what our latent construct represents across the two visits, and they are measuring the same factor longitudinally (see Table 2).

#### 3.3 | Path analyses

We observed several significant associations between the two memory factor scores and two brain morphometry measures (Table 3 and Figure 3) across cognitive Visits 1 and 2. First, lower EM at Visits 1 and 2 was associated with greater WMHV burden (Figure 3A). Second, lower WM at Visits 1 and 2 was associated with greater WMHV burden (Figure 3B). Third, higher EM at Visits 1 and 2 was associated with greater HV (Figure 3C). Fourth, higher WM at Visit 2 was associated with greater HV (Figure 3D). For our tertile associations, we observed that older adults in the low, intermediate, and high groups had similar memory scores across the two visits (Figure S1). In addition, we confirmed that adjusting for language preference (Spanish vs English) does not change our significant findings. Using complex study design weights derived from the HCHS/SOL parent study and modified to best

**TABLE 2** Confirmatory factor analysis and longitudinal invariance model fit statistics and chi-square difference test for episodic memory and working memory across two visits.

	AIC	BIC	Two-factor episodic and working memory				
			$\chi^2_{df_M}$	RMSEA (90% CI)	CFI	SRMR	$\chi^2_{df_D}$
<b>Confirmatory factor analysis</b>							
Visit 1	68297.967	68421.482	166.197(13); $p < 0.001$	0.076 (0.066–0.087)	0.975	0.042	–
Visit 2	68974.666	69098.191	245.734(13); $p < 0.001$	0.094 (0.084–0.104)	0.965	0.044	–
<b>Longitudinal invariance</b>							
<b>Episodic memory</b>							
	AIC	BIC	$\chi^2_{df_M}$	RMSEA (90% CI)	CFI	SRMR	$\chi^2_{df_D}$
Configural	63455.242	63612.471	232.108 (16); $p < 0.001$	0.082 (0.072–0.091)	0.977	0.022	–
Metric	63450.148	63590.530	233.014 (19); $p < 0.001$	0.075 (0.066–0.083)	0.977	0.022	0.906 (3)
Scalar	63460.031	63583.567	248.897 (22); $p < 0.001$	0.071 (0.063–0.079)	0.976	0.024	15.883 (3)**
Partial scalar <sup>a+</sup>	63448.271	63583.038	233.136 (20); $p < 0.001$	0.072 (0.064–0.081)	0.978	0.022	0.122 (1)
<b>Working memory</b>							
	AIC	BIC	$\chi^2_{df_M}$	RMSEA (90% CI)	CFI	SRMR	$\chi^2_{df_D}$
Configural	70110.539	70228.460	70.046 (6); $p < 0.001$	0.073 (0.058–0.088)	0.991	0.024	–
Metric	70110.309	70217.000	73.816 (8); $p < 0.001$	0.064 (0.051–0.077)	0.991	0.020	3.77 (2)
Scalar	70265.192	703060.652	232.699 (10); $p < 0.001$	0.105 (0.093–0.117)	0.968	0.035	158.886 (2)**
Partial scalar <sup>b+</sup>	70108.317	70209.393	73.824 (9); $p < 0.001$	0.060 (0.047–0.073)	0.991	0.020	0.008 (1)

Note: AIC = Akaike information criteria; BIC = Bayesian information criteria;  $\chi^2_M$  = chi-square test of model fit;  $df_M$  = degrees of freedom for model fit; RMSEA = root-mean square error of approximation; CI = confidence interval; CFI = comparative fit index; SRMR = standardized root-mean square residual;  $\chi^2_D$  = chi-square test of difference;  $df_D$  = degrees of freedom for difference in model fit.

\* $p < 0.05$ ; \*\* $p < 0.001$ .

<sup>a</sup>Partial scalar for episodic memory, where the intercept for B-SEVLT list 1 and B-SEVLT list 2 were constrained to be equal across the two visits.

<sup>b</sup>Partial scalar for working memory, where the intercept for Word Fluency (Letter A) and Word Fluency (Letter F) were constrained to be equal across the two visits.

<sup>+</sup>Best model fit.

reflect the subset selection of the SOL-INCA-MRI study resulted in similar relationships (see Tables S1 and S2) between latent variables and subsequent MRI, although the strength of these associations was attenuated somewhat as described in the supplemental materials.

## 4 | DISCUSSION

The overall aims of our study were to (1) create latent cognitive constructs in a Hispanic/Latino cohort and establish longitudinal invariance across two visits, and (2) to determine whether the cognitive constructs were associated with subsequent measures of brain integrity. We established a two-factor EM and WM factor with longitudinal invariance across two visits. Following this fundamental step, we observed that the two-factor EM and WM latent scores at both visits were significantly associated with subsequent MRI measures. Specifically, lower EM scores at both visits were associated with greater WMHV and lower HV. Lower WM scores at both visits were associated with greater WMHV and lower HV only at Visit 2. Neurocognitive profiles examined as tertiles further supported that an overall higher performing neurocognitive profile was associated with larger HV and smaller WMHV measured years later. This is the first study to report

cognitive risk profiles are associated with future MRI structural differences in a large Hispanic/Latino cohort. Our finding advances work on early detection and interventions for this diverse group with increased risk of dementia by identifying specific neurocognitive risk profiles that are associated with neurodegeneration  $\approx 10$  years later. Neurocognitive assessments are easier to administer and cost-effective than blood-based and neuroimaging biomarkers.<sup>31</sup> Thus, identifying high cognitive risk profile groups may lead to changes in clinical trials aimed at delaying dementia onset and subsequently influencing the overall burden for both caregivers and health care costs across the United States. Future work should consider testing this in other ethnorracial groups for replication.

In research aim 1, we obtained longitudinally invariant two-factor latent memory construct across two visits in our sample of Hispanic/Latino older adults. This finding establishes a latent memory model with two factors comprising seven manifest variables (B-SEVLT trials 1–3, B-SEVLT recall, digit symbol substitution, and word fluency letters A and F). A latent variable approach provides a superior and robust estimation of the memory construct where measurement errors associated with each indicator are adjusted for in the model.<sup>22</sup> Such latent constructs are not commonly examined or available for Hispanic/Latino populations. By accounting for more than one

**TABLE 3** Path analysis results for episodic and working memory with white matter hyperintensity volume (WMHV) and hippocampal volume (HV).

	Episodic memory Visit 1 (continuous)			Episodic memory Visit 1 (tertiles)			Working memory Visit 1 (continuous)			Working memory Visit 1 (tertiles)		
	$\beta$	SE	p	$\beta$	SE	p	$\beta$	SE	p	$\beta$	SE	p
WMHV	-0.155	0.035	<0.001	-0.179	0.039	<0.001	-0.143	0.036	<0.001	-0.159	0.041	<0.001
Hippocampal volume	0.035	0.140	0.016	0.037	0.016	0.024	0.030	0.015	0.050	0.033	0.017	0.053
	Episodic memory Visit 2 (continuous)			Episodic memory Visit 2 (tertiles)			Working memory Visit 2 (continuous)			Working memory Visit 2 (tertiles)		
	$\beta$	SE	p	$\beta$	SE	p	$\beta$	SE	p	$\beta$	SE	p
WMHV	-0.215	0.034	<0.001	-0.224	0.040	<0.001	-0.148	0.036	<0.001	-0.146	0.041	<0.001
Hippocampal volume	0.049	0.014	0.001	0.046	0.017	0.006	0.024	0.015	0.111	0.038	0.017	0.026

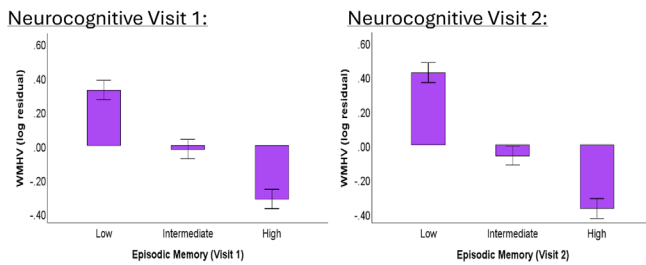
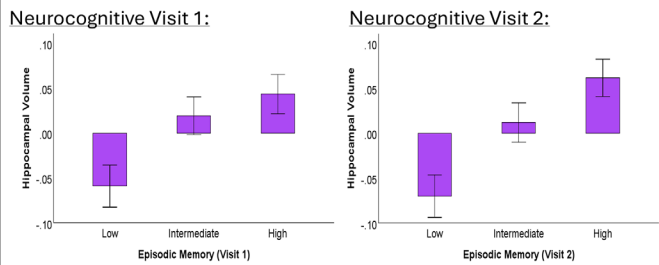
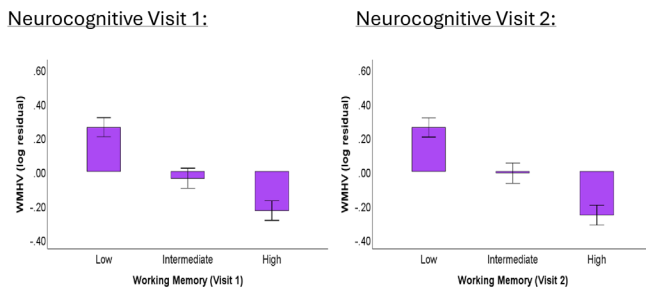
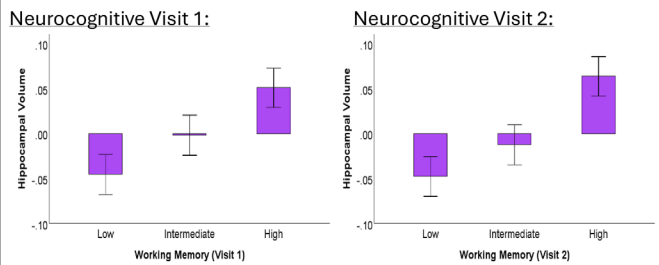
Note:  $\beta$  = beta estimate. SE = standard error.

manifest variable, the shared common variance among multiple indicators is used to determine the underlying latent construct. Although large inter-individual differences and intra-individual variability are typically observed with age and possibly even Hispanic/Latino background, we acquired longitudinal invariance for our two-factor memory model. This fundamental step in latent construct allows us to examine the same invariant construct across two visits in our large and diverse Hispanic/Latino sample. To our knowledge, this is one of the only studies of Hispanic/Latino individuals from diverse heritage groups to establish cognitive constructs and longitudinal invariance.

In our second research aim, we observed that each factor, EM and WM, regardless of continuous or tertile measurement, was associated with differences in subsequent HV and WMHVs. Subtle changes in memory profiles across the lifespan may be a precursor to neurodegeneration<sup>13</sup> in late life in Hispanic/Latino adults. Validation studies should consider examining this approach as a potential screening tool for adults who are at a higher risk of brain atrophy or neurodegeneration ultimately resulting in significant ADRD-related cognitive deficits. This method may provide a relatively inexpensive and globally accessible resource for health care and early dementia diagnosis in Hispanic/Latino populations.

Memory factor scores may also indirectly represent brain reserve,<sup>32</sup> where the rate of subsequent neurodegeneration is composed of concurrent brain reserve and cognitive performance. Future research should consider examining longitudinal memory changes as well as their associations with brain reserve and integrity over time. As expected from prior cross-sectional and longitudinal brain-cognition findings,<sup>33,34</sup> the neurocognitive profile collected closest in time was more consistently associated with brain morphometry in the current study. Larger interval differences between measurements may imply greater discrepancies resulting in stronger concurrent brain-cognition associations. It is also important to note the uncertainty of risk and protective factors within this measurement interval and its impact on brain-cognition associations. Normal cognitive trajectories from early adulthood typically show a decline in memory and speed measures, whereas vocabulary and general knowledge increase up to 60 years of age.<sup>35</sup> Thus, identifying specific cognitive domains and their threshold or deflection points as early as possible will result in earlier detection of individuals at higher risk of accelerated cognitive decline and subsequent dementia diagnosis.

A few strengths and limitations of the present study should be noted. Regarding, limitations, first, our middle-aged and older adult sample included only a Hispanic/Latino population and may not be generalizable to other ethn racial groups. However, our sample includes a diverse group of Hispanic/Latino adults including people of Mexican, Cuban, Dominican, Puerto Rican, and Central and South American heritages (Table 1). Second, our MRI sub-sample findings may not represent the SOL-INCA study population, as it includes only those who qualified and were generally younger and willing to have MRI. When we included weighted results as representative of the Hispanic/Latino population, the general findings remained, but were somewhat attenuated (see [supplementary materials](#)). Third, our ongoing data collection

**(A) Episodic Memory and WMHV****(C) Episodic Memory and HV****(B) Working Memory and WMHV****(D) Working Memory and HV**

**FIGURE 3** Neurocognitive profiles represented with episodic and working memory tertiles at neurocognitive Visits 1 and 2 are associated with subsequent white matter hyperintensity volume (WMHV) and hippocampal volume (HV). All tertiles were significantly different across all neurocognitive visits for brain integrity except for neurocognitive Visit 1 and HV.  $\pm 1$  standard error of the mean is shown for all figures.

and processing for longitudinal brain morphometry data limited our analysis to cross-sectional. Future work with longitudinal brain morphometry data will provide additional information to support our preliminary brain-cognition integrity results. Fourth, all cognitive tests examined were designed to study a Hispanic/Latino group typically observed in a large epidemiological study and cannot be compared with construct or loadings in a non-Hispanic White cohort as the individual tests are specific to this cohort. Fifth, although we included sex as a covariate, future work should consider examining sex differences with memory and brain integrity associations in Hispanic/Latino cohorts.<sup>23</sup> Sixth, structural determinants of health including economic and social policies and racism directly impact everyday living conditions in this group<sup>36</sup> and may not be generalizable to other ethnic groups. This includes fair access to housing, education, and health care,<sup>37</sup> each of which could affect cognitive performance obscuring the brain-cognition relationship while simultaneously increasing risk for late-life dementia.<sup>38</sup> A first strength is the large (>2000) and diverse (more than four heritage groups) sample of Hispanic/Latino adults tested longitudinally on neurocognitive performance across an  $\approx 10$ -year period from an ongoing study with neuroimaging data. Second, we used seven scores from three commonly examined standard cognitive tests to represent our two-factor, longitudinally invariant, memory construct, which accounts for measurement error frequently present with single cognitive variables. Third, neurocognitive data were collected before brain morphometry measures, making our study design unique and among the first studies to examine this dynamic

and complex brain-cognition relationship in a diverse Hispanic/Latino cohort.

In conclusion, we established two-factor longitudinally invariant EM and WM latent construct models of cognition in a large and diverse Hispanic/Latino cohort of middle-aged and older adults from four U.S. metropolitan areas. These neurocognitive profiles were associated with subsequent indices of WMHV and HV. This implies an accurate reflection of memory at the two visits ( $\approx 7$  years apart) and suggests that neurocognitive profiles at any given time also reflect the extent of underlying brain integrity. Future studies should consider examining the impact of longitudinal memory changes to predict brain integrity as well as replication studies with other ethnoracial groups and patients with dementia. Careful monitoring of neurocognitive risk profiles in the Hispanic/Latino population may identify individuals at high risk for future neurodegeneration, and significantly lead to early detection and individualized intervention programs. Although our findings confirm an association between cognitive risk profile and future structural MRI changes, it is important to note that longitudinal studies are needed to infer a predictive relationship between neurocognitive risk and future neurodegeneration. Examining neurocognitive profiles periodically across the lifespan may detect thresholds or deflection points that accurately identify individuals at high risk of experiencing structural brain abnormalities associated with neurodegeneration. This approach can lead to early detection and opportunities for on-time and person-centered interventions that may significantly impact the course of neurodegeneration in Hispanic/Latino adult communities.



## ACKNOWLEDGMENTS

The authors thank the staff and participants of HCHS/SOL for their important contributions. Investigators website- <http://www.csc.unc.edu/hchs/>. The Hispanic Community Health Study/Study of Latinos is a collaborative study supported by contracts from the National Heart, Lung, and Blood Institute (NHLBI) to the University of North Carolina (HHSN268201300001I / N01-HC-65233), University of Miami (HHSN268201300004I / N01-HC-65234), Albert Einstein College of Medicine (HHSN268201300002I / N01-HC-65235), University of Illinois at Chicago (HHSN268201300003I / N01-HC-65236 Northwestern Univ), and San Diego State University (HHSN268201300005I / N01-HC-65237). The following Institutes/Centers/Offices have contributed to the HCHS/SOL through a transfer of funds to the NHLBI: National Institute on Minority Health and Health Disparities, National Institute on Deafness and Other Communication Disorders, National Institute of Dental and Craniofacial Research, National Institute of Diabetes and Digestive and Kidney Diseases, National Institute of Neurological Disorders and Stroke, NIH Institution-Office of Dietary Supplements. The views expressed in this manuscript are those of the authors and do not necessarily represent the views of the National Heart, Lung, and Blood Institute; the National Institutes of Health; or the U.S. Department of Health and Human Services. This study also was supported by grants R01-AG048642, RF1 AG054548, R01 AG07575, RF1 AG061022, N01-HC65233, N01-HC65234, N01-HC65235, N01-HC65236, and N01-HC65237. M.L. was also supported by grant R01-AG062711. A.M.S. receives support from K08AG075351, L30AG074401, and U54CA267789.

## CONFLICT OF INTEREST STATEMENT

The authors declare no conflicts of interest.

## CONSENT STATEMENT

Written informed consent was obtained from all participants.

## DISCLOSURE

All authors report no disclosures relevant to the manuscript.

## REFERENCES

- Nichols E, Steinmetz JD, Vollset SE, et al. Estimation of the global prevalence of dementia in 2019 and forecasted prevalence in 2050: an analysis for the Global Burden of Disease Study 2019. *Lancet Public Heal*. 2022;7:e105-e125. doi:10.1016/S2468-2667(21)00249-8/ATTACHMENT/60E03FD1-38B2-4B40-A91D-9AFDDA22B45E/MMC1.PDF
- Mayeda ER, Glymour MM, Quesenberry CP, Whitmer RA. Inequalities in dementia incidence between six racial and ethnic groups over 14 years. *Alzheimers Dement*. 2016;12:216. doi:10.1016/J.JALZ.2015.12.007
- Quiroz YT, Solis M, Aranda MP, et al. Addressing the disparities in dementia risk, early detection and care in Latino populations: highlights from the second Latinos & Alzheimer's Symposium. *Alzheimer's Dement*. 2022;18:1677. doi:10.1002/ALZ.12589
- Jack CR, Knopman DS, Jagust WJ, et al. Update on hypothetical model of Alzheimer's disease biomarkers. *Lancet Neurol*. 2013;12:207. doi:10.1016/S1474-4422(12)70291-0
- O'Bryant SE, Zhang F, Petersen M, et al. Neurodegeneration from the AT(N) framework is different among Mexican Americans compared to non-Hispanic Whites: a Health & Aging Brain among Latino Elders (HABLE) Study. *Alzheimer's Dement Diagnosis. Assess Dis Monit*. 2022;14:e12267. doi:10.1002/DAD2.12267
- Lim AC, Barnes LL, Weisberger GH, et al. Quantification of race/ethnicity representation in Alzheimer's disease neuroimaging research in the USA: a systematic review. *Commun Med*. 2023;3:1-12. doi:10.1038/S43856-023-00333-6
- Hale JM, Schneider DC, Mehta NK, Myrskylä M. Cognitive impairment in the U.S.: lifetime risk, age at onset, and years impaired. *SSM—Popul Heal*. 2020;11:100577. doi:10.1016/J.SSMPH.2020.100577
- González HM, Tarraf W, Fornage M, et al. A research framework for cognitive aging and Alzheimer's disease among diverse US Latinos: design and implementation of the Hispanic Community Health Study/Study of Latinos—Investigation of Neurocognitive Aging (SOL-INCA). *Alzheimer's Dement*. 2019;15:1624-1632. doi:10.1016/J.JALZ.2019.08.192
- Singh TD, Josephs KA. Symptom Prevalence of Neurodegenerative Diseases among Minorities. *J Alzheimers Dis Park*. 2017;7:1-6. doi:10.4172/2161-0460.1000397
- Nichols ES, Wild CJ, Owen AM, Soddu A. Cognition across the lifespan: investigating age, sex, and other sociodemographic influences. *Behav Sci (Basel)*. 2021;11:51. doi:10.3390/BS11040051/S1
- Tucker-Drob EM, Briley DA, Harden KP. Genetic and environmental influences on cognition across development and context. *Curr Dir Psychol Sci*. 2013;22:349. doi:10.1177/0963721413485087
- Zsembik BA, Peek MK. Race differences in cognitive functioning among older adults. *J Gerontol Ser B*. 2001;56:S266-S274. doi:10.1093/GERONB/56.5.S266
- Wilson RS, Leurgans SE, Boyle PA, Schneider JA, Bennett DA. Neurodegenerative basis of age-related cognitive decline (e-Pub ahead of print)(CME). *Neurology*. 2010;75:1070. doi:10.1212/WNL.0B013E3181F39ADC
- Wilson RS, Gilley DW, Bennett DA, Beckett LA, Evans DA. Person-specific paths of cognitive decline in Alzheimer's disease and their relation to age. *Psychol Aging*. 2000;15:18-28. doi:10.1037/0882-7974.15.1.18
- Wilson RS, Beckett LA, Barnes LL, et al. Individual differences in rates of change in cognitive abilities of older persons. *Psychol Aging*. 2002;17:179-193. doi:10.1037/0882-7974.17.2.179
- Steinerman JR, Hall CB, Sliwinski MJ, Lipton RB. Modeling cognitive trajectories within longitudinal studies: a focus on older adults. *J Am Geriatr Soc*. 2010;58:S313-S318. doi:10.1111/J.1532-5415.2010.02982.X. Suppl 2.
- DeCarli C, Massaro J, Harvey, et al. Measures of brain morphology and infarction in the Framingham heart study: establishing what is normal. *Neurobiol Aging*. 2005;26:491-510. doi:10.1016/j.neurobiolaging.2004.05.004
- Prosser L, MacDougall A, Sudre CH, et al. Predicting cognitive decline in older adults using baseline metrics of AD pathologies, cerebrovascular disease, and neurodegeneration. *Neurology*. 2023;100:E834-E845. doi:10.1212/WNL.000000000000201572
- Wang YL, Chen W, Cai WJ, et al. Associations of white matter hyperintensities with cognitive decline: a longitudinal study. *J Alzheimers Dis*. 2020;73:759-768. doi:10.3233/JAD-191005
- Sachdev PS, Zhuang L, Braidy N, Wen W. Is Alzheimer's a disease of the white matter? *Curr Opin Psychiatry*. 2013;26:244-251. doi:10.1097/YCO.0B013E32835ED6E8
- Van Petten C. Relationship between hippocampal volume and memory ability in healthy individuals across the lifespan: review and meta-analysis. *Neuropsychologia*. 2004;42:1394-1413. doi:10.1016/j.neuropsychologia.2004.04.006
- Little TD. *Longitudinal structural equation modeling*. Guilford Press; 2013.

23. Stickel AM, Tarraf W, González KA, et al. Characterizing age- and sex-related differences in brain structure among middle-aged and older Hispanic/Latino adults in the study of Latinos- investigation of neurocognitive aging magnetic resonance imaging (SOL-INCA MRI). *Neurobiol Aging*. 2023;126:58-66. doi:[10.1016/J.NEUROBIOLAGING.2023.02.007](https://doi.org/10.1016/J.NEUROBIOLAGING.2023.02.007)
24. LaVange LM, Kalsbeek WD, Sorlie PD, et al. Sample design and cohort selection in the Hispanic Community Health Study/Study of Latinos. *Ann Epidemiol*. 2010;20:642-649. doi:[10.1016/J.ANNEPIDEM.2010.05.006](https://doi.org/10.1016/J.ANNEPIDEM.2010.05.006)
25. Sorlie PD, Avilés-Santa LM, Wassertheil-Smoller S, et al. Design and implementation of the Hispanic Community Health Study/Study of Latinos. *Ann Epidemiol*. 2010;20:629-641. doi:[10.1016/J.ANNEPIDEM.2010.03.015](https://doi.org/10.1016/J.ANNEPIDEM.2010.03.015)
26. Fletcher E, Carmichael O, Decarli C. MRI non-uniformity correction through interleaved bias estimation and B-spline deformation with a template. *Annu Int Conf IEEE Eng Med Biol Soc IEEE Eng Med Biol Soc Annu Int Conf*. 2012;2012:106-109. doi:[10.1109/EMBC.2012.6345882](https://doi.org/10.1109/EMBC.2012.6345882)
27. DeCarli C, Miller BL, Swan GE, et al. Predictors of brain morphology for the men of the NHLBI twin study. *Stroke*. 1999;30:529-536. doi:[10.1161/01.STR.30.3.529](https://doi.org/10.1161/01.STR.30.3.529)
28. Breton J, Stickel AM, Tarraf W, et al. Normative data for the Brief Spanish-English Verbal Learning Test for representative and diverse Hispanics/Latinos: results from the Hispanic Community Health Study/Study of Latinos (HCHS/SOL). *Alzheimer's Dement Diagnosis, Assess Dis Monit*. 2021;13(1):e12260. doi:[10.1002/DAD2.12260](https://doi.org/10.1002/DAD2.12260)
29. Muthén L, Muthén B. *Mplus user's guide*. 1998. Seventh edition.
30. Kline RB. *Principles and practice of structural equation modeling*. Guilford Press; 2010. doi:[10.1038/156278a0](https://doi.org/10.1038/156278a0)
31. Sapkota S, Erickson K, Harvey D, et al. Plasma biomarkers predict cognitive trajectories in an ethnoracially and clinically diverse cohort: Mediation with hippocampal volume. *Alzheimer's & Dementia: Diagnosis, Assessment & Disease Monitoring*. 2022;14(1):e12349.
32. Stern Y, Barnes CA, Grady C, Jones RN, Raz N. Brain reserve, cognitive reserve, compensation, and maintenance: operationalization, validity, and mechanisms of cognitive resilience. *Neurobiol Aging*. 2019;83:124-129. doi:[10.1016/j.neurobiolaging.2019.03.022](https://doi.org/10.1016/j.neurobiolaging.2019.03.022)
33. Xie L, Das SR, Wisse LEM, et al. Baseline structural MRI and plasma biomarkers predict longitudinal structural atrophy and cognitive decline in early Alzheimer's disease. *Alzheimer's. Res Ther*. 2023;15:1-14. doi:[10.1186/S13195-023-01210-Z/FIGURES/3](https://doi.org/10.1186/S13195-023-01210-Z/FIGURES/3)
34. Schmidt R, Ropele S, Enzinger C, et al. White matter lesion progression, brain atrophy, and cognitive decline: the Austrian stroke prevention study. *Ann Neurol*. 2005;58:610-616. doi:[10.1002/ANA.20630](https://doi.org/10.1002/ANA.20630)
35. Salthouse TA. Trajectories of normal cognitive aging n.d. doi:[10.1037/pag0000288](https://doi.org/10.1037/pag0000288)
36. National Academies of Sciences, Engineering, and Medicine; Health and Medicine Division; Board on Population Health and Public Health Practice; Committee on Community-Based Solutions to Promote Health Equity in the United States. *Communities in Action: Pathways to Health Equity*. Baciu A, Negussie Y, Geller A, Weinstein JN, eds. National Academies of Sciences, Engineering, and Medicine; Health and Medicine Division; Board on Population Health and Public Health Practice; Committee on Community-Based Solutions to Promote Health Equity in the United States. *Communities in Action: Pathways to Health Equity*. National Academies Press (US); 2017:1-558. doi:[10.17226/24624](https://doi.org/10.17226/24624). editors.
37. Cabral J, Cuevas AG. Health inequities among Latinos/Hispanics: documentation status as a determinant of health. *J Racial Ethn Heal Disparities*. 2020;7:874. doi:[10.1007/S40615-020-00710-0](https://doi.org/10.1007/S40615-020-00710-0)
38. González HM, Tarraf W, Fornage M, et al. A research framework for cognitive aging and Alzheimer's disease among diverse US Latinos: design and implementation of the Hispanic Community Health Study/Study of Latinos-Investigation of Neurocognitive Aging (SOL-INCA). *Alzheimers Dement*. 2019;15:1624-1632. doi:[10.1016/J.JALZ.2019.08.192](https://doi.org/10.1016/J.JALZ.2019.08.192)

#### SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article.

**How to cite this article:** Sapkota S, Maillard P, Stickel AM, et al. Neurocognitive profiles are associated with subsequent brain integrity in a sample of Hispanics/Latinos: Findings from the SOL-INCA-MRI study (HCHS/SOL). *Alzheimer's Dement*. 2024;16:e12622. <https://doi.org/10.1002/dad2.12622>