

Female sex is linked to a stronger association between sTREM2 and CSF p-tau in Alzheimer's disease

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Abstract

In Alzheimer's disease (AD), A β triggers p-tau secretion, which drives tau aggregation. Therefore, it is critical to characterize modulators of A β -related p-tau increases which may alter AD trajectories. Here, we assessed whether factors known to alter tau levels in AD modulate the association between fibrillar A β and secreted p-tau₁₈₁ determined in the cerebrospinal fluid (CSF). To assess potentially modulating effects of female sex, younger age, and ApoE4, we included 322 ADNI participants with cross-sectional/longitudinal p-tau₁₈₁. To determine effects of microglial activation on p-tau₁₈₁, we included 454 subjects with cross-sectional CSF sTREM2. Running ANCOVAs for nominal and linear regressions for metric variables, we found that women had higher A β -related p-tau₁₈₁ levels. Higher sTREM2 was associated with elevated p-tau₁₈₁, with stronger associations in women. Similarly, ApoE4 was related to higher p-tau₁₈₁ levels and faster p-tau₁₈₁ increases, with stronger effects in female ApoE4 carriers. Our results show that sex alone modulates the A β to p-tau axis, where women show higher A β -dependent p-tau secretion, potentially driven by elevated sTREM2-related microglial activation and stronger effects of ApoE4 carriership in women.

Keywords Alzheimer's Disease; Microglia; sTREM2; p-tau; Sex Differences

Subject Category Neuroscience

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Introduction

Beta-amyloid (A β) and tau are the hallmark pathologies of Alzheimer's disease (AD), ensuing neurodegeneration and cognitive decline (Jack et al, 2018). Previously it was shown that A β -oligomers trigger the neuronal secretion of soluble phosphorylated tau (p-tau) (Jin et al, 2011), which in turn drives the aggregation and trans-synaptic spread of neurofibrillary tau tangle pathology (Pichet Binette et al, 2022). These findings indicate that A β -related p-tau increases are critical for the subsequent development of tau aggregates. While the sequence of the amyloid cascade is well-established (Glenner and Wong, 1984; Hardy and Selkoe, 2002; Selkoe and Hardy, 2016), the progression rate of A β -initiated tau accumulation differs significantly between patients, causing heterogeneous disease trajectories and dynamics across patients (Dujardin et al, 2020; Komarova and Thalhauser, 2011; Landau et al, 2022). The aim of the present study is therefore to determine modulating factors of the A β to p-tau axis, which can help identify factors that accelerate or attenuate tau progression and determine targets to attenuate p-tau secretion and subsequent tau aggregation. To this end, we specifically focused on factors that have been previously associated with an increased risk of tau pathology in AD, which are female sex, microglial activation, younger age, and ApoE4, which is the main genetic risk factor for AD.

Accumulating evidence indicates that women are more severely affected by AD than men (Buckley et al, 2019b; Fisher et al, 2018; Laws et al, 2018; Levine et al, 2021; Mosconi et al, 2017; Nebel et al, 2018; Vest and Pike, 2013), accounting for two-thirds of AD dementia cases in the US (Alzheimer's, 2014). Previous work revealed that women show increased levels of CSF total tau and p-tau (Hohman et al, 2018), tau deposition (Buckley et al, 2019b), and a faster tau accumulation rate compared to men (Smith et al, 2020). Recently it was found that faster tau accumulation in women was facilitated by a stronger association between A β fibrils and

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soluble p-tau in women compared to men, suggesting early A β -dependent tau secretion as a critical turnover point for the observed sex differences in AD (Wang et al, 2024). Although the driving mechanisms behind these findings are not fully clear, differences in sex hormones (Sundermann et al, 2020) and inflammatory processes (Casaletto et al, 2022) are assumed to play an underlying role in the manifestation of sex differences in AD. In this context, analysis of post-mortem brain tissue of older adults show that microglial activation mediated the association between A β plaque pathology and neurofibrillary tau tangles in women but not in men (Casaletto et al, 2022). An association between microglial activation and the accumulation and spread of tau in AD has been previously shown in vitro (Brelstaff et al, 2021; Maphis et al, 2015) and in vivo (Pascoal et al, 2021; Vogels et al, 2019), thus microglial activation may play an early key role in the amyloid cascade (Pascoal et al, 2021). From a mechanistic point of view, microglia are the brains innate immune cells, which react to hazardous stimuli with the release of pro-inflammatory cytokines. Once the hazard stimulus has been eliminated, microglia return to their original homeostatic resting state. However, in chronic inflammation, microglia lose their capability to return back to their homeostatic state, resulting in neurotoxicity and tissue damage (Bivona et al, 2023). The Triggering Receptor Expressed on Myeloid Cell 2 (TREM2) has been associated with a shift of microglia from homeostatic to disease associated states (Keren-Shaul et al, 2017; Krasemann et al, 2017), parallels PET-assessed microglial activation (Brendel et al, 2017), and is thus a well-established proxy for microglial activation (Ewers et al, 2020; Ewers et al, 2019; Franzmeier et al, 2020). We and others showed recently that increased CSF sTREM2 levels are associated with higher levels of p-tau in early phases of sporadic AD (Suarez-Calvet et al, 2019), and mediate A β -related p-tau increases in earliest A β fibrillization (Biel et al, 2023). Thus, microglial activation might have a pivotal role in the early pathogenesis of AD, with different effects in men and women.

A further potential modulator of the A β to p-tau axis might relate to the patient's age. In addition to the effects of sex and sTREM2-related microglial activation, studies show that younger age at symptom onset is associated with a worsened prognosis and faster tau accumulation in sporadic AD (Frontzkowski et al, 2022; Koedam et al, 2008; van der Vlies et al, 2009). However, it remains unclear, whether younger age modulates the A β to p-tau axis towards a faster p-tau increase, which would support the view of a more aggressive form of AD when patients enter the amyloid cascade at younger age (Koedam et al, 2008; Touroutoglou et al, 2023).

Finally, genetic predispositions might play a critical role for early tau pathology. The $\epsilon 4$ allele of the ApoE-encoding apolipoprotein (ApoE4) is the main genetic risk factor for sporadic AD, and carriership of the ApoE4 risk allele has been linked to an oversupply of cholesterol, ensuing accelerated A β production (Lee et al, 2021), neuroinflammation (Ophir et al, 2005), impaired myelination (Blanchard et al, 2022), and tau-mediated neurodegeneration (Shi et al, 2017). Further, ApoE4 carriership is associated with lower levels of testosterone (Hogervorst et al, 2002), a sex hormone which is mostly expressed in males and associated with anti-inflammatory processes (Bianchi, 2019; Ota et al, 2012) and cholesterol clearance (Kilby et al, 2021). Previously, we showed that ApoE4 drives A β -related tau

accumulation at lower levels of A β pathology, suggesting that in ApoE4 carriers, tau accumulation starts earlier than in ApoE4 non-carriers (Steward et al, 2023). In addition, several studies indicate that female ApoE4 carriers show enhanced levels of soluble CSF total tau (Altmann et al, 2014; Babapour Mofrad et al, 2020; Buckley et al, 2019a; Damoiseaux et al, 2012; Hohman et al, 2018) and p-tau (Babapour Mofrad et al, 2020; Hohman et al, 2018) compared to their male counterparts, hence, the association between ApoE4 carriership and A β -dependent tau might be further modulated by sex.

Together, female sex, microglial activation, younger age, and ApoE4-related genetic predisposition for AD have been previously associated with increased tau burden. The main aims of the present study were therefore to test, (i) whether sex, sTREM2-related microglial activation, younger age or ApoE4 modulate the A β to p-tau axis, and (ii) whether the effects of sTREM2, younger age or ApoE4 are stronger in women than in men.

Results

Sample characteristics

To assess whether sex, age, or ApoE4 modulates the A β to p-tau axis, we included 144 CN A β - controls, as well as 178 participants across the AD spectrum as defined by A β + status [CN/MCI/Demented=48/115/15] with cross-sectional and longitudinal CSF p-tau₁₈₁ data. The average follow-up time from baseline for p-tau₁₈₁ was 3.54 ± 1.97 years. As expected, the A β + group showed higher baseline levels of p-tau₁₈₁, higher p-tau₁₈₁ change rates and had a higher likelihood of ApoE4 positivity. For the assessment of CSF sTREM2 as a potential modulator of the A β to p-tau₁₈₁ axis, only cross-sectional data were available. 160 CN A β - and 294 A β + [CN/MCI/Demented=41/160/93] participants with sTREM2 and cross-sectional p-tau₁₈₁ data were included. As for the longitudinal sample, the A β + group showed higher p-tau₁₈₁ levels. For detailed descriptive statistics, see Table 1.

Higher sTREM2 levels and ApoE4 as risk factors for increased p-tau₁₈₁ levels

We tested first whether sex, CSF sTREM2, age, or ApoE4 are associated with increased cross-sectional or longitudinal CSF p-tau₁₈₁ levels. To that end, we calculated main effects using ANCOVAs for nominal potential modulators (i.e., sex, ApoE4) and linear regression for metric potential modulators (i.e., sTREM2, age). We found that higher sTREM2 was related to higher p-tau₁₈₁ levels ($T = 10.098$, $p < 0.001$, $p_{FDR} < 0.001$, partial $R^2 = 0.186$; Fig. 1C), and that ApoE4 was related to higher p-tau₁₈₁ levels ($F = 45.398$, $p < 0.001$, $p_{FDR} < 0.001$, $\eta^2 = 0.13$; Fig. 1F) and faster p-tau₁₈₁ increases ($F = 8.915$, $p = 0.003$, $p_{FDR} = 0.009$, $\eta^2 = 0.03$; Fig. 1G). Neither sex nor age were linked to constitutively higher p-tau₁₈₁ levels (sex: $F = 2.845$, $p = 0.093$, Fig. 1A; age: $T = 1.047$, $p = 0.296$, Fig. 1D) or faster p-tau₁₈₁ increases (sex: $F = 1.611$, $p = 0.205$, Fig. 1B; age: $T = 0.938$, $p = 0.349$, Fig. 1E). The results are summarized in Table 2. In line with previous work, we found that sTREM2-related microglial activation and ApoE4 positivity are related to higher levels in p-tau₁₈₁, suggesting a critical role of both factors in the onset of tau pathology.

Table 1. Demographics.

	Controls (Aβ [−])	AD spectrum (Aβ ⁺)	p-values
Modulators sex, age, education, ApoE4			
N	144	178	
Clinical status (CN/MCI/Dem)	144/0/0	48/115/15	<0.001
Sex (male/female)	71/73	85/93	0.869
Age in years	72.72 (6.57)	73.35 (6.57)	0.394
Years of education	16.97 (2.38)	16.07 (2.57)	0.001
CSF Aβ ₁₋₄₂ (pg/ml)	1517.16 (552.09)	760.11 (315.95)	<0.001
CSF p-tau ₁₈₁ (pg/ml)	19.46 (7.22)	33.94 (15.17)	<0.001
Amyloid-PET (centiloid)	−7.87 (11.80)	76.73 (35.77)	<0.001
ApoE4 status (non-carrier/carrier)	119/25	66/112	<0.001
Follow-up CSF p-tau ₁₈₁ (mean years)	3.72 (2.18)	3.40 (1.77)	0.145
CSF p-tau ₁₈₁ change rate	0.38 (0.34)	0.75 (0.62)	<0.001
Modulator sTREM2			
N	160	294	
Clinical status (CN/MCI/Dem)	160/0/0	41/160/93	<0.001
Sex (male/female)	79/81	165/129	0.201
Age in years	72.60 (6.41)	73.81 (7.32)	0.079
Years of education	16.91 (2.39)	15.85 (2.71)	<0.001
CSF Aβ ₁₋₄₂ (pg/ml)	1411.73 (396.05)	631.87 (174.24)	<0.001
CSF p-tau ₁₈₁ (pg/ml)	19.73 (7.46)	34.52 (15.17)	<0.001
CSF sTREM2 (pg/ml)	3940.74 (1992.21)	3966.61 (2210.14)	0.902
Amyloid-PET (centiloid)	−7.22 (12.08)	82.55 (33.31)	<0.001

Values are presented as mean (SD); p-values were derived from ANOVAs for continuous measures and from Chi-squared tests for categorical measures.
Aβ status (−/+) was defined on global amyloid-PET SUVRs.
CN cognitively normal, MCI mild cognitive impairment, Dem demented.

Female sex is associated with stronger amyloid-dependent p-tau₁₈₁ secretion

Next, we determined whether sex, CSF sTREM2, age, or ApoE4 specifically modulate the Aβ to p-tau axis and increase Aβ-dependent p-tau₁₈₁ secretion, which may translate into faster downstream tau aggregation and spread. Here, we found that solely sex modulates the association between centiloid and p-tau₁₈₁, where women compared to men showed higher Aβ-related p-tau₁₈₁ levels (T = 2.746, p = 0.006, p_{FDR} = 0.026; partial R² = 0.023; Fig. 2A) and faster p-tau₁₈₁ increases (T = 2.169, p = 0.031; partial R² = 0.015; Fig. 2B) which reached trend level significance after FDR correction (p_{FDR} = 0.092). Neither sTREM2, age, or ApoE4 modulated Aβ-related p-tau₁₈₁ levels (sTREM2: T = 0.422, p = 0.673, Fig. 2C; age: T = −0.240, p = 0.810, Fig. 2D; ApoE4: T = −0.513, p = 0.608, Fig. 2F) or faster p-tau₁₈₁ increases (age: T = 0.516, p = 0.606, Fig. 2E; ApoE4: T = −1.409, p = 0.160, Fig. 2G). The results are summarized in Table 2. The results indicate that sex

is associated with modulation of the Aβ to p-tau axis, suggesting a stronger association between Aβ-dependent p-tau₁₈₁ secretion and eventually faster tau aggregation in women compared to men. In contrast, our analysis did not provide statistical evidence that sTREM2, age, or ApoE4 significantly modulate the Aβ to p-tau axis.

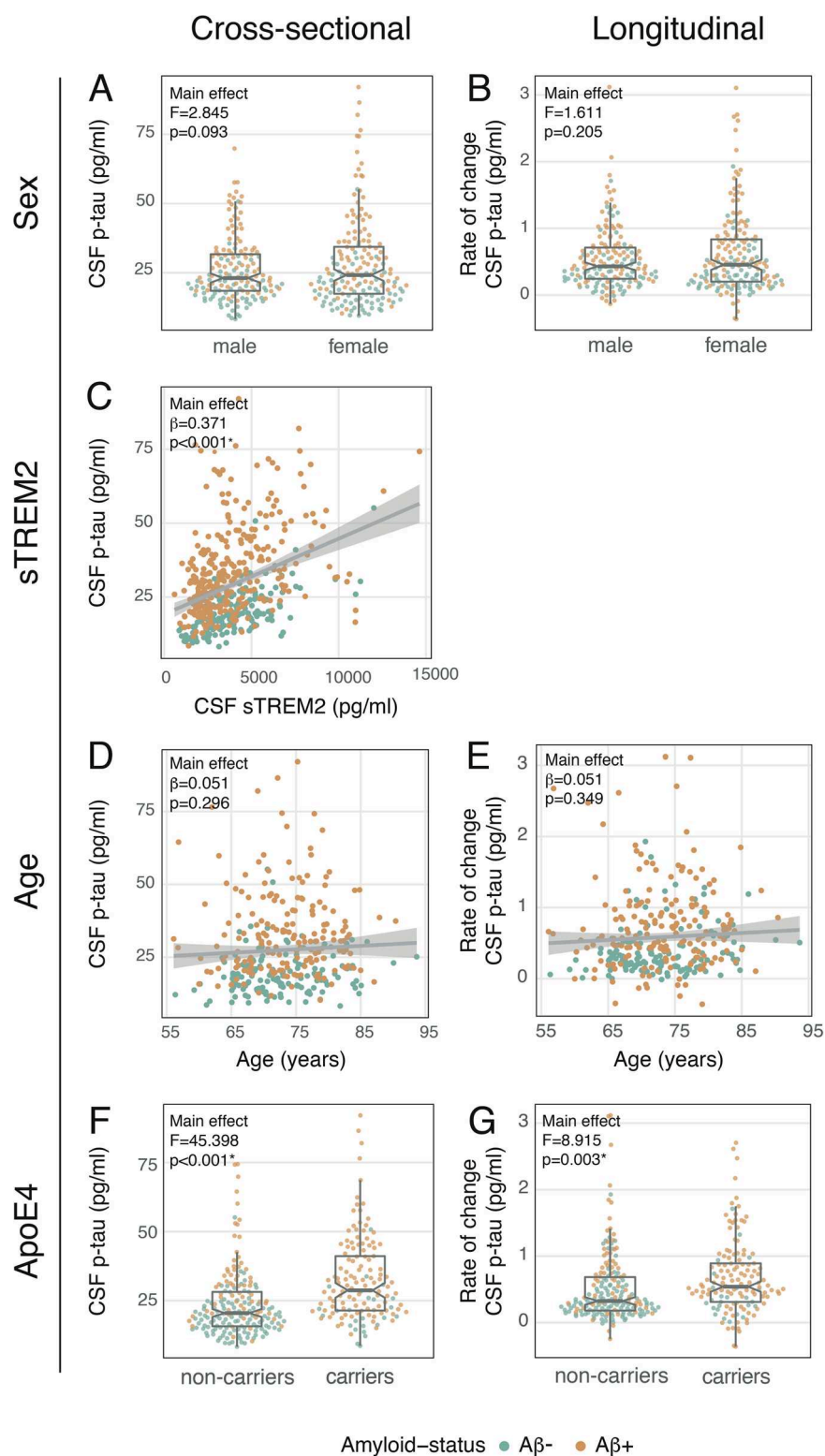
sTREM2 promotes higher amyloid-dependent p-tau₁₈₁ levels in women compared to men

Next, we aimed to test whether female sex is associated with a higher vulnerability for detrimental effects of potential modulators on CSF p-tau₁₈₁ levels, and specifically, the Aβ to p-tau axis. To that end, we determined interaction effects of each potential modulator (i.e., CSF sTREM2, age, ApoE4) and sex on cross-sectional or longitudinal p-tau₁₈₁ levels. The analysis revealed a significant effect of sex on the association between sTREM2 and p-tau₁₈₁, with women showing a stronger association between sTREM2 and p-tau₁₈₁ levels compared to men (T = 2.177, p = 0.030, p_{FDR} = 0.045; partial R² = 0.011; Fig. 3A). Post hoc analyses calculating separate linear regression analyses for men and women further revealed higher partial R² values in women (T = 8.286, p < 0.001, partial R² = 0.253) vs. men (T = 5.978, p < 0.001, partial R² = 0.132), supporting a stronger association between sTREM2 and p-tau₁₈₁ in women than in men. In addition, we detected a significant interaction between ApoE4 carriership and sex on p-tau₁₈₁, where female ApoE4 carriers compared to male ApoE4 carriers showed higher levels of p-tau₁₈₁ (T = 2.185, p = 0.030, p_{FDR} = 0.045; partial R² = 0.015; Fig. 3B) but no faster p-tau₁₈₁ increases (T = 1.119, p = 0.264). There was no significant effect of sex on the association between age and p-tau₁₈₁ levels (T = −1.005, p = 0.315) or p-tau₁₈₁ increases (T = −0.735, p = 0.463). The findings show that the associations between sTREM2-related microglial activation as well as ApoE4 status on p-tau₁₈₁ levels are stronger in women than in men.

As a last step, we assessed whether sex further modulates the Aβ to p-tau axis by interacting with potential modulators. Thus, we assessed the association between centiloid, each potential modulator (i.e., sTREM2, age, ApoE4), and sex on cross-sectional or longitudinal p-tau₁₈₁ levels. We detected a significant centiloid x sTREM2 x sex interaction on cross-sectional p-tau₁₈₁ (T = 2.316, p = 0.021; partial R² = 0.012; Fig. 3C), where higher sTREM2 levels in women were associated with higher p-tau₁₈₁ levels at a given level of Aβ. However, the analysis only reached borderline significance after FDR correction (p_{FDR} = 0.063). Age or ApoE4 did not show interaction effects with sex on Aβ-dependent p-tau₁₈₁ levels (age: T = 0.009, p = 0.993; ApoE4: T = 0.362, p = 0.718) or p-tau₁₈₁ increases (age: T = 0.357, p = 0.721; ApoE4: T = 0.476, p = 0.634). The results are summarized in Table 3. These findings indicate that women show a trend for a different effect of sTREM2-related microglial activation on the Aβ to p-tau axis than men, which might result in higher tau burden and worsened disease progression in women.

Discussion

In the present study, we systematically assessed modulating factors of the Aβ to p-tau axis, i.e., a potentially critical driver of tau



fibrillization in AD (Pichet Binette et al, 2022), to better understand heterogeneity in pathophysiological disease progression. Specifically, we assessed whether sex, microglial activation (i.e., sTREM2), age or genetic predisposition for AD (i.e., ApoE4) are associated with higher levels in p-tau₁₈₁, and specifically, modulate the Aβ to

p-tau axis. Since women are at increased risk of AD, we further tested whether effects of any potential Aβ to p-tau modulator are stronger in women than in men. First, we show that sTREM2 and ApoE4 are associated with higher p-tau₁₈₁ levels and that the effects were even more pronounced in women than in men. Second, we

Figure 1. Main effects of potential modulators and CSF p-tau₁₈₁ across Aβ[−] cognitively normal plus Aβ⁺ ranging from cognitively normal to AD demented (longitudinal sample: N = 322; sTREM2 sample: N = 454).

Significant main effects were found between CSF sTREM2 and cross-sectional CSF p-tau₁₈₁ (C, $p < 2e-16$) and between ApoE4 carriership (non-carriers: $n = 185$; carriers: $n = 137$) and cross-sectional (F, $p = 7.69e-11$) and longitudinal (G) p-tau₁₈₁ levels. Sex (male: $n = 156$; female: $n = 166$) (A, B) and age (D, E) were not associated with higher p-tau₁₈₁ levels or faster p-tau₁₈₁ increases. F and p-values were derived for nominal variables (A, B, F, G) from ANCOVAs, and standardized beta-estimates (β) and p-values were derived for metric variables (C, D, E) from linear regressions. (A) and (B) were controlled for age, education, clinical status, and amyloid-PET (in centiloid); (C), (F), and (G) were controlled for sex, age, education, clinical status, and centiloid; (D) and (E) were controlled for sex, education, clinical status, and centiloid. The center line of each boxplot (A, B, F, G) indicates the median (50th percentile), the bounds of the box show the interquartile range (25–75th percentiles), and the whiskers extend to 1.5 times the interquartile range from the edges of the box. * = $p_{FDR} < 0.05$.

Table 2. Main and interaction effects of potential modulators on cross-sectional and longitudinal CSF p-tau₁₈₁ levels.

Model	Covariates	Cross-sectional			Longitudinal		
Main effects modulators on p-tau							
ANCOVA							
			F	p		F	p
CSF p-tau ₁₈₁ ~ sex	Age, education, clinical status, CL		2.845	0.093		1.611	0.205
CSF p-tau ₁₈₁ ~ ApoE4	Sex, age, education, clinical status, CL		45.398	<0.001*		8.915	0.003*
Linear regression							
		β	T	p	β	T	p
CSF p-tau ₁₈₁ ~ sTREM2	Sex, age, education, clinical status, CL	0.371	10.098	<0.001*			
CSF p-tau ₁₈₁ ~ age	Sex, education, clinical status, CL	0.051	1.047	0.296	0.051	0.938	0.349
Interactions CL x modulators on p-tau		β	T	p	β	T	p
CSF p-tau ₁₈₁ ~ CL*sex	Age, education, clinical status	0.206	2.746	0.006*	0.182	2.169	0.031#
CSF p-tau ₁₈₁ ~ CL*CSF sTREM2	Sex, age, education, clinical status	0.037	0.422	0.673			
CSF p-tau ₁₈₁ ~ CL*age	Sex, education, clinical status	−0.137	−0.240	0.810	0.327	0.516	0.606
CSF p-tau ₁₈₁ ~ CL*ApoE4	Sex, age, education, clinical status	−0.045	−0.513	0.608	−0.138	−1.409	0.160

Main effects of sex and ApoE4 on p-tau₁₈₁ were calculated using ANCOVAs and main effects of CSF sTREM2 and age on p-tau₁₈₁ using linear regressions. Interaction effects between modulators and the association between amyloid-PET (in centiloid; CL) and p-tau₁₈₁ levels were calculated using linear regressions. * = $p_{FDR} < 0.05$; # = $p_{FDR} < 0.1$.

show that solely sex modulates Aβ-dependent p-tau₁₈₁ levels, with stronger Aβ-dependent p-tau₁₈₁ secretion in women compared to men. Finally, we observed a trend for sex differences for the association between sTREM2 and Aβ-dependent p-tau₁₈₁ levels, again, with higher p-tau₁₈₁ levels in women than in men. Together, our results underline sex-specific dynamics in AD disease pathways with more severe consequences for higher p-tau₁₈₁ levels in women. The findings are critical for patient stratifications in clinical trials, especially for drugs targeting microglial activation as a disease modifying approach.

Previously, higher levels of soluble (Hohman et al, 2018; Tsiknia et al, 2022) and aggregated tau (Buckley et al, 2019b; Shokouhi et al, 2020) were found in women compared to men. Congruently, we found that women showed stronger Aβ-related p-tau₁₈₁ secretion and trend to have faster Aβ-related p-tau₁₈₁ increases than men ($p_{FDR} = 0.092$), with sex being the only tested factor that modulated the Aβ to p-tau axis. However, future studies are needed to further investigate the effect of sex on Aβ-related longitudinal p-tau propagation. Besides a main effect of sTREM2-related microglial activation on p-tau₁₈₁ levels, we further revealed a stronger association between sTREM2 and p-tau₁₈₁ in women than in men. When testing whether this observation could be

applied to the Aβ to p-tau axis, we found a 3-way interaction of Aβ, sTREM2, and sex on p-tau₁₈₁, showing that in women, higher levels of sTREM2 were linked to a stronger Aβ-dependent p-tau₁₈₁ response. However, when applying FDR correction, the result only reached borderline significance ($p_{FDR} = 0.063$), hence, future studies are needed to confirm this finding. In our previous work investigating disease stage-dependent effects of sTREM2-related microglial activation on p-tau₁₈₁ increases, we found that in patients within earliest Aβ pathology (defined as Aβ CSF positive and amyloid-PET negative) (Palmqvist et al, 2017), sTREM2 mediated Aβ-related p-tau₁₈₁ increases (Biel et al, 2023). In addition, early Aβ pathology was associated with glucose hypermetabolism, indicating that sTREM2 follows earliest Aβ fibrillization, which might manifest in activated microglia consuming more glucose (Xiang et al, 2021). Our current observations align well with findings using TSPO-PET as a proxy of microglial activation, where TSPO-PET was associated with higher tau-PET signals in female but not in male AD patients (Biechele et al, 2024). Similarly, in post-mortem investigations, microglial activation was linked to Aβ-related tau pathology in women but not in men (Casetto et al, 2022). Hence, microglial-induced tau accumulation might be more pronounced in women than in men.

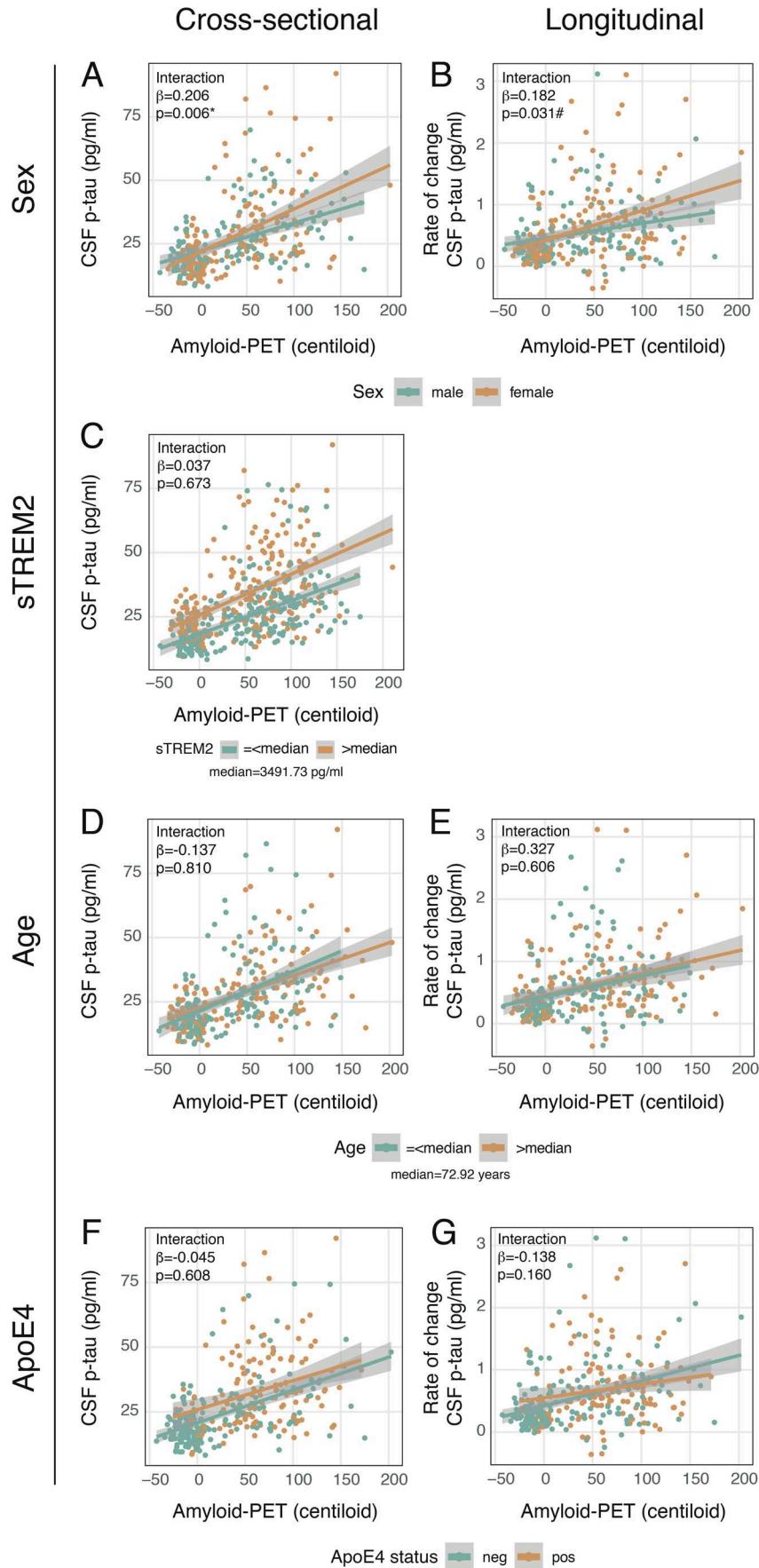


Figure 2. Interaction effects of potential modulators on the association between amyloid-PET (in centiloid) and CSF p-tau₁₈₁ across Aβ[−] cognitively normal plus Aβ⁺ ranging from cognitively normal to AD demented (longitudinal sample: *N* = 322; sTREM2 sample: *N* = 454).

A significant interaction effect was found between centiloid and sex (male: *n* = 156; female: *n* = 166) on cross-sectional (A) and longitudinal (B) p-tau₁₈₁ levels (B only borderline significant after FDR correction). No significant interaction effects were found between centiloid and sTREM2 (C), age (D, E) or ApoE4 status (non-carriers: *n* = 185; carriers: *n* = 137) (F, G) on cross-sectional/longitudinal p-tau₁₈₁ levels. Standardized beta-estimates (β) and *p*-values were derived from linear regressions. (A) and (B) were controlled for age, education, and clinical status; (C), (F), and (G) were controlled for sex, age, education, and clinical status, and (D) and (E) were controlled for sex, education, and clinical status. * = *p*_{FDR} < 0.05; # = *p*_{FDR} < 0.1.

Biologically, women are predisposed to higher levels of neuroinflammatory markers than men, which has been shown using TSPO-PET across studies in healthy adults (Tuisku et al, 2019) and animal models of amyloidosis (Biechele et al, 2020). Preclinical research found that microglia have transcriptional sex differences in adult brains, suspected to be caused by sex chromosomes as well as sex hormones that might be involved in microglial functioning (Guillot-Sestier et al, 2021; Kodama and Gan, 2019; Villa et al, 2018). In addition, women are more often affected by autoimmune diseases of the central nervous system, such as multiple sclerosis (Kalincik et al, 2013; Koch-Henriksen and Sorensen, 2010), which has been further attributed to maladaptive microglial activation (Yong, 2022). Thus, sex-specific differences in microglial activation in women might result in a higher vulnerability to chronic neuroinflammation, which may cause neuronal damage (Bivona et al, 2023; Jayaraman et al, 2021). It would be critical to assess, whether the observed association between sTREM2-related microglial activation and p-tau₁₈₁ is mediated by pro-inflammatory cytokines (e.g., Interleukin 1β), which might result from prolonged microglial activation as a response to earliest Aβ fibrillization (Wang et al, 2015). Here, it should be tested, whether the threshold for a pro-inflammatory cytokine response differs between men and women. In addition, future studies should include additional markers related to neuroinflammation in the CSF (e.g., YKL-40, ICAM-1, VCAM1) (Janelidze et al, 2018; Popp et al, 2017) or tissue (e.g., TSPO-PET, FDG-PET) (Xiang et al, 2021) to address the underlying mechanism that link neuroinflammation and p-tau secretion. Moreover, future investigations could benefit from incorporating proteomic analyses to further explore more complex patterns of neuroinflammation markers, particularly those related to microglial activation. Detrimental effects of microglial activation in early disease stages of AD are in contrast to the observed positive effects microglial activation might have in later stages of AD, such as protective effects on Aβ pathology, neurodegeneration, and cognitive decline (Ewers et al, 2020; Ewers et al, 2019; Morenas-Rodriguez et al, 2022). We therefore suggest to consider subanalyses in clinical trials that are stratified by sex and disease stage, as our findings indicate that men and women show different dynamics in AD disease pathways. These might be driven among others by a different response to microglial activation and presumably earlier thresholds for Aβ-related neuroinflammation in women than in men.

Besides the association between sTREM2-related microglial activation and p-tau₁₈₁, we observed a main effect of ApoE4 status on cross-sectional p-tau₁₈₁ as well as longitudinal p-tau₁₈₁ increases, which supports our previous work showing that ApoE4 enhances tau spreading using tau-PET (Steward et al, 2023). From a mechanistic point of view, it has been shown that the ApoE4 allele interferes with the absorption of polyunsaturated fatty acids,

which are vital for the cell's functioning. As a consequence of ApoE4, fewer nutrients can be absorbed, the cells become inflamed and ultimately die (Asaro et al, 2020). This inflammatory reaction might promote the secretion of soluble tau, similar to the observed effects of sTREM2-related microglial activation on p-tau (Biel et al, 2023). Indeed, previous work reported that ApoE4 facilitates microglia-related neuroinflammation and thereby might contribute to AD pathways (Kang et al, 2018; Krasemann et al, 2017; Parhizkar and Holtzman, 2022; Tai et al, 2015; Ulrich et al, 2018). Specifically, it was recently shown that ApoE4 activates microglia within brain regions that are prone to early tau propagation, and this effect was independent of Aβ (Ferrari-Souza et al, 2023). In addition, and in line with previous observations (Altmann et al, 2014; Babapour Mofrad et al, 2020; Damoiseaux et al, 2012; Hohman et al, 2018), we found that female ApoE4 risk allele carriers show higher levels of cross-sectional p-tau₁₈₁ compared to male ApoE4 risk allele carriers. Importantly, higher microglia-induced inflammatory states were previously found in female ApoE4 carriers compared to male ApoE4 carriers (Mhatre-Winters et al, 2022), suggesting similar sex-specific associations between sTREM2- and ApoE4-related neuroinflammation and p-tau₁₈₁ levels. However, with the data of the present study, causal conclusions are limited, thus, future work is needed to test the link between ApoE4-induced cell inflammation and subsequent p-tau secretion. Further, our finding of increased p-tau₁₈₁ in ApoE4 carriers may reflect, in part, their predisposition toward earlier Aβ pathology onset and thus a more advanced disease stage (Therriault et al, 2021). Given that ApoE4 carriers in our study show higher Aβ positivity and load (Figs. 1 and 2), the observed association with p-tau₁₈₁ could be influenced by their progression along the amyloid cascade. Future longitudinal studies with stage-specific controls would help clarify whether this relationship is independent of ApoE4's effects on Aβ progression. In contrast, ApoE4 status did not modulate the association between Aβ and p-tau₁₈₁, which seems surprising since ApoE4 has been extensively identified as a driver of Aβ pathology (Liu et al, 2017; Morris et al, 2010; Reiman et al, 2009). Similarly, the interaction between ApoE4 and sex on p-tau₁₈₁ was no longer present when including Aβ as interaction term. Recently, we found that Aβ mediates the association between ApoE4 and faster tau accumulation in regions that are vulnerable for early tau aggregation (Steward et al, 2023), thus, ApoE4 might only drive Aβ-related p-tau increases in early AD disease stages, while in later disease, the effects of ApoE4 on p-tau might be independent of Aβ fibrillization. Along the same lines, it has been noted that the interaction between ApoE4 and sex on p-tau levels is only persistent in early disease stages (subjective cognitive decline and MCI, but not in dementia) (Babapour Mofrad et al, 2020), consistent with another study reporting an ApoE4 x sex interaction on tau-PET only within early regions of

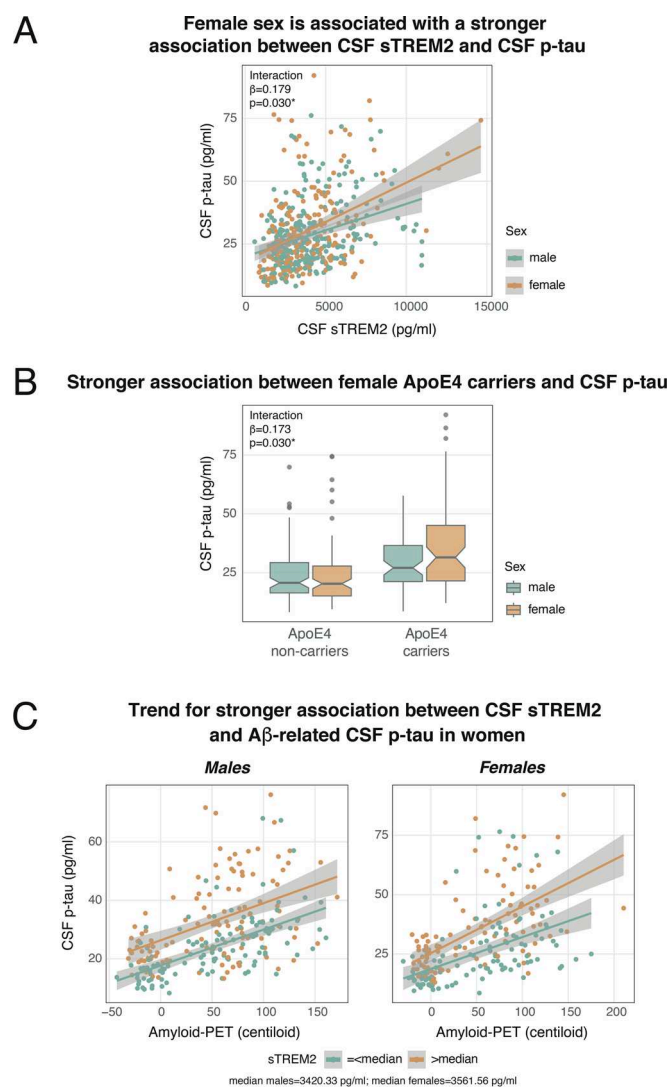


Figure 3. Sex as modulator for the effects of CSF sTREM2 and ApoE4 carrier status on CSF p-tau₁₈₁ across Aβ⁻ cognitively normal plus Aβ⁺ ranging from cognitively normal to AD demented (ApoE4 sample: *N* = 322; sTREM2 sample: *N* = 454).

Female sex compared to male sex (male: *n* = 244; female: *n* = 210) is associated with a stronger association between sTREM2 and p-tau₁₈₁ levels (A). Stronger association between ApoE4 carrier status (non-carriers: *n* = 185; carriers: *n* = 137) and p-tau₁₈₁ in women than in men (B). 3-way interaction effect of centiloid, sTREM2, and sex on p-tau₁₈₁ levels with women showing a stronger association between centiloid and p-tau₁₈₁ with increasing sTREM2 levels ($\beta = 0.312$, $T = 2.316$, $p = 0.021$, $p_{FDR} = 0.063$) (C). Standardized beta-estimates (β) and *p*-values were derived from linear regressions. (A) and (B) were controlled for age, education, clinical status, and centiloid. (C) was controlled for age, education, and clinical status. The center line of the boxplot (B) indicates the median (50th percentile), the bounds of the box show the interquartile range (25–75th percentiles), and the whiskers extend to 1.5 times the interquartile range from the edges of the box. * = $p_{FDR} < 0.05$.

tau deposition (Wang et al, 2021). In the context of microglial activation and neuroinflammation, we also previously showed that sTREM2 mediates Aβ-related p-tau₁₈₁ increases only in early Aβ fibrillization (Biel et al, 2023). It would be a key next step to test whether the observed sex interactions with sTREM2 and ApoE4 on

p-tau₁₈₁ are disease stage-dependent and whether they are related to each other.

Finally, we did not observe any effects of age on cross-sectional or longitudinal p-tau₁₈₁ levels, neither a main effect nor an interaction with Aβ or sex. Older age is the major risk factor for developing AD (Guerreiro and Bras, 2015; Hou et al, 2019). However, younger age at symptom onset has been conversely found to be associated with accelerated tau accumulation (Smith et al, 2020), neurodegeneration (Moller et al, 2013), cognitive decline (van der Vlies et al, 2009) and higher rates of mortality in AD (Koedam et al, 2008). Therefore, we tested whether accelerated spread of tau in younger patients can be further explained by a stronger association between Aβ and p-tau₁₈₁, which was not confirmed by our analyses. Therefore, faster tau accumulation in younger AD patients is unlikely driven by a higher Aβ-related p-tau response and it is unclear why tau accumulates in younger patients at a faster rate and whether female patients with an early onset show a faster spreading of tau. Here, future research should further address the underlying mechanisms of tau accumulation in patients with an earlier disease onset.

A strength of this study is the inclusion of several biomarker assessments in relation to sex differences in AD, investigating modulating effects on the Aβ to p-tau axis within a large sample ranging from cognitively normal to demented. However, several limitations should be addressed when interpreting our data. First, sTREM2 data have been obtained relatively late in the ADNI dataset, hence, data with subsequent CSF p-tau₁₈₁ for assessing longitudinal relationships were limited. Since we previously show that sTREM2 mediated the association between Aβ and p-tau₁₈₁ only in earliest Aβ fibrillization, we restricted the analysis on cross-sectional data for the sTREM2 sample in order to increase the sample covering Aβ⁻ controls to Aβ⁺ patients across the AD spectrum to 454 participants. We encourage future studies to assess sex differences in longitudinal associations between Aβ, sTREM2, and p-tau₁₈₁ once more data are available. Second, sTREM2 is only an indirect marker of microglial activation, thus other direct (e.g., post-mortem) or indirect (e.g., TSPO-PET) marker should be included in future studies. Third, in the present study, not sufficient tau-PET data were available to reliably test whether the stronger p-tau₁₈₁ response in women promotes faster spreading of tau aggregates. Once more data are available, this might be an important target for future investigations. Finally, the analysis should be replicated in other cohorts than ADNI and include more diverse participant groups with different ethnicities in order to increase generalizability of our findings.

In conclusion, our findings show that sex is an important modulator of Aβ-dependent p-tau₁₈₁ secretion. In particular, women show a stronger association between sTREM2-related microglial activation and p-tau₁₈₁ than men, supporting the view that neuroinflammation may play a key role in the observed sex differences in AD. In addition, we found higher p-tau₁₈₁ levels in female ApoE4 carriers compared to male ApoE4 carriers, which might be as well attributable to greater neuroinflammatory effects of ApoE4 in women. Our study provides evidence for sex-specific dynamics of AD disease pathways related to neuroinflammation and has potential implications for drug treatments targeting microglial activation, in which sex should be considered as an important modulating factor.

Methods

Reagents and tools table

Reagent/Resource	Reference or Source	Identifier or Catalog Number
Experimental models		
Alzheimer's disease cohort sample	Alzheimer's Disease Neuroimaging Initiative (ADNI) database (adni.loni.usc.edu)	Phase ADNI2, ADNI3, ADNIGO
Recombinant DNA		
Not applicable		
Antibodies		
Biotinylated polyclonal goat anti-human TREM2 antibody	R&D Systems BAF1828	Suarez-Calvet et al (2016) sTREM2 cerebrospinal fluid levels are a potential biomarker for microglia activity in early-stage Alzheimer's disease and associate with neuronal injury markers. EMBO Mol Med 8:466-476
Monoclonal mouse anti-human TREM2 antibody	Santa Cruz Biotechnology; B-3, sc373828	
SULFO-TAG-labeled anti-mouse secondary antibody	Meso Scale Discovery	
Oligonucleotides and other sequence-based reagents		
Not applicable		
Chemicals, Enzymes and other reagents		
Not applicable		
Software		
R statistical software version 4.0.2	http://www.R-project.org/	
Statistical analysis: lmer, aov, lm.beta, lm	R Core Team, 2021. R: A language and environment for statistical computing. R Foundation for Statistical Computing, Vienna, Austria.	
Visualization: ggplot		
Other		

Participants

To determine the effects of sex, age, and ApoE4 on cross-sectional and longitudinal p-tau₁₈₁ levels, we included 322 participants from the Alzheimer's Disease Neuroimaging Initiative (ADNI) with availability of ¹⁸F-florbetapir/¹⁸F-florbetaben amyloid-PET, ApoE4 status, demographical information (sex, age, education), clinical status as well as longitudinal p-tau₁₈₁ data (>1 measurement). Baseline data had to be obtained within a time window of 6 months for participants to be included in this study. Participants were classified as ApoE4 risk allele carriers when at least one ε4 allele was present. For specifically assessing the effects of sTREM2, we included a larger sample of 454 ADNI participants with CSF sTREM2 in addition to available ¹⁸F-florbetapir/¹⁸F-florbetaben amyloid-PET, demographical information (sex, age, education), and clinical status. Only cross-sectional p-tau₁₈₁ data were included for the sTREM2 sample since longitudinal p-tau₁₈₁ was not sufficiently available to specifically assess effects of sTREM2-related microglial activation on p-tau₁₈₁ change rates. Clinical status was defined by ADNI investigators as cognitively normal (CN; Mini Mental State Examination [MMSE] ≥ 24, Clinical Dementia Rating [CDR] = 0, non-depressed), mild cognitive impairment (MCI; MMSE ≥ 24, CDR = 0.5, objective memory-impairment on education-adjusted Wechsler Memory Scale II, preserved activities of daily living) or dementia (MMSE = 20–26, CDR ≥ 0.5, NINCDS/ADRDA criteria for probable AD). Aβ status (–/+) was determined using tracer-specific cut-offs for global amyloid-PET (i.e., Aβ+ = SUVR > 1.11/1.08 for ¹⁸F-florbetapir (Landau et al, 2012)/¹⁸F-florbetaben (Royse et al, 2021)). The study is in accordance with the Declaration of Helsinki. Ethical approval was obtained by ADNI investigators, and all study participants provided written informed consent.

CSF acquisition

The ADNI biomarker core team at the University of Pennsylvania assessed CSF p-tau₁₈₁ data using an electrochemiluminescence immunoassays Elecsys on a fully automated Elecsys cobas e 601

Table 3. Effects of sex for the association between potential modulators and cross-sectional/longitudinal CSF p-tau₁₈₁ and between potential modulators and Aβ-related cross-sectional/longitudinal p-tau₁₈₁ levels.

Model	Covariates	Cross-sectional			Longitudinal		
		β	T	p	β	T	p
Interactions modulators x sex on p-tau							
CSF p-tau ₁₈₁ ~ CSF sTREM2*sex	Age, education, clinical status, CL	0.179	2.177	0.030*			
CSF p-tau ₁₈₁ ~ age*sex	Education, clinical status, CL	−0.542	−1.005	0.315	−0.442	−0.735	0.463
CSF p-tau ₁₈₁ ~ ApoE4*sex	Age, education, clinical status, CL	0.173	2.185	0.030*	0.100	1.119	0.264
Interactions CL x modulators x sex on p-tau							
CSF p-tau ₁₈₁ ~ CL*sTREM2*sex	Age, education, clinical status	0.312	2.316	0.021#			
CSF p-tau ₁₈₁ ~ CL*age*sex	Education, clinical status	0.008	0.009	0.993	0.352	0.357	0.721
CSF p-tau ₁₈₁ ~ CL*ApoE4*sex	Age, education, clinical status	0.051	0.362	0.718	0.075	0.476	0.634

Interaction effects between potential modulators and sex on p-tau₁₈₁ as well as interaction effects between amyloid-PET (in centiloid; CL), potential modulators, and sex on p-tau₁₈₁ levels were calculated using linear regressions. * = p_{FDR} < 0.05; # = p_{FDR} < 0.1.

instrument and a single lot of reagents for each biomarker. sTREM2 data were assessed using a previously described ELISA approach using the MSD Platform (Ewers et al, 2019; Kleinberger et al, 2014; Suarez-Calvet et al, 2016) and are provided in the ADNIHAASSWASHULAB.csv file on the ADNI database (variable “MSDSTREM2CORRECTED”). For a detailed description of the applied methods, see <https://ida.loni.usc.edu>.

MRI and PET acquisition and preprocessing

ADNI acquired 3T structural MRI of T1-weighted MPRAGE sequences using unified scanning protocols (<http://adni.loni.usc.edu/methods/mri-tool/mri-analysis/>). Amyloid-PET was recorded 50–70 min after ^{18}F -florbetapir injection in 4×5 min frames or 90–110 min after ^{18}F -florbetaben injection in 4×5 min frames. The recorded time frames were motion corrected and averaged to obtain mean images (<http://adni.loni.usc.edu/methods/pet-analysis-method/pet-analysis/>). Next, the Advanced Normalization Tools (ANTs (Avants et al, 2011)) high-dimensional warping algorithm was used to estimate nonlinear spatial normalization parameters based on structural skull-stripped T1-weighted images. After amyloid-PET images were co-registered to native-space T1-weighted images, the ANTs-derived normalization parameters were used to normalize the images to Montreal Neurological Institute (MNI) space. Amyloid-PET SUVRs were intensity normalized to the whole cerebellum. Global amyloid-PET SUVRs were transformed to the centiloid scale in order to harmonize between ^{18}F -florbetapir and ^{18}F -florbetaben A β tracers (Klunk et al, 2015).

Statistical analyses

All statistical analyses were performed using R statistical software version 4.0.2 (<http://www.R-project.org>) (R Core Team, 2021).

Baseline characteristics between controls (i.e., CN A β –) and A β – were compared using ANOVAs for continuous and chi-squared tests for categorical data. Except for the CSF sTREM2 analysis where only cross-sectional data were available, all analyses were performed both on cross-sectional and longitudinal CSF p-tau₁₈₁. Longitudinal p-tau₁₈₁ was determined as the annual rate of change in p-tau₁₈₁ using a linear mixed model with time from baseline as the independent variable, incorporating random intercepts and slopes to account for individual variability, with a covariance term between the random intercept and slope for each individual (Biel et al, 2023; Pichet Binette et al, 2022; Preische et al, 2019).

First, we tested the main effects of potential A β to p-tau modulators on cross-sectional and longitudinal p-tau₁₈₁ levels. We calculated ANCOVAs for nominal potential modulators (i.e., sex, ApoE4) and linear regressions for metric potential modulators (i.e., sTREM2, age). Potential A β to p-tau modulators were included as independent variables and cross-sectional or longitudinal p-tau₁₈₁ as dependent variable. The models were controlled for sex, age, education, clinical status, and amyloid-PET (i.e., centiloid), whereby sex and age were not included as covariates in the models testing sex or age as independent variable, respectively. For our main analysis, we aimed to investigate modulating effects of sex, sTREM2, age, and ApoE4 on the association between centiloid and p-tau₁₈₁. To that end, we ran separate linear regressions, including centiloid and potential modulators as independent variables and cross-sectional or longitudinal p-tau₁₈₁ as

The paper explained

Problem

In Alzheimer's disease (AD), the accumulation of A β pathology triggers the secretion of phosphorylated tau (p-tau) from neurons which drives the aggregation and spread of fibrillar tau pathology ensuing neurodegeneration and cognitive decline. Therefore, A β -related increases in p-tau are a critical event in the amyloid cascade triggering the progression of AD. Thus, it is of particular importance to characterize potential modulators of A β -related p-tau increases which may alter downstream tau aggregation and spread. Previous studies have linked female sex, microglial activation, younger age, and the genetic risk factor ApoE4 to altered tau levels in AD. Thus, we systematically tested whether these factors modulate the association between baseline levels of PET-assessed A β pathology and cross-sectional or longitudinal p-tau increases in the CSF.

Results

We found that higher amyloid-PET was linked to elevated p-tau where only female sex compared to male sex was associated with higher A β -related p-tau levels (i.e., interaction between amyloid-PET and sex). In contrast, higher sTREM2 levels and ApoE4 positivity were related to constitutively elevated p-tau across the low to high A β spectrum (i.e., main effect), while there was no effect of sex or age. However, sex further modulated the observed main effects, with higher sTREM2-related p-tau levels in women compared to men and a stronger effect in female ApoE4 risk allele carriers on p-tau levels compared to their male counterparts.

Impact

Together, our results show that ApoE4 and sTREM2 are associated with higher p-tau levels, with stronger effects in women. Of factors known to modulate tau pathology in AD, sex alone modulated the A β to p-tau axis, where female sex is associated with a stronger A β -dependent p-tau secretion, potentially driven by elevated sTREM2-related microglial activation. These findings help to understand heterogenous disease progression in men and women which might be critical for clinical trials, especially for drug treatments targeting microglial activation as a disease modifying approach.

dependent variable. Covariates of the models were sex, age, education, and clinical status, whereby sex and age were not included in the models testing sex or age as independent variable, respectively. Please refer to Table 2 for a depiction of the statistical equations used within each model.

To further assess whether effects differ between men and women, we repeated the analyses for the main and interaction effects adding sex as interaction term. First, we assessed modulator (i.e., sTREM2, age, ApoE4) $\times$ sex interactions on cross-sectional or longitudinal p-tau₁₈₁, including potential modulators and sex as independent and cross-sectional or longitudinal p-tau₁₈₁ as dependent variable. The models were controlled for age, education, clinical status, and centiloid. Next, we examined 3-way interactions of centiloid, potential modulators, and sex on cross-sectional or longitudinal p-tau₁₈₁. Here, we included centiloid, potential modulators, and sex as independent variables and cross-sectional or longitudinal p-tau₁₈₁ as dependent variable. The models were controlled for age, education, and clinical status. Age was not included in the model testing age as independent variable. Please refer to Table 3 for a depiction of the statistical equations used within each analysis.

To assess effect sizes for significant results, partial R^2 values were calculated for linear models and partial eta-squared (η^2) for ANCOVAs.

Each of our four analyses (i.e., main effects, CL x modulator, modulator x sex, CL x modulator x sex) was corrected for multiple comparisons for cross-sectional and longitudinal measurements separately using the false discovery rate (FDR) approach within the p.adjust R function.

Data availability

All data used in this manuscript are publicly available from the ADNI database (adni.loni.usc.edu) upon registration and compliance with the data use agreement. The data that support the findings of this study are available upon reasonable request from the corresponding author.

The source data of this paper are collected in the following database record: [biostudies:S-SCDT-10_1038-S44321-024-00190-3](https://biostudies.nlm.nih.gov/study/10.1038/S44321-024-00190-3).

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