# Longitudinal Cerebral Blood Flow Changes in Normal Aging and the Alzheimer's Disease Continuum Identified by Arterial Spin Labeling MRI

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- Accepted 7 April 2021
   Pre-press 7 May 2021

## 11 Abstract.

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- Background: Cross-sectional studies have shown lower cerebral blood flow (CBF) in Alzheimer's disease (AD), but longitudinal CBF changes in AD are still unknown.
- Objective: To reveal the longitudinal CBF changes in normal control (NC) and the AD continuum using arterial spin labeling
- <sup>15</sup> perfusion magnetic resonance imaging (ASL MRI).
- <sup>16</sup> Methods: CBF was calculated from two longitudinal ASL scans acquired  $2.22 \pm 1.43$  years apart from 140 subjects from the
- Alzheimer's Disease Neuroimaging Initiative (ADNI). At the baseline scan, the cohort contained 41 NC, 74 mild cognitive
- impairment patients (MCI), and 25 AD patients. 21 NC converted into MCI and 17 MCI converted into AD at the follow-up.
- Longitudinal CBF changes were assessed using paired-*t* test for non-converters and converters separately at each voxel and in the meta-ROI. Age and sex were used as covariates.
- Results: CBF reductions were observed in all subjects. Stable NC (n = 20) showed CBF reduction in the hippocampus and
- precuneus. Stable MCI patients (n = 57) showed spatially more extended CBF reduction patterns in hippocampus, middle
- 23 temporal lobe, ventral striatum, prefrontal cortex, and cerebellum. NC-MCI converters showed CBF reduction in hippocampus
- and cerebellum and CBF increase in caudate. MCI-AD converters showed CBF reduction in hippocampus and prefrontal
- <sup>25</sup> cortex. CBF changes were not related with longitudinal neurocognitive changes.
- **Conclusion:** Normal aging and AD continuum showed common longitudinal CBF reductions in hippocampus independent
- <sup>29</sup> of disease and its conversion. Disease conversion independent longitudinal CBF reductions escalated in MCI subjects.

Keywords: Aging, Alzheimer's disease, arterial spin labeling, cerebral blood flow, longitudinal analysis

<sup>1</sup>Data used in preparation of this article were obtained from the Alzheimer's Disease Neuroimaging Initiative (ADNI) database (http://adni.loni.usc.edu). As such, the investigators within the ADNI contributed to the design and implementation of ADNI and/or provided data but did not participate in analysis or writing of this report. A complete listing of ADNI investigators can be found at: http://adni.loni.usc.edu/wp-content/uploads/how\_to\_apply/ ADNI\_Acknowledgement\_List.pdf

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# INTRODUCTION

Alzheimer's disease (AD) is a neurodegenerative disease characterized by amyloid deposition and cognitive impairment [1, 2]. Cerebral blood flow (CBF) is a fundamental physiological measure, and reduced CBF (hypoperfusion) has been observed repeatedly in AD using neuroimaging [3, 4], suggesting ADrelated neurovascular and neuronal dysfunctions.

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Hypoperfusion may even represent a major cause of 37 AD pathology and subsequent cognitive decline [5]. 38 Arterial spin labeling (ASL) perfusion magnetic reso-39 nance imaging (MRI) is a non-invasive technique for 40 quantifying CBF without using exogenous tracers [6, 41 7]. It is relatively low-cost and can be repeated many 42 times, therefore its use is highly appealing in longitu-43 dinal AD studies. ASL hypoperfusion patterns in mild 44 cognitive impairment (MCI) and AD subjects have 45 been reported in [8-12]. While encouraging, most 46 of these findings were based on cross-sectional data, 47 and longitudinal CBF changes in the AD population 48 have not been under-studied. Based on ASL CBF data 49 from a small sample size, Wang reported AD conver-50 sion and reversion-related CBF decrease and increase 51 [13]. Also based on a small sample size, Staffaroni et 52 al. [14] reported that individuals with MCI who later 53 converted to AD had lower baseline perfusion in the 54 precuneus, middle cingulum, inferior parietal, and 55 middle frontal cortices than non-converters. Exam-56 ination of changes in longitudinal CBF and their 57 association to disease progression is still lacking in 58 the literature. The purpose of this study is to exam-59 ine the longitudinal CBF changes in the course of 60 disease progression using the large samples available 61 from Alzheimer's Disease Neuroimaging Initiative 62 (ADNI) (http://adni.loni.usc.edu). To the best of our 63 knowledge, this study represents the first of its type 64 published in the literature. 65

#### 66 MATERIALS AND METHODS

#### 67 Participants

Data used were obtained from the ADNI database. 68 ADNI was launched in 2003 by the National Insti-69 tute on Aging, the National Institute of Biomedical 70 Imaging and Bioengineering, the Food and Drug 71 Administration (FDA), private pharmaceutical com-72 panies and non-profit organizations, as a \$60 million, 73 5-year public private partnership. The primary goal of 74 ADNI has been to test whether serial MRI, positron 75 emission tomography (PET), other biological mark-76 ers, as well as clinical and neuropsychological 77 assessments can be combined to measure the pro-78 gression of MCI to early AD. The ADNI 2 (phase 79 2) includes a sub-study of ASL MRI for participants 80 scanned on the Siemens 3T MRI platform ( $\sim$ 1/3 of 81 enrolled subjects). This multi-site study allows for 82 the assessment of ASL MRI sensitivity to disease 83 severity across the spectrum from cognitively nor-84 mal adults, early and late mild cognitive impairment 85

Table 1
Demographic characteristics of study subjects

	NC	MCI	AD
Number of subjects	41	74	25
Age (y)	$72.9\pm6.9$	$70.5\pm7.0$	$72\pm 6.38$
Age range (y)	60 - 85	56 - 85	61 - 82
Female:Male	25:16	43:31**	15:10**
Years of education (SD)	$16.4\pm2.3$	$16.4 \pm 2.8$	$16.4\pm3.1$
mean GM CBF (ml /100 g/min)	$53.35 \pm 17.36$	$52.64 \pm 15.37$	$45.13 \pm 13.30$
MMSE	$27.10\pm7.76$	$25.85 \pm 7.95$	$23.56\pm5.77$

\*\*means significantly different from controls.

(EMCI, LMCI), and mild AD. For up-to-date information, see http://www.adni-info.org. Subjects recruited in ADNI GO and ADNI II with MPRAGE and ASL-MRI images were included and the cohort included in this study contains 41 normal controls (NC); age:  $72.9 \pm 6.9$  years (mean  $\pm$  standard deviation), 74 MCI patients, age:  $70.5 \pm 7.0$  years, and 25 AD patients, age:  $72.0 \pm 6.38$  years. More detail of the demographic information can be found in Table 1.

# Image acquisition

Both high-resolution structural MRI data and ASL-MRI data were downloaded. The structural images were acquired using a 3D MPRAGE T1-weighted sequence with the following parameters: TR/TE/ TI = 2300/2.98/900 ms, 176 sagittal slices, within plane FOV =  $256 \times 240 \text{ mm}^2$ , voxel size =  $1.1 \times$  $1.1 \times 1.2 \text{ mm}^3$ , flip angle = 9°, bandwidth = 240 Hz/ pix. ASL data were acquired using the Siemens product 2D PICORE sequence, which is a pulsed ASL sequence using the Q2TIPs technique for defining the spin bolus [15]. The acquisition parameters were TR/TE = 3400/12 ms, TI1/TI2 = 700/1900 ms, FOV = 256 mm, 24 sequential 4 mm thick slices with a 25% gap between the adjacent slices, partial Fourier factor = 6/8, bandwidth = 2368 Hz/pix, and imaging matrix =  $64 \times 64$ .

## ASL data processing

Similar to our previous study [10], a SPM12 113 (http://www.fil.ion.ucl.ac.uk/spm) based toolbox, 114 ASLtbx [16, 17] was used for preprocessing all 115 MR images. The steps for processing ASL images 116 include motion correction [17], temporal denois-117 ing, spatial smoothing, CBF quantification, outlier 118 cleaning [18], partial volume correction, and spa-119 tial registration to the Montreal Neurology Institute 120

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(MNI) standard brain space. Temporal filtering was 121 achieved by using a high-pass Butterworth filter 122 (cutoff frequency = 0.01Hz) and temporal nuisance 123 cleaning. Temporal nuisances including head motion 124 time courses (3 translations and 3 rotations), and the 125 cerebrospinal fluid (CSF) mean signal time course 126 were regressed out from ASL image series at each 127 voxel. CSF mask was defined during the T1-weighted 128 structural image segmentation. Spatial smoothing 129 was performed with an isotropic Gaussian kernel 130 with a full-width-at-half-maximum of 6 mm. The pre-131 processed ASL label and control image pairs were 132 then successively subtracted, and the control-label 133 difference was converted into a quantitative CBF 134 value using the one-compartment model included in 135 ASLtbx. The detailed model parameters can be found 136 in other references [19]. Quality assurance measures 137 consisted of three different methods: 1) using the 138 method proposed in [20], 2) subjects with CBF map-139 ping out of the range of mean  $CBF \pm 3^*$ std were 140 rejected. 20 AD patients' CBF maps were rejected; 141 and 3) three manual checks of the registration CBF 142 images to the MNI space. The mean ASL image was 143 registered to the high resolution structural T1 images 144 using SPM 12. The corresponding registration trans-145 form was used to register the CBF maps into the 146 structural MRI 147

Structural images were segmented into grey mat-148 ter (GM), white matter (WM), and CSF using the 149 segmentation tool provided in SPM12. These images 150 were projected into the native ASL image space based 151 on the registration correspondence between the mean 152 ASL control image and the structural image; and 153 they were subsequently used for extracting the CBF 154 signals for temporal denoising and partial volume 155 correction. The Diffeomorphic Anatomical Registra-156 tion Through Exponential Lie Algebra (DARTEL) 157 routine [19] implemented in SPM12 was used to gen-158 erate a local template for all subjects based on their 159 segmented GM and WM probability maps. The local 160 template was registered into the MNI standard space 161 using a linear affine transformation. With these two 162 transformations, each individual subject's brain was 163 mapped into the MNI space. The slice-wise adap-164 tive outlier cleaning algorithm [17] was applied to 165 the resulting CBF time series. Partial volume effect 166 (PVE) correction was performed at each voxel in 167 the GM using a previously described approach. The 168 PVE corrected CBF map was then registered into 169 the structural image space using the same regis-170 tration transformation from the mean ASL control 171 image to the structural image described above. The 172

meta-region-of-interest (meta-ROI) identified by Landau et al. [21] was used to extract mean CBF in the temporal parietal regions which have been shown to be sensitive to AD-related CBF changes [10, 22].

#### Statistical analysis

Table 1 shows the demographic information, whereby the group differences were determined by  $\chi^2$  for sex and two sample *t*-tests for continuous variables. The values are shown in the form of mean ± SD. Only sex was significantly different between the patients and NC. Additionally, Pearson correlation was computed between the change of meta-ROI and the change of Mini-Mental State Examination (MMSE) (This score was selected based on the closest in date to the date of acquisition for the ASL-MRI images.)

Subjects were classified into two categories based on their disease diagnosis results at each time scan timepoint using the clinical assessment data obtained at the date close to the image data acquisition date: 1) non-converters: subjects who did not have a change in diagnosis across all sessions (i.e., NC to NC, MCI to MCI, AD to AD), 2) converters: subjects whose diagnosis progressed beyond their baseline diagnosis (i.e., NC to MCI, or MCI to AD). Since only 5 AD subjects remained after ASL CBF image quality check, we did not run statistical analysis for the AD to AD subgroup. Paired-t test as implemented in SPM12 was used to assess the longitudinal CBF difference at the two scan dates at each voxel and for each subgroup separately. Sex, age, and education were included as covariates. A voxelwise statistical significance threshold was set to p < 0.001. The Monte Carlo simulation-based cluster size estimation was used for correcting the multiple comparisons [23]. For visualization, BSPVIEW [24] was used.

Mean meta-ROI CBF was extracted and compared across time for each group of subjects. Neurocognitive decline was assessed by MMSE, working memory (the LIMMTOTAL (LIMM) and LDELTO-TAL (LDEL) score), and daily function measure (the Functional Assessment Questionnaire (FAQ)). Longitudinal neurocognitive decline was examined with paired *t*-test for each group separately. Correlations between the longitudinal meta-ROI CBF change and the longitudinal neurocognitive score changes were calculated using Pearson correlation analysis. Sex and time difference between the two assessments was included as nuisance. Because hippocampus is pivotal to memory and has been frequently implicated in AD, we repeated the above analyses for the bilateral hippocampus mean CBF. The hippocampus was
defined by the Wakeforest PickAtlas [25] and covers the entire hippocampus while the meta-ROI only
contains a small sphere in the hippocampus.

# 228 RESULTS

## 229 Longitudinal CBF changes in non-converters

Figure 1 shows the voxelwise longitudinal CBF 230 difference for both stable NC and stable MCI patients. 231 20 stable NC subjects had two ASL scans within 232  $2.45 \pm 1.50$  years. Figure 1A shows the significant 233 CBF changes in the stable NC. The threshold was 234 t > 3.57 at a p < 0.001 and a cluster size > 57. CBF 235 reduction was found in the right and left hippocampus 236 and left fusiform gyrus. Furthermore, the meta-ROI 237 CBF computed for this group was 52.4 ml/100 g/min 238 and 51.86 ml ml/100 g/min in the first and last ses-230 sions, respectively. 240

Time difference between the two ASL scans 241 for the 57 stable MCI patients was  $2.18 \pm 1.43$ 242 years. Figure 1B shows their significant longitudinal 243 CBF changes. The voxel-wise statistical significance 244 threshold was t > 3.24 at a p < 0.001. The cluster size 245 threshold was 57. Significant CBF reduction was 246 found in left and right hippocampus, left and right 247 cerebellum, basal ganglia, and left fusiform gyrus. 248 The meta-ROI CBF for this group had a mean of 249 53.35 ml ml/100 g/min and 51.20 ml/100 g/min in the 250 first and last sessions, respectively. 251

#### 252 Longitudinal CBF changes in converters

Figure 2 shows the voxelwise longitudinal CBF 253 difference for the converters: NC to MCI and MCI 254 to AD. 21 NC to MCI converters had two ASL 255 scans within  $3.00 \pm 1.18$  years. Figure 2A shows the 256 significant longitudinal CBF changes in the NC to 257 MCI converters at the statistical significance level 258 of t > 3.55 at a p < 0.001 and a cluster size > 57. A 259 reduction of CBF was found in the left and right hip-260 pocampus, right cerebellum, and an increase of CBF 261 was found in the right putamen and right caudate 262 nucleus. The meta-ROI CBF for this group showed a 263 mean of 56.84 ml/100 g/min and 54.80 ml/100 g/min 264 in the first and last sessions, respectively. No signifi-265 cant difference was observed (p = 0.42). 266

17 MCI to AD converters had two ASL MRI scans within  $1.71 \pm 1.26$  years. Figure 2B shows the longitudinal CBF changes defined by a statistical threshold

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of t > 3.6861 at a p < 0.001 and a cluster size > 57. Longitudinal CBF reduction was found in the right hippocampus and right superior orbital gyrus.

Table 2 lists the mean CBF of the meta-ROI for each subgroup at both baseline and the follow-up time. Table 3 lists the mean CBF of bilateral hippocampus for each subgroup at both baseline and the follow-up. Hippocampus ROI was defined by the PickAtlas. Longitudinal CBF reduction in the stable MCI patients was statistically significant in both meta-ROI and the hippocampus ROI, resulted in a significant longitudinal CBF reduction in both ROIs in the entire group.

Stable NC (NC-NC) showed significant longitudinal memory decline as measured by LIMM (p = 0.04) and LDEL (p = 0.003). Stable MCI patients showed significant memory decline (LIMM, p = 0.02; LDEL, p = 0.0002) and significant daily function impairment as measured by FAQ (p = 0.0005). NC-MCI converters showed significant longitudinal memory decline (LIMM, p = 0.05). MCI-AD converters showed significant memory decline (LDEL, p = 1.4e-6) and FAQ decline (p = 0.001). Longitudinal CBF changes were not related to longitudinal neuro-cognitive decline in any group (p > 0.1).

# DISCUSSION

We examined longitudinal CBF changes in normal aging, and patients in the AD continuum. In subjects without disease progression (non-converters), statistically significant longitudinal CBF reduction was observed in the hippocampus and cerebellum in both stable NC and MCI subjects. In subjects with disease status change at the second timepoint (converters), CBF reduction was found in the left and right hippocampus and right cerebellum in NC subjects who converted to MCI. MCI to AD converters showed CBF reduction in the right hippocampus and in the right superior orbital gyrus. No significant longitudinal changes were observed in the mean GM CBF and the meta-ROI mean CBF in all populations. Change of mean GM CBF or meta-ROI CBF was not significantly related to the change of neurocognitive changes as measured by MMSE, working memory indices, and FAQ.

Cross-sectional studies [26] have suggested longitudinal CBF reductions occur in aging and AD. Our data provide direct evidence of the longitudinal CBF changes in hippocampus in both healthy elderly and AD patients with or without disease progression.

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Fig. 1. Voxel-wise statistical analysis results of the within-subject CBF changes in patients with no change of disease status at both assessed time points. CBF changes were marked with the red clusters. Panel A is the longitudinal CBF reductions in the 20 non-converter NC subjects; significant CBF reduction was found in the left and right hippocampus and left fusiform gyrus. Panel B shows the longitudinal CBF reductions in the 57 non-converter MCI patients; significant reduction of CBF was found on left and right hippocampus, left and right cerebellum, basal ganglia, and left fusiform gyrus. The number underneath each image slice indicate the slice location in the MNI standard brain space.



Fig. 2. Voxel-wise statistical analysis results for the converter groups. Panel A shows the CBF change patterns in the 21 NC to MCI converters; significant reduction of the CBF was found on the left and right hippocampus, right cerebellum, and an increase in CBF in the right putamen and right caudate nucleus. Panel B shows the CBF change patterns for 17 MCI to AD converters; significant CBF reduction was found in the right hippocampus and right superior orbital gyrus. The number underneath each image slice indicate the slice location in the MNI standard brain space.

Table 2	
Meta-ROI CBF in the baseline and the second time poi	nt

Group	Ν	CBF at baseline	CBF at second time point	р
NC to NC	20	53.35 (17.58)	51.23 (15.14)	0.69
MCI to MCI	57	54.72 (16.55)	50.72 (15.99)	0.19
NC to MCI	21	57.97 (17.60)	54.00 (13.68)	0.42
MCI to AD	17	45.70 (7.23)	43.50 (13.19)	0.55
All Subjects	115	53.74 (16.16)	50.34 (15.19)	0.10

Values were shown in the format of mean and standard deviation in the parenthesis. CBF is in the unit of ml/100 g/min. N represents the number of subjects in each group after the remove of outliers.

Table 3
Hippocampal CBF in the baseline and the second time point

Group	Ν	CBF at baseline	CBF at second	р
		(ml/100 g/min)	time point	
			(ml/100 g/min)	
NC to NC	20	41.83 (10.54)	40.19 (12.38)	0.34
MCI to MCI	57	41.63 (9.04)	37.11 (9.84)	0.0002*
NC to MCI	21	44.59 (12.15)	38.51 (8.02)	0.06
MCI to AD	17	39.09 (7.14)	37.54 (10.19)	0.38
All Subjects	115	41.83 (9.71)	37.97 (10.02)	2.48x10 <sup>-5**</sup>

\*indicates p < 0.05. Values were shown in the format of mean and standard deviation in the parenthesis. CBF is in the unit of ml/100 g/min. N represents the number of subjects in each group after the remove of outliers.

The hippocampus is a pivotal region for both aging 319 and AD as it is the major region involved in episodic 320 memory. Hippocampal CBF reduction overserved in 321 both non-converters and converters suggests a disease independent hippocampal function decline during 323

the progressive aging process. Cross-sectional stud-324 ies have suggested larger longitudinal hippocampal 325 CBF reductions in the AD continuum than in normal 326 aging [4, 10], in line with the hallmark fast memory 327 decline in AD. One reason for missing the disease 328 related longitudinal CBF could be the limited sam-329 ple size in the converter groups. In the current study, 330 the stable MCI group had the largest sample size and 331 their longitudinal CBF reduction patterns appeared 332 to be the largest among all four groups. Another rea-333 son could be the symptom progression heterogeneity. 334 Even for the "stabilized" NC and MCI patients, we 335 still found significant memory decline and daily func-336 tion decline at the second scan time. In other words, 337 some of the nonconverter NC and MCI might be 338 better grouped into converters or early converters as 339 also suggested by the AD subtyping concept [27]. 340 In addition to the hippocampus, aging-related CBF 341 reduction (the time effect) was demonstrated in both 342 normal elderly and MCI in other regions, includ-343 ing the medial prefrontal cortex, cingulate cortex, 344 and ventral striatum. The medial prefrontal cortex 345 and cingulate are involved in memory and decision 346 making [28]. Reduction of CBF, seen over time, 347 in the medial prefrontal cortex may be related to 348 aging-related memory and decision making decay. 349 Hypoperfusion in cingulate was consistent with an 350 early SPECT imaging study [29], where cingulate 351 hypoperfusion was found to be predictive of AD. 352 Cingulate is involved in self-referencing [30], which 353 is related to memory. Hypoperfusion in cingulate 354

cortex in aging and MCI may indicate impairments 355 of self-referencing function. The "stable" MCI group 356 showed longitudinal hypoperfusion in ventral stria-357 tum, indicating an impairment of reward information 358 processing and motor function in MCI since ventral 359 striatum is pivotal to those brain functions and has 360 been reported to be affected in aging and AD [31, 361 32. 331. 362

Hypoperfusion was observed in the lateral stria-363 tum in the putamen and temporal cortex after patients 364 converted to MCI from normal aging. However, this 365 pattern was diminished in the MCI to AD conversion 366 group. While we do not know the exact reason for 367 this discrepancy, one reason may be the small num-368 ber of patients included in the MCI to AD conversion 369 group. Disease severity-related CBF reduction in the 370 parietal cortex, precuneus, and temporal cortex was 371 reported in a previous ADNI ASL study [10]. In our 372 current study, we did not find a hypoperfusion pattern 373 in the parietal cortex and precuneus. Future studies 374 are needed to investigate this discrepancy. 375

No significant correlation was found between the 376 longitudinal CBF change and the longitudinal neu-377 rocognitive decline in either the nonconverters or the 378 converters. While this result may suggest a non-linear 379 relationship between the longitudinal CBF change 380 and the longitudinal neurocognitive changes, it may 381 also be caused by the large population heterogeneity 382 as we mentioned above and the relatively low signal-383 to-noise-ratio of the PASL sequence used in ADNI II 384 ASL data acquisitions. 385

Hypoperfusion patterns in MCI and AD detected 386 by ASL CBF have been shown to be comparable to 387 hypo-metabolism patterns detected by PET-FDG [22, 388 34, 35]. Cerebral metabolism rate of glucose (CMR-389 glu) measured by PET has been long postulated to 390 progressively decline as the disease progresses [36]. 391 A future important study could be assessing the lon-392 gitudinal CMRglu decline in the same groups as 393 included in this paper or combining ASL CBF and 394 PET-FDG CMRglu for better delineating the longi-395 tudinal brain versus behavioral relationship. 396

Several limitations have been discussed above, 397 including the relatively small sample size in three 398 of the four groups, the relatively low signal-to-noise-399 ratio of the ADNI PASL data, and the neurocognitive 400 progression inheterogeneity in each group. Larger 401 sample size may be available when more ADNI data 402 will be released. High quality ASL data are available 403 from ADNI phase III study but there were few sub-404 jects who had converted from NC to MCI or from 405 MCI to AD by the time we performed this study. 406

Group subtyping is possible when larger cohort is available. This study was also limited in terms of lack of AD pathology analysis. We did not include longitudinal AD pathological data as few subjects had the data at both time points and AD pathology may not be sensitive to detect longitudinal neurocognitive decline [37, 38, 39, 40]. Another limitation is the unclear caffeine intake information at both the baseline scan and the follow-up scan. The ADNI patient enrollment excluded the use of antihypertensive agents and benzodiazepines but it is unclear for whether caffeine intake was controlled at each imaging date. Previous studies have shown that caffeine can cause transient acute CBF reductions [41, 42]. It is possible that part of the longitudinal CBF reduction might be contributed by caffeine intake difference between the two timepoints.

## CONCLUSION

Using ADNI longitudinal ASL data, we found consistent longitudinal CBF reduction in the hippocampus in normal aging and in the progression of AD. Also, striatal CBF changes were found in the progression of NC to MCI, suggesting this is a sign of early disease progression and may be used as an additional biomarker for early disease detection.

# ACKNOWLEDGMENTS

This work was supported by NIH/NIA Grant R01AG060054. Data collection and sharing for this project was funded by the Alzheimer's Disease Neuroimaging Initiative (ADNI) (National Institutes of Health Grant U01 AG024904) and DOD ADNI (Department of Defense award number W81XWH-12-2-0012).

ADNI is funded by the National Institute on Aging, the National Institute of Biomedical Imaging and Bioengineering, and through generous contributions from the following: AbbVie, Alzheimer's Association; Alzheimer's Drug Discovery Foundation; Araclon Biotech; BioClinica, Inc.; Biogen; Bristol-Myers Squibb Company; CereSpir, Inc.; Cogstate; Eisai Inc.; Elan Pharmaceuticals, Inc.; Eli Lilly and Company; EuroImmun; F. Hoffmann-La Roche Ltd and its affiliated company Genentech, Inc.; Fujirebio; GE Healthcare; IXICO Ltd.; Janssen Alzheimer Immunotherapy Research & Development, LLC.; Johnson & Johnson Pharmaceutical Research & Development LLC.; Lumosity; Lundbeck; Merck

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& Co., Inc.; Meso Scale Diagnostics, LLC.; Neu-454 roRx Research; Neurotrack Technologies; Novartis 455 Pharmaceuticals Corporation; Pfizer Inc.; Piramal 456 Imaging; Servier; Takeda Pharmaceutical Company; 457 and Transition Therapeutics. The Canadian Institutes 458 of Health Research is providing funds to support 459 ADNI clinical sites in Canada. Private sector con-460 tributions are facilitated by the Foundation for the 461 National Institutes of Health (http://www.fnih.org). 462 The grantee organization is the Northern Califor-463 nia Institute for Research and Education, and the 464 study is coordinated by the Alzheimer's Therapeu-465 tic Research Institute at the University of Southern 466 California. ADNI data are disseminated by the Labo-467 ratory for Neuroimaging at the University of Southern 468 California. 469

470 Authors' disclosures available online (https:// 471 www.j-alz.com/manuscript-disclosures/21-0116r1).

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