

Functional connectivity associated with tau levels in ageing, Alzheimer's, and small vessel disease

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In Alzheimer's disease, tau pathology spreads hierarchically from the inferior temporal lobe throughout the cortex, ensuing cognitive decline and dementia. Similarly, circumscribed patterns of pathological tau have been observed in normal ageing and small vessel disease, suggesting a spatially ordered distribution of tau pathology across normal ageing and different diseases. *In vitro* findings suggest that pathological tau may spread 'prion-like' across neuronal connections in an activity-dependent manner. Supporting this notion, functional brain networks show a spatial correspondence to tau deposition patterns. However, it remains unclear whether higher network-connectivity facilitates tau propagation. To address this, we included 55 normal aged elderly (i.e. cognitively normal, amyloid-negative), 50 Alzheimer's disease patients (i.e. amyloid-positive) covering the preclinical to dementia spectrum, as well as 36 patients with pure (i.e. amyloid-negative) vascular cognitive impairment due to small vessel disease. All subjects were assessed with AV1451 tau-PET and resting-state functional MRI. Within each group, we computed atlas-based resting-state functional MRI functional connectivity across 400 regions of interest covering the entire neocortex. Using the same atlas, we also assessed within each group the covariance of tau-PET levels among the 400 regions of interest. We found that higher resting-state functional MRI assessed functional connectivity between any given region of interest pair was associated with higher covariance in tau-PET binding in corresponding regions of interest. This result was consistently found in normal ageing, Alzheimer's disease and vascular cognitive impairment. In particular, inferior temporal tau-hotspots, as defined by highest tau-PET uptake, showed high predictive value of tau-PET levels in functionally closely connected regions of interest. These associations between functional connectivity and tau-PET uptake were detected regardless of presence of dementia symptoms (mild cognitive impairment or dementia), amyloid deposition (as assessed by amyloid-PET) or small vessel disease. Our findings suggest that higher functional connectivity between brain regions is associated with shared tau-levels, supporting the view of prion-like tau spreading facilitated by neural activity.

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Abbreviations: CN-A β - = cognitively normal amyloid- β -negative; ROI = region of interest; SUVR = standardized uptake value ratio; SVD = small vessel disease; VCI = vascular cognitive impairment

Introduction

In Alzheimer's disease, the emergence of amyloid plaques is followed by the formation of tau-containing neurofibrillary tangles that are closely correlated with neurodegeneration and dementia symptoms (Orr *et al.*, 2017). Different lines of research suggest that for tau, the spatial expansion of neurofibrillary tangles occurs in a hierarchical pattern during the course of Alzheimer's disease. Seminal brain autopsy studies established a systematic staging of tau pathology which starts to occur in the locus coeruleus and transentorhinal cortex, subsequently spreading to the hippocampus, anterior frontal and posterior parietal cortex, before showing a global distribution in the brain (Braak and Braak, 1991). Recent results from cross-sectional studies assessing AV1451 tau-PET in living humans could recapitulate distinct spatial patterns of tau distribution similar to those established by autopsy-based tau staging (Scheff *et al.*, 2006; Scholl *et al.*, 2016; Schwarz *et al.*, 2016). Since the successive spatial expansion of tau pathology is critical for the development of cognitive impairment in tauopathies such as Alzheimer's disease (Ossenkoppele *et al.*, 2016), understanding of those factors that are associated with the spatial tau distribution is of pivotal clinical importance (Bejanin *et al.*, 2017). Recent results from structural connectivity studies in humans and rodents suggest that the regional expansion of tau can be predicted by the axonal connectivity between brain regions (Iba *et al.*, 2013; Jacobs *et al.*, 2018). Results from preclinical *in vivo* and *in vitro* studies suggest that a 'prion-like' neuron-to-neuron transmission may underlie this gradual, connectivity-dependent pattern of tau distribution in the brain (Lace *et al.*, 2009; de Calignon *et al.*, 2012; Kaufman *et al.*, 2018). Injection of pathological tau within the hippocampus of tau transgenic mice triggered the spreading of filamentous tau to spatially remote yet anatomically connected brain regions, suggesting that spreading of pathological tau reflects an active transport along axonal connections rather than just passive diffusion to spatially adjacent regions (Clavaguera *et al.*, 2009). At

the functional level, neural activity has been revealed to be an important modulator of tau seeding. Several *in vitro* and *in vivo* studies showed that higher neuronal activity triggered the release of filamentous tau from neurons ensuing micropinocytosis of pathological tau and aggregation in downstream neurons (Pooler *et al.*, 2013; Wu *et al.*, 2016; Evans *et al.*, 2018). Thus, regions that show shared neuronal activity exhibit a higher likelihood of similar tau levels. However, whether the level of regional neural activity synchronous between brain regions is related to the similarity of tau levels in those connected brain regions in humans is not clear (Seeley *et al.*, 2009). The major aim of the current combined resting-state functional MRI and tau-PET study was to test whether higher functional MRI-assessed intrinsic functional connectivity, i.e. synchronous activity between two given brain regions, is associated with stronger interregional similarity of tau deposition (i.e. tau covariance) as assessed by tau-PET.

Functional connectivity of neural activity can be non-invasively estimated via resting-state functional MRI assessed synchronicity in the blood oxygen level-dependent signal, i.e. a proxy of neuronal firing. Resting-state functional MRI studies have revealed that the brain is composed of large-scale functional networks that show highly correlated activity fluctuations between even distant brain regions (Smith *et al.*, 2009). Such intrinsic functional networks correspond largely to anatomical fibre tract connections between regions, providing an anatomical feasibility of network connectivity (Honey *et al.*, 2009). For the current cross-sectional analysis, we hypothesize that higher resting-state functional connectivity between brain regions is related to higher covariance of tau between the functionally connected brain regions (i.e. 'tau covariance'). Initial support for this notion comes from previous tau-PET imaging studies in subjects with Alzheimer's disease showing a spatial correspondence between regional prevalence of abnormal tau and major functional networks in the human brain (Hansson *et al.*, 2017; Hoening *et al.*, 2018). A quantitative relationship between the level of resting-state functional connectivity and tau-PET, however, has rarely been

assessed. A recent combined functional MRI and tau-PET study showed that higher tau was associated with higher graph theoretical indices of functional connectivity assessed in Alzheimer's disease dementia ($n = 20$), but not primary progressive palsy (Cope *et al.*, 2018). These results support the view that functional connectivity is related to tau deposition, but raise the question whether such an association is specific to Alzheimer's disease dementia.

Albeit at a more restricted level compared to subjects in presumably early stages of Alzheimer's disease (i.e. preclinical Alzheimer's disease), higher age in amyloid-negative elderly subjects is also associated with an increase in AV1451 PET assessed tau deposition (Johnson *et al.*, 2016; Maass *et al.*, 2018). In normal ageing, higher levels of AV1451 PET detected pathological (filamentous) tau is found mainly in the medial and inferior temporal lobe (Johnson *et al.*, 2016; Scholl *et al.*, 2016). Furthermore, dramatically increased levels of tau deposition were recently reported amyloid-negative vascular cognitive impairment (VCI) (Kim *et al.*, 2018). In VCI, abnormal tau as assessed by AV1451 PET was observed in medial and inferior temporal regions, but also in adjacent medial parietal and medial frontal regions, similar to the tau pattern observed in Alzheimer's disease (Kim *et al.*, 2018).

Here, we addressed the pivotal question whether higher levels of resting-state functional connectivity are associated with higher spatial covariance of tau within normal ageing, a wider clinical spectrum of Alzheimer's disease subjects and VCI. To this end, we assessed the association between functional connectivity and higher spatial tau covariance in a larger sample of subjects ($n = 141$), including cognitively normal amyloid-negative elderly subjects ($n = 55$), amyloid-positive subjects ranging from cognitive normal to Alzheimer's disease dementia ($n = 50$), as well as amyloid-

negative subjects with VCI due to small vessel disease (SVD, $n = 36$). Using resting-state functional MRI and AV1451 tau-PET data obtained in these subjects, we assessed in a whole-brain approach whether the pattern of tau deposition is associated with the underlying functional brain architecture.

Materials and methods

Participants

Normal ageing and Alzheimer's disease: ADNI

We included 105 participants from the Alzheimer's Disease Neuroimaging Initiative (ADNI) phase 3 (ClinicalTrials.gov ID: NCT02854033) based on availability of T₁-weighted and resting-state functional MRI, ¹⁸F-AV1451 tau-PET for the assessment of tau and ¹⁸F-AV45 amyloid-PET ($n = 87$) or alternatively ¹⁸F-florbetaben amyloid-PET ($n = 18$) for the assessment of amyloid deposition. All measures had to be obtained at the same study visit. Using Freesurfer-derived global amyloid-PET (AV45/florbetaben) standardized uptake value ratio (SUV_R) scores normalized to the whole cerebellum (provided by the ADNI-PET Core), all subjects were characterized as amyloid- β -positive (A β +) or -negative (A β -) based on established cut-points (global AV45 SUV_R > 1.11 or global florbetaben-PET SUV_R > 1.2; Table 1) (Landau *et al.*, 2012). For the normal-ageing group, we included 55 elderly cognitively normal [Mini Mental State Examination (MMSE) > 24, Clinical Dementia Rating (CDR) = 0, non-depressed] amyloid- β -negative subjects (CN-A β -). To cover the spectrum of Alzheimer's disease, we included 27 cognitively normal amyloid- β -positive (CN-A β +), 16 mild cognitively impaired (MCI) amyloid- β -positive subjects (MMSE > 24, CDR = 0.5, showing objective memory loss on the education-adjusted Wechsler Memory Scale II but preserved activities of daily living) and

Table 1 Sample characteristics

AD spectrum	CN-A β - ($n = 55$)	CN-AD ($n = 27$)	MCI-AD ($n = 16$)	Dementia-AD ($n = 7$)	P-value
Age, years	72.64 (6.69)	74.26 (4.39)	73.16 (7.44)	77.56 (10.75)	0.245
Gender, male/female	24/31	8/19	8/8	3/4	0.542
Education	16.62 (2.29)	16.70 (2.67)	15.88 (3.22)	14.57 (2.51)	0.085
MMSE	29.15 (1.16)	29.41 (0.93)	25.5 (3.14)	23.43 (2.23)	<0.001
ADAS-Cog	9.61 (2.69)	8.98 (2.52)	16.05 (4.62)	20.38 (4.59)	<0.001
VCI (amyloid-β-)	MCI ($n = 22$)	Dementia ($n = 14$)			
Age	76.27 (6.81)	78.57 (5.83)			0.304
Gender, male/female	7/15	3/11			0.767
Education	7.64 (5.55)	6.46 (4.86)			0.522
MMSE	25.36 (3.72)	17.43 (4.20)			<0.001
SVLT	17.32 (5.20)	11.00 (5.87)			0.002
SVD composite score	1.55 (1.1)	1.43 (1.22)			0.768
WMH volume, ml	22.59 (6.10)	44.82 (10.10)			0.483
Number of lacunes	6.47 (7.51)	7.36 (7.18)			0.646
Number of microbleeds	13.37 (18.69)	25.96 (49.20)			0.212

Values are presented as mean (SD).

AD = Alzheimer's disease; ADAS-Cog = Alzheimer's disease assessment scale cognitive subscale; MMSE = Mini-Mental State Examination; SVLT = Seoul verbal learning test; WMH = white matter hyperintensity.

seven amyloid- β -positive patients with dementia (MMSE < 26, CDR > 0.5, fulfilment of NINCDS/ADRDA criteria for probable Alzheimer's disease) (Petersen *et al.*, 2010). Ethical approval was obtained by the ADNI investigators, all participants provided written informed consent.

Vascular cognitive impairment: Samsung Medical Center, Seoul

We included 36 amyloid- β -negative subjects with VCI due to SVD who were recruited from 2015 to 2016 at the Samsung Medical Center, Seoul, Korea (Leemans *et al.*, 2009). For inclusion in the current analysis, patients had to have available structural MRI and resting-state functional MRI, ^{18}F -AV1451 tau-PET and ^{18}F -florbetaben amyloid-PET all obtained at the same study visit. General study inclusion criteria have been described in detail previously (Kim *et al.*, 2016, 2018). In brief, all subjects had to show objective cognitive impairment as indicated by a test score below the age-adjusted 16th percentile in any cognitive domain including language, visuo-spatial, memory or executive function. Significant SVD was defined as white-matter hyperintensity burden of size > 10 mm within the periventricular white matter and > 25 mm in deep white matter. MCI was clinically diagnosed following the Petersen criteria (Petersen *et al.*, 2014), dementia was diagnosed following the National Institute on Aging research criteria for probable Alzheimer's disease (McKhann *et al.*, 2011). Based on Freesurfer-derived global florbetaben-PET SUVR scores (intensity normalized to the cerebellar grey matter) (Kim *et al.*, 2018), patients were defined as amyloid- β -negative (MCI/dementia = 22/14) based on a previously established cut-off at 1.45 (Villemagne *et al.*, 2011; Bullich *et al.*, 2017). The burden of SVD was graded on a scale ranging from 0 to 3, using a previously described scoring system based on SVD imaging markers (Kim *et al.*, 2018). That composite score of SVD burden (SVD score) was the sum of the presence of lacunes (score of 1 if more than four lacunes), microbleeds (score of 1 if more than four microbleeds) and white-matter hyperintensities (score of 1 if white-matter hyperintensity volume > 40.6 ml). For a more detailed description of the SVD score refer to Kim *et al.* (2018). The study was approved by the Institutional Board of Samsung Medical Center, all participants provided written informed consent.

MRI and PET acquisition and preprocessing

In both samples, all MRI data were obtained on 3 T scanner systems. AV1451 tau-PET was assessed via intravenous bolus tracer injection. For details on image acquisition and sequence parameters please see the Supplementary material. AV1451 and resting-state functional MRI images were preprocessed and spatially normalized using the same SPM12-based (Wellcome Trust Centre for Neuroimaging, University College London) pipeline as described previously (Franzmeier *et al.*, 2017a, b, c, d, 2018). Details on preprocessing are provided in the Supplementary material. Note that all processing steps were conducted fully independent for the samples from ADNI and Samsung Medical Center, hence no data were merged during any stage of data processing or analysis.

Assessment of functional connectivity and tau covariance

Functional connectivity and tau covariance were estimated in a region of interest (ROI)-based manner, using 400 ROIs from the Schaefer functional MRI atlas (Fig. 1A), which is based on a data-driven functional MRI parcellation of the neocortex and argued to reflect a neurobiologically-meaningful brain parcellation (Schaefer *et al.*, 2018). The 400 ROIs can be grouped within seven large-scale functional networks (Fig. 1A) that are congruent with previous parcellations (Yeo *et al.*, 2011). This atlas is especially suited for our joint analysis of AV1451 tau-PET and functional MRI, since the ROIs are restricted to the neocortex excluding typical AV1451 off-target binding regions such as the hippocampus or basal ganglia (Marque *et al.*, 2015; Schaefer *et al.*, 2018), which may have otherwise confounded our analyses. All analyses steps were conducted separately but in an equivalent manner for the ADNI and Seoul datasets. Prior to all analyses, the Schaefer functional MRI atlas was masked with sample-specific sharpened grey matter masks for both samples. Sharpening was based on a previously described protocol, where voxels with the higher probability of being CSF than being grey matter were discarded from the analysis (Jack *et al.*, 2017). Further, to address whether the distance between ROI-mediated associations between functional connectivity and tau, we computed the Euclidean distance between any ROI pair (Supplementary material).

To ensure that reported results were not driven by the nature of the 400 ROI Schaefer parcellation, we repeated all analyses using the 200 ROI variant of the Atlas (Schaefer *et al.*, 2018). The result pattern when using this 200 ROI parcellation was consistent with all results reported here.

Functional connectivity assessment

Functional connectivity was estimated for each subject based on fully preprocessed functional MRI data. Specifically, we extracted the mean functional MRI time course for each of the 400 ROIs by averaging the signal across voxels falling within an ROI per volume. Mean ROI time courses were then cross-correlated using Pearson-Moment correlation, yielding a 400×400 functional connectivity matrix that was subsequently Fisher z-transformed and autocorrelations were set to zero. For each group (i.e. CN-A β -, Alzheimer's disease and VCI), we then computed group-average functional connectivity matrices across subjects.

Tau covariance assessment

We assessed the correlation between the levels of tau-PET in a given region X and another region Y (see Fig. 1B for an analysis flow chart). The analysis pipeline was adopted in a modified way from previous studies using this approach to determine FDG-PET (i.e. metabolic covariance) or grey matter covariance (i.e. structural connectivity) across brain regions (Pagani *et al.*, 2014; Di *et al.*, 2017). First, we computed the mean tau-PET uptake within each of the 400 ROIs for each subject [Fig. 1B(i)]. Next, we vectorized the mean ROI data to subject-specific 400-element vectors [Fig. 1B(ii)]. Using these 400-element tau-PET uptake vectors, we then assessed across subjects the pairwise ROI-to-ROI Spearman correlation

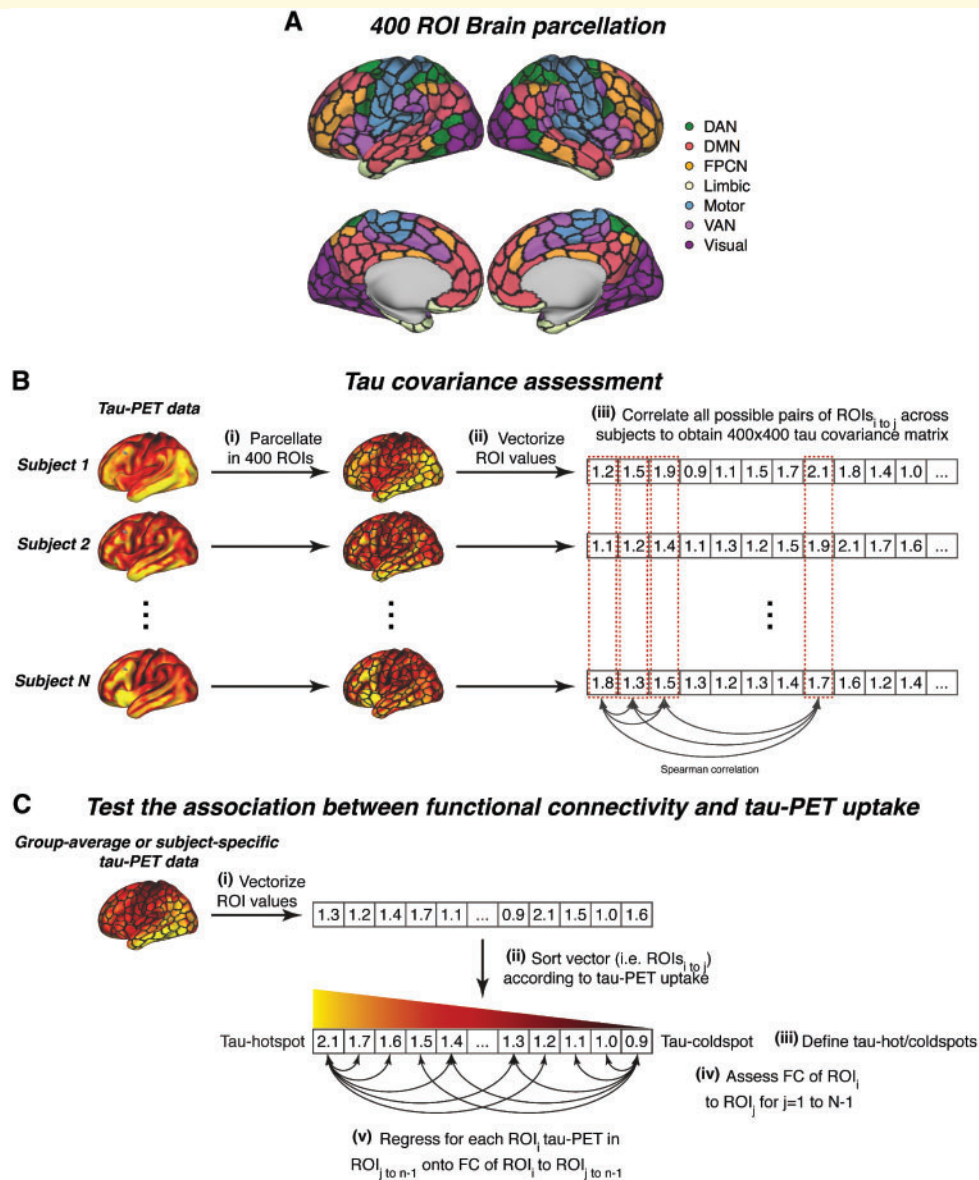


Figure 1 Analysis flow chart. (A) Brain parcellation scheme (Schaefer *et al.*, 2018) that was used for parcellating tau-PET and functional MRI data. (B) Flow chart of the tau covariance analysis. (i) Individual tau-PET scans are parcellated into 400 ROIs for each individual and (ii) mean ROI values are subsequently vectorized. Across subject tau values within a given ROI are correlated with all other ROIs using spearman-correlation (iii) to obtain a 400 × 400 tau covariance matrix. (C) Pipeline for testing the association between functional connectivity of seed ROIs and absolute tau-PET levels in target ROIs. DAN = dorsal attention network; DMN = default-mode network; FC = functional connectivity; FPCN = fronto-parietal control network; VAN = ventral attention network.

of tau-PET uptake [Fig. 1B(iii)]. We specifically used Spearman correlation to avoid that tau covariance estimation was driven by extreme tau-PET values. This analysis resulted in a single 400 × 400 sized tau covariance matrix each for each group (i.e. CN-Aβ⁻, Alzheimer's disease, VCI). Again, autocorrelations were set to zero and all correlations were Fisher z-transformed, equivalent to the functional connectivity matrices.

Statistics

For both samples, baseline demographics were compared between diagnostic groups within the ADNI and Seoul sample

using chi-squared tests for categorical variables and ANOVAs (ADNI) or two-sample *t*-tests (Seoul) for continuous variables.

To assess the spatial distribution of pathological tau (i.e. SUVR > 1.2) (Mishra *et al.*, 2017), we averaged voxel-wise tau-PET maps within each diagnostic group. We extracted the average tau-PET uptake in a network-specific way, to assess whether tau-accumulation is constrained to certain networks.

To test our first hypothesis, i.e. that the functional connectivity between two given brain regions is associated with tau covariance between those regions, we computed spatial linear regression with the average functional connectivity matrix as

the independent variable and the tau covariance matrix as the dependent variable. This analysis was conducted separately for CN-A β –, Alzheimer’s disease and VCI groups. Significance was assessed by repeating this linear regression on 1000 bootstrapped samples (based on which group-average functional connectivity and tau covariance matrices were iteratively determined) and applying a one-sample *t*-test on the resulting β -value distribution. We next tested whether associations between functional connectivity and tau covariance were driven by spatial proximity between ROIs, since tau is known to propagate across spatially adjacent regions (Cho *et al.*, 2016). To this end, we repeated the above described analysis this time controlling for Euclidean distance between ROIs.

We also hypothesized that at high levels of tau in seed regions, higher functional connectivity should be associated with higher tau in connected target regions. However, at lower levels of tau in seed regions, higher functional connectivity should be associated with lower levels of tau in connected target regions. The rationale is that tau propagation is a function of both the level of tau in the seed region and the level of functional connectivity between the seed region and the target region. To test this hypothesis, we vectorized [Fig. 1C(i)] and rank-ordered all ROIs by group-average tau-PET uptake [Fig. 1C(ii)]. We then assessed the group-average seed-based functional connectivity for each pair of seed and target ROIs in the brain [Fig. 1C(iv)]. We next regressed the tau-PET levels in the target ROIs for a given seed ROI onto the functional connectivity values between the target ROIs and the given seed ROI. We iterated this analysis for all seed ROIs, resulting a series of β -values across the different seed ROIs [Fig. 1C(v)]. To assess whether higher tau-PET in the seed ROI is associated with higher functional connectivity related tau-PET in target ROIs, we computed across seed ROIs, the Pearson-Moment correlation between the tau-PET uptake in a seed ROI and the corresponding β -value (i.e. the association between a seed ROI’s functional connectivity pattern and tau-PET uptake in the target ROIs) for a given seed ROI. To assess significance of this association we repeated the entire analysis on 1000 bootstrapped samples (based on which group-average seed functional connectivity and tau-PET uptake were iteratively determined). To illustrate the association between functional connectivity and absolute tau-PET levels we plotted the association between seed functional connectivity and tau-PET uptake for regions with maximum tau (i.e. tau-hotspots) and minimum tau (i.e. tau cold spots) [Fig. 1C(iii)]. To ensure that results were not driven by ROIs with very low tau-PET signal, we repeated this analysis in a stepwise manner, retaining only ROIs with an AV1451 tau-PET SUVR > 1.0, 1.1.

In a third step, we aimed to determine whether the inter-individual variability in the association between functional connectivity and tau-PET uptake was explained by elevated amyloid- β levels or SVD burden. Here, we conducted a random effects analysis, where we first ran linear regression models to determine subject-specific associations between functional connectivity of a subjects’ tau hot- or cold spot (i.e. the ROIs with maximum/minimum tau-PET uptake in a given subject) and tau-PET uptake in remaining ROIs (Fig. 1C). Using a one-sample *t*-test we assessed whether the resulting distribution of standardized β -values (i.e. the weight of the subject-level associations between tau hot- or cold spot functional

connectivity and tau-PET-uptake in target regions) was significantly different than zero. We then tested whether subject-level β -values were different between CN-A β – and Alzheimer’s disease groups using an ANCOVA, including group, age, gender, education and site as predictors. In the VCI subjects, we tested whether associations between tau hot- or cold spot functional connectivity and tau uptake were associated with SVD severity that has been previously shown to relate to increased inferior temporal tau load in this sample (Kim *et al.*, 2018). To this end, we tested whether β -values were associated with SVD composite scores or white matter hyperintensity volume, microbleed count and lacune count using linear regression, controlled for age, gender and education.

All analyses described here were conducted using R statistical software. Associations (standardized β -weights and correlations) were considered significant when meeting an alpha threshold of 0.05.

Data availability

The data that support the findings of this study will be made available upon request to the corresponding author and the Alzheimer’s Disease Neuroimaging Initiative (ADNI) committee. The data from ADNI cannot be shared directly by the authors due to data protection defined by the ADNI data use policy (<https://ida.loni.usc.edu/collaboration/access/appLicense.jsp>).

Results

Group demographics are shown in Table 1.

Spatial distribution of abnormal tau across diagnostic groups

In agreement with previous findings, we observed a hierarchical, disease stage-dependent pattern of tau-PET uptake. In normal ageing (i.e. CN-A β –) abnormal tau-PET uptake was primarily restricted to the inferior lateral temporal cortex (Fig. 2A). In Alzheimer’s disease (i.e. A β +), increasing disease severity from cognitively normal to dementia was associated gradual increasing tau-PET uptake following a typical Braak-like pattern. In VCI, abnormal tau-PET uptake was restricted to inferior temporal and frontal regions in MCI, but more widespread in VCI dementia. Regional tau-PET levels within major functional networks showed a network-specific profile of tau distribution, with tau being highest within the medial temporal limbic network, followed by elevated tau levels in other cortical networks, whereas the motor network was mostly spared (Fig. 2B). Tau burden increased in each network with increasing disease severity.

Functional connectivity is associated with tau covariance

To test whether functional connectivity between any two brain regions is associated with covarying tau-PET levels,

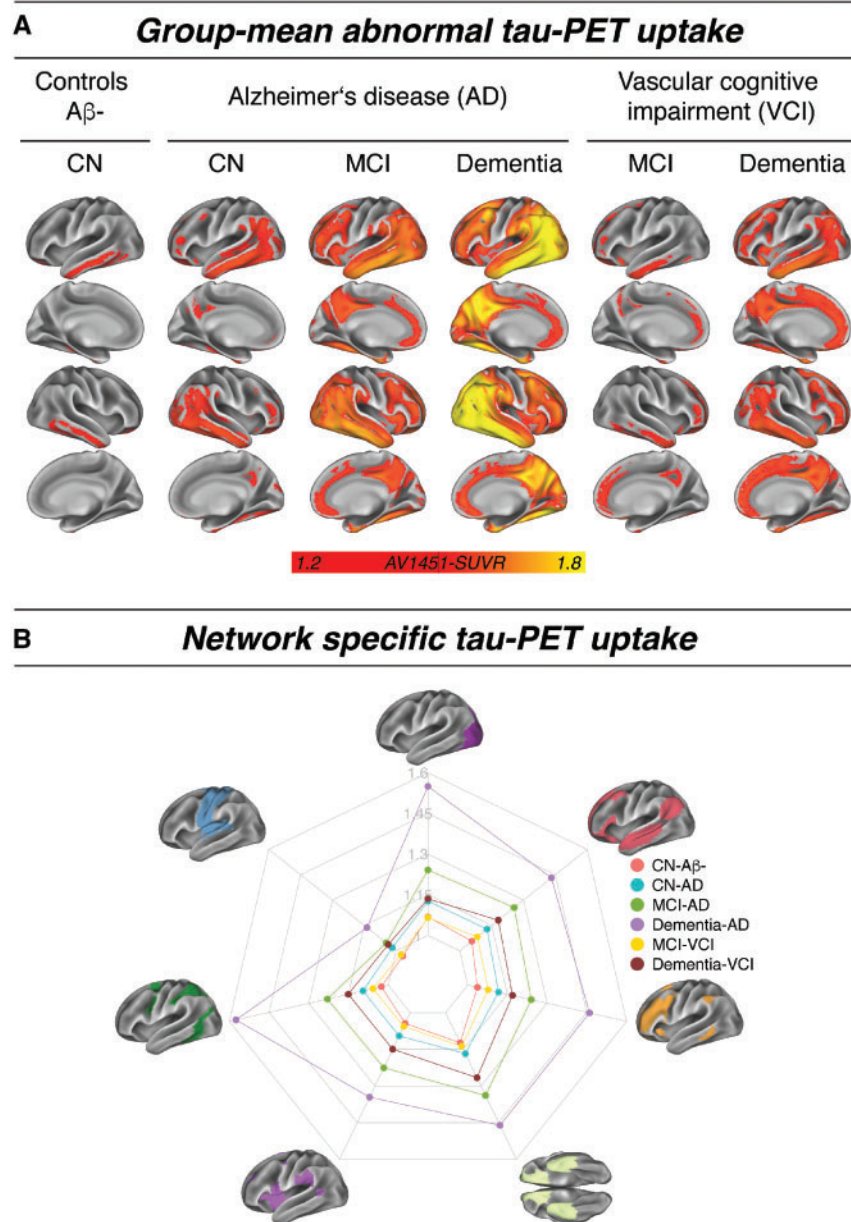
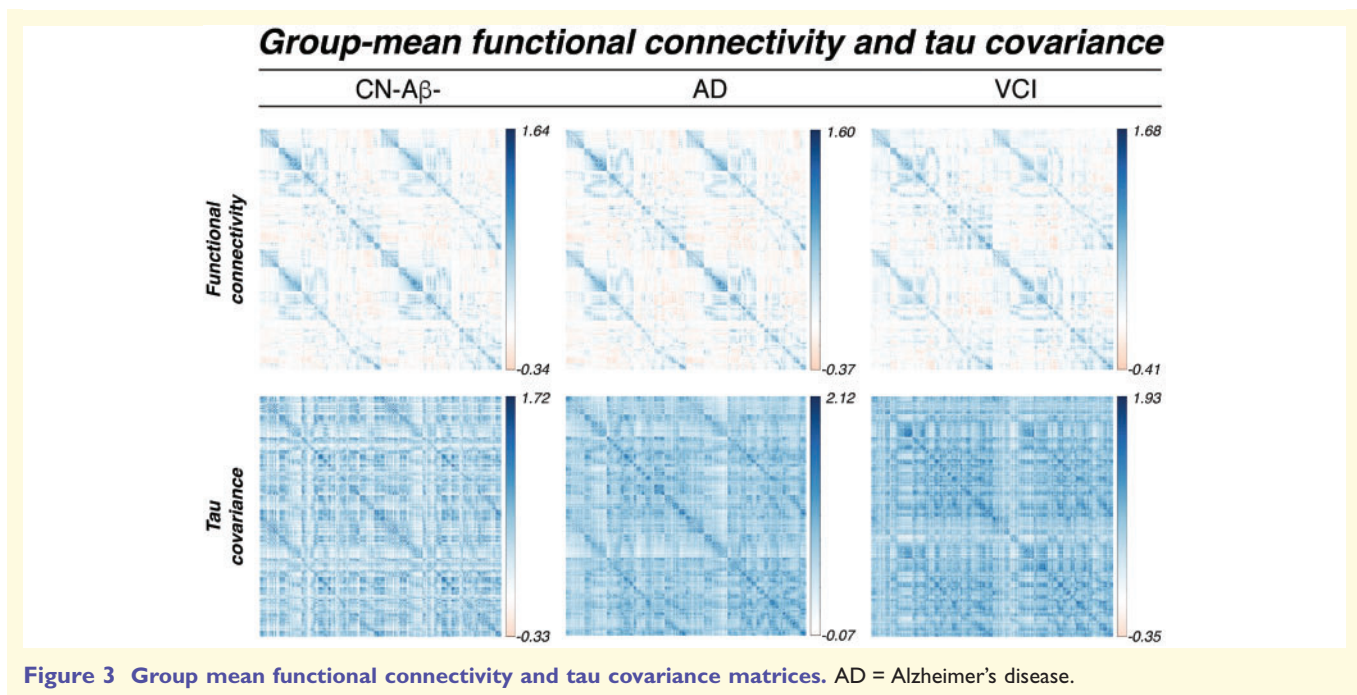


Figure 2 Group mean tau-PET data. (A) Mean distribution of abnormal tau (i.e. SUVR > 1.2) for each sample and diagnostic group. (B) Network-specific mean tau-PET SUVRs stratified by diagnostic groups. AD = Alzheimer's disease; CN = cognitively normal.

we computed the similarity between functional connectivity and tau covariance matrices (Fig. 3). Spatial regression of functional connectivity against the tau covariance matrices showed that higher functional connectivity was associated with higher tau covariance, for CN-A β - ($\beta = 0.299$, $P < 0.001$, Fig. 4A), Alzheimer's disease spectrum ($\beta = 0.453$, $P < 0.001$, Fig. 4B) and VCI ($\beta = 0.397$, $P < 0.001$, Fig. 4C). These results confirm our hypothesis that higher functional connectivity was associated with higher tau covariance in normal ageing, different stages of Alzheimer's disease, as well as VCI. To assess whether associations between functional connectivity and tau covariance were driven by spatial proximity between ROIs

we recomputed the above described regression models, controlling for between-ROI Euclidean distance (see Supplementary material for how Euclidean distance was determined). Here, all associations between functional connectivity and tau covariance remained consistent, in the CN-A β - ($\beta = 0.251$, $P < 0.001$), Alzheimer's disease ($\beta = 0.354$, $P < 0.001$) and VCI sample ($\beta = 0.421$, $P < 0.001$). Mapping of tau-PET uptake within the functional network topology showed that the tau deposition clustered within closely functionally connected regions (Fig. 4D–F), suggesting that the functional topology rather than geometric distance between brain regions corresponds best to the spatial pattern of tau deposition.



Functional connectivity predicts absolute tau-PET uptake levels

We next tested whether the level of tau-PET uptake in a given seed region is predictive of tau-PET uptake in connected target regions. For seeds with higher levels of tau, we found that higher functional connectivity was associated with higher levels of tau in target regions in all three groups including CN-Aβ⁻, Alzheimer's disease spectrum, and VCI. Conversely, for seeds with lower levels of tau, higher functional connectivity was associated with lower tau in target regions (Fig. 5A–C). This result pattern was reflected in a strong positive correlation between the seed ROIs tau-PET uptake and their functional connectivities' predictive weight (i.e. regression derived β -coefficient) on tau-PET uptake in target ROIs, which was consistently detected in CN-Aβ⁻ ($\beta = 0.724$, $P < 0.001$), Alzheimer's disease spectrum (Aβ⁺: $\beta = 0.759$, $P < 0.001$) and VCI ($\beta = 0.611$, $P < 0.001$). Results remained consistent when restricting this entire analysis to ROIs with AV1451 tau-PET SUVRs > 1.0 or 1.1 (Supplementary Fig. 1).

To illustrate this point further, we display the results for the analysis of seed regions with peak-level of tau (tau hot-spots, Fig. 5D–F) and minimum-level of tau (tau cold-spot, Fig. 5 G–I). Higher functional connectivity of the hotspot seed was associated with higher absolute levels of tau in the target regions in CN-Aβ⁻ ($\beta = 0.469$, $P < 0.001$), Alzheimer's disease spectrum ($\beta = 0.619$, $P < 0.001$) and VCI ($\beta = 0.199$, $P < 0.001$). Conversely, higher functional connectivity of the cold spot seeds was associated with lower absolute levels of tau in target regions in CN-Aβ⁻ ($\beta = -0.098$, $P = 0.049$), Alzheimer's disease spectrum

($\beta = -0.582$, $P < 0.001$), and VCI ($\beta = -0.293$, $P < 0.001$). This result pattern suggests that regions with high tau levels share similarly high tau levels with closely connected brain regions, while regions with low tau share similarly low tau levels with closely connected regions.

The anatomical location of tau hot or cold spots within each sample is shown in Supplementary Fig. 2.

Associations between functional connectivity and tau are not driven by amyloid- β or small vessel disease

We next asked whether the level of amyloid- β or SVD modulated the association between functional connectivity and tau covariance. To this end, we conducted subject-specific regression models, where we tested the individual association strength (i.e. β -value) between functional connectivity of a tau hot- or cold spot seed and tau-PET uptake in target regions. First, we confirmed on the subject level that higher functional connectivity of tau hotspots predicts higher tau in target regions, where we found significant positive β -weights for CN-Aβ⁻ [mean/standard deviation (SD) = 0.23/0.16, $t(54) = 10.326$, $P < 0.001$], Alzheimer's disease spectrum [mean/SD = 0.20/0.17, $t(49) = 7.986$, $P < 0.001$] and VCI groups [mean/SD = 0.16/0.14, $t(35) = 6.722$, $P < 0.001$] as indicated by t -tests against zero on the β -weight distributions. Conversely, we found significant negative β -weights for tau-cold spots for CN-Aβ⁻ [mean/SD = $-0.19/0.19$, $t(54) = -7.596$, $P < 0.001$], Alzheimer's disease spectrum [mean/SD = $-0.22/0.16$, $t(49) = -9.678$, $P < 0.001$] and VCI [mean/SD = $-0.16/0.17$, $t(35) = -5.596$, $P < 0.001$].

Functional connectivity associated with tau covariance

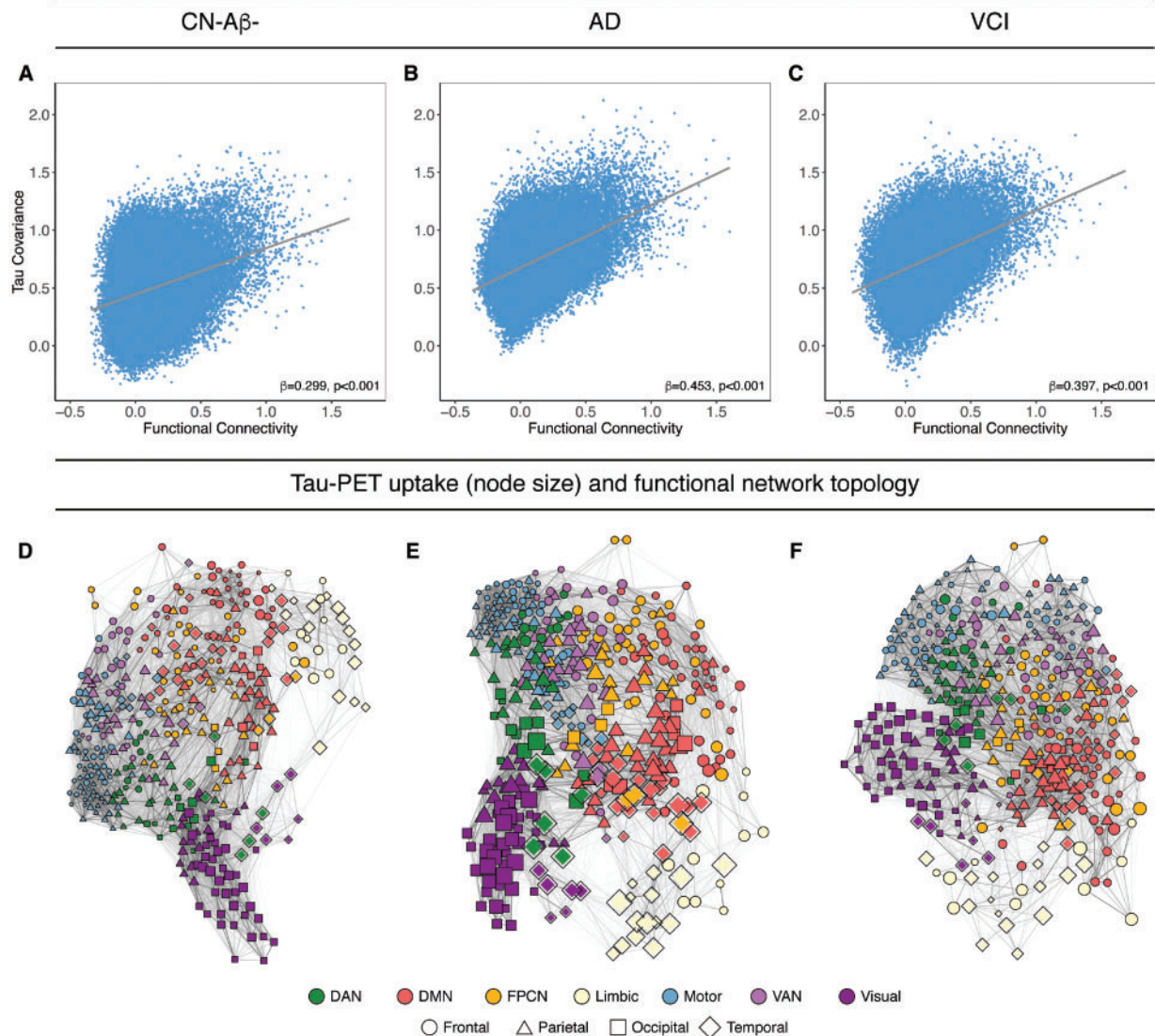


Figure 4 Associations between functional connectivity and tau covariance. Scatterplots showing the associations between tau and functional connectivity for CN-A β - (A), Alzheimer's disease (AD) (B), and VCI groups (C). Scatterplots are based on group-average data, significance for all analyses was determined using linear regression repeated on 1000 bootstrapped samples on which group-average functional connectivity and tau covariance were iteratively determined. (D–F) Force-directed graphs illustrating the association between functional network topology (node distance), tau-PET uptake (node size) and anatomical location (node symbol). Node proximity is defined based on the Fruchterman-Reingold algorithm applied to group-average functional connectivity strength. DAN = dorsal attention network; DMN = default-mode network; FPCN = fronto-parietal control network; VAN = ventral attention network.

When testing whether abnormal amyloid- β was associated with stronger associations between functional connectivity and tau, we found no β -value differences between Alzheimer's disease spectrum and CN-A β - subjects for tau-hotspots [$F(5,96) = 0.941$, $P = 0.335$] or cold spots [$F(5,96) = 0.355$, $P = 0.553$; ANCOVAS controlled for age, gender, education and site].

Lastly, we assessed in the VCI sample whether SVD load influenced the association between functional connectivity and tau using linear regression adjusting for age, gender, diagnosis and education. Here, we found no association

between the SVD composite scores and β -weights [hotspots: $t(30) = -0.904$, $\beta = -0.184$, $P = 0.373$; cold spots $t(30) = -0.767$, $\beta = -0.165$, $P = 0.449$]. In a similar vein, β -weights were not associated with continuous measures of white matter hyperintensity volume [hotspots: $t(30) = 0.063$, $\beta = 0.012$, $P = 0.951$; cold spots: $t(30) = -0.958$, $\beta = -0.19$, $P = 0.346$], number of microbleeds [hotspots: $t(30) = -0.081$, $\beta = 0.016$, $P = 0.936$; cold spots: $t(30) = -0.851$, $\beta = -0.171$, $P = 0.402$] or number of lacunes [hotspots: $t(30) = -1.371$, $\beta = 0.290$, $P = 0.181$; cold spots: $t(30) = -0.512$, $\beta = -0.117$,

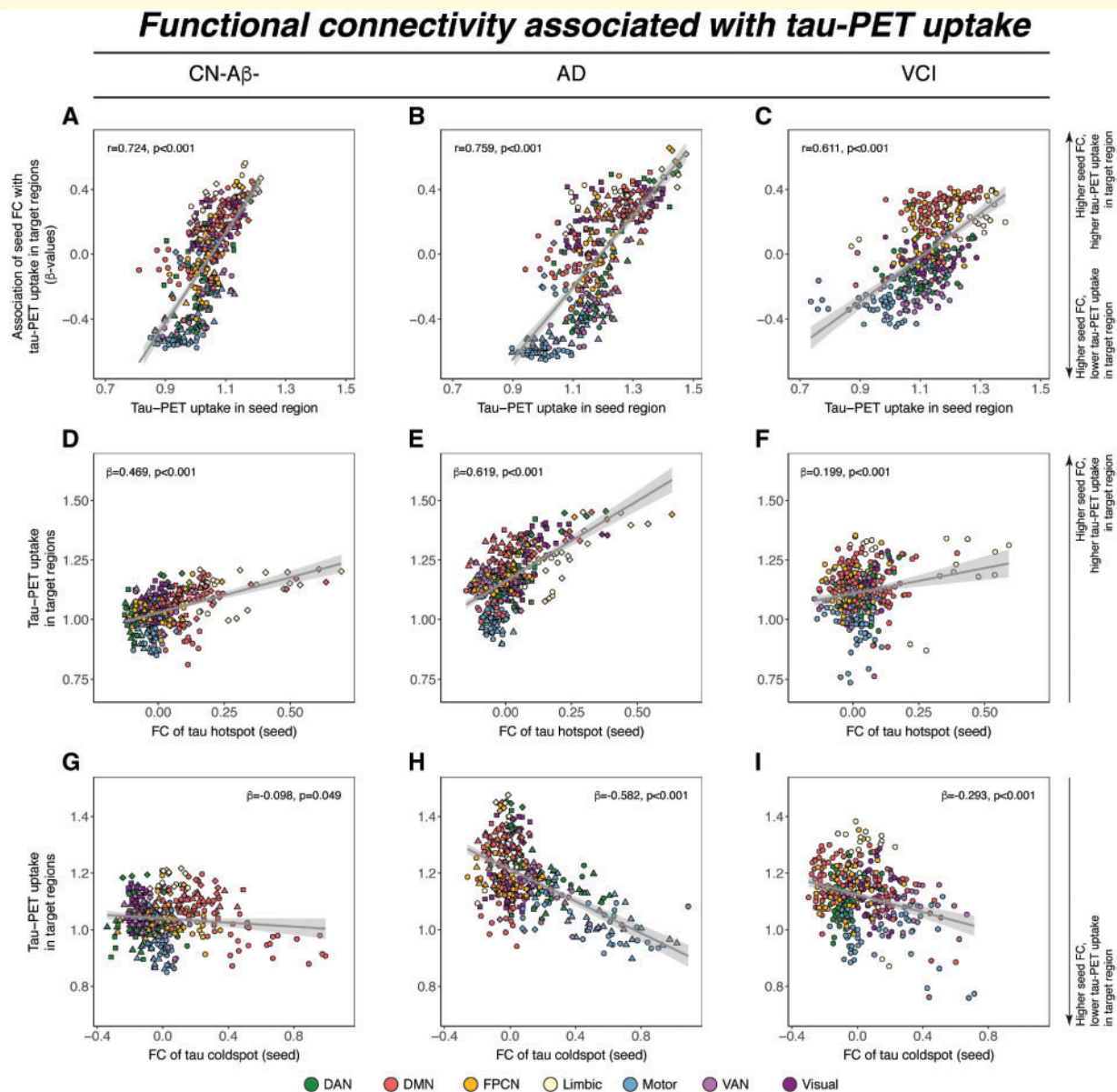


Figure 5 Functional connectivity as a predictor of tau-PET uptake. (A–C) Relationship between tau-PET uptake of a seed ROI (x-axis) and the regression-derived association between its functional connectivity (FC) to target regions and tau-PET uptake in the respective target regions (y-axis). Positive y-values indicate that higher functional connectivity to target regions is associated with higher tau, while negative y-values indicate that higher functional connectivity to target regions is associated with lower tau. Example illustration of the results shown for regions of maximum tau (i.e. hotspots, D–F) and regions of minimum tau (i.e. cold spot, G–I). Scatterplots are based on group-average functional connectivity or tau-PET uptake, significance for all analyses was determined using linear regression repeated on 1000 bootstrapped samples on which group-average functional connectivity and group-average tau-PET uptake were iteratively determined. The anatomical location of tau hot and cold spots is shown in Supplementary Fig. 2. AD = Alzheimer's disease; DAN = dorsal attention network; DMN = default-mode network; FPCN = fronto-parietal control network; VAN = ventral attention network.

$P = 0.612$]. Results remained unchanged when using binarized measures (see 'Materials and methods' section for cut-offs) of white matter hyperintensities, lacunes or microbleeds. These results suggest that associations between functional connectivity and tau are not influenced by the presence of pathological amyloid- β levels or cerebrovascular pathology.

Discussion

The main findings of the current cross-sectional study are that (i) higher functional connectivity between any two given brain regions is associated with stronger tau covariance; (ii) for high-tau regions, higher functional connectivity predicts high tau-PET in the connected regions, but for

low-tau regions, higher functional connectivity predicts lower tau-PET in the connected regions; and (iii) all associations between functional connectivity and tau-PET were consistently detected across normal ageing (i.e. CN-A β -), the Alzheimer's disease spectrum and VCI. Together, these results suggest that the regional pattern of functional connectivity is predictive of the spatial pattern of tau, where the interregional tau levels covary as a function of functional connectivity, regardless of the presence of abnormal amyloid- β , cognitive impairment, or cerebrovascular pathology.

Our first finding confirms our hypothesis that levels of tau are similar (i.e. covary) between those regions that are highly functionally connected. This result is largely consistent with two recent AV1451 tau-PET studies showing that regions with covarying tau levels (i) cluster in a hierarchical manner from early- to late-Braak regions (Sepulcre *et al.*, 2017); and (ii) show a topological match with resting-state functional MRI derived functional networks in Alzheimer's disease (Hoenig *et al.*, 2018). In a similar vein, another previous study in Alzheimer's disease has shown that more widespread connectivity of a given brain region (i.e. weighted degree) was associated with higher regional tau levels, suggesting that functional hub regions are in particular susceptible to the accumulation of tau pathology (Cope *et al.*, 2018). Our results are in line with those previous reports (Cope *et al.*, 2018; Hoenig *et al.*, 2018) and point towards functional connectivity as an important factor that is predictive of regional tau-PET levels. The novelty of our current study is that the strength of functional connectivity linearly maps to the covariance of tau levels between remote brain regions, which was not only found in Alzheimer's disease but also in normal ageing and VCI. Previous *in vitro* and rodent studies have shown that optogenetically enhanced activity of tau-harboring neurons triggered tau-release ensuing increased tau-load in postsynaptic neurons (Pooler *et al.*, 2013; Wu *et al.*, 2016). The current findings are in line with this result, showing that higher interregional functional connectivity is associated with higher covariance of tau. Although our study is correlational in nature, the results are consistent with the tau propagation model, where higher functional connectivity facilitated the seeding of tau.

Importantly, we found across all samples and groups that the strength of the association between functional connectivity and tau covariance remained almost unchanged when controlling for the Euclidian distance between regions. Thus, the link between functional connectivity and tau covariance was not driven by spatial proximity, supporting the view that tau spreads across connected regions rather than just diffusing to nearby regions (Liu *et al.*, 2012; Calafate *et al.*, 2015; Lewis and Dickson, 2016). These findings are in agreement with preclinical findings in rodents, where injection of pathological human tau (Ahmed *et al.*, 2014) or synthetically preformed tau aggregates (Iba *et al.*, 2013) caused time-dependent tau

propagation to synaptically connected rather than just spatially adjacent regions.

We further showed that particular regions with peak levels of tau share high tau with functionally closely connected regions, whereas regions with very low levels of tau share low levels of tau with functionally highly connected regions. Previous studies in Alzheimer's disease could show that the functional connectivity pattern of medial temporal lobe 'atrophy hotspots' predicted similar atrophy levels in highly connected regions, an association which the authors assumed to be mediated by tau-spread from hotspots to connected regions (Mutlu *et al.*, 2017; Filippi *et al.*, 2018). The current findings support this notion, showing higher tau levels in those brain regions with high functional connectivity to tau hotspots. Given previous results of higher activity related tau spreading in transgenic mouse models of tau (Wu *et al.*, 2016), it is thus possible that higher functional connectivity of tau hotspots may facilitate the spread of tau to other brain regions. We caution, however, that our current results are cross-sectional and correlational in nature, precluding a causative interpretation. An alternative explanation of similar tau levels across functionally connected regions could be based on a regionally similar susceptibility for developing tau. Here, it has been shown previously that (i) network-forming regions exhibit similar gene expression patterns (Richiardi *et al.*, 2015); and (ii) that specific gene expression patterns can render brain regions susceptible for developing Alzheimer's disease pathology (Grothe *et al.*, 2018). Accordingly, the association between functional connectivity and tau covariance could partly be an epiphenomenon of similar function or gene expression ensuing shared susceptibility for developing tau pathology. In view of these previous findings, it is thus possible that the association between functional connectivity and tau covariance is a function of both similar local susceptibility and transneuronal propagation of tau.

We showed that the associations between functional connectivity and tau were detected not only in Alzheimer's disease but also within normal ageing (i.e. CN-A β -) and amyloid- β -negative subjects with VCI, suggesting that tau propagation between brain regions is associated with the level of functional connectivity, independent of amyloid- β . *In vitro* and animal studies have shown that pathological human tau propagates along connected neurons in the absence of elevated amyloid- β (Liu *et al.*, 2012; Pooler *et al.*, 2013; Calafate *et al.*, 2015; Wu *et al.*, 2016). Also, human autopsy studies have demonstrated that tau-pathology in non-demented and demented elderlies can follow a Braak-like pattern, even when amyloid- β levels are normal, which is now considered to reflect suspected non-amyloid pathology (SNAP) or primary age-related tauopathy (PART) (Crary *et al.*, 2014; Crary, 2016). Together these results suggest that tau propagation across connected regions is unlikely to be a gain of function mediated by the presence of amyloid- β . However, amyloid- β -related microglial activation (Heurtaux *et al.*, 2010) has been shown to promote local tau-hyperphosphorylation thereby increasing the

likelihood of tau spread across connected neurons (Maphis *et al.*, 2015). A recent study in Alzheimer's disease using microglia PET has indeed shown that early microglial activation can be found in inferior temporal regions, i.e. the most early occurring tau hotspots (Hamelin *et al.*, 2016). Microglia-associated tau hyperphosphorylation may cause increased local 'tau pressure' that then drives tau from hotspots to connected regions.

In the VCI sample, we found elevated tau levels in the absence of amyloid- β , consistent with previous reports in this sample (Kim *et al.*, 2018). In line with this finding, a recent post-mortem study has shown that higher systolic blood pressure—a key risk factor for VCI—is associated with higher density of tau-containing neurofibrillary tangles but not amyloid- β (Arvanitakis *et al.*, 2018). It is possible that amyloid- β -independent tau accumulation is triggered by ischaemia or chronic hypoperfusion. Rodent studies have reported that ischaemia can alter the interaction between glycogen synthase kinase 3 and protein phosphatase 2A, ensuing hyperphosphorylation of intracellular tau (Song *et al.*, 2013). However, we did not detect a modulating effect of SVD markers on the relationship between functional connectivity and tau, suggesting that this association is not moderated by SVD-related brain alterations. We caution though that the current SVD markers and composite score were primarily based on radiological global white matter alterations, and thus were not region specific. Future DTI-based fibre-tracking studies may test whether associations between functional connectivity and tau covariance are influenced specifically by the integrity of the underlying anatomical connections.

Several caveats need to be considered when interpreting the results of the current study. First, the AV1451 tau-PET tracer has been previously argued to show off-target binding in the meninges, basal ganglia, hippocampus and choroid plexus, which could potentially confound associations between functional connectivity, tau covariance and absolute tau levels (Marquie *et al.*, 2017). To address this, we *a priori* selected a brain atlas that excludes those regions typically affected by off-target binding (Schaefer *et al.*, 2018). Nevertheless, we cannot fully exclude that local increases and thus covariance in the AV1451 tau-PET signal are influenced by off-target binding.

Second, our results are exclusively based on associations between resting-state functional MRI assessed functional connectivity and tau-PET. While functional connectivity is a measure of neuronal activity shared between brain regions (Brookes *et al.*, 2011; Chang *et al.*, 2013), regions with high functional connectivity do not necessarily exhibit a direct monosynaptic structural connection (Honey *et al.*, 2009; Diaz-Parra *et al.*, 2017). Animal studies have shown that resting-state functional MRI-assessed functional connectivity can reflect multisynaptic connections (Grandjean *et al.*, 2017). Hence the currently reported associations between functional connectivity and tau covariance may reflect indirect connections along multiple intermediary connections. However, the mapping of those multi-leg

connections *in vivo* is both statistically and technically difficult to date. Multivariate methods to assess complex multi-ROI connectivity patterns and advances in DTI to demonstrate smaller cortico-cortical connections, which may underlie indirect anatomical connections between grey matter regions, will enable to disentangle connections between ROIs in future studies.

Third, functional connectivity is mostly, but not entirely, matched by fibre tract connections as determined by DTI (Honey *et al.*, 2009). While the incomplete structural mappings may be partially explainable due to technical limitations of DTI (Abhinav *et al.*, 2014), it needs to be cautioned that ROI-to-ROI connections do not necessarily correspond to direct anatomical connections. Indirect cortico-cortical connections that are hard to track with current diffusion weighted imaging techniques may, however, provide the anatomical backbone for functional connectivity.

Fourth, the current study is cross-sectional in nature and thus does not assess the progression of tau pathology in the brain. To test the predictive value of functional connectivity for regional changes in tau-PET, longitudinal tau-PET studies are necessary.

Fifth, previous studies have found evidence for slightly impaired neurovascular coupling mechanisms in SVD (Lin *et al.*, 2011), which may influence functional MRI-assessed functional connectivity in the VCI group (Lawrence *et al.*, 2018). Still, we found similar patterns of the association between functional connectivity and tau covariance in patients with and without cerebrovascular disease, rendering it unlikely that the current results were influenced by altered blood oxygen level-dependent signal due to vascular changes. To overcome this limitation, future studies could employ MEG or EEG to compute functional connectivity metrics that are unbiased by impaired neuro-vascular coupling, to assess associations between functional connectivity and tau spreading in patients with SVD.

In conclusion, our results demonstrate a close correlation between functional connectivity and tau levels shared by functionally connected brain regions across normal ageing, Alzheimer's disease and VCI. These findings clearly suggest that functional connectivity plays a role in the distribution of tau and have implications for future clinical trials. Possible clinical interventions could be the silencing of overactive neural activity. A previous drug study indeed showed that suppressing hippocampal hyperactivity with levetiracetam in Alzheimer's disease improved memory (Bakker *et al.*, 2012). Future studies on drug intervention or non-invasive stimulation such as transcranial magnetic stimulation need to assess whether altering functional connectivity levels affects the progression of tau.

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Competing interests

The authors report no competing interests.

Supplementary material

Supplementary material is available at *Brain* online.

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