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Sexual dimorphism of physical activity on cognitive aging: Role of immune functioning

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Abstract

Objective.—Exercise is one of the most potent strategies available to support cognitive health with age, yet substantial variability exists. Sexual dimorphism is evident for brain and immune functioning, the latter being implicated as important pathway for exercise. We examined the moderating role of sex on the relationship between physical activity and systemic inflammatory and brain health outcomes in support of more personalized approaches to behavioral interventions.

Methods.—Our discovery cohort included 45 typically aging women matched on age ($\pm 5y$) and education ($\pm 2y$) to 45 men (mean age=72.5; Clinical Dementia Rating=0) who completed self-reported current physical activity (Physical Activity Scale for Elderly), blood draw, neuropsychological evaluation, and brain MRI. An independent sample of 45 typically aging women and 36 men who completed the same measures comprised a replication cohort. Plasma was analyzed for 11 proinflammatory cytokine and chemokine markers via MesoScale Discovery.

Results.—*Discovery cohort:* Reported physical activity did not differ between sexes (150 vs. 157, $p=0.72$). There was a significant interaction between sex and physical activity on chemokine markers MDC, MIP-1b, MCP-4, and eotaxin-3 ($ps<0.03$), with a similar trend for MCP-1 and $INF\gamma$ ($ps<0.09$). Men who reported greater activity demonstrated lower inflammatory markers, an effect attenuated-to-absent in women. An interaction between sex and physical activity was also observed for parahippocampal volumes ($p=0.02$) and cognition (processing speed and visual memory; $ps<0.04$). Again, the beneficial effect of physical activity on outcomes was present in men, but not women. Replication cohort analyses conferred a consistent effect of sex on the relationship between physical activity and immune markers; models examining neurobehavioral

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outcomes did not strongly replicate. Across cohorts, post-hoc models demonstrated an interaction between sex and activity-related inflammatory markers on total gray matter volume and visual memory. Men with higher inflammatory markers demonstrated poorer brain structure and function, whereas inflammatory markers did not strongly relate to neurobehavioral outcomes in women.

Conclusions.—Greater physical activity was associated with lower markers of inflammation in clinically normal older men, but not women - an effect consistently replicated across cohorts. Additionally, men appeared disproportionately vulnerable to the adverse effects of peripheral inflammatory markers on brain structure and function compared to women. Immune activation may be a male-specific pathway through which exercise confers neurobehavioral benefit.

Keywords

exercise; inflammation; gender; cognitive aging; brain aging; lifestyle; chemokines

INTRODUCTION

Dementia is a quarter trillion-dollar public health problem with no disease modifying treatments currently available, highlighting the need to carefully examine readily available alternate approaches¹. Physical activity is one such target that has demonstrated some of the largest effect sizes on neurobehavioral outcomes, including age-related cognition²⁻⁵, white matter integrity⁶⁻⁸, and even gray matter growth^{9,10}. For example, one recent study demonstrated an 88% reduced risk of dementia in adults with high midlife fitness compared to their less fit peers⁴. Yet, as noted in the 2017 National Academy of Medicine, other data are mixed and evidence is not yet sufficient to indicate that exercise can prevent dementia¹¹. In fact, one recent large-scale trial in patients with mild-to-moderate dementia showed statistically significant functional *declines* after a 12-month exercise treatment¹². A major gap in this literature is that we do not fully understand the mechanisms of how exercise may exert protective effects on the brain in order to identify who may stand to benefit the most.

Biological sex is not only an important moderator of brain and cognitive aging, but also of immunological functioning, and this latter system is posited as an important pathway through which exercise may benefit the brain¹³. While men demonstrate steeper memory declines in typical aging^{14,15} and “older” appearing markers of brain epigenetics and metabolism^{16,17}, up to 2 out of 3 patients with Alzheimer’s disease (AD) are women¹. Women also harbor higher levels of AD pathology and, clinically, appear to be disproportionately affected by AD risk factors (e.g., *APOEε4*, cerebral amyloid)¹⁸⁻²⁰. Interestingly, converging whole genome studies highly implicate innate immune dysfunction in the development of AD²¹⁻²³, and there is also evidence for sexual dimorphism of the immune system. For example, there are clear sex differences in the prevalence immune-mediated diseases (e.g., 80% of autoimmune diseases are in women)²⁴. Women generally mount a stronger immunological response to a pathogen or injury (e.g., TBI, ischemia) particularly at younger ages compared to men, including increased transcription of toll-like receptor ligands following an immune challenge and bigger antibody production following vaccination²⁴⁻²⁶. The endocrine environment also plays a potent regulating role as both androgen and estradiol response elements are present on innate immunity genes²⁷ and

expressed in various lymphoid tissues, lymphocytes, macrophages, and dendritic cells. While estradiol appears to have a bipotential effect with low doses enhancing inflammatory cytokine production and high levels reducing their production, androgens, including testosterone, generally suppresses immune activity in men, potentially contributing to pathogen toxicity^{28,29}. As a result, women demonstrate faster pathogen clearance, wound healing, and return to immunological quiescence following an injury, but may ultimately be more susceptible to low grade inflammation and autoimmune diseases, while men are at risk of greater pathogen toxicity due to an insufficiently mounted immunologic response^{24,25}. Given that 1) there is compelling evidence for sexual dimorphism across brain and immunologic functioning, and 2) physical activity has been linked with both of these systems^{30–35}, our overarching goal was to examine the effect of biological sex on the relationship between physical activity and these age-related outcomes.

Despite these links and the surge in exercise-related brain health literature, relatively few studies have directly explored this question. In humans, there appear to be sex differences in the relationship between exercise and brain integrity and cognitive outcomes, though the exact pattern is less clear. In one of the few prospective analyses, Barha and colleagues (2019) examined the relationship of self-reported walking on 10-year cognitive and brain volume trajectories stratified by sex in the Health ABC cohort of non-demented older adults³⁶. In women, walking was associated with more optimal dorsolateral prefrontal volume and processing speed trajectories, while in men, walking was linked to better hippocampal volume trajectories. On the other hand, in a randomized trial of physical activity in older adults with small vessel ischemic disease, aerobic training was associated with slowed white matter hyperintensity growth in men, but not women³⁷. Regarding cognition, several randomized trials of aerobic activity have also demonstrated specific beneficial effects of physical activity on processing speed and executive functioning only in women³⁸, while others show benefits on memory only in men^{39,40}. Notably, the study cohorts included in these reviews were cognitively heterogeneous, including a mix of both typical aging and mild cognitive impairment adults. Given that disease state may critically modulate sex effects of cognitive aging (e.g., men may decline more quickly in states of health, women may decline more quickly in states of AD), it is difficult to fully disentangle these effects. Additionally, there are fairly consistent demographic cohort differences between sexes, with women tending to be younger and less well educated, potentially reflecting generational effects on factors known to relate to cognitive aging.

In this study, we evaluated the moderating effect of biological sex on the relationship between physical activity and brain health related outcomes among typically aging older adults. Our outcomes included cognition, gray matter volume, and plasma markers of immunologic functioning between the sexes. To address cohort issues, we matched women and men on demographic factors shown to vary by sex and be related to brain health outcomes – namely, age and education. Careful characterization of the individuals who stand to benefit the most from behavioral interventions are critically needed to support personalized health approaches, shape risk-stratification techniques for clinical trials, and inform our fundamental understanding of brain health development.

METHODS.

Participants.

All participants were drawn from the larger Hillblom Aging Network at University of California, San Francisco, an ongoing study characterizing the neurobehavior of typical aging. Participants represent a community-dwelling, convenience sample of the Bay Area collected between 2000 and 2019, recruited via advertisements, flyers, community outreach events, word of mouth, and through family members of patients affected by neurodegenerative disease. At screening, participants completed comprehensive neurological, and neuropsychological evaluation, including a study partner interview, all of which are reviewed at interdisciplinary case conferences, and determined to be within normative standards by board certified neurologists and neuropsychologists. Evaluation measures included detailed neurobehavioral and medical interview with participant and an informant, motor and physical exam, brain MRI review, informant-based Clinical Dementia Rating Scale, and standardized well-described neuropsychological measures covering episodic memory, executive functions, processing speed, language, visuospatial skills, and mood described in details elsewhere (see for detailed measures and further cohort description^{14,41–43}). Inclusion criteria: 1) no diagnosed memory or neurological condition (e.g., epilepsy, large vessel stroke), 2) no major medical (e.g., active neoplasm, HIV, dialysis), psychiatric disorder (e.g., schizophrenia), or active substance use disorder, and 2) no functional decline operationalized as Clinical Dementia Rating (CDR) of 0 via study partner interviews. This approach yields a cohort of older, functionally intact subjects who are heterogeneous in terms of cognition, and common chronic age-related vascular risk factors and general health conditions.

Discovery cohort.—120 typically aging older adults completed the Physical Activity Scale for the Elderly (PASE) and blood draw with plasma analyzed for immune activation markers in one analytic batch. Men and women were matched on age (± 5 years) and education (± 2 years) via case control matching (IBM Corp. SPSS; Case Control Matching, Hayes package), resulting in 45 matches (N=90 total).

Replication cohort.—We identified an additional cohort of 90 independent older adults (36 male, 45 female) from the Hillblom Aging Network who also completed the PASE and blood draw with plasma analyzed for immune markers (on the same analytic platform) *in a separate analytic batch* and who served as a validation sample. The goal of a replication cohort was to increase the rigor of our clinical study by testing the reliability of the evaluated relationships. Models demonstrating similar effect directionality and size across both cohorts may therefore be interpreted as more generalizable and robust. We opted to not match this cohort in order to optimize sample size, and instead statistically adjusted for demographic factors that differed between sexes.

The UCSF Committee on Human Research approved the study protocol, and per their guidelines, all subjects provided written informed consent.

Reported Physical Activity.

Participants completed the Physical Activity Scale for the Elderly (PASE), a self-reported measure of physically-demanding activities in the past 7 days. The PASE was developed and has been well-validated to capture physical activities common in older adults, including quantification of duration, frequency, and exertion level. A total composite score was calculated according to the manual (New England Research Institutes, Inc, 1991) with higher scores indicating higher levels of physical activity (possible range 0 to 400+).

Immune Activation Markers.

Venous blood was drawn in the morning following a 10+ hour fasting interval in EDTA-containing tubes and plasma continuously stored at -80°C . Samples were gradually brought to room temperature and analyzed via Meso Scale Discovery (Rockville, MD, USA) V-Plex proinflammatory cytokine and chemokine kits, according to manufacturer guidelines. Analytes quantified included interleukin (IL)-6, IL-10, tumor necrosis factor-alpha (TNF- α), monocyte derived chemokine (MDC/CCL22), macrophage inflammatory protein-alpha and beta (MIP1a/CCL3 and MIP1b/CCL4), monocyte chemoattractant protein 1 and 4 (MCP-1/CCL2, MCP-4/CCL13), and interferon gamma (INF γ), eotaxin-1 and -3. Samples were run in two separate analytic batches using antibodies from two different manufacturer lots at different time points; given that discrepant analytic lots and time points are commonly not directly comparable⁴⁴, we elected to split the sample into independent Discovery and Replication cohorts based on batch analysis. All samples were run in duplicate and those with coefficients of variance (CV) >20% were excluded from analyses. Final values were also examined for extreme outliers and samples with values >5 \times the upper interquartile range were also excluded. Due to positive skew, all markers were log transformed to achieve normality prior to analysis.

Cardiovascular Health.

Other measures of cardiovascular health included height and weight (body mass index calculated), blood pressure (systolic and diastolic), and serum-based clinical laboratory measures of blood sugar (hemoglobin A1C) and insulin resistance (Homeostatic Model Assessment of Insulin Resistance, HOMA-IR) (Quest Diagnostics; Seacaucus, NJ).

Neuroimaging.

Participants also completed a 3T Magnetom Vision TIM Siemens Trio brain magnetic resonance imaging (MRI) within 180 days of their neuropsychological evaluation and blood draw. T1-weighted magnetization prepared rapid acquisition GRE structural scan was acquired (acquisition time 8 minutes, 53 seconds), sagittal orientation, field of view $160 \times 240 \times 256$ mm and isotropic voxel resolution of 1 mm^3 (repetition time = 2300ms, echo time = 2.98 ms, time inversion = 900 ms, and flip angle = 9). Before processing, all images were visually inspected for quality and those with excessive motion or other image artifact excluded. Magnetic field bias was corrected using the N3 algorithm⁴⁵. Tissue segmentation was performed using the unified segmentation procedure in SPM12⁴⁶. Each participant's T1-weighted image was warped to create a study-specific template using Diffeomorphic Anatomical Registration using Exponentiated Lie algebra (DARTEL)⁴⁷; subsequently, the

images were normalized and modulated in the study-specific template space using nonlinear and rigid-body registration. Images were smoothed using an 8-mm Gaussian kernel with 8-mm full width half maximum. For registration with a brain parcellation atlas, linear and nonlinear transformations between DARTEL's space and ICBM space were applied⁴⁸. Quantification of volumes in specific brain regions at each time point was accomplished by transforming a standard parcellation atlas into ICBM space and summing all modulated gray matter within each parcellated region⁴⁹. Total intracranial volume was estimated for each subject in MNI space.

A priori selected gray matter regions of interest (ROIs) included total gray matter volume, bilateral substructures of the medial temporal lobe (hippocampus, parahippocampus, entorhinal), and bilateral dorsolateral prefrontal cortex (caudal and rostral middle frontal gyrus), given previously reported sensitivity of these structures to exercise^{9,10}. Total intracranial volume was statistically regressed out of each ROI prior to analyses.

Neuropsychological evaluation.

We selected measures of processing speed, episodic memory, and executive functions given their known changes in aging and previous reported associations with physical activity^{43,50}. *Spatial processing speed* was measured using a well-validated, experimental computerized battery of visually (e.g., Dot Counting, Flanker) mediated reaction-time tasks, developed by Kerchner and colleagues (2011)⁵¹. Tasks within each domain are averaged into a composite z-score, reflecting reaction time (higher values indicating *slower* performance) of participant performance compared to young adults. *Verbal episodic memory* was measured via the California Verbal Learning Test, second edition⁵²; total long delay (20-30 minute) free recall scores were the primary metric of interest (range 0-16). *Visual episodic memory* was quantified by delayed (10-minute) free recall of a complex figure (modified Benson Figure). *Executive functions* were quantified via a composite index of digit span backwards, modified Trail Making Test, Stroop Inhibition, lexical fluency (D-words/60''), and design fluency (DKEFS Condition 1) performances; this battery of measures is described in detail elsewhere^{43,53}.

Statistical Analyses.

Discovery cohort analyses.

In the age- and education-matched sample, independent Student's t-tests were conducted to examine possible remaining demographic and clinical differences between sexes. Next, to evaluate the moderating effect of sex on the relationship between reported physical activity and neurobehavioral outcomes of interest, we conducted linear regression models entering both main effects and the interaction term between sex*physical activity. Given that we captured 11 immunological markers, in order to reduce multiple comparisons, we first conducted a multivariate linear regression with all 11 markers entered as the dependent variable; follow-up analyses then evaluated each individual immune marker separately. Parallel multivariable linear regression models also evaluated the interaction of sex*physical activity on a priori selected cardiovascular (blood pressure, HOMA-IR, hemoglobin A1C), brain structure (total GMV, medial temporal lobe subregions, dorsolateral prefrontal cortex),

and cognitive (verbal/visual episodic memory, processing speed, executive functions) outcomes. To better capture the specific effect of current physical activity on outcomes of interest, all models covaried for BMI as an indicator of overall fitness/metabolic differences. Models with interaction terms reaching $\alpha < 0.05$ were further probed by testing effects of physical activity on immune/neurobehavioral outcomes stratified by sex. Standardized beta values are reported across all models.

Replication Analyses.

In the unmatched replication cohort, Student's t-tests were conducted to again evaluate demographic and clinical differences between sexes. This cohort demonstrated significant differences on education, BMI, and heart rate between males and females; as such, these measures were included as covariates in all subsequent models. To streamline analyses and avoid multiple comparisons, we replicated regression models (described above) that demonstrated small- to-medium effect sizes (interaction term parameter: $\beta > 0.30$) in the discovery cohort⁵⁴.

Post-Hoc Models.

After determining that the most replicable sex-specific effect was observed on the relationship between physical activity and peripheral inflammatory markers, we aimed to explore how these exercise-related immune markers may relate to markers of central nervous system functioning (brain structure and function) in our cohorts. To do so, we first created an inflammatory composite (z-score) within each cohort that included only the chemokine markers demonstrating at least small-to-medium ($\beta > 0.30$) sex-exercise effects across cohorts: MCP4, eotaxin-3, and MIP1b. Collapsing across cohorts to increase sample size, we then examined the possible moderating role of sex on the relationship between our exercise-related immune composite and markers of brain structure and cognition. Multivariable linear regression models therefore tested the interaction between sex*exercise-related immune composite on gray matter volume and cognition, adjusting for age, education, and BMI.

Results.

Discovery Cohort.

Sample Characteristics.—Demographically-matched men and women did not statistically differ on overall reported physical activity levels, BMI, blood pressure, hemoglobin A1C, or HOMA-IR. Regarding inflammatory markers, men and women did not differ across most, though women showed lower IL-6 ($p=0.03$) and higher INF γ ($p=0.04$).

Immune Activation Outcomes.—The omnibus multivariate regression modeling sex*physical activity against all 11 immune markers reached statistical significance ($F(42, 67)=2.16, p=0.0018$). In individual models, sex significantly moderated the relationship between physical activity and several proinflammatory chemokine markers, including MDC ($p=0.03$), MIP1-b ($p=0.02$), eotaxin-3 ($p=0.007$), and MCP-4 ($p=0.02$; Table 3, Figure 1). Models examining MCP-1 ($p=0.09$) and INF γ ($p=0.06$) approached, but did not reach, statistical significance. In all models, greater reported physical activity was consistently associated with lower inflammatory markers among men, but not women (Men: β range:

–0.59 to –0.27, all p-values <0.07; Women: β range: –0.15 to 0.19, all p-values >0.21). There were no statistically significant sex by physical activity interactions on proinflammatory cytokine markers examined (e.g., IL-6, TNF α).

Brain Structural Outcomes.—Sex also significantly interacted with physical activity on parahippocampal volumes ($p=0.02$; Table 4; Figure 3). Greater physical activity demonstrated a medium, positive relationship with parahippocampal volume in men ($\beta=0.43$, $p=0.01$), but not in women ($\beta=0.03$, $p=0.86$). Interaction parameters were in the same direction but did not reach statistical significance for entorhinal ($\beta=-0.31$, $p=0.35$), hippocampal ($\beta=-0.41$, $p=0.19$), total gray matter ($\beta=-0.41$, $p=0.19$) or dorsolateral prefrontal cortex ($\beta=-0.19$, $p=0.53$; Table 4).

Neuropsychological Outcomes.—Lastly, there was also a significant sex by physical activity interaction on visual episodic memory ($p=0.04$) and processing speed ($p=0.027$; Table 4; Figure 4). Among men, greater reported physical activity demonstrated a medium, positive association with visual memory and processing speed performances, but this effect was attenuated in women (Men: memory $\beta=0.25$, speed $\beta=-0.37$, p -values<0.12; Women: memory $\beta=-0.18$, speed $\beta=0.04$, p -values<.82). The interaction term did not reach significance for executive functions or verbal episodic memory (all p -values>0.15).

Replication Sample (Unmatched).

In the replication sample, men and women were comparably aged, though women were less well educated (16.9 vs 18.3 years, $p=0.008$; Table 1). Men and women in the replication sample did not differ on reported levels of physical activity, blood pressure, hemoglobin A1C, or HOMA-IR, though women had higher heart rates (68.2 vs. 63.5, $p=0.02$) and lower BMIs (24.5 vs. 27.1, $p=0.007$) compared to men; we adjusted for education, heart rate, and BMI in all analyses.

Only models that demonstrated small-to-medium effect sizes ($\beta >0.30$)⁵⁴ in the discovery cohort were tested in the replication cohort. Inflammatory markers examined included: MCP-4, MCP-1, eotaxin-3, MDC, MIP1 b, and INF γ ; cardiovascular markers included systolic and diastolic blood pressure; brain volume regions included total GMV and all medial temporal subregions; and cognition included visual episodic memory and processing speed.

Adjusting for education, BMI, and heart rate, we continued to observe medium effect size interactions between sex by physical activity for select pro-inflammatory chemokine markers, MCP-4 ($\beta=0.42$, $p=0.029$), MCP-1 ($\beta=0.27$, $p=0.17$), eotaxin-3 ($\beta=0.41$, $p=0.016$), and MIP1b ($\beta=0.36$, $p=0.07$). Again, the beneficial relationship between physical activity and immune markers in men (MCP-4 $\beta= -0.29$, $p=0.11$; MCP-1 $\beta=-0.23$, $p=0.21$; eotaxin-3 $\beta= -0.30$, $p=0.29$; MIP1b $\beta=-0.30$, $p=0.12$) was notably attenuated in women (MCP-4 $\beta=0.08$, $p=0.63$; MCP-1 $\beta=0.01$, $p=0.92$; eotaxin-3 $\beta=0.14$, $p=0.63$; MIP1b $\beta=0.02$, $p=0.90$). The sex by activity interaction effect on other inflammatory markers was small to negligible (β range= –0.27 to 0.03, all p -values>0.87). Regarding gray matter volumetries, sex by physical activity interaction terms demonstrated small benefits favoring males, but also did not reach statistical significance (GMV $\beta= -0.26$, $p=0.31$; parahippocampal $\beta= -0.15$,

$p=0.54$; hippocampal $\beta=-0.17$, $p=0.51$); the sex by activity interaction term examining entorhinal volumes favored females but did not reach statistical significance ($\beta=0.17$, $p=0.51$). Lastly, sex did not appear to meaningfully moderate the relationship between physical activity and cognition in the replication cohort (visual memory $\beta=0.03$, $p=0.87$; processing speed $\beta=0.17$, $p=0.46$).

Post-hoc: How does activity-related peripheral inflammation relate to brain and cognitive outcomes across sexes?

Adjusting for age, education, and BMI, we observed a sex by inflammatory composite (MCP-4, eotaxin-3, MIP-1b) interaction on total gray matter volume (inflammation*sex $\beta=0.27$, $p=0.029$) and visual memory (inflammation*sex $\beta=0.24$, $p=0.02$; Figure 5). In both models, there was a stronger inverse relationship between the exercise-inflammatory composite and brain health related outcomes only in men, but not women (Men: $\beta=-0.38$, $p=0.01$ (GMV); $\beta=-0.22$, $p=0.11$ (visual memory); Women: $\beta=0.04$, $p=0.73$ (GMV); $\beta=0.10$, $p=0.44$ (visual memory)). Models exploring sex by inflammatory interactions on medial temporal subregions or DLPFC volumes did not reach significance (inflammation*sex β range=0.14 to 0.17, all p -values<0.28), nor did models examining executive functions, processing speed, and verbal memory (inflammation*sex β range=0.03 to 0.09, all p -values<0.92) - however, all models demonstrated the same directionality (i.e., tighter relationship between inflammation and neurobehavioral outcomes in men *versus* women).

Discussion

Using demographically-matched and replication samples, we show that physical activity is disproportionately related to better markers of peripheral inflammation in typically aging men, and these activity-related inflammatory proteins disproportionately associate with brain and cognitive outcomes in men (Figure 5). In our discovery cohort, men showed a tighter relationship between reported daily physical activity and lower concentrations of MCP4, MCP1, MDC, MIP1b, INF γ , and eotaxin-3, larger parahippocampal volumes, and better visual memory and processing speed that appeared to be attenuated or absent in women. When replicated in an independent unmatched cohort, we observed similar effect sizes, particularly for plasma inflammatory markers MIP1b, MCP4, and eotaxin-3, though less consistently for neurobehavioral outcomes. Across cohorts, we then found that lower concentrations of these exercise-related inflammatory proteins were disproportionately associated with larger total gray matter volume and better visual memory in typically aging men compared to women. Taken together, our data suggest that immune regulation may be a sex-specific pathway by which men reap benefit from exercise on brain health. These data add to the emerging literature suggesting that exercise may differentially impact age-related neurological outcomes in men compared to women, and extends these works by implicating the immune system in contributing in sex-specific pathways.

It is difficult to determine from our observational design if these data indicate a *lessened* benefit in women or if typically aging men represent a high-risk group with *greater* benefit, particularly when it comes to immunologic health. Supporting the latter, females mount

generally larger and faster innate and adaptive immune responses to pathogens or injury resulting in more rapid clearance, repair and wound-healing, and efficacy of vaccines across species²⁴. Indeed, women show greater upregulation of immune-related transcriptional factors (e.g., TLR) following an immune challenge or vaccine, greater phagocytic activity of neutrophils and macrophages, and more effective antigen-presenting activity compared to men^{27,55}. Given that exercise is linked to maintenance of immune homeostasis^{34,35}, perhaps the more tightly coupled effects observed between both physical activity and peripheral inflammation, and between peripheral inflammation and neurobehavior in our older adult men reflect this male risk bias. That is, older men may need exercise to a greater degree than women to keep either their vulnerable immune systems in check and/or mount an appropriate immunologic response, whereas low physical activity is simply less detrimental to women's already robust immune system. Further supporting this line of thinking and as related to the brain, we found a stronger relationship between activity-related inflammation and brain structure and function in men compared to women. These data suggest that immune dysregulation may be particularly detrimental to the aging male brain. Taken together, in states of health, perhaps women's more inherently robust immune system is less important for and/or confers a female-specific resilience to the effects of typical brain aging, whereas men need greater support (in the form of exercise) to maintain the same level of immune and cognitive functioning.

On the other hand, although converging lines of evidence clearly indicate that females benefit from exercise^{4,56}, it is possible that the degree or pattern may differ, and/or that women require a larger amount of exercise to gain the same benefits as men. In female ovariectomized mice, Berchtold and colleagues (2001) showed that not only was estrogen loss associated with reduced voluntary exercise, but the beneficial effect of exercise on hippocampal neurotrophic expression (i.e., mRNA BDNF) was significantly attenuated in the absence of estrogen⁵⁷. Importantly, estrogen replacement resulted in improved exercise-induced BDNF levels in female hippocampi, though the effect was not entirely restored to baseline levels. Other studies additionally show greater hippocampal long-term potentiation and improved memory following voluntary exercise in male compared to female mice^{58,59}. Consistent with our findings, these data suggest that men may show greater neurobehavioral benefits following exercise, but the effects may be (at least in part) hormone-mediated.

Other clinical and animal studies have been less clear and perhaps indicate network-specificity to the observed sex-exercise effects on the brain. Though certainly not the case in all studies, there may be an emerging pattern suggesting a female-specific relationship between physical activity and dorsolateral prefrontal cortices and speeded/executive functioning tasks, with men demonstrating greater hippocampal and related memory-specific benefits^{36,58,60}. This network specificity may be consistent with the reported relative abundance of estrogen receptors not only in the hippocampus but also particularly, the prefrontal cortex (i.e., up to 50% of ER α receptors)⁶¹⁻⁶³. Our data recapitulate disproportionate effects of physical activity on medial temporal and memory functioning in men compared to women; yet, we did not observe a female-specific effect on prefrontal or executive/speeded tasks, or any other outcomes. One major study design difference was our utilization of demographic matching which aimed to remove sex-specific variance in age and educational differences that were not directly controlled for in other studies that used

stratified modeling (i.e., developed models in males and females separately versus direct testing of sex-specific slopes)³⁶. Additionally, we intentionally captured a cognitively homogeneous cohort of high-functioning, typically aging older adults, which differs from some previous works that included individuals with mild cognitive impairment. This cognitive homogeneity may be advantageous given the known differential sex effects on brain aging (i.e., women demonstrating more optimal trajectories in states of health but more precipitous declines in states of disease (e.g., Alzheimer's disease); nonetheless, it will be critical to parse out disease state specific effects of exercise by sex.

Regarding the specific inflammatory markers, we found that MIP1b, MCP4, and eotaxin-3 and to a lesser extent, MCP1, demonstrated the most consistent sex-specific relationships with physical activity across cohorts. Although it is difficult to draw pathway-specific interpretations from circulating protein levels, we do note that each of these markers are C-C motif chemokines involved in monocyte, granulocyte, and lymphocyte recruitment, migration, and activation^{64,65}. Interestingly, plasma levels of MCP1 have been linked to risk of AD diagnosis and longitudinal memory-specific declines in clinically normal adults by our group^{66,67}, and CSF (but not plasma) MCP1 has been shown to predict conversion from MCI and AD dementia in older adults⁶⁸. Additionally, we have also demonstrated that, among a larger panel of inflammatory markers, peripheral MIP1b concentrations were among the most closely associated with cerebrospinal fluid levels in healthy older adults ($r=0.55$) and were associated with higher CSF p-tau levels⁶⁹, suggesting that the relationships observed here may have implications for central nervous system inflammation and neurodegeneration. Additionally, eotaxins have increasingly been implicated in aging and neurodegenerative disease⁶⁵. Both in serum and CSF, eotaxin-3 levels relate to age⁷⁰, differ between normal and cognitively impaired patients,^{68,71} and serum concentrations have been proposed as a potential adjunct biomarker for AD⁷²; yet other studies of peripheral eotaxin-3 levels have failed to find group differences across cognitively impaired cohorts^{67,68,73}. Similarly, MCP-4 is known to increase with age and relate to chronic inflammatory diseases in the periphery, though CSF and peripheral levels have not tracked closely with cognition in older adults^{66,68}. Taken together, these peripheral proteins appear to show some relevant signals to age-related CNS function and AD risk, suggesting that systemic immune cell activation and recruitment may be pathway through which exercise relates to cognitive aging. Nonetheless, these are observational, clinical data, and future mechanistic works are greatly needed to parse out the immune-specific pathways (likely via network-based proteomics) represented in the periphery that may be moderated by exercise and driving CNS age-related health.

Although we are among the first to directly implicate the immune system as a potential sex-specific pathway between exercise and brain health, our understanding of other mechanisms driving this relationship are nascent and ultimately a complex interplay among chromosomal, hormonal, metabolic, and psychosocial contextual (e.g., health-seeking behavior, exposure) factors are likely implicated. A limitation to our study is that these retrospective data did not capture menopausal status or hormone replacement therapy, though the majority of women in our study were likely in postmenopausal stages (>94% of cohort were 60+ years old). As noted previously, estrogen availability may be a critical moderator of how the female brain gains benefits of exercise⁵⁷. Additionally, estradiol

importantly moderates immune responses with heightened inflammation at low levels but attenuated inflammation at high levels²⁴. On the other hand, androgen levels, including testosterone, also decline with age, and their decreases are associated with more adverse brain and cognitive outcomes^{74–76} and also (given their immunosuppressive role) greater states of age-related chronic inflammation²⁴. In-depth characterization of how sex hormone levels, including menopausal state and hormone replacement therapy, and age interact with physical activity and the immune system to impact the aging male and female brain are ongoing but clearly a high-need area of research. Furthermore, sex chromosomes are known to directly impact immune functioning^{77–79} and recent elegant experiments manipulating sex organs across sex chromosomal genotypes indicate that the X chromosome may drive female-linked longevity⁸⁰ and cognitive resilience in wildtype and AD mouse models, independently of sex hormones^{81,82}. Careful exploration of the synergistic and divergent effects of sex-relevant biologies (e.g., hormonal and chromosomal) is critically needed to disentangle these important emerging brain, behavior, and immune relationships.

Another major limitation of our study was the use of self-report for physical activity that did not explicitly differentiate activity intensity (e.g., aerobic vs resistance training). We cannot know if sex differences in reporting bias exist or impact our findings. That is, it is certainly possible that either women overestimated their activity resulting in an apparent greater male benefit at seemingly similar activity levels, or that men are engaged in more intensive physical activities that are not qualitatively captured on our self-report measure (e.g., jogging at the same frequency but a faster speed). We also did not systematically capture common medication regimens known to target immune-mediated processes (e.g., NSAIDs, corticosteroids, TNF inhibitors)^{83–85}, and may be an important confounder to evaluate in future works. Additionally, the observational design of the study inherently limits determination of causality, as it is possible that older adults with poorer overall functioning (e.g., poorer immune, cardiovascular, neurobehavioral health) are engaging in less physical activity. Lastly, although we utilized an independent-sample replication design, the sample sizes were small, making it difficult to meaningfully test more complex models (e.g., mediating effects). Future large cohort studies and, ultimately, randomized controlled trials that include fluid biological markers as well as neurobehavioral outcomes are critically needed to begin to parse out these mechanistic relationships.

Our data suggest sexual dimorphism influences how physical activity confers effects on the body and the brain. Namely, the beneficial effect of physical activity on brain health indicators may be more closely related to regulation of immune functioning for men, but not women. These data underscore the importance of personalized medicine approaches to better understand how and in whom certain behavioral interventions may be most efficacious. The critical role of biological sex on the development of the peripheral and central nervous systems and risk for disease with age is an exciting area of study that will likely lead to highly fruitful avenues of understanding both disease risk and resiliency more broadly.

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References

1. 2018 Alzheimer's disease facts and figures. *Alzheimer's Dement.* 2018. doi:10.1016/j.jalz.2018.02.001
2. Barnes DE, Yaffe K, Satariano WA, Tager IB. A Longitudinal Study of Cardiorespiratory Fitness and Cognitive Function in Healthy Older Adults. *J Am Geriatr Soc.* 2003;51(4):459–465. doi:10.1046/j.1532-5415.2003.51153.x [PubMed: 12657064]
3. Yaffe K, Fiocco AJ, Lindquist K, et al. Predictors of maintaining cognitive function in older adults: The Health ABC Study. *Neurology.* 2009;72(23):2029–2035. doi:10.1212/WNL.0b013e3181a92c36 [PubMed: 19506226]
4. Horder H, Johansson L, Guo X, et al. Midlife cardiovascular fitness and dementia: A 44-year longitudinal population study in women. *Neurology.* 3 2018:10.1212/WNL.0000000000005290. doi:10.1212/WNL.0000000000005290
5. Colcombe S, Kramer AF. Fitness effects on the cognitive function of older adults: A meta-analytic study. *Psychol Sci.* 2003. doi:10.1111/1467-9280.t01-1-01430
6. Kim RE, Yun C- H, Thomas RJ, et al. Lifestyle-dependent Brain Change: A Longitudinal Cohort MRI Study. *Neurobiol Aging.* 2018;10.1016/j.neurobiolaging.2018.04.017
7. Lovden M, Bodammer NC, KQhn S, et al. Experience-dependent plasticity of white-matter microstructure extends into old age. *Neuropsychologia.* 2010;48(13):3878–3883. doi:10.1016/j.neuropsychologia.2010.08.026 [PubMed: 20816877]
8. Boraxbekk C- J, Salami A, Wahlin A, Nyberg L. Physical activity over a decade modifies age-related decline in perfusion, gray matter volume, and functional connectivity of the posterior default-mode network—A multimodal approach. *Neuroimage.* 2016;131:133–141. doi:10.1016/j.neuroimage.2015.12.010 [PubMed: 26702778]
9. Erickson KI, Voss MW, Prakash RS, et al. Exercise training increases size of hippocampus and improves memory. doi:10.1073/pnas.1015950108
10. Wittfeld K, Jochem C, Dorr M, et al. Cardiorespiratory Fitness and Gray Matter Volume in the Temporal, Frontal, and Cerebellar Regions in the General Population. *Mayo Clin Proc.* 2020;95(1):44–56. doi: 10.1016/j.mayocp.2019.05.030 [PubMed: 31902428]
11. National Academies of Sciences Engineering and Medicine. Preventing Cognitive Decline and Dementia: A Way Forward.; 2017 <http://nationalacademies.org/hmd/reports/2017/preventing-cognitive-decline-and-dementia-a-way-forward.aspx>. Accessed November 20, 2018.
12. Lamb SE, Sheehan B, Atherton N, et al. Dementia And Physical Activity (DAPA) trial of moderate to high intensity exercise training for people with dementia: randomised controlled trial. *BMJ.* 2018;361 :k1675. doi:10.1136/BMJ.K1675 [PubMed: 29769247]
13. Cotman CW, Berchtold NC, Christie LA. Exercise builds brain health: key roles of growth factor cascades and inflammation. *Trends Neurosci.* 2007;30(9):464–472. doi:10.1016/j.tins.2007.06.011 [PubMed: 17765329]
14. Casaletto KB, Elahi FM, Staffaroni AM, et al. Cognitive aging is not created equally: differentiating unique cognitive phenotypes in “normal” adults. *Neurobiol Aging.* 2019. doi: 10.1016/j.neurobiolaging.2019.01.007
15. Jack CR, Wiste HJ, Weigand SD, et al. Age, Sex, and APOE e4 Effects on Memory, Brain Structure, and β -Amyloid Across the Adult Life Span. *JAMA Neurol.* 2015;72(5):511. doi: 10.1001/jamaneurol.2014.4821 [PubMed: 25775353]
16. Horvath S, Gurven M, Levine ME, et al. An epigenetic clock analysis of race/ethnicity, sex, and coronary heart disease. *Genome Biol.* 2016; 17(1): 171. doi: 10.1186/s13059-016-1030-0 [PubMed: 27511193]

17. Goyal MS, Blazey TM, Su Y, et al. Persistent metabolic youth in the aging female brain. *Proc Natl Acad Sci U S A*. 2019; 116(8):3251–3255. doi: 10.1073/pnas.1815917116 [PubMed: 30718410]
18. Buckley RF, Mormino EC, Rabin JS, et al. Sex Differences in the Association of Global Amyloid and Regional Tau Deposition Measured by Positron Emission Tomography in Clinically Normal Older Adults. *JAMA Neurol*. 2019. doi: 10.1001/jamaneurol.2018.4693
19. Koran MEI, Wagener M, Hohman TJ. Sex differences in the association between AD biomarkers and cognitive decline. *Brain Imaging Behav*. 2017. doi: 10.1007/s11682-016-9523-8
20. Hohman TJ, Dumitrescu L, Barnes LL, et al. Sex-specific association of apolipoprotein e with cerebrospinal fluid levels of tau. *JAMA Neurol*. 2018. doi:10.1001/jamaneurol.2018.0821
21. Bis JC, Jian X, Kunkle BW, et al. Whole exome sequencing study identifies novel rare and common Alzheimer's-Associated variants involved in immune response and transcriptional regulation. *Mol Psychiatry*. 8 2018:1–17. doi:10.1038/s41380-018-0112-7
22. Gjoneska E, Pfenning AR, Mathys H, et al. Conserved epigenomic signals in mice and humans reveal immune basis of Alzheimer's disease. *Nature*. 2015;518(7539):365–369. doi:10.1038/nature14252 [PubMed: 25693568]
23. Jones L, Lambert J- C, Wang L- S, et al. Convergent genetic and expression data implicate immunity in Alzheimer's disease. *Alzheimer's Dement*. 2015;11(6):658–671. doi:10.1016/j.jalz.2014.05.1757 [PubMed: 25533204]
24. Klein SL, Flanagan KL. Sex differences in immune responses. *Nat Rev Immunol*. 2016. doi:10.1038/nri.2016.90
25. Zuk M The Sicker Sex. Rall GF, ed. *PLoS Pathog*. 2009;5(1):e1000267. doi:10.1371/journal.ppat.1000267 [PubMed: 19180235]
26. Villapol S, Loane DJ, Burns MP. Sexual dimorphism in the inflammatory response to traumatic brain injury. *Glia*. 2017;65(9):1423–1438. doi:10.1002/glia.23171 [PubMed: 28608978]
27. Hannah MF, Bajic VB, Klein SL. Sex differences in the recognition of and innate antiviral responses to Seoul virus in Norway rats. *Brain Behav Immun*. 2008. doi:10.1016/j.bbi.2007.10.005
28. Hou J, Wu FZ. Effect of sex hormones on NK and ADCC activity of mice. *Int J Immunopharmacol*. 1988; 10(1):15–22. doi:10.1016/0192-0561(88)90145-2 [PubMed: 3366506]
29. Rettew JA, Huet-Hudson YM, Marriott I. Testosterone Reduces Macrophage Expression in the Mouse of Toll-Like Receptor 4, a Trigger for Inflammation and Innate Immunity. *Biol Reprod*. 2008;78(3):432–437. doi:10.1095/biolreprod.107.063545 [PubMed: 18003947]
30. Northey JM, Cherbuin N, Pumpa KL, Smee DJ, Rattray B. Exercise interventions for cognitive function in adults older than 50: a systematic review with meta-analysis. *Br J Sports Med*. 4 2017:bjsports-2016–096587. doi: 10.1136/bjsports-2016-096587
31. Anderson L, Oldridge N, Thompson DR, et al. Exercise-Based Cardiac Rehabilitation for Coronary Heart Disease Cochrane Systematic Review and Meta-Analysis. *J Am Coll Cardiol*. 2016;67(1):1–12. doi:10.1016/j.jacc.2015.10.044 [PubMed: 26764059]
32. Fedewa M V, Hathaway ED, Ward-Ritacco CL. Effect of exercise training on C-reactive protein: a systematic review and meta-analysis of randomised and non-randomised controlled trials. doi:10.1136/bjsports-2016-095999
33. Fiuza-Luces C, Santos-Lozano A, Joyner M, et al. Exercise benefits in cardiovascular disease: beyond attenuation of traditional risk factors. *Nat Rev Cardiol*. 2018;15(12):731–743. doi:10.1038/s41569-018-0065-1 [PubMed: 30115967]
34. Duggal NA, Niemiro G, Harridge SDR, Simpson RJ, Lord JM. Can physical activity ameliorate immunosenescence and thereby reduce age-related multi-morbidity? *Nat Rev Immunol*. 2019; 19(9):563–572. doi:10.1038/s41577-019-0177-9 [PubMed: 31175337]
35. Gleeson M, Bishop NC, Stensel DJ, Lindley MR, Mastana SS, Nimmo MA. The anti-inflammatory effects of exercise: Mechanisms and implications for the prevention and treatment of disease. *Nat Rev Immunol*. 2011. doi:10.1038/nri3041
36. Barha CK, Best JR, Rosano C, Yaffe K, Catov JM, Liu-Ambrose T. Sex-Specific Relationship Between Long-Term Maintenance of Physical Activity and Cognition in the Health ABC Study: Potential Role of Hippocampal and Dorsolateral Prefrontal Cortex Volume. *Journals Gerontol Ser A*. 4 2019. doi:10.1093/gerona/glz093

37. Dao E, Barha CK, Best JR, Hsiung GY, Tam R, Liu-Ambrose T. The Effect of Aerobic Exercise on White Matter Hyperintensity Progression May Vary by Sex. *Can J Aging*. 2019;38(2):236–244. doi: 10.1017/S0714980818000582 [PubMed: 30867079]
38. Barha CK, Hsiung GYR, Best JR, et al. Sex Difference in Aerobic Exercise Efficacy to Improve Cognition in Older Adults with Vascular Cognitive Impairment: Secondary Analysis of a Randomized Controlled Trial. *J Alzheimer's Dis*. 2017;60(4):1397–1410. doi:10.3233/JAD-170221 [PubMed: 29036816]
39. Barha CK, Falck RS, Davis JC, Nagamatsu LS, Liu-Ambrose T. Sex differences in aerobic exercise efficacy to improve cognition: A systematic review and meta-analysis of studies in older rodents. *Front Neuroendocrinol*. 2017;46:86–105. doi:10.1016/j.yfrne.2017.06.001 [PubMed: 28614695]
40. Barha CK, Liu-Ambrose T. Exercise and the Aging Brain: Considerations for Sex Differences. *Brain Plast*. 2018;4(1):53–63. doi:10.3233/bpl-180067 [PubMed: 30564546]
41. Bott NT, Bettcher BM, Yokoyama JS, et al. Youthful Processing Speed in Older Adults: Genetic, Biological, and Behavioral Predictors of Cognitive Processing Speed Trajectories in Aging. *Front Aging Neurosci*. 2017;9:55. doi:10.3389/fnagi.2017.00055 [PubMed: 28344553]
42. Lindbergh C, Casaletto KB, Staffaroni AM, et al. Systemic Tumor Necrosis Factor-Alpha Trajectories Relate to Brain Health in Typically Aging Older Adults. *J Gerontology Med Sci*.
43. Kramer Joel H.; Juri Jennifer; Sha Sharon J.; Rankin Kate P.; Rosen Howard J.; Johnson Julene K.; Miller BLM. Distinctive Neuropsychological Patterns in Frontotemporal Dementia, Semantic Dementia, And Alzheimer Disease. *Cogn Behav Neurol*. 2003;16(4):211–218. <http://ovidsp.uk.ovid.com/sp-3.27.2b/ovidweb.cgi?QS2=434f4e1a73d37e8c6d5cc3ea7a7100e09ed58082c7a5078041ec5dd93115ee3c4d1685b49b33ca59e684eab23d8ab323358d6fcb2ffb60478ac06f45f37b6625f91b6afcebec9099709edcdc1fe0ebeca549a70b5bce8d76d1de1a064d20884f6e13e08d63>. Accessed January 7, 2018. [PubMed: 14665820]
44. Casaletto KB, Elahi FM, Fitch R, et al. A comparison of biofluid cytokine markers across platform technologies: Correspondence or divergence? *Cytokine*. 2018. doi:10.1016/j.cyto.2018.05.032
45. Sled JG, Zijdenbos a P, Evans a C. A nonparametric method for automatic correction of intensity nonuniformity in MRI data. *IEEE Trans Med Imaging*. 1998. doi:10.1109/42.668698
46. Ashburner J, Friston KJ. Unified segmentation. *Neuroimage*. 2005. doi:10.1016/j.neuroimage.2005.02.018
47. Ashburner J A fast diffeomorphic image registration algorithm. *Neuroimage*. 2007. doi:10.1016/j.neuroimage.2007.07.007
48. Mazziotta JC, Toga AW, Evans A, Fox P, Lancaster J. A probabilistic atlas of the human brain: theory and rationale for its development. The International Consortium for Brain Mapping (ICBM). *Neuroimage*. 1995;2(2):89–101.
49. Desikan RS, Segonne F, Fischl B, et al. An automated labeling system for subdividing the human cerebral cortex on MRI scans into gyral based regions of interest. *Neuroimage*. 2006. doi:10.1016/j.neuroimage.2006.01.021
50. Kramer AF, Erickson KI. Capitalizing on cortical plasticity: influence of physical activity on cognition and brain function. *Trends Cogn Sci*. 2007. doi:10.1016/j.tics.2007.06.009
51. Kerchner GA, Racine CA, Hale S, et al. Cognitive Processing Speed in Older Adults: Relationship with White Matter Integrity. *PLoS One*. 2012;7(11). doi:10.1371/journal.pone.0050425
52. Delis DC, Kramer JH, Kaplan E, Ober BA. California Verbal Learning Test: Adult Version (CVLT-II): Manual. 2nd ed San Antonio TX: Psychological Corporation; 2000.
53. Casaletto KB, Marx G, Dutt S, et al. Is “Learning” episodic memory? Distinct cognitive and neuroanatomic correlates of immediate recall during learning trials in neurologically normal aging and neurodegenerative cohorts. *Neuropsychologia*. 2017;102. doi:10.1016/j.neuropsychologia.2017.05.021
54. Cohen Jacob. *Statistical Power Analyses for the Behavioral Sciences*. 2nd ed Routledge; 1988.
55. Klein SL, Jedlicka A, Pekosz A. The Xs and Y of immune responses to viral vaccines. *Lancet Infect Dis*. 2010. doi:10.1016/S1473-3099(10)70049-9

56. Yaffe K, Barnes D, Nevitt M, Lui L- Y, Covinsky K. A Prospective Study of Physical Activity and Cognitive Decline in Elderly Women. *Arch Intern Med.* 2001;161(14):1703. doi: 10.1001/archinte.161.14.1703 [PubMed: 11485502]
57. Berchtold NC, Kessler JP, Pike CJ, Adlard PA, Cotman CW. Estrogen and exercise interact to regulate brain-derived neurotrophic factor mRNA and protein expression in the hippocampus. *Eur J Neurosci.* 2001; 14(12): 1992–2002. doi: 10.1046/j.0953-816x.2001.01825.x [PubMed: 11860494]
58. Barha CK, Falck RS, Davis JC, Nagamatsu LS, Liu-Ambrose T. Sex differences in aerobic exercise efficacy to improve cognition: A systematic review and meta-analysis of studies in older rodents. *Front Neuroendocrinol.* 2017;46:86–105. doi:10.1016/J.YFRNE.2017.06.001 [PubMed: 28614695]
59. Titterness AK, Wiebe E, Kwasnica A, Keyes G, Christie BR. Voluntary exercise does not enhance long-term potentiation in the adolescent female dentate gyrus. *Neuroscience.* 2011; 183:25–31. doi: 10.1016/j.neuroscience.2011.03.050 [PubMed: 21458541]
60. Barha CK, Davis JC, Falck RS, Nagamatsu LS, Liu-Ambrose T. Sex differences in exercise efficacy to improve cognition: A systematic review and meta-analysis of randomized controlled trials in older humans. *Front Neuroendocrinol.* 2017;46:71–85. doi:10.1016/J.YFRNE.2017.04.002 [PubMed: 28442274]
61. Goldstein JM. Normal Sexual Dimorphism of the Adult Human Brain Assessed by In Vivo Magnetic Resonance Imaging. *Cereb Cortex.* 2001 ;11(6):490–497. doi: 10.1093/cercor/11.6.490 [PubMed: 11375910]
62. Donahue JE, Stopa EG, Chorsky RL, et al. Cells containing immunoreactive estrogen receptor- α in the human basal forebrain. *Brain Res.* 2000;856(1–2):142–151. doi:10.1016/S0006-8993(99)02413-0 [PubMed: 10677621]
63. Wang ACJ, Hara Y, Janssen WGM, Rapp PR, Morrison JH. Synaptic estrogen receptor- α levels in prefrontal cortex in female rhesus monkeys and their correlation with cognitive performance. *J Neurosci.* 2010;30(38): 12770–12776. doi: 10.1523/JNEUROSCI.3192-10.2010 [PubMed: 20861381]
64. Laing KJ, Secombes CJ. Chemokines. *Dev Comp Immunol.* 2004;28(5):443–460. doi:10.1016/j.dci.2003.09.006 [PubMed: 15062643]
65. Huber AK, Giles DA, Segal BM, Irani DN. An emerging role for eotaxins in neurodegenerative disease. *Clin Immunol.* 2018;189:29–33. doi: 10.1016/j.dim.2016.09.010 [PubMed: 27664933]
66. Bettcher BM, Neuhaus J, Wynn MJ, et al. Increases in a Pro-inflammatory Chemokine, MCP-1, Are Related to Decreases in Memory over Time. *Front Aging Neurosci.* 2019. doi:10.3389/fnagi.2019.00025
67. Bettcher BM, Fitch R, Wynn MJ, et al. MCP-1 and eotaxin-1 selectively and negatively associate with memory in MCI and Alzheimer’s disease dementia phenotypes. *Alzheimer’s Dement Diagnosis, Assess Dis Monit.* 2016;3:91–97. doi:10.1016/j.dadm.2016.05.004
68. Westin K, Buchhave P, Nielsen H, Minthon L, Janciauskiene S, Hansson O. CCL2 is associated with a faster rate of cognitive decline during early stages of Alzheimer’s disease. *PLoS One.* 2012;7(1):e30525. doi:10.1371/journal.pone.0030525 [PubMed: 22303443]
69. Bettcher BM, Johnson SC, Fitch R, et al. Cerebrospinal Fluid and Plasma Levels of Inflammation Differentially Relate to CNS Markers of Alzheimer’s Disease Pathology and Neuronal Damage. *J Alzheimer’s Dis.* 2018;62(1). doi:10.3233/JAD-170602
70. Craig-Schapiro R, Kuhn M, Xiong C, et al. Multiplexed immunoassay panel identifies novel CSF biomarkers for alzheimer’s disease diagnosis and prognosis. *PLoS One.* 2011;6(4). doi:10.1371/journal.pone.0018850
71. Choi C, Jeong JH, Jang JS, et al. Multiplex analysis of cytokines in the serum and cerebrospinal fluid of patients with Alzheimer’s disease by color-coded bead technology. *J Clin Neurol.* 2008;4(2):84–88. doi:10.3988/jcn.2008.4.2.84 [PubMed: 19513308]
72. O’Bryant S, Guanghua X, Robert B, et al. S4–01-03: A Serum protein-based algorithm for the detection of Alzheimer’s disease. *Alzheimer’s Dement.* 2011;7:S674–S675. doi:10.1016/j.jalz.2011.05.1944

73. Leung R, Proitsi P, Simmons A, et al. Inflammatory Proteins in Plasma Are Associated with Severity of Alzheimer's Disease. *PLoS One*. 2013;8(6). doi:10.1371/journal.pone.0064971
74. Moffat SD. Effects of Testosterone on Cognitive and Brain Aging in Elderly Men. *Ann NY Acad Sci*. 2005;1055:80–92. doi:10.1196/annals.1323.014 [PubMed: 16387720]
75. Lv W, Du N, Liu Y, et al. Low Testosterone Level and Risk of Alzheimer's Disease in the Elderly Men: a Systematic Review and Meta-Analysis. *Mol Neurobiol*. 2016;53(4):2679–2684. doi: 10.1007/s12035-015-9315-y [PubMed: 26154489]
76. Janowsky JS. Thinking with your gonads: Testosterone and cognition. *Trends Cogn Sci*. 2006; 10(2):77–82. doi: 10.1016/j.tics.2005.12.010 [PubMed: 16386941]
77. Bianchi I, Lleo A, Gershwin ME, Invernizzi P. The X chromosome and immune associated genes. *J Autoimmun*. 2012;38(2–3). doi: 10.1016/j.jaut.2011.11.012
78. Libert C, Dejager L, Pinheiro I. The X chromosome in immune functions: When a chromosome makes the difference. *Nat Rev Immunol*. 2010;10(8):594–604. doi: 10.1038/nri2815 [PubMed: 20651746]
79. Smith-Bouvier DL, Divekar AA, Sasidhar M, et al. A role for sex chromosome complement in the female bias in autoimmune disease. *J Exp Med*. 2008;205(5): 1099–1108. doi: 10.1084/jem.20070850 [PubMed: 18443225]
80. Davis EJ, Lobach I, Dubal DB. Female XX sex chromosomes increase survival and extend lifespan in aging mice. *Aging Cell*. 2019; 18(1). doi: 10.1111/accel.12871
81. Davis E, Broestl L, Abdulai-Saiku S, et al. The second X chromosome confers resilience against Alzheimer's related deficits in male and female mice.
82. Dubai DB, Rogine C. Apolipoprotein E ϵ 4 and Risk Factors for Alzheimer Disease—Let's Talk About Sex. *JAMA Neurol*. 2017;74(10):1167. doi:10.1001/jamaneurol.2017.1470 [PubMed: 28846761]
83. Ali T, Bronz, Kaitha, Mahmood, Ftai Stone. Clinical use of anti-TNF therapy and increased risk of infections. *Drug Healthc Patient Saf*. 2013;5:79. doi: 10.2147/dhps.s28801 [PubMed: 23569399]
84. Tsuboi I, Tanaka H, Nakao M, Shichijo S, Itoh K. Nonsteroidal anti-inflammatory drugs differentially regulate cytokine production in human lymphocytes: Up-regulation of tnf, ifn- γ and il-2, in contrast to down-regulation of il-6 production. *Cytokine*. 1995;7(4):372–379. doi: 10.1006/cyto.1995.0047 [PubMed: 8589268]
85. Wallen N, Kita H, Weiler D, Gleich GJ. Glucocorticoids inhibit cytokine-mediated eosinophil survival. *J Immunol*. 1991; 147(10):3490–3495. <http://www.ncbi.nlm.nih.gov/pubmed/1940348>. Accessed May 4, 2020. [PubMed: 1940348]

Highlights

- Exercise relates to better immune and brain aging, and both systems evidence sexual dimorphism.
- Greater physical activity related to lower peripheral chemokine markers only in aged men.
- Lower chemokine markers related to better brain structure and function only in aged men
- Inflammation may be a male-specific pathway through which exercise confers neurobehavioral benefit.

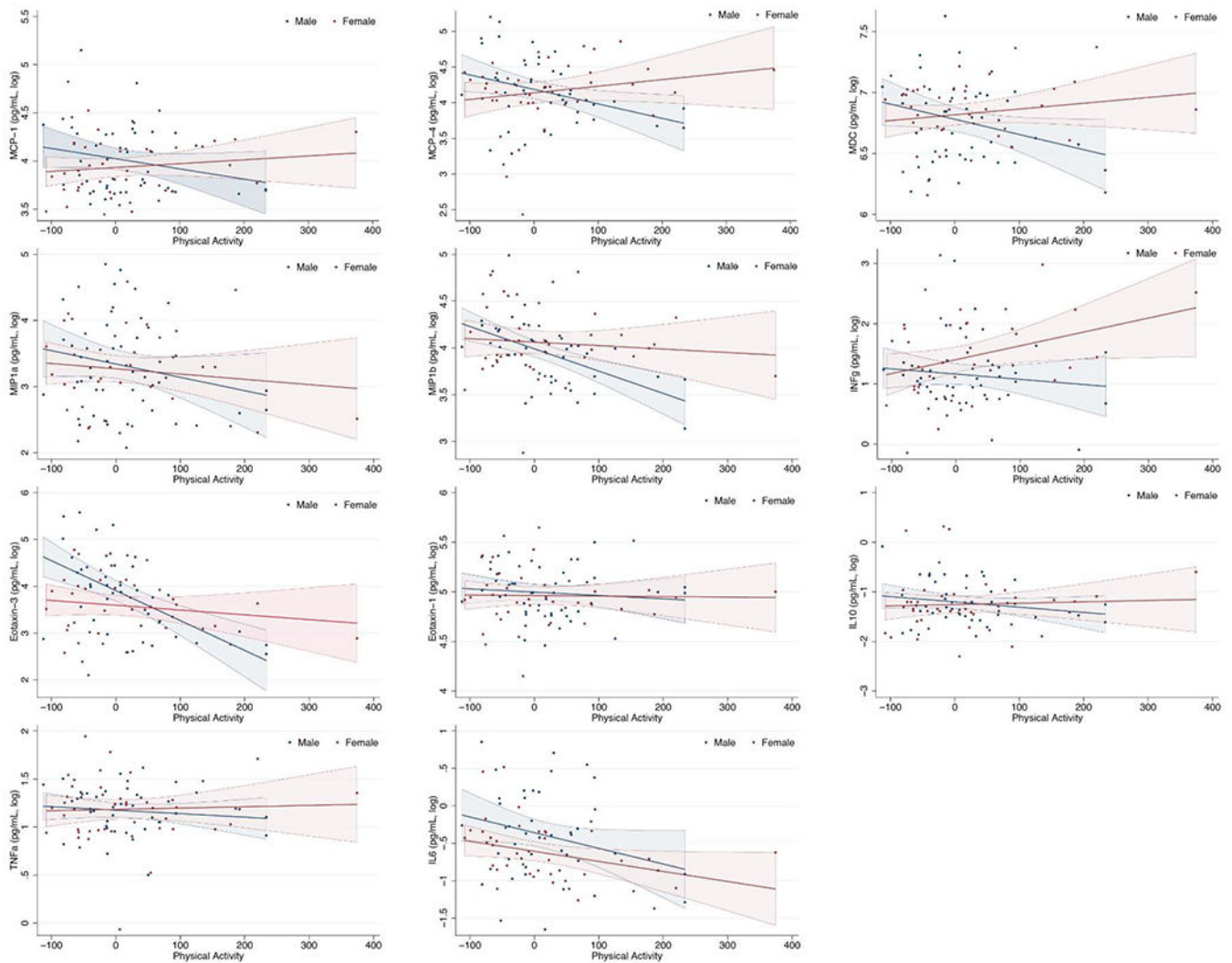


Figure 1. Men demonstrate a stronger relationship between reported physical activity and peripheral inflammatory markers compared to women (Discovery cohort models).

Note. Interaction terms for MDC, MIP-1b, MCP-4, eotaxin-3 (all p-values <0.05), and MCP-1 and $INF\gamma$ (p-values <0.09) demonstrated small-to-medium effects (all β values >0.32; MCP-4, MIP-1b, eotaxin-3, and MCP-1 demonstrated similar effect sizes in replication

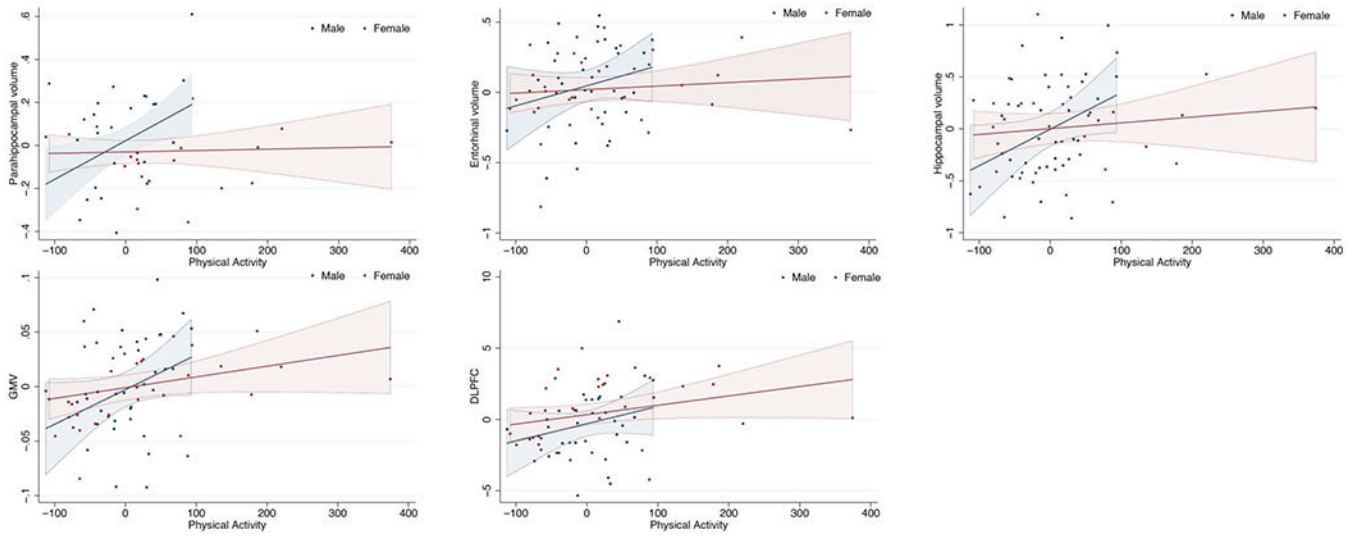


Figure 2.

Men demonstrate a stronger relationship between reported physical activity and brain volume outcomes compared to women (Discovery cohort models).

Note. Interaction terms for parahippocampal ($p=0.02$), hippocampal ($p=0.19$) and gray matter volume (GMV; $p=0.19$) demonstrated small-to-medium effects (all β values >0.41).

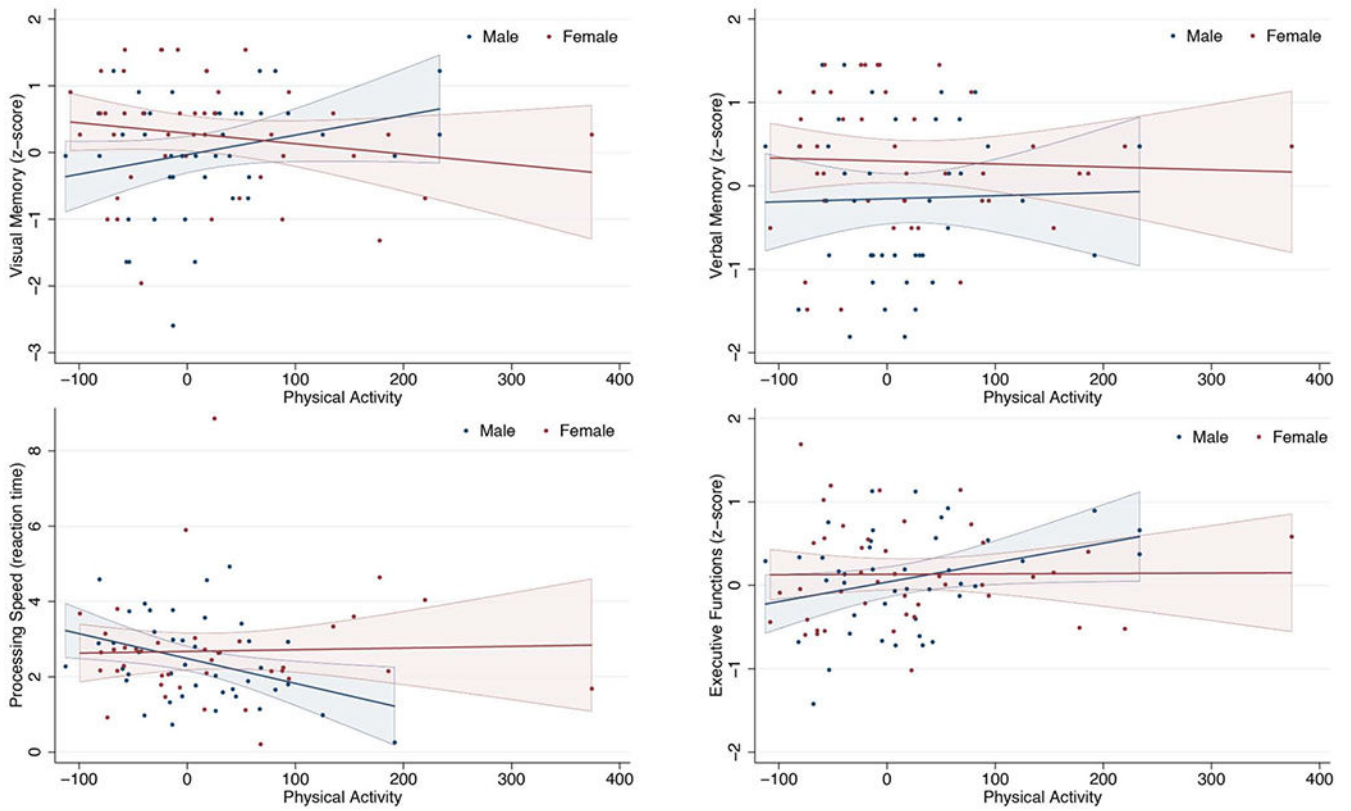


Figure 3.

Men demonstrate a stronger relationship between reported physical activity and cognitive outcomes compared to women (Discovery cohort models).

Note. Interaction terms for visual memory ($p=0.04$) and processing speed ($p=0.07$) demonstrated small-to-medium effect sizes ((all β values >0.37)).

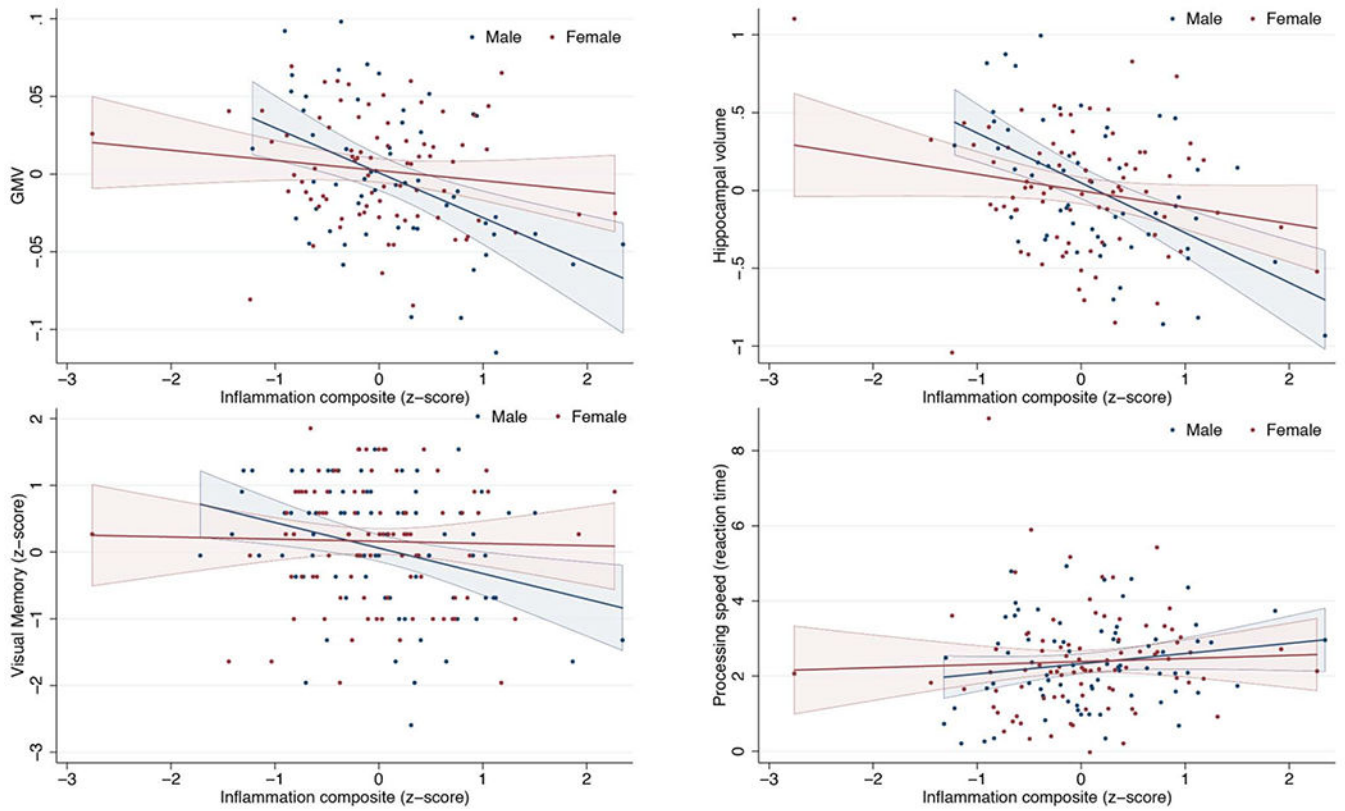


Figure 4.

Post-hoc models exploring the differential relationship between activity-related inflammatory markers (MCP4, eotaxin-3, and MIP1b) and brain structure and function across sexes.

Note. Interaction terms for gray matter volume (GMV; $p=0.03$) and visual memory ($p=0.02$) demonstrated small effect sizes (all β values >0.24).

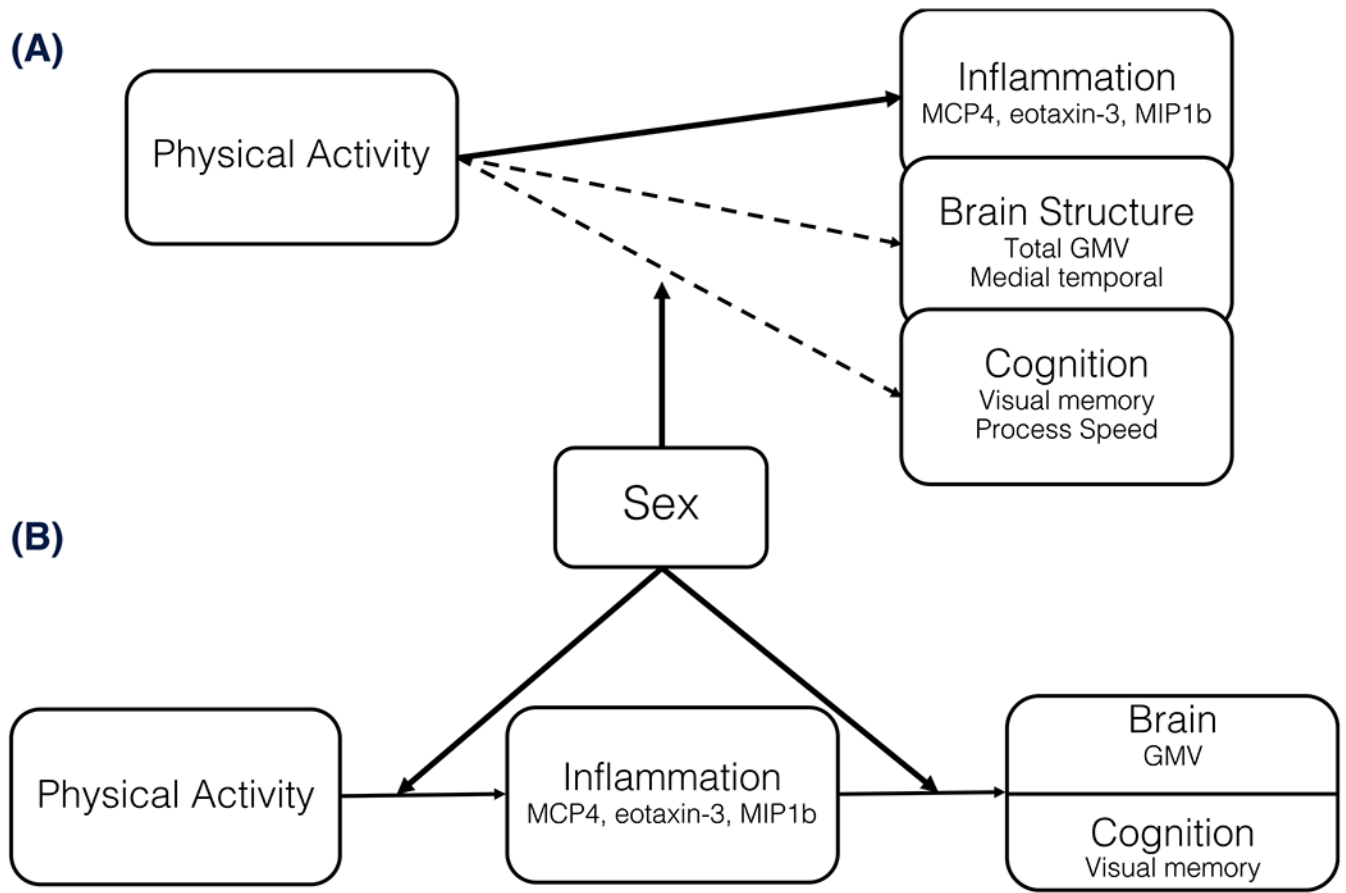


Figure 5. Summary schematic of primary study findings: (A) Initial models in the Discovery Cohort indicated that sex moderated the relationship between physical activity and markers of immune, brain and cognitive health, with men demonstrating a stronger relationship that appeared attenuated-to-absent in women; however, the most consistent effect reproduced in the Replication Cohort was demonstrated for inflammatory markers; (B) Taking together both the initial and post-hoc models, greater reported physical activity related to lower markers of inflammation in men only, and lower markers of inflammation related to better brain and cognitive outcomes in men only.

Table 1.

Discovery and Replication cohort demographic and clinical characteristics.

	DISCOVERY COHORT*			REPLICATION COHORT		
	Female	Male	p-value	Female	Male	p-value
	n=45	n=45		n=45	n=36	
Age	72.0 (8.0)	73.0 (8.4)	0.53	73.5 (6.6)	74.4 (7.6)	0.55
Education	17.1 (1.9)	17.7 (1.8)	0.11	16.8 (2.3)	18.2 (2.3)	0.006
MMSE	29.3 (1.2)	29.1 (1.2)	0.28	29.0 (1.1)	28.8 (1.6)	0.68
BMI	24.9 (4.6)	25.6 (3.4)	0.39	24.5 (3.8)	26.9 (4.7)	0.01
Hemoglobin A1C	5.46 (0.3)	5.44 (0.4)	0.78	5.53 (0.3)	5.51 (0.3)	0.70
HOMA-IR	1.73 (1.1)	2.04 (1.6)	0.32	2.57 (1.8)	2.94 (1.8)	0.38
Blood pressure	129.3 (13.8)		0.32	133.8 (19.7)		0.14
Systolic	72.0 (9.0)	132.4 (14.3)	0.69	71.8 (7.5)	128.0 (13.7)	0.32
Diastolic		72.8 (8.5)			73.6 (8.3)	
Reported Physical Activity (PASE)	150.1 (96.7)	156.9 (83.9)	0.72	137 (75.3)	120.6 (66.5)	0.31

* **Note.** Case-control matched on age ($\pm 5\gamma$) and education ($\pm 2\gamma$). MMSE = Mini Mental Status Examination; BMI = body mass index; HOMA-IR = homeostatic model assessment of insulin resistance; PASE = Physical Activity Scale for the Elderly.

Table 2.

Discovery cohort plasma inflammatory marker concentrations do not substantially differ by sex.

DISCOVERY COHORT	Female (n=45)	Male (n=45)	p-value
CHEMOKINES			
MDC	955.5 (786.5, 1123.3)	883.6 (652.0, 1073.3)	0.27
MIP1a	26.9 (14.4, 44.0)	23.2 (14.0, 41.4)	0.84
MIP1b	53.6 (44.8, 77.1)	54.8 (40.2, 64.4)	0.20
MCP-1	49.2 (40.2, 64.3)	47.2 (40.0, 72.8)	0.43
MCP-4		61.9 (49.1, 85.3)	0.97
Eotaxin-1	137.7 (120.0, 168.1)	147 (121.6, 174.8)	0.61
Eotaxin-3	36.8 (21.4, 59.7)	45.2 (20.8, 82.2)	0.23
INF γ	3.7 (2.4, 7.2)	3.0 (2.3, 4.0)	0.04
CYTOKINES			
IL-10	0.26 (0.21, 0.34)	0.28 (0.23, 0.45)	0.65
IL-6	0.51 (0.40, 0.71)	0.68 (0.43, 1.1)	0.03
TNF α	3.3 (2.7, 4.0)	3.3 (2.8, 3.8)	0.75

Note. Median (interquartile range) reported.

Table 3.

Sex moderates the relationship between reported physical activity and peripheral inflammatory markers (Discovery cohort models).

	MDC		MIP1b		MIP1a		Estroin-1		Estroin-3		MCP-1		MCP-4		INFγ		IP10		IL-6		TNFα		IL-10	
	B	95% CI	B	95% CI	B	95% CI	B	95% CI	B	95% CI	B	95% CI	B	95% CI	B	95% CI	B	95% CI	B	95% CI	B	95% CI	B	95% CI
BMI	0.29	0.096, 0.04	-0.21	-0.037, -0.0006	0.12	-0.02, 0.06	-0.08	-0.02, 0.009	0.45	-0.52, 0.09	-0.07	-0.02, 0.01	0.09	-0.01, 0.04	0.08	-0.02, 0.05	0.10	-0.01, 0.04	0.19	-0.003, 0.05	0.03	-0.01, 0.02	0.12	-0.01, 0.04
Sex	0.19	-0.01, 0.23	0.12	-0.06, 0.23	-0.04	-0.35, 0.23	-0.08	-0.16, 0.07	0.45	-0.52, 0.09	-0.11	-0.22, 0.07	0.02	-0.18, 0.22	0.24	0.06, 0.61	0.15	-0.07, 0.34	-0.19	-0.40, 0.02	0.03	-0.11, 0.15	-0.01	-0.23, 0.20
PASE	-0.30	-0.002, 5.8E-5	-0.59	-0.004, -0.001	-0.26	-0.005, 0.001	-0.14	-0.002, 0.007	0.45	-0.009, -0.005	-0.28	-0.002, 0.0005	0.12	-0.35, -1.4E3	-0.10	-0.003, 0.002	0.06	-0.002, 0.002	-0.33	-0.004, 5.8E5	-0.11	-0.001, 0.001	-0.17	-0.003, 0.001
Sex* PASE	0.36	0.001, 0.003	0.39	0.003, 0.004	0.13	-0.002, 0.005	0.09	-0.001, 0.001	0.45	0.002, 0.009	0.30	-0.003, 0.003	0.41	0.004, 0.005	0.32	-0.002, 0.006	-0.03	-0.003, 0.002	0.09	-0.002, 0.003	0.12	-0.001, 0.002	0.17	-0.001, 0.004

Note. Male=1, Female=2; B = standardized beta parameters; bolded models reproduced similar effect sizes in replication cohort. BMI body mass index; PASE = Physical Activity Scale for the Elderly.

Table 4.

Sex moderates the relationship between reported physical activity and neurobehavioral outcomes (Discovery cohort models).

COGNITIVE OUTCOMES															
	Visual Processing Speed*			Executive Functions			Verbal Memory			Visual Memory					
	B	95% CI	p-value	B	95% CI	p-value	B	95% CI	p-value	B	95% CI	p-value			
BMI	-0.02	-0.08, 0.07	0.87	0.05	-0.03, 0.04	0.65	0.02	-0.04, 0.05	0.83	0.03	-0.04, 0.05	0.82			
Sex	0.11	-0.29, 0.88	0.32	0.07	-0.18, 0.34	0.55	0.25	0.05, 0.84	0.03	0.13	-0.15, 0.61	0.24			
PASE	-0.44	-0.01, -0.0003	0.04	0.35	-0.5, 6e5, 0.005	0.055	0.03	-0.003, 0.004	0.88	0.30	-0.001, 0.006	0.09			
Sex*PASE	0.40	-0.0005, 0.02	0.065	-0.26	-0.005, 0.0008	0.15	-0.05	-0.005, 0.004	0.80	-0.37	-0.01, -0.0001	0.043			
BRAIN VOLUME OUTCOMES															
	GMV			DLPFC			Parahippocampal			Entorhinal			Hippocampus		
	B	95% CI	p-value	B	95% CI	p-value	B	95% CI	p-value	B	95% CI	p-value	B	95% CI	p-value
BMI	-0.12	-0.003, 0.001	0.34	-0.15	-0.02, 0.05	0.23	0.10	-0.006, 0.01	0.42	-0.12	-0.02, 0.008	0.34	0.11	-0.01, 0.04	0.39
Sex	-0.05	-0.02, 0.02	0.66	0.10	-0.08, 1.6	0.49	-0.21	-0.16, -0.01	0.09	-0.14	-0.21, 0.06	0.28	-0.05	-0.27, 0.18	0.41
PASE	0.64	1.0e-5, 0.001	0.04	0.43	-0.005, 0.03	0.17	0.82	0.0004, 0.003	0.009	0.40	-0.001, 0.003	0.21	0.57	-0.00004, 0.007	0.08
Sex*PASE	-0.41	-0.001, 0.0001	0.19	-0.19	-0.03, 0.01	0.53	-0.72	-0.003, -0.0003	0.02	-0.31	-0.003, 0.001	0.35	-0.41	-0.006, 0.001	0.19

Note. Male=1, Female=2;

* higher values indicate slower reaction time; bolded models were reproduced in replication cohort. BMI = body mass index; PASE = Physical Activity Scale for the Elderly; GMV = total gray matter volume; DLPFC = dorsolateral prefrontal cortex.