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# Modulating heart rate oscillation affects plasma amyloid beta and tau levels in younger and older adults

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Slow paced breathing via heart rate variability (HRV) biofeedback stimulates vagus-nerve pathways that counter noradrenergic stress and arousal pathways that can influence production and clearance of Alzheimer's disease (AD)-related proteins. Thus, we examined whether HRV biofeedback intervention affects plasma A $\beta$ 40, A $\beta$ 42, total tau (tTau), and phosphorylated tau-181 (pTau-181) levels. We randomized healthy adults (N = 108) to use slow-paced breathing with HRV biofeedback to increase heart rate oscillations (Osc+) or to use personalized strategies with HRV biofeedback to decrease heart rate oscillations (Osc-). They practiced 20–40 min daily. Four weeks of practicing the Osc+ and Osc- conditions produced large effect size differences in change in plasma A $\beta$ 40 and A $\beta$ 42 levels. The Osc+ condition decreased plasma A $\beta$  while the Osc- condition increased A $\beta$ . Decreases in A $\beta$  were associated with decreases in gene transcription indicators of  $\beta$ -adrenergic signaling, linking effects to the noradrenergic system. There were also opposing effects of the Osc+ and Osc- interventions on tTau for younger adults and pTau-181 for older adults. These results provide novel data supporting a causal role of autonomic activity in modulating plasma AD-related biomarkers.

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#### Abbreviations

Aβ Amyloid-beta AD Alzheimer's disease ANOVA Analysis of variance

CESD Center for Epidemiological Studies-Depression CREB CAMP response element-binding protein

CSF Cerebrospinal fluid HRV Heart rate variability

Osc- The current control condition for decreasing heart rate oscillations
Osc+ The current intervention condition for increasing heart rate oscillations

PET Positron emission tomography

POMS Profile of Mood State pTau Phosphorylated tau RNA Ribonucleic acid

STAI State Trait Anxiety Inventory

TELIS Transcription Element Listening System TFBMs Transcription-factor binding motifs

TPM Transcript counts per million total transcripts

tTau Total tau

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Alzheimer's disease (AD) incidence rates increase exponentially with age<sup>1</sup>. Why does aging increase AD risk so much? One potentially critical factor has been given little attention. During aging, the balance between the sympathetic and parasympathetic branches of the autonomic nervous system shifts<sup>2,3</sup>. As people get older, parasympathetic activity declines, as indicated by decreases in heart rate variability (HRV)<sup>2</sup>. At the same time, sympathetic (or noradrenergic) activity increases, as indicated by increases in sympathetic nerve activity and circulating noradrenaline levels<sup>4</sup>. Age-related increases in noradrenergic activity and decreases in parasympathetic activity are associated with AD-related conditions including sleep disorders, diabetes, and heart disease<sup>5</sup>.

Age-related increases in noradrenergic activity along with decreases in parasympathetic activity might influence levels of amyloid-β (Aβ) peptides in the brain and body. Generally, increasing neuronal or cellular activity stimulates release of  $A\beta^7$ . Rodent AD models indicate that noradrenergic agonists/antagonists affect  $A\beta$  accumulation and amyloid plaque formation<sup>8,9</sup> and suggest that stressful situations tend to stimulate Aβ peptide release into the interstitial fluid<sup>10</sup>. While these findings suggest that countering noradrenergic activity could help decrease Aβ release in the brain, predictions involving tau proteins are not straightforward. Similar to Aβ, neuronal activity increases tau release 11-13 and repeated stress induces tau phosphorylation 14. However, research indicates that anesthetics that lower noradrenergic activity induce tau phosphorylation<sup>15,16</sup>, and dexmedetomidine, an α2 adrenergic receptor agonist that produces a sedative state, also increases tau phosphorylation<sup>17</sup>. In addition, animal studies suggest that arousal states affect brain waste clearance by modulating effectiveness of glymphatic pathways which transport cerebrospinal fluid (CSF) and flush interstitial waste from the brain to veins 18,19. Glymphatic transport was increased when inducing anesthesia with dexmedetomidine, suppressing noradrenaline release<sup>20</sup> and when administering adrenergic antagonists<sup>19</sup>. Furthermore, stimulating the vagus nerve, which provides parasympathetic innervation, increased CSF penetrance in the brain<sup>21</sup>. Similar dynamics may exist in human brains <sup>22,23</sup>. Certainly, sleep affects Aβ levels. One night of sleep disruption increased Aβ concentrations in the CSF<sup>24,25</sup>, and older adults with lower slow-wave activity during sleep had higher Aβ and tau accumulation measured by positron emission tomography (PET) scans<sup>26</sup>. However, the effects of sleep or sleep deprivation may be more related to production than clearance. For instance, measuring Aβ stable isotope labeling kinetics suggest that sleep deprivation increases Aβ production<sup>27</sup>. Together, these studies suggest that enhancing parasympathetic activity either via improving sleep or directly stimulating the vagus nerve has the potential to reduce  $A\beta$  and tau levels.

The vagus nerve can be non-invasively stimulated by breathing around the baroreflex frequency (0.1 Hz or 10 s/breath)<sup>28</sup>. The 10 s-paced breathing can stimulate brain mechanisms that help control blood pressure and heart beats and boost the amplitude of cardiovascular oscillations29. We hypothesized that, by attenuating noradrenergic activity and enhancing parasympathetic activity, the amplified oscillations could reduce  $A\beta$  release and facilitate clearing the aggregation-prone Aβ42 and pTau-181 from the brain to the periphery. To test these possibilities, we added measures of plasma  $A\beta$  and tau to a clinical trial involving daily sessions of HRV biofeedback (ClinicalTrials.gov NCT03458910; primary study outcomes were focused on effects on emotion-related brain networks)<sup>30</sup>. As outcomes that would reflect changes in cellular release of A $\beta$ , we examined plasma A $\beta$ 40 and Aβ42 levels. We also included plasma total tau (tTau) and phosphorylated tau (pTau-181) to measure effects on tau proteins. As outcomes that would reflect changes in clearance from the brain to blood, we examined two plasma ratios: Aβ42 to Aβ40 and pTau-181 to tTau. We selected these as clearance-related outcomes as these ratios each involve one plasma biomarker that is more likely to be brain-derived (Aβ42, pTau-181) and one that relates more to peripheral production or release (Aβ40, tTau). Compared with Aβ40, Aβ42 is relatively more prevalent in the brain than in the periphery<sup>31</sup>. Platelets are the major source of peripheral  $A\beta^{7,32}$  and produce predominantly Aβ40 over Aβ42<sup>7,31</sup>. Plasma Aβ42 is more likely than plasma Aβ40 to reflect brain-derived Aβ, as reflected in the stronger correlation between plasma and CSF A $\beta$ 42 than between plasma and CSF A $\beta$ 40 $^{33,34}$ . Plasma pTau-181 and tTau show a similar brain vs. periphery dichotomy. Once diagnostic groups are controlled for, plasma tTau and CSF tTau do not significantly correlate with each other, and are correlated with different aspects of brain atrophy and cognition<sup>33,35-37</sup>. In contrast, plasma pTau-181 levels correlate with CSF pTau-181 levels<sup>38,39</sup>, suggesting plasma pTau-181 is more likely than plasma tTau to originate in the brain.

To test whether the HRV biofeedback intervention could affect  $A\beta$  and tau dynamics, we conducted assays of plasma samples from 108 healthy adults (54 younger and 54 older adults) who were randomized into one of two groups with opposing goals: reducing or increasing the amplitude of heart rate oscillations (Osc– vs. Osc+ condition). In addition to testing effects across age groups, we conducted follow-up analyses separately for younger and older adults. To our knowledge, no prior studies have compared the effects of any interventions across younger vs. older adults on AD biomarkers. However, analyzing the data separately for the two age groups could provide important insights regarding which effects are general across adulthood and which are specific to one age group. In addition, we ran two exploratory analyses. First, to test whether intervention effects on plasma biomarkers were related to changes in noradrenergic activity, in the younger subgroup of the participants (N = 54), we conducted gene expression analyses of circulating blood cells to assess longer-term tonic levels of noradrenergic activity. We used cAMP-responsive element binding protein (CREB)-regulated gene expression as a slow-moving index of  $\beta$ -adrenergic signaling that reflects adrenergic-related transcription activity<sup>40</sup>. Second, we examined the possible association between change in A $\beta$ 42/40 ratios and negative emotion as studies indicated that plasma A $\beta$ 42/40 ratios are correlated with later-life major depression<sup>41,42</sup>.

#### Results

Baseline characteristics of participants. The male and female ratio was similar across age groups and conditions (Table 1). At baseline, in neither age cohort did the Osc+ and Osc- groups differ significantly in plasma  $A\beta$ , plasma tau, age, body mass index, waist hip ratio, blood pressure, sleep, nor heart rate variability (Table 2). In addition, we compared males to females for the same baseline measures of Table 2 and reported the

	Osc+	Osc-	Total			
Younger ad	lults					
Male	11	7	18			
Female	19	17	36			
Total	30	24	54			
Older adults						
Male	7	8	15			
Female	20	19	39			
Total	27	27	54			

**Table 1.** Age group and sex for Osc+ vs. Osc-.

results in Supplementary Table. There was no significant baseline difference in CREB, bootstrap Z = 1.31, p = 0.19 (available only for 54 younger adults).

We then tested age differences in the six biomarkers (A $\beta$ 42, A $\beta$ 40, tTau, pTau-181, A $\beta$ 42/A $\beta$ 40 ratio and pTau-181/tTau ratio) at baseline. We adjusted p values to control for false discovery rate<sup>43,44</sup>. Older adults compared with younger adults showed higher baseline levels of A $\beta$ 42, t(106) = 2.51, adjusted p = 0.01, A $\beta$ 40, t(106) = 3.33, adjusted p = 0.002, pTau-181, t(76.4) = 4.95, adjusted p = 0.00004, and pTau/tTau ratios, t(71.0) = 5.65, adjusted p = 0.000006, but lower baseline A $\beta$ 42/A $\beta$ 40 ratios, t(85.0) = -3.02, adjusted p = 0.005, and no significant differences in tTau, t(106) = -0.52, adjusted p = 0.33.

**Intervention effects on Aβ42 and Aβ40.** There were significant time-point by condition interactions for Aβ42, F(1, 106) = 16.62, adjusted p = 0.0005,  $\eta_p^2 = 0.14$ , and for Aβ40, F(1, 106) = 14.01, adjusted p = 0.001,  $\eta_p^2 = 0.12$ . Simple main effects showed that Osc+ decreased Aβ42 (p = 0.05) and Aβ40 levels (p = 0.03) from preto post-intervention, while Osc- increased Aβ42 (p < 0.001) and Aβ40 levels (p = 0.003). With conditions collapsed, there were no main time-point effects for either Aβ42 (p = 0.17) or Aβ40 (p = 0.50). There was no interaction for the Aβ42/Aβ40 ratio, F(1, 106) = 0.55, adjusted p = 0.26,  $\eta_p^2 = 0.01$ , with no main time-point effect (p = 0.89). The significant results were maintained after removing outliers (Supplementary Information).

In follow-up tests where we split the data (N = 108) into the younger (N = 54) and older (N = 54) age groups (Fig. 1), the time-point by condition interactions on A $\beta$  levels remained significant for younger adults, F(1, 52) = 12.30, adjusted p = 0.002,  $\eta_p^2 = 0.19$  for A $\beta$ 42 and F(1, 52) = 6.64, adjusted p = 0.01,  $\eta_p^2 = 0.11$  for A $\beta$ 40 as well as for older adults, F(1, 52) = 4.51, adjusted p = 0.04,  $\eta_p^2 = 0.08$  for A $\beta$ 42 and F(1, 52) = 7.37, adjusted p = 0.01,  $\eta_p^2 = 0.12$  for A $\beta$ 40. For the A $\beta$ 42/A $\beta$ 40 ratio, older adults showed a trend towards an interaction, F(1, 52) = 3.35, adjusted p = 0.05,  $\eta_p^2 = 0.06$ , whereas younger adults showed no interaction effect, F(1, 52) = 0.02, adjusted P = 0.45,  $\eta_p^2 < 0.001$ .

**Intervention effects on tTau and pTau-181.** Across all participants, there were no significant time-point by condition interactions for either tTau, F(1, 106) = 2.01, adjusted p = 0.10,  $\eta_p^2 = 0.02$  or pTau-181, F(1, 106) = 3.28, adjusted p = 0.05,  $\eta_p^2 = 0.03$ . However, the pTau/tTau ratio showed a significant interaction, F(1, 106) = 7.41, adjusted p = 0.01,  $\eta_p^2 = 0.07$ . Simple main effects showed that Osc– decreased the pTau/tTau ratio (p = 0.02) from pre- to post-intervention, while Osc+ increased it but not significantly (p = 0.14). With conditions collapsed, there were no main time-point effects (p = 0.49).

The follow-up analyses for younger and older adults (Fig. 1) revealed a significant time-point by condition interaction in tTau for younger adults, F(1,52) = 8.63, adjusted p = 0.007,  $\eta_p^{-2} = 0.14$ , but not for older adults, F(1,52) = 0.69, adjusted p = 0.24,  $\eta_p^{-2} = 0.01$ . For pTau-181, younger adults showed no interaction, F(1,52) = 0.02, adjusted p = 0.45,  $\eta_p^{-2} < 0.001$ , while older adults showed a significant interaction, F(1,52) = 5.55, adjusted p = 0.02,  $\eta_p^{-2} = 0.10$ . For the pTau/tTau ratio, neither younger nor older adults showed significant interactions, F(1,52) = 3.56, adjusted p = 0.05,  $\eta_p^{-2} = 0.06$  for younger adults and F(1,52) = 3.46, adjusted p = 0.05,  $\eta_p^{-2} = 0.06$  for older adults.

Based on our hypothesis that changes in the A $\beta$ 42/A $\beta$ 40 ratio and the pTau/Tau ratio could both be affected by changes in brain clearance, we expected some correlation in change among these two ratio scores. Changes in the pTau/Tau ratio correlated in the positive direction with changes in the A $\beta$ 42/A $\beta$ 40 ratio when controlled for their baseline values across all participants, r(104) = 0.20, adjusted p = 0.04. However, the correlation between ratio scores was not significant independently for younger adults, r(50) = 0.20, adjusted p = 0.10, nor for older adults, r(50) = 0.20, adjusted p = 0.10.

Relationship between changes in plasma A $\beta$  levels and noradrenergic-related gene transcription activity. Among the younger subset tested (N=54), there was a significant time-point by condition interaction in CREB transcription factor activity, bootstrap Z=-3.30, adjusted p=0.002. While Osc+showed no significant changes (Z=-0.45, p=0.65), Osc- increased CREB activity after intervention (Z=2.70, p=0.008). When we examined the correlations between changes in CREB activity and changes in the six biomarkers, we found that individual decreases in plasma A $\beta$ 40 from pre- to post-intervention were associated with decreases in activity of the CREB transcription factor that mediates sympathetic nervous system-induced  $\beta$ -adrenergic signaling (0.75-fold prevalence of CREB response elements in A $\beta$ 40 down-regulated vs. up-regulated genes;

	Osc+		Osc-		Test statistics			
	M	SE	M	SE	t	df	p	
Younger adults	,	•			•			
Age (years)	22.60	0.47	22.70	0.73	-0.12	40.3	0.91	
Plasma Ab42 (pg/ml)	9.76	0.43	9.26	0.47	0.79	52	0.43	
Plasma Ab40 (pg/ml)	166.95	7.58	151.75	4.95	1.68	48.0	0.10	
Plasma Ab42/Ab40 ratio	0.06	0.002	0.06	0.003	-0.62	52	0.54	
Plasma tTau (pg/ml)	2.13	0.14	2.11	0.16	0.12	52	0.90	
Plasma pTau-181 (pg/ml)	1.57	0.12	1.57	0.14	0.02	52	0.98	
Plasma pTau-181/tTau ratio	0.78	0.06	0.77	0.06	0.12	52	0.90	
Body mass index (kg/m²)	23.44	0.70	23.43	0.97	0.003	51	0.997	
Waist hip ratio	0.80	0.01	0.79	0.01	0.88	52	0.38	
Systolic blood pressure (mmHg)	113.58	2.02	110.90	2.09	0.92	52	0.36	
Diastolic blood pressure (mmHg)	69.22	1.45	70.98	1.35	-0.87	52	0.39	
Mean heart rate (beat/min)	71.78	2.06	73.29	1.90	-0.53	52	0.60	
RMSSD (ms)	67.64	5.93	57.16	3.92	1.48	48.3	0.15	
Hours of sleep (h)	6.41	0.17	6.08	0.20	1.26	45	0.21	
Hours of REM sleep (h)	1.43	0.09	1.39	0.11	0.29	45	0.77	
Hours of deep sleep (h)	1.13	0.11	1.16	0.09	-0.22	45	0.82	
Heart rate during deep sleep (beat/min)	59.82	1.15	60.86	1.55	-0.54	45	0.59	
RMSSD during deep sleep (ms)	82.64	6.89	76.1	5.86	0.72	45	0.48	
Cortisol at awakening (µg/dl)	0.29	0.03	0.25	0.04	0.73	49	0.47	
Cortisol awakening response (µg/dl)	0.19	0.05	0.25	0.06	-0.87	47	0.39	
Blood collection time (h)	14.43	0.13	14.30	0.11	0.73	52	0.47	
Older adults	1							
Age (years)	66.19	1.56	65.65	1.14	0.28	52	0.78	
Plasma Ab42 (pg/ml)	10.78	0.58	10.94	0.62	-0.19	52	0.85	
Plasma Ab40 (pg/ml)	198.02	9.15	211.76	23.47	-0.54	52	0.59	
Plasma Ab42/Ab40 ratio	0.05	0.001	0.05	0.002	-0.330	52	0.74	
Plasma tTau (pg/ml)	1.91	0.12	2.17	0.22	-1.04	40.99	0.30	
Plasma pTau-181 (pg/ml)	2.55	0.22	2.64	0.31	-0.25	52	0.81	
Plasma pTau-181/tTau ratio	1.42	0.15	1.39	0.14	0.14	52	0.89	
Body mass index (kg/m²)	26.40	0.99	26.54	1.36	-0.09	52	0.93	
Waist hip ratio	0.87	0.04	0.86	0.02	0.23	52	0.82	
Systolic blood pressure (mmHg)	126.63	3.13	129.04	2.69	-0.58	52	0.56	
Diastolic blood pressure (mmHg)	77.26	1.80	78.44	1.65	-0.49	52	0.63	
Mean heart rate (beat/min)	67.93	1.91	71.88	2.05	-1.38	47	0.17	
RMSSD (ms)	35.71	4.10	32.86	2.90	0.58	47	0.56	
Hours of sleep (h)	6.04	0.22	5.63	0.28	1.14	43	0.26	
Hours of REM sleep (h)	1.52	0.12	1.45	0.10	0.48	43	0.63	
Hours of deep sleep (h)	1.18	0.06	1.12	0.08	0.64	43	0.52	
Heart rate during deep sleep (beat/min)	59.41	1.65	59.05	7.02	-1.85	43	0.07	
RMSSD during deep sleep (ms)	59.05	7.02	44.52	4.61	1.71	43	0.09	
Blood collection time (h)	12.34	0.20	11.82	0.24	1.65	52	0.10	

Table 2. Comparison of baseline characteristics between Osc+ and Osc-.

0.418 log2 ratio units  $\pm$  0.120 standard error; Z = 2.98, adjusted p = 0.002). Decreases in CREB activity were not significantly associated with individual decreases in plasma Aβ42 from pre- to post-intervention (0.87-fold; 0.207  $\pm$  0.114; Z = 1.82, adjusted p = 0.05) and thus showed an inverse association with the Aβ42/Aβ40 ratio (1.32-fold;  $-0.392\pm0.116$ ; Z = -3.39, adjusted p = 0.002). Increases in pTau-181 were associated with decreased CREB activity (1.35-fold;  $-0.427\pm0.120$ ; Z = -3.56, adjusted p = 0.002). Neither tTau (1.18-fold;  $-0.237\pm0.136$ ; Z = -1.75, adjusted p = 0.06), nor pTau-181/tTau ratios (1.06-fold;  $-0.083\pm0.101$ ; Z = -0.81, adjusted p = 0.24) showed a significant association with CREB activity.

**Individual differences in plasma Aβ42/40 and negative affect.** There was no intervention effect for negative affect, F(1, 50) = 0.32, p = 0.58,  $\eta_p^2 = 0.01$  for younger adults and F(1, 45) = 0.73, p = 0.40,  $\eta_p^2 = 0.02$  for older adults. However, pre- to post-intervention increases in Aβ42/40 ratio were associated with decreases

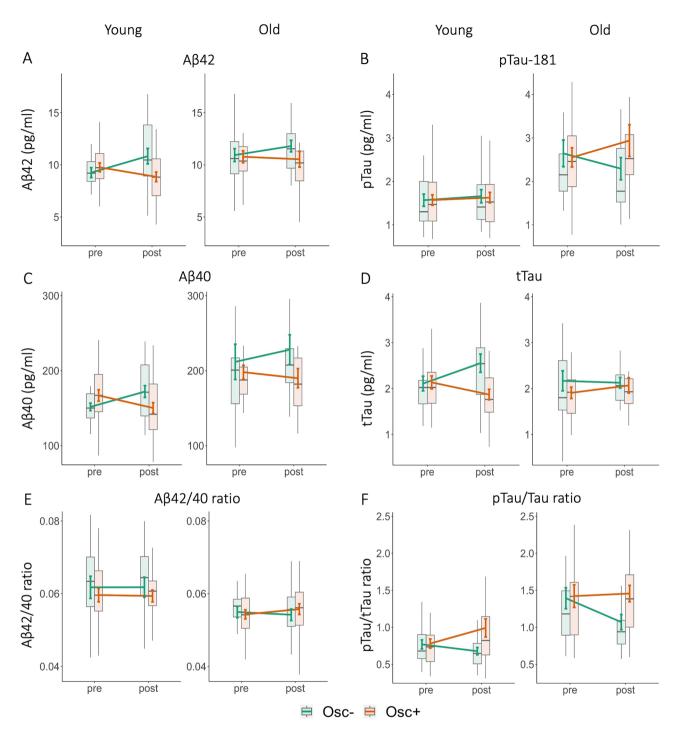


Figure 1. Intervention effect on  $A\beta$  and tau levels. Orange represents Osc+ and green represents Osc-. The upper and lower box boundaries indicate the 75th and 25th percentiles respectively. The gray horizontal bar inside each box shows a median value for the box, and the colored vertical line describes the mean and standard error. The outliers are included for the summary statistics but are not shown in the figure.

in negative affect, r(43) = -0.41, adjusted p = 0.007 for older adults, but not for younger adults, r(48) = -0.02, adjusted p = 0.45.

Intervention effects on other physiological variables. Other than plasma A $\beta$  and tau changes, we did not see significant intervention-induced changes in any other physiological measures including BMI, blood pressure, RMSSD (root mean square of successive differences) at rest, total sleep time, REM (rapid eye movement) sleep, deep sleep, and RMSSD during deep sleep (all p's>0.05, Table 3).

	Osc+		Osc-		Test statistics		
	M	SE	M	SE	T	df	p
Younger adults							
Body mass index (kg/m²)	0.01	0.28	0.27	0.32	-0.610	50	0.55
Waist hip ratio	0.001	0.006	0.005	0.008	-0.40	52	0.69
Systolic blood pressure (mmHg)	-3.02	2.14	0.48	1.73	-1.23	52	0.23
Diastolic blood pressure (mmHg)	0.18	1.56	-1.00	1.18	0.58	52	0.56
Mean heart rate (beat/min)	-4.86	1.76	-9.03	2.40	1.17	52	0.25
RMSSD (ms)	-5.09	5.56	6.95	11.52	-1.00	52	0.32
Hours of sleep (h)	-0.12	0.18	0.12	0.12	-1.13	39.7	0.26
Hours of REM sleep (h)	0.03	0.07	0.06	0.07	-0.27	45	0.79
Hours of deep sleep (h)	0.03	0.10	-0.10	0.05	1.11	34.0	0.27
Heart rate during deep sleep (beat/min)	0.34	0.44	2.28	2.02	0.29	45	0.78
RMSSD during deep sleep (ms)	2.28	2.02	-1.45	2.44	1.18	45	0.24
Cortisol at awakening (μg/dl)	-0.02	0.05	0.02	0.04	-0.47	47	0.64
Cortisol awakening response (µg/dl)	0.03	0.07	-0.06	0.07	0.97	43	0.34
Blood collection time (h)	-0.24	-0.08	0.06	0.10	-1.37	52	0.18
Older adults		,	,				
Body mass index (kg/m²)	0.04	0.12	-0.49	0.41	1.23	47	0.23
Waist hip ratio	0.025	0.044	0.004	0.008	0.50	49	0.62
Systolic blood pressure (mmHg)	-0.23	3.36	-0.96	3.22	0.16	48	0.88
Diastolic blood pressure (mmHg)	-0.60	1.62	-1.21	1.27	0.30	48	0.77
Mean heart rate (beat/min)	1.36	1.08	1.84	1.23	-0.29	47	0.77
RMSSD (ms)	14.84	9.41	6.46	4.27	0.86	47	0.39
Hours of sleep (h)	-0.41	0.21	-0.28	0.22	-0.41	43	0.68
Hours of REM sleep (h)	-0.10	0.07	-0.10	0.08	-0.05	43	0.96
Hours of deep sleep (h)	-0.07	0.05	-0.05	0.05	-0.30	43	0.77
Heart rate during deep sleep (beat/min)	-0.84	0.53	-0.98	0.56	0.18	43	0.86
RMSSD during deep sleep (ms)	-1.33	2.43	0.04	2.01	-0.43	43	0.67
Blood collection time (h)	-0.04	0.11	-0.11	0.09	0.55	52	0.58

Table 3. Comparison of pre- and post-intervention changes (post-pre) between Osc+ and Osc-.

#### Discussion

The current study investigated whether modulating heart rate oscillations via HRV biofeedback would affect plasma A $\beta$  and tau levels. The study showed that daily practice of inducing high-amplitude heart rate oscillations (Osc+) reduced plasma A $\beta$ 42 and A $\beta$ 40 levels, while daily practice of reducing heart rate oscillations (Osc-) raised plasma A $\beta$ 42 and A $\beta$ 40 levels. These interaction effects of time and condition were significant both for younger and older adults. Plasma tTau also showed reductions in the Osc+ condition and increases in the Osc- condition among younger adults but showed no significant effects among older adults. Gene expression analysis in younger adult samples revealed that the magnitude of decreases in plasma A $\beta$ 40 was associated with the downregulation of CREB transcription factor activity. Even though the intervention did not affect pTau-181 levels in younger adults, increases in pTau-181 were associated with decreases in CREB activity, consistent with prior findings that anesthesia, a state of low noradrenergic activity, induced tau phosphorylation 15,16. CREB-regulated gene expression in circulating blood cells provides a slow-moving time-integrated index of  $\beta$ -adrenergic signaling that reflects noradrenergic activity during the intervention period, thus these findings suggest that changes in these plasma biomarkers were associated with changes in noradrenergic activity.

As far as we can tell from the published literature and ClinicalTrials.gov searches, this study provides the first evidence of a behavioral intervention that reduces  $A\beta$  levels (measured with plasma, CSF or PET) compared to a randomized control group. For instance, at least to date, exercise interventions have not decreased  $A\beta$  levels (nor improved the plasma  $A\beta42/A\beta40$  ratio)<sup>45–48</sup>. In healthy adults, higher plasma  $A\beta40$  and  $A\beta42$  levels predict higher risk of an AD diagnosis<sup>49,50</sup> and high plasma  $A\beta40$  levels appear to promote vascular aging<sup>51</sup> and are associated with increased risk of mortality<sup>52</sup>. Slow-paced breathing via HRV biofeedback may be a low-cost and low-risk way to reduce plasma  $A\beta$  levels. Effects of the interventions on plasma  $A\beta$  levels were seen not only among older adults but also among younger adults. Thus, regularly practicing slow paced breathing via HRV biofeedback may help keep plasma  $A\beta$  levels low throughout adulthood.

In addition to testing overall levels of plasma A $\beta$  and tau, we also examined whether the interventions affected plasma A $\beta$ 42/A $\beta$ 40 and pTau-181/tTau ratios. We were interested in these two ratio scores as proxy measures of brain clearance, given the greater likelihood of plasma A $\beta$ 42 and pTau-181 to be brain-derived compared with A $\beta$ 40 and tTau, respectively <sup>33,34,38,39</sup>. The A $\beta$ 42/A $\beta$ 40 ratio showed a trend towards an interaction effect in older adults only, for whom the ratio increased for Osc+ relative to Osc-. For older adults, increased A $\beta$ 42/A $\beta$ 40 ratios

were significantly associated with decreased negative affect, consistent with the literature linking plasma A $\beta$ 42/A $\beta$ 40 ratios and depression <sup>41,42</sup>. The pTau-181/tTau ratio showed significant differences in change between the two intervention groups across age groups, with effects not significant in either age group alone. The condition differences in the ratio score were driven by changes in tTau for younger adults and by changes in pTau-181 for older adults (Fig. 1). Although suggestive, our findings regarding the potentially clearance-related plasma A $\beta$ 42/A $\beta$ 40 and pTau-181/tTau ratios do not provide clear support that the interventions affected brain clearance as the A $\beta$ 42/A $\beta$ 40 changes did not quite achieve significance and there are other potential dynamics that could affect pTau-181/tTau ratios other than changes in brain clearance. For instance, greater plasma pTau-181 levels are typically viewed as reflecting worse brain pathology, as plasma pTau-181 correlates positively with PET measures of amyloid and tau burden<sup>53</sup>. Also, as already discussed, previous findings indicate noradrenergic influences on tau phosphorylation<sup>15-17</sup>. Thus, the pTau-181/tTau ratio measure is ambiguous. While our findings indicate that daily practice sessions aimed at modulating heart rate oscillation differently affect plasma pTau-181 and tTau, the mechanisms are unclear. To address the possibility of clearance-related effects, future studies should include more direct brain measures of amyloid/tau burden or clearance dynamics.

Taken together, our results provide novel evidence that manipulating autonomic activity affects plasma AD biomarkers. There are at least three plausible (and potentially synergistic) routes of influence that should be tested in future studies: (1) production; (2) peripheral clearance; and (3) brain clearance.

First, high-amplitude heart rate oscillations induced by slow-paced breathing could lessen A $\beta$  production by reducing noradrenergic activity. In general, experiencing stress and adversity has been associated with higher risk of AD in humans and rodents<sup>10</sup>, and the tonic pattern of activity seen in the locus coeruleus (the source of most of the brain's noradrenaline) under stress accelerates spread of AD pathology compared with a non-stress phasic pattern of activity<sup>54</sup>. Our findings of an association between changes in the plasma A $\beta$  and changes in the CREB transcription factor activity are consistent with the possibility that noradrenergic activity plays a role in these changes. An interesting question is whether reduced noradrenergic activity during the intervention practice sessions affects A $\beta$  production or whether changes in tonic resting-state noradrenergic activity mediate the outcomes. In the current study, HRV biofeedback interventions did not change resting-state physiological states including RMSSD and heart rate (Table 3) and, in exploratory post-hoc analyses, changes in RMSSD and heart rate did not significantly correlate with changes in plasma A $\beta$  or tTau levels (Supplementary Information). However, decreases in plasma A $\beta$  and tTau levels correlated with the intensity of heart rate oscillations during practice (Supplementary Information). Thus, initial findings suggest that the changes in overall levels of plasma A $\beta$  and tTau depended more on the strong differences in oscillatory dynamics elicited during practice sessions than on changes in resting-state physiology.

Second, the heart rate oscillations could modulate peripheral clearance functions involving the kidney. The Osc+ intervention was designed to maximize heart rate oscillations by aligning breathing rate with the baroreflex frequency. Prior studies indicated that stimulating the baroreflex suppresses chronic sympathetic nerve activity in the kidney, which then facilitates its excretion of bodily waste including  $A\beta$  and tau  $^{55,56}$ . Importantly, even if the intervention effects were entirely driven by peripheral mechanisms, reducing  $A\beta$  and tau in the periphery is likely to have downstream benefits for clearing  $A\beta$  and tau derived in the brain  $^{57}$ .

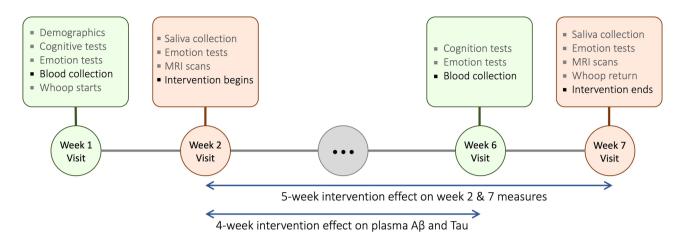
Third, slow-paced breathing may stimulate the clearance of  $A\beta$  and tau from the brain. The majority of  $A\beta$  isoforms are removed via transport across the blood brain barrier and via the glymphatic system using the interstitial fluid bulk flow<sup>58</sup>. Flow of cerebrospinal fluid through the glymphatic system is enhanced by decreased noradrenergic activity<sup>19</sup> and by breathing- and/or heartbeat-induced pulsatile waves of blood flow<sup>59</sup>. These clearance systems decline with aging and AD-related pathology<sup>60,61</sup>. As discussed above, our findings were mixed regarding the effects of the interventions on potential plasma biomarker signals of change in clearance and future work should include more direct measures of clearance.

This study also had some limitations that should be addressed in future studies. One key limitation is that plasma  $A\beta$  and tau levels are indirect measures of brain  $A\beta$  and tau levels<sup>62</sup>. Future studies are needed to see if these manipulations involving heart rate oscillations impact  $A\beta$  and tau brain levels and their eventual aggregation. Next, plasma  $A\beta$  and tau levels can vary depending on multiple factors including sleep and circadian rhythms<sup>63</sup>. We minimized the impact of this potential variability by collecting blood at similar times for each participant at pre- and post-intervention and measuring sleep hours using an actigraph device. There were no significant pre-post intervention differences in blood collection times or sleep hours (Table 3). Finally, we note that the effects were driven by opposing effects of the Osc+ and Osc- interventions. Although these intervention effects on plasma biomarkers likely dissipate after the intervention no longer being practiced, to avoid the increased plasma  $A\beta$  levels found in the active control condition (Osc-), future longer-term studies may consider employing a neutral control condition.

In summary, we found that HRV biofeedback interventions modulated plasma  $A\beta$  and tau levels in younger and/or older adults, and that, at least among the younger adults, changes in plasma  $A\beta$  and tau levels were associated with changes in noradrenergic activity. There are multiple plausible pathways through which high-amplitude heart rate oscillations could affect plasma  $A\beta$  and tau; indeed, it is possible that the differences between the two conditions seen here are due to multiple synergistic pathways that simultaneously affect  $A\beta$  and tau production and clearance.

#### Methods

**Study design and participants.** The current study was part of a larger heart rate variability biofeedback intervention study (ClinicalTrials.gov Identifier: NCT03458910)<sup>30</sup>. Healthy participants without serious medical conditions participated in the seven-week study after providing informed consent approved by University of Southern California's Institutional Review Board. The current report focuses on the 54 younger and 54 older



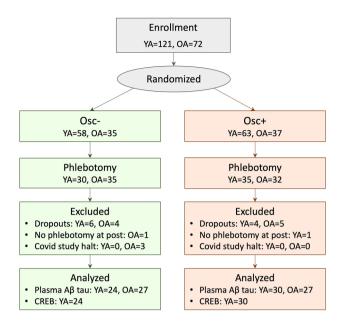
**Figure 2.** Weekly lab visit schedule. Schedules from Week 3 to 5 were not included because the visits were irrelevant to the measures reported in the current study. Detailed descriptions for each week can be found in the main outcome report of the intervention<sup>30</sup>.

adults who had blood samples available at both pre and post intervention. Recruiters, blind to condition assignment, allocated participants in waves of around 20 to small groups of 3-6 people such that each group could visit the lab on a common weekly schedule. Each group was randomly assigned to either the Osc+ or Osc- condition. Both conditions involved 20-40 min of daily home practice of HRV biofeedback with opposite goals. Osc+ participants were instructed to maximize their heart rate oscillations using slow paced breathing, while Osc- participants were instructed to minimize their heart rate oscillations using individualized strategies. We had Osc+ participants try five different breathing cycles from 9 to 13 s per breath and selected the pace that produced the largest amplitude oscillations at the breathing frequency (as indicated by spectral power at around that frequency), suggesting resonance between the baroreflex and breathing. For instance, if an Osc+participant's resonance frequency appeared to be 10 s (or 0.1 Hz) on the basis of high heart rate oscillations when breathing at that frequency, the participant was guided to inhale for 5 s and exhale for 5 s during their home practice sessions. For Osc- participants, we had them try out a set of self-generated strategies to reduce heart rate oscillations. Their proposed strategies included imagining natural scenes, listening to calming sounds, and closing eyes. Among the strategies, we selected the one whose frequency power was spread over the broad range of frequencies without a dominant frequency peak. Participants in both groups received feedback using performance scores which were calculated to reflect the opposite goals of the two conditions.

The whole study consisted of seven weekly visits. We collected baseline measurements during Week 1 and 2 visits and post-intervention measures during Week 6 and 7 visits. After Week 2 baseline measurements, participants were introduced to biofeedback training and took home a laptop computer connected with an ear sensor which measured their heartbeats and displayed real-time heart rate biofeedback on the screen. Participants were asked to practice their assigned intervention technique at home for at least 20 min every day from Week 2 until Week 7. The whole intervention lasted for 5 weeks from Week 2 through Week 7. However, we collected blood samples in Weeks 1 and 6. Since the intervention began on Week 2 and post-intervention blood draw took place on Week 6, the intervention effects on plasma Aβ and tau levels are based on 4 weeks of practice (Fig. 2). Upon completion of the study, participants were paid for their time and performance. The sample size for the intervention study was determined to detect medium effect size differences between the two groups. While we aimed for 100 younger and 100 older adults, a total of 106 younger and 56 older adults completed the whole HRV biofeedback intervention sessions lasting from Week 1 through Week 7. The number of younger participants from whom we collected blood samples was half of those who completed the whole study, because the blood collection setup was implemented halfway through the collecting of younger adult data. Due to Covid19, data collection for older adults was terminated before reaching the goal of 100. This yielded a final sample of 54 older and 54 younger participants available for plasma assays at both pre- and post-intervention (Fig. 3).

**Blood collection procedure.** The blood samples were collected via antecubital venipuncture during Week 1 and 6 visits. A phlebotomist drew 10 ml of blood from each participant's arm into a K2 EDTA tube and then 2.5 ml of blood into a PAXgene RNA tube. To separate plasma from red blood cells, the whole blood from the K2 EDTA tubes was centrifuged at the speed of 1500 RPM for 15 min at room temperature (15 °C). Plasma was then aliquoted in cryovials and stored at -80 °C. The frozen plasma samples were transferred and assayed at University of California, Irvine for A $\beta$ 42, A $\beta$ 40, tTau, and pTau-181. The PAXgene RNA tubes were gently inverted ten times right after sample collection and kept at room temperature for between 2.0 and 70.2 h (mean = 6.95 h) to comply with the PAXgene RNA tube requirement of 2- to 72-h stabilization time. The samples were then temporarily stored in a -20 °C freezer before being stored at -80 °C. They were transported for analysis to the Social Genomics Core Lab at University of California, Los Angeles.

**Plasma assay procedure.** Plasma samples for both younger and older adults were analyzed using the automated Simoa SR-X analyzer with the commercially available Simoa Human Neurology 3-Plex A assay kit



**Figure 3.** Flow chart. The phlebotomy took place for a subset of the total participants. The whole intervention had 15 dropouts for younger adults (7 Osc+, 8 Osc-) and 16 dropouts including 6 Covid-induced study halts for older adults (9 Osc+, 7 Osc-). Among 6 Covid-halted cases (all older adults), three participants were included for plasma assays because they completed up to Week 6 sessions including phlebotomy.

(Quanterix, Billerica, MA, USA) for A $\beta$ 42, A $\beta$ 40, and tTau. Plasma concentrations of pTau-181 were measured using the automated Simoa HD-X analyzer and the Simoa pTau-181 Advantage V2 kit (Quanterix, Billerica, MA, USA). Analyses were performed in duplicates (mean % coefficient of variation [%CV]: A $\beta$ 42: 6.33, A $\beta$ 40: 4.55, tTau: 8.81, pTau-181: 6.01) using a 1:4 dilution protocol according to the manufacturer's instructions. Prior to analysis, plasma samples were thawed at room temperature for 1 h and centrifuged at 10,000×g for 5 min to prevent transfer of debris. All assays were conducted by the same operator with the same respective instrument.

**PAXgene RNA assay procedure.** The PAXgene RNA tubes of younger adults were transferred and assayed in a single batch using previously published methods<sup>37</sup> which first extracted total RNA from samples using automated nucleic acid processing (QIAcube; Qiagen) and checked for suitable RNA integrity and mass (> 50 ng by NanoDrop One spectrophotometry; achieved mean = 4497 ng). Samples were then assayed by RNA sequencing using Lexogen QuantSeq 3' FWD cDNA library synthesis and multiplex DNA sequencing on an Illumina HiSeq 4000 instrument with single-strand 65-nt sequence reads (all following the manufacturer's standard protocol). Analyses targeted > 10 million sequence reads per sample (achieved mean 15.1 million), each of which was mapped to the RefSeq human transcriptome sequence using the STAR aligner (achieved average 94% mapping rate) to generate transcript counts per million total transcripts (TPM). TPM values were floored at 1 TPM to reduce spurious variability, log2-transformed to reduce heteroscedasticity, and analyzed by linear statistical models.

**Negative affect measure.** During weekly lab visits for the pre- and post-intervention measures, we asked participants to take affect-related questionnaires including State Trait Anxiety Inventory (STAI)<sup>64</sup>, Center for Epidemiological Studies-Depression (CESD)<sup>65</sup>, Profile of Mood State (POMS)<sup>66</sup>. As POMS includes multiple mood states, we only averaged negative mood items for this analysis. As the three types of questionnaires were measured at Week 1 and 2, we had a total of six pre-intervention emotion measures for each participant. Likewise, we also have a total of six post-intervention emotion measures. To create summary scores for negative affect, we first standardized each measurement separately for younger and older participants. We next ran a principal component analysis on the six normalized pre-intervention measures separately for younger and older adults. This resulted in the pre-intervention summary score as well as one dominant component whose coefficient matrix elements indicate factor loadings for the six emotional measures. Using those matrix elements as weights, we calculated the weighted average of the six corresponding normalized post-intervention emotional measures (Week 6 and 7) to obtain post-intervention summary scores.

**Other physiological measures.** Participants wore a photoplethysmography WHOOP wristband<sup>67</sup> for the whole study period (Week 1 through Week 7) to assess changes in sleep hours and sleep-derived HRV. WHOOP algorithms have been validated as having a 95% sensitivity for sleep, 68% sensitivity for deep sleep and 70% for REM sleep<sup>68</sup>. Participants were instructed to wear the waterproof wristband as much as possible and especially during sleep.

Saliva samples for cortisol awakening response were collected only for younger adults to reduce participant burden for older adults. We instructed younger participants to collect saliva samples using oral swabs both upon awakening and 30 min later. Saliva was collected in the morning on Week 2 and 7 and brought to the lab in a thermos with ice packs. Samples were stored at -20 °C until they were sent to Salimetrics (CA, USA) for cortisol assays.

During Weeks 2 and 7 visits, we obtained resting heart rate data by having participants sit in a chair for five minutes. Using HeartMath emWave Pro software and its infrared pulse plethysmograph (PPG) ear sensor, the heartbeat was sampled at 370 Hz and its inter-beat interval data was recorded after removing artifacts. The data for each participant was analyzed with Kubios HRV Premium Version 3.1 to obtain a mean heart rate and root mean squared successive difference.

**Statistical analysis.** All statistical analyses were performed using IBM SPSS Statistics (Version 28). To test the intervention effect, we ran a 2 (condition: Osc+, Osc-)×2 (timepoint: pre-, post-intervention) ANOVA to test the intervention effect on each AD biomarker and followed each of these up with another 2 (condition: Osc+, Osc-)×2 (timepoint: pre-, post-intervention) ANOVA for each age group (older and younger participants). We also tested whether our results still held when outliers were removed (Supplementary Information). Based on the boxplot rule of SPSS, outliers for each biomarker were identified if either their pre-intervention or post-intervention values among 108 participants were greater than the third quartile plus three times of interquartile range and lower than the first quartile minus three times of the interquartile range. We found two outliers for Aβ42 (one older Osc+, one older Osc-), one outlier for Aβ40 (one older Osc-), one outlier for Aβ42/40 ratio (one younger Osc-), six outliers for tTau (one younger Osc+, two younger Osc-'s, one older Osc-, two older Osc-'s), three outliers for pTau (two older Osc+'s, one older Osc-), and two outliers for pTau/tTau ratio (one younger Osc+, one older Osc+).

To compare the baseline characteristics of participants between the Osc+ and Osc- conditions, we ran independent sample t-tests on measures regarding heart rate, body mass index, and sleep with two-tailed p values (Table 2). We also compared males versus females on the same measures at baseline (Supplementary Information). We calculated change values by subtracting baseline values from the post-intervention values of the same measures in Table 2. Using these change values, we repeated two-tailed independent sample t-tests to compare Osc+ and Osc- (Table 3). We found that two older adults had abnormally extreme RMSSD values (> 270) at baseline and excluded them for the heart rate and RMSSD comparisons in older adults in Tables 2 and 3.

We examined how changes in each of the six plasma biomarkers ( $A\beta42$ ,  $A\beta40$ ,  $A\beta42/A\beta40$  ratio, tTau, pTau-181, and pTau/tTau ratio) related to changes in CREB-regulated gene transcription activity in an exploratory analysis with the younger adults. The analysis employed the Transcription Element Listening System (TELiS)<sup>69,70</sup> approach to identify transcription-factor binding motifs (TFBMs) that were overrepresented among the promoters of up- or down-regulated genes in association with each of the six plasma biomarker change scores (post–pre intervention). We examined the relationship between change in plasma biomarkers and change in CREB-regulated gene transcription activity that mediates sympathetic nervous system-induced  $\beta$ -adrenergic signaling, with statistical significance evaluated using standard errors derived by bootstrapping (200 cycles).

To test whether the intervention changed the levels of negative affect, we ran a 2 (condition: Osc+, Osc-)  $\times$  2 (timepoint: pre-, post-intervention) ANOVA with negative affect summary scores as the dependent measure separately for younger and older adults. To explore how individual differences in change of negative affect are associated with individual differences in change of A $\beta$ 42/40 ratio, we ran a partial correlation between the post-intervention negative affect summary score and post-intervention A $\beta$ 42/40 ratio separately for younger and older adults while controlling for the pre-intervention A $\beta$ 42/40 and negative affect values.

**Corrections for multiple comparisons.** We used the false discovery rate method to correct for multiple comparisons in our study<sup>44</sup>. The false discovery rate is the expected fraction of tests from an analysis set that are declared significant for which the null hypothesis is true. The major benefit of the false discovery rate correction is that it allows for appropriately different thresholds for: (1) a set of analyses with scientifically driven hypotheses for which the null hypotheses are generally false vs. (2) a set of exploratory analyses for which null hypotheses are generally true. The false discovery rate sets the thresholds based on the nature of the distributions of p values from the set of tests<sup>71</sup>.

We controlled for false discovery rate at the 0.05 level for our 36 hypothesis-driven tests. These consisted of (1) 19 tests of a time-point by condition interaction: six biomarkers (A $\beta$ 42, A $\beta$ 40, A $\beta$ 42/A $\beta$ 40 ratio, tTau, pTau-181, and pTau/tTau ratio) × 3 tests (for all, younger, and older participants) and CREB (available only for younger participants), and (2) 17 tests of association: six CREB and biomarker change associations, three correlations between changes in the pTau/Tau ratio and A $\beta$ 42/A $\beta$ 40 ratio (for all, younger and older participants), six age-group differences in biomarkers at baseline, and two correlations between negative affect change and A $\beta$ 42/A $\beta$ 40 ratio change (for younger and older participants). For these 36 tests which are not independent from each other, we report adjusted p values obtained from the two-stage Benjamini and Hochberg linear step-up procedure ("TSBH")<sup>44</sup> using the R package, 'multtest' (Version 2.54.0)<sup>43,72</sup>.

We note that we also included a series of non-hypothesis-driven tests listed in Tables 2 and 3. Table 2 consists of the baseline comparisons of various measures across the two conditions separately by age group. For the baseline tests, the conservative thing to do is not to correct for multiple comparisons, as they serve as control variables for us to detect whether there were potential problems with randomization. Thus, for Table 2, we did not employ false discovery rate control. Table 3 compares pre vs. post changes across conditions for 26 measures for which we had no specific hypotheses. For the Table 3 set of tests, we did not correct for multiple comparisons to

increase the chance of detecting potentially confounding factors. However, none of the tests turned out significant before corrections. For all these tests in Tables 2 and 3, we report original *p* values.

**Ethical approval and consent to participate.** The study was approved by the institutional Review Board at University of Southern California (ID: UP-17-00219, Name: HRV-biofeedback and emotion regulation). We obtained written informed consent forms from all participants of the study. All the experiments involving human blood samples were carried out in accordance with relevant guidelines and regulations. The experimental procedures were specified in the Biohazardous Use Application (BUA-18-00027), approved by the Institutional Biosafety Committee at University of Southern California.

#### Data availability

Upon publication, study data (i.e., individual participant assay values) will be made publicly available at Open-Neuro as part of the parent study dataset: https://openneuro.org/datasets/ds003823.

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#### References

- 1. Ziegler-Graham, K., Brookmeyer, R., Johnson, E. & Arrighi, H. M. Worldwide variation in the doubling time of Alzheimer's disease incidence rates. *Alzheimer's Dement* 4(5), 316–323. https://doi.org/10.1016/j.jalz.2008.05.2479 (2008).
- 2. Bonnemeier, H. et al. Circadian profile of cardiac autonomic nervous modulation in healthy subjects. J. Cardiovasc. Electrophysiol. 14(8), 791–799. https://doi.org/10.1046/j.1540-8167.2003.03078.x (2003).
- 3. Fukusaki, C., Kawakubo, K. & Yamamoto, Y. Assessment of the primary effect of aging on heart rate variability in humans. Clin. Auton. Res. 10(3), 123–130. https://doi.org/10.1007/BF02278016 (2000).
- Seals, D. R. & Esler, M. D. Human ageing and the sympathoadrenal system. J. Physiol. 528(3), 407–417. https://doi.org/10.1111/j. 1469-7793.2000.00407.x (2000).
- 5. Lee, P. Y., Yun, A. J. & Bazar, K. A. Conditions of aging as manifestations of sympathetic bias unmasked by loss of parasympathetic function. *Med. Hypotheses* 62(6), 868–870. https://doi.org/10.1016/j.mehy.2003.11.024 (2004).
- 6. Mather, M. Noradrenaline in the aging brain: Promoting cognitive reserve or accelerating Alzheimer's disease?. Semin. Cell Dev. Biol. 116, 108–124. https://doi.org/10.1016/j.semcdb.2021.05.013 (2021).
- 7. Evin, G. & Li, Q. X. Platelets and Alzheimer's disease: Potential of APP as a biomarker. World J. Psychiatry. 2(6), 102–113. https://doi.org/10.5498/wjp.v2.i6.102 (2012).
- 8. Dobarro, M., Gerenu, G. & Ramírez, M. J. Propranolol reduces cognitive deficits, amyloid and tau pathology in Alzheimer's transgenic mice. *Int. J. Neuropsychopharmacol.* **16**(10), 2245–2257. https://doi.org/10.1017/S1461145713000631 (2013).
- Ni, Y. et al. Activation of β2-adrenergic receptor stimulates y-secretase activity and accelerates amyloid plaque formation. Nat. Med. 12(12), 1390-1396. https://doi.org/10.1038/nm1485 (2006).
- 10. Justice, N. J. The relationship between stress and Alzheimer's disease. Neurobiol. Stress. 8, 127–133. https://doi.org/10.1016/j.ynstr. 2018.04.002 (2018).
- Wu, J. W. et al. Neuronal activity enhances tau propagation and tau pathology in vivo. Nat. Neurosci. 19(8), 1085–1092. https://doi.org/10.1038/nn.4328 (2016).
- 12. Pooler, A. M., Phillips, E. C., Lau, D. H. W., Noble, W. & Hanger, D. P. Physiological release of endogenous tau is stimulated by neuronal activity. *EMBO Rep.* 14(4), 389–394. https://doi.org/10.1038/embor.2013.15 (2013).
- Yamada, K. et al. Neuronal activity regulates extracellular tau in vivo. J. Exp. Med. 211(3), 387–393. https://doi.org/10.1084/jem. 20131685 (2014).
- 14. Rissman, R. A. Stress-induced tau phosphorylation: Functional neuroplasticity or neuronal vulnerability?. *J. Alzheimers Dis.* **18**(2), 453–457. https://doi.org/10.3233/JAD-2009-1153 (2009).
- 15. Planel, E. *et al.* Acceleration and persistence of neurofibrillary pathology in a mouse model of tauopathy following anesthesia. *FASEB J.* 23(8), 2595–2604. https://doi.org/10.1096/fj.08-122424 (2009).
- Papon, M. A., Whittington, R., El Khoury, N. & Planel, E. Alzheimer's disease and anesthesia. Front. Neurosci. https://doi.org/10.3389/fnins.2010.00272 (2011).
- 17. Whittington, R. A. *et al.* Dexmedetomidine increases tau phosphorylation under normothermic conditions in vivo and in vitro. *Neurobiol. Aging* 36(8), 2414–2428. https://doi.org/10.1016/j.neurobiolaging.2015.05.002 (2015).
- 18. Benveniste, H. et al. The glymphatic system and waste clearance with brain aging: A review. GER. 65(2), 106–119. https://doi.org/10.1159/000490349 (2019).
- 19. Xie, L. et al. Sleep drives metabolite clearance from the adult brain. Science 342(6156), 373–377. https://doi.org/10.1126/science. 1241224 (2013).
- 20. Benveniste, H. et al. Anesthesia with dexmedetomidine and low-dose isoflurane increases solute transport via the glymphatic pathway in rat brain when compared with high-dose isoflurane. Anesthesiology 127(6), 976–988. https://doi.org/10.1097/ALN. 000000000001888 (2017).
- Cheng, K. P. et al. Clinically-derived vagus nerve stimulation enhances cerebrospinal fluid penetrance. Brain Stimul. 13(4), 1024–1030. https://doi.org/10.1016/j.brs.2020.03.012 (2020).
- Eide, P. K., Vatnehol, S. A. S., Emblem, K. E. & Ringstad, G. Magnetic resonance imaging provides evidence of glymphatic drainage from human brain to cervical lymph nodes. Sci. Rep. 8(1), 7194. https://doi.org/10.1038/s41598-018-25666-4 (2018).
- 23. Bohr, T. et al. The glymphatic system: Current understanding and modeling. iScience. 25(9), 104987. https://doi.org/10.1016/j.isci. 2022.104987 (2022).
- 24. Ooms, S. *et al.* Effect of 1 night of total sleep deprivation on cerebrospinal fluid β-amyloid 42 in healthy middle-aged men: A randomized clinical trial. *JAMA Neurol.* 71(8), 971–977. https://doi.org/10.1001/jamaneurol.2014.1173 (2014).
- 25. Blattner, M. S. *et al.* Increased cerebrospinal fluid amyloid-β during sleep deprivation in healthy middle-aged adults is not due to stress or circadian disruption (Naismith S, ed.). *JAD* 75(2), 471–482. https://doi.org/10.3233/JAD-191122 (2020).
- 26. Lucey, B. P. et al. Reduced non-rapid eye movement sleep is associated with tau pathology in early Alzheimer's disease. Sci. Transl. Med. 11(474), 6550. https://doi.org/10.1126/scitranslmed.aau6550 (2019).
- Lucey, B. P. et al. Effect of sleep on overnight cerebrospinal fluid amyloid β kinetics. Ann. Neurol. 83(1), 197–204. https://doi.org/ 10.1002/ana.25117 (2018).
- 28. Lehrer, P. M. & Gevirtz, R. Heart rate variability biofeedback: How and why does it work?. Front. Psychol. 5, 756. https://doi.org/10.3389/fpsyg.2014.00756 (2014).
- 29. Mather, M. & Thayer, J. F. How heart rate variability affects emotion regulation brain networks. *Curr. Opin. Behav. Sci.* 19, 98–104. https://doi.org/10.1016/j.cobeha.2017.12.017 (2018).

- Nashiro, K. et al. Increasing coordination and responsivity of emotion-related brain regions with a heart rate variability biofeedback randomized trial. Cognit. Affect. Behav. Neurosci. https://doi.org/10.3758/s13415-022-01032-w (2022).
- 31. Roher, A. E. et al. Amyloid beta peptides in human plasma and tissues and their significance for Alzheimer's disease. Alzheimer's Dement. 5(1), 18–29. https://doi.org/10.1016/j.jalz.2008.10.004 (2009).
- 32. Bush, A. I. et al. The amyloid precursor protein of Alzheimer's disease is released by human platelets. J. Biol. Chem. 265(26), 15977-15983 (1990).
- Verberk, I. M. W. et al. Plasma amyloid as prescreener for the earliest Alzheimer pathological changes. Ann. Neurol. 84(5), 648–658. https://doi.org/10.1002/ana.25334 (2018).
- 34. Janelidze, S., Stomrud, E., Palmqvist, S. *et al.* Plasma β-amyloid in Alzheimer's disease and vascular disease. *Sci. Rep.* **6**, 26801. https://doi.org/10.1038/srep26801 (2016).
- 35. Deters, K. D. et al. Plasma tau association with brain atrophy in mild cognitive impairment and Alzheimer's disease. J. Alzheimers Dis. 58(4), 1245–1254. https://doi.org/10.3233/JAD-161114 (2017).
- 36. Fossati, S. et al. Plasma tau complements CSF tau and P-tau in the diagnosis of Alzheimer's disease. Alzheimer's Dement. Diagn. Assess. Dis. Monit. 11, 483–492. https://doi.org/10.1016/j.dadm.2019.05.001 (2019).
- Barthélemy, N. R., Horie, K., Sato, C. & Bateman, R. J. Blood plasma phosphorylated-tau isoforms track CNS change in Alzheimer's disease. J. Exp. Med. 217(11), e20200861. https://doi.org/10.1084/jem.20200861 (2020).
- 38. Thijssen, E. H. et al. Diagnostic value of plasma phosphorylated tau181 in Alzheimer's disease and frontotemporal lobar degeneration. Nat. Med. 26(3), 387–397. https://doi.org/10.1038/s41591-020-0762-2 (2020).
- Clark, C., Lewczuk, P., Kornhuber, J. et al. Plasma neurofilament light and phosphorylated tau 181 as biomarkers of Alzheimer's disease pathology and clinical disease progression. Alz. Res. Therapy 13, 65. https://doi.org/10.1186/s13195-021-00805-8 (2021).
- 40. Cole, S. W. Elevating the perspective on human stress genomics. *Psychoneuroendocrinology* **35**(7), 955–962. https://doi.org/10. 1016/j.psyneuen.2010.06.008 (2010).
- 41. Pomara, N. et al. Plasma amyloid-β dynamics in late-life major depression: A longitudinal study. Transl. Psychiatry 12(1), 1–7. https://doi.org/10.1038/s41398-022-02077-8 (2022).
- 42. do Nascimento, K. K. F., Silva, K. P., Malloy-Diniz, L. F., Butters, M. A. & Diniz, B. S. Plasma and cerebrospinal fluid amyloid-β levels in late-life depression: A systematic review and meta-analysis. *J. Psychiatr. Res.* 69, 35–41. https://doi.org/10.1016/j.jpsychires.2015.07.024 (2015).
- Pollard, K.S., Dudoit, S., & van der Laan, M.J. Multiple Testing Procedures: The Multtest Package and Applications to Genomics. (Gentleman, R., Carey, V.J., Huber, W., Irizarry, R.A., Dudoit, S., eds.). 251–272. https://doi.org/10.1007/0-387-29362-0\_15 (Springer, 2005)
- 44. Benjamini, Y., Krieger, A. M. & Yekutieli, D. Adaptive linear step-up procedures that control the false discovery rate. *Biometrika* 93(3), 491–507. https://doi.org/10.1093/biomet/93.3.491 (2006).
- 45. Baker, L. D. et al. Effects of aerobic exercise on mild cognitive impairment: A controlled trial. Arch. Neurol. 67(1), 71–79. https://doi.org/10.1001/archneurol.2009.307 (2010).
- 46. Frederiksen, K. S. et al. Moderate- to high-intensity exercise does not modify cortical β-amyloid in Alzheimer's disease. Alzheimers Dement. (N.Y.) 5, 208–215. https://doi.org/10.1016/j.trci.2019.04.006 (2019).
- 47. Kim, J. H. et al. Effects of aquatic and land-based exercises on amyloid beta, heat shock protein 27, and pulse wave velocity in elderly women. Exp. Gerontol. 108, 62–68. https://doi.org/10.1016/j.exger.2018.03.024 (2018).
- 48. Vidoni, E. D. *et al.* Effect of aerobic exercise on amyloid accumulation in preclinical Alzheimer's: A 1-year randomized controlled trial. *PLoS ONE* **16**(1), e0244893. https://doi.org/10.1371/journal.pone.0244893 (2021).
- Song, F. et al. Meta-analysis of plasma amyloid-β levels in Alzheimer's disease. J. Alzheimer's Dis. 26(2), 365–375. https://doi.org/10.3233/JAD-2011-101977 (2011).
- Ertekin-Taner, N. et al. Plasma amyloid protein is elevated in late-onset Alzheimer disease families. Neurology 70(8), 596–606. https://doi.org/10.1212/01.wnl.0000278386.00035.21 (2008).
- 51. Stakos, D. A. et al. The Alzheimer's disease amyloid-beta hypothesis in cardiovascular aging and disease. J. Am. Coll. Cardiol. 75(8), 952–967. https://doi.org/10.1016/j.jacc.2019.12.033 (2020).
- 52. Gabelle, A. et al. Plasma β-amyloid 40 levels are positively associated with mortality risks in the elderly. Alzheimer's Dement. 11(6), 672–680. https://doi.org/10.1016/j.jalz.2014.04.515 (2015).
- 53. Mielke, M. M. et al. Plasma phospho-tau181 increases with Alzheimer's disease clinical severity and is associated with tau- and amyloid-positron emission tomography. Alzheimer's Dement. 14(8), 989–997. https://doi.org/10.1016/j.jalz.2018.02.013 (2018).
- 54. Omoluabi, T. *et al.* Novelty-like activation of locus coeruleus protects against deleterious human pretangle tau effects while stress-inducing activation worsens its effects. *Alzheimer's Dement. Transl. Res. Clin. Intervent.* 7(1), e12231. https://doi.org/10.1002/trc2. 12231 (2021)
- 55. Lohmeier, T. E., Hildebrandt, D. A., Warren, S., May, P. J. & Cunningham, J. T. Recent insights into the interactions between the baroreflex and the kidneys in hypertension. *Am. J. Physiol.-Regulat. Integr. Comp. Physiol.* 288(4), R828–R836. https://doi.org/10.1152/ajpregu.00591.2004 (2005).
- 56. Tian, D. Y. et al. Physiological clearance of amyloid-beta by the kidney and its therapeutic potential for Alzheimer's disease. Mol. Psychiatry. 26(10), 6074–6082. https://doi.org/10.1038/s41380-021-01073-6 (2021).
- 57. Xiang, Y. et al. Physiological amyloid-beta clearance in the periphery and its therapeutic potential for Alzheimer's disease. Acta Neuropathol. 130(4), 487–499. https://doi.org/10.1007/s00401-015-1477-1 (2015).
- Tarasoff-Conway, J. M. et al. Clearance systems in the brain—Implications for Alzheimer disease. Nat. Rev. Neurol. 11(8), 457–470. https://doi.org/10.1038/nrneurol.2015.119 (2015).
- Kiviniemi, V. et al. Ultra-fast magnetic resonance encephalography of physiological brain activity—Glymphatic pulsation mechanisms?. J. Cereb. Blood Flow Metab. 36(6), 1033–1045. https://doi.org/10.1177/0271678X15622047 (2016).
- 60. Marques, F., Sousa, J. C., Sousa, N. & Palha, J. A. Blood-brain-barriers in aging and in Alzheimer's disease. *Mol. Neurodegener.* 8(1), 38. https://doi.org/10.1186/1750-1326-8-38 (2013).
- Kress, B. T. et al. Impairment of paravascular clearance pathways in the aging brain. Ann. Neurol. 76(6), 845–861. https://doi.org/ 10.1002/ana.24271 (2014).
- 62. Blennow, K., Hampel, H., Weiner, M. & Zetterberg, H. Cerebrospinal fluid and plasma biomarkers in Alzheimer disease. *Nat. Rev. Neurol.* 6(3), 131–144. https://doi.org/10.1038/nrneurol.2010.4 (2010).
- 63. Huang, Y. et al. β-Amyloid dynamics in human plasma. Arch. Neurol. 69(12), 1591–1597. https://doi.org/10.1001/archneurol.2012.
- Barnes, L. L. B., Harp, D. & Jung, W. S. Reliability generalization of scores on the Spielberger State-Trait Anxiety Inventory. Educ. Psychol. Meas. 62(4), 603–618. https://doi.org/10.1177/0013164402062004005 (2002).
- 65. Radloff, L. S. The CES-D Scale: A self-report depression scale for research in the general population. *Appl. Psychol. Meas.* 1(3), 385–401. https://doi.org/10.1177/014662167700100306 (1977).
- 66. Grove, J. R. & Prapavessis, H. Preliminary evidence for the reliability and validity of an abbreviated profile of mood states. *Int. J. Sport Psychol.* 23(2), 93–109 (1992).
- 67. Bellenger, C. R., Miller, D., Halson, S. L., Roach, G. & Sargent, C. Wrist-based photoplethysmography assessment of heart rate and heart rate variability: Validation of WHOOP. Sensors. 21(10), 3571. https://doi.org/10.3390/s21103571 (2021).

- 68. Miller, D. J. et al. A validation study of a commercial wearable device to automatically detect and estimate sleep. Biosensors 11(6), 185. https://doi.org/10.3390/bios11060185 (2021).
- 69. Cole, S. W., Yan, W., Galic, Z., Arevalo, J. & Zack, J. A. Expression-based monitoring of transcription factor activity: The TELiS database. *Bioinformatics* 21(6), 803–810. https://doi.org/10.1093/bioinformatics/bti038 (2005).
- 70. Cole, S. W., Shanahan, M. J., Gaydosh, L. & Harris, K. M. Population-based RNA profiling in Add Health finds social disparities in inflammatory and antiviral gene regulation to emerge by young adulthood. *PNAS* 117(9), 4601–4608. https://doi.org/10.1073/pnas.1821367117 (2020).
- 71. Glickman, M. E., Rao, S. R. & Schultz, M. R. False discovery rate control is a recommended alternative to Bonferroni-type adjustments in health studies. J. Clin. Epidemiol. 67(8), 850–857. https://doi.org/10.1016/j.jclinepi.2014.03.012 (2014).
- 72. R Core Team. R: A Language and Environment for Statistical Computing. (R Foundation for Statistical Computing, 2022). https://www.r-project.org/. Accessed 18 Jan 2023.

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#### **Author contributions**

M.M. conceptualized, designed and supervised the HRV biofeedback intervention study with advice from J.T. and D.N. K.N. supervised execution of the whole study and preprocessed the data on emotion. H.Y. managed data curation and preprocessed heart rate variability data. C.C. provided administrative support. J.M. prepared blood collection and its preprocessing with the help of J.W. J.R. assayed plasma samples for A $\beta$  and tau with the supervision of A.M. and E.H. S.C. was responsible for analyzing data on gene transcription indicators. S.P. collected sleep data and ran related analyses. J.M. and M.M. analyzed the results and drafted the first manuscript. J.R., S.C., and S.P. added to the paper with their parts. S.P. verified data analyses. All authors reviewed and approved the final manuscript. All authors agreed to publish the paper.

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#### **Competing interests**

The authors declare no competing interests.

#### Additional information

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