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Title

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Permalink https://escholarship.org/uc/item/4j09n219

Journal Nature Medicine, 30(4)

ISSN

1078-8956

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Publication Date

2024-04-01

DOI

10.1038/s41591-024-02869-z

Peer reviewed

nature medicine

Article

Highly accurate blood test for Alzheimer's disease is similar or superior to clinical cerebrospinal fluid tests

Received: 24 October 2023	A list of authors and their affiliations appears at the end of the paper			
Accepted: 12 February 2024				
Published online: 21 February 2024	With the emergence of Alzheimer's disease (AD) disease-modifying therapies,			
Published online: 21 February 2024 Check for updates	With the emergence of Alzheimer's disease (AD) disease-modifying therapies, identifying patients who could benefit from these treatments becomes critical. In this study, we evaluated whether a precise blood test could perform as well as established cerebrospinal fluid (CSF) tests in detecting amyloid- β (A β) plaques and tau tangles. Plasma %p-tau217 (ratio of phosporylated-tau217 to non-phosphorylated tau) was analyzed by mass spectrometry in the Swedish BioFINDER-2 cohort ($n = 1,422$) and the US Charles F. and Joanne Knight Alzheimer Disease Research Center (Knight ADRC) cohort ($n = 337$). Matched CSF samples were analyzed with clinically used and FDA-approved automated immunoassays for A β 42/40 and p-tau181/A β 42. The primary and secondary outcomes were detection of brain A β or tau pathology, respectively, using positron emission tomography (PET) imaging as the reference standard. Main analyses were focused on individuals with cognitive impairment (mild cognitive impairment and mild dementia), which is the target population for available disease-modifying treatments. Plasma %p-tau217 was clinically equivalent to FDA-approved CSF tests in classifying A β PET status, with an area under the curve (AUC) for both between 0.95 and 0.97. Plasma %p-tau217 was generally superior to CSF tests in classification of tau-PET with AUCs of 0.95–0.98. In cognitively impaired subcohorts			
	(BIOFINDER-2: <i>n</i> = 720; Knight ADRC: <i>n</i> = 50), plasma %p-tau217 had an accuracy, a positive predictive value and a negative predictive value of 89–90%			
	for A β PET and 87–88% for tau PET status, which was clinically equivalent			
	to CSF tests, further improving to 95% using a two-cutoffs approach. Blood plasma %p-tau217 demonstrated performance that was clinically equivalent			
	or superior to clinically used FDA-approved CSF tests in the detection of			

Dementia affects more than 40 million people worldwide¹, and its prevalence is projected to rise to 130 million by the year 2050^2 . The annual global cost associated with dementia is approximately \$1 trillion US dollars², making it a major global contributor to disability, institutionalization and mortality. Alzheimer's disease (AD) accounts for 60-70% of all dementia cases³ and is characterized by the deposition of amyloid- β (A β)-containing plaques in the extracellular space of the brain parenchyma and the formation of intraneuronal tau tangle

AD pathology. Use of high-performance blood tests in clinical practice can improve access to accurate AD diagnosis and AD-specific treatments.

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Table 1 | Participant characteristics

		BioFINDER-2		Knight ADRC			
	All (n=1,422)	Cognitively unimpaired (<i>n</i> =720)	Cognitively impaired (n=702)	All (n=337)	Cognitively unimpaired (n=287)	Cognitively impaired (<i>n</i> =50)	
Age, years	69.3 (10.6)	66.3 (12.1)	72.3 (7.9)	69.8 (8.3)	69.0 (8.3)	74.6 (6.5)	
Women <i>, n</i> (%)	708 (49.8%)	393 (54.6%)	315 (44.9%)	175 (51.9%)	155 (54.0%)	20 (40.0%)	
APOE-ε4 carriers, n (%)ª	659 (51.5%)	278 (47.8%)	381 (54.6%)	128 (38.0%)	101 (35.2%)	27 (54.0%)	
Years of education ^b	12.7 (3.9)	12.9 (3.6)	12.4 (4.2)	16.4 (2.4)	16.5 (2.3)	15.6 (2.6)	
Race (Black/White/ Other), <i>n</i>	N.A.	N.A.	N.A.	24/308/5	24/259/4	0/49/1	
MMSE ^c	26.7 (3.9)	28.9 (1.2)	24.4 (4.4)	28.8 (2.1)	29.3 (1.1)	26.1 (3.7)	
Aβ PET, Centiloids ^d	19.2 (41.8)	7.99 (31.9)	45.0 (49.7)	25.0 (35.6)	17.3 (27.2)	69.3 (44.8)	
Aβ PET positive, n (%) ^d	258 (25.8%)	107 (15.3%)	151 (49.7%)	85 (25.2%)	48 (16.7%)	37 (74.0%)	
Tau PET, SUVR ^e	1.36 (0.47)	1.18 (0.17)	1.56 (0.59)	1.20 (0.19)	1.16 (0.09)	1.47 (0.35)	
Tau PET positive ^e	355 (25.0%)	49 (6.8%)	306 (43.6%)	35 (10.4%)	7 (2.4%)	28 (56.0%)	
AD diagnosis, n (%)	346 (24.3%)	0 (0%)	346 (49.3%)	50 (14.8%)	0 (0%)	50 (100%)	
Severity of cognitive impairment (CU/MCI/ dementia)	720/366/336	720/0/0	0/366/336	287/37/13	287/0/0	0/37/13	

All measures represent mean (s.d.) unless otherwise stated. Percentages are calculated from the sample available for each variable. Aß PET positivity was defined as Centiloids ≥ 37. Tau PET positivity was defined using previously validated in-house thresholds (SUVR>1.32 for both cohorts). Race was not collected in the BioFINDER-2 cohort. ^a: 143 participants missing in BioFINDER-2 ^b: 31 participants missing in BioFINDER-2 ^c: 1 participant missing in BioFINDER-2 ^d: 421 participants missing in BioFINDER-2 ^c: 54 participants missing in BioFINDER-2 ^f: 432 participants missing in BioFINDER-2 ^c: 54 participants missing in BioFINDER-2 ^f: 432 participants missing in BioFINDER-2 ^c: 54 participants missing in BioFINDER-2 ^f: 432 participants missing in BioFINDER-2 ^f: 54 participants missing missing

aggregates. During an extended pre-symptomatic phase, which lasts 10-20 years, A β plaques first accumulate in the cortex and are thought to facilitate the subsequent spread of tau pathology from the medial temporal lobe to neocortical areas⁴. The presence of tau pathology in the neocortex is correlated with the clinical phase of the disease, which is marked by progressive cognitive impairment and dementia⁵.

Several phase 3 trials demonstrated that anti-amyloid antibodies can clear A β plaques from the brain⁶⁻⁸, which leads to a slowing of cognitive and functional decline in individuals with mild cognitive impairment (MCI) and mild dementia due to AD. Recently, lecanemab received traditional approval from the US Food & Drug Administration (FDA) for treatment of patients with MCI and mild dementia with biomarker-proven AB pathology⁸, and other immunotherapies are expected to follow. The presence of AB pathology can be determined by the brain, or cerebrospinal fluid (CSF) assays, which measure CSF levels of A β 42 as a ratio with A β 40, phosphorylated tau (p-tau) or total tau^{4,9-11}. Biomarker testing reduces dementia misdiagnoses: when biomarkers are not used, the rate of misdiagnosis is approximately 25-35% in specialty clinics and even higher in primary care clinics^{4,12,13}. Additionally, PET and CSF can identify cognitively unimpaired individuals at high risk of future cognitive decline and progression to AD dementia^{14,15}. However, although safe, the widespread clinical use of PET and CSF has been hampered by high costs, reliance on expensive equipment and specially trained personnel and perceived invasiveness¹¹. As a result, there is an urgent need for scalable and cost-effective methods to detect AD pathology in routine clinical practice.

In the last several years, blood-based markers (BBMs) capable of detecting AD pathology have been developed^{16–18}. Plasma levels of p-tau are strongly associated with PET and CSF biomarkers of AD pathology^{19–25}, neuropathological changes associated with AD^{20,23,26,27} and the subsequent development of AD dementia^{20,23,28}. Among different p-tau variants, tau phosphorylated at threonine 217 (p-tau217) has demonstrated the highest accuracy in detecting AD pathology and predicting future cognitive decline^{23,27,29–31}. However, certain comorbidities, especially kidney disease, can lead to false elevations in plasma p-tau levels^{32,33}, although this can be mitigated by using the ratio of p-tau217 to the non-phosphorylated levels of the same tau peptide (%p-tau217)³⁴.

Potentially because %p-tau217 is less affected by confounding factors, this blood test has the highest performance yet demonstrated in identifying individuals with AD pathology²⁹.

Despite BBMs being used in clinical practice in some countries, including the United States, they have not been recommended as standalone diagnostic tests due to a lack of studies demonstrating their equivalence to clinically used CSF and PET methods^{16,35-37}. Therefore, we compared the diagnostic performance of plasma %p-tau217 with clinically used and FDA-approved CSF assays (CSF AB42/40 from Fujirebio and p-tau181/Aβ42 from Roche) in independent Swedish and US cohorts. Because confirmation of AB positivity is required for initiation of anti-amyloid immunotherapies, the primary outcome was the detection of A β pathology as determined by A β PET imaging. Secondary outcomes included the classification of brain tau aggregates as determined by tau PET imaging, which has also been used by some trials in the selection of patients suitable for anti-amyloid immunotherapy^{7,38}, and agreement with a clinical AD diagnosis. Our main analyses were focused on individuals with cognitive impairment (MCI and mild dementia), because the clinical use of anti-amyloid therapies is currently approved for cases where cognitive impairment is deemed to be caused by AD pathology.

Results

Study participants

The BioFINDER-2 cohort included 1,422 participants with a mean (standard deviation (s.d.)) age of 69.3 (10.6) years, of whom 708 (49.8%) were female and 702 (49.3%) were cognitively impaired as defined by either MCI or dementia (Table 1). The Charles F. and Joanne Knight Alzheimer Disease Research Center (Knight ADRC) cohort included 337 participants with a mean age of 69.8 (8.3) years, of whom 175 (51.9%) were female and 50 (14.8%) were cognitively impaired.

Classification of A β or tau PET status by fluid biomarkers

We first compared the area under the curve (AUC) of plasma %p-tau217 with clinically used CSF biomarkers in classification of A β PET (Centiloids \geq 37) or tau PET status (standardized uptake value ratio (SUVR) > 1.32 in Braak I–IV region of interest (ROI) for both cohorts) (Fig. 1 and Extended Data Table 1). The diagnostic performances of two



Plasma %p-tau217
 CSF Aβ42/40
 CSF p-tau181/Aβ42

Fig. 1 | Concordance of fluid and imaging biomarkers of amyloid and tau pathologies. a, b, d, e, Concordance of fluid biomarkers with A β and tau PET positivity in BioFINDER-2 (a and d) and Knight ADRC (b and e) participants. ROC curves including all participants are included in the first row. AUCs for all, cognitively impaired and cognitively unimpaired groups are shown in the next three columns, respectively. c, f, Bootstrapped differences (n = 1,000 resamples with replacement stratifying by the output) between the statistics using plasma %p-tau217 (reference) and CSF biomarkers are shown in c and f for both the BioFINDER-2 cohort (left) and the Knight ADRC (right) cohort. The horizontal dashed line is plotted at zero, representing the lack of difference between plasma and CSF biomarkers. We considered plasma and CSF biomarkers clinically equivalent if the 95% CI of the mean difference included zero and clinically superior if it did not include zero and favored plasma (>0). Dots and error bars represent the actual statistic and 95% CI (from bootstrapped n = 1,000 samples with replacement), respectively. Vertical dashed lines represent the maximal AUC value possible (1). A β PET positivity was assessed as Centiloids \geq 37. Tau PET positivity was assessed using previously validated in-house thresholds (SUVR > 1.32 in Braak I–IV for both cohorts). AUC, area under the curve; CI, cognitively impaired; CSF, cerebrospinal fluid; CU, cognitively unimpaired; SUVR, standardized uptake value ratio; CI, confidence interval.



Fig. 2 | **Comparison among fluid biomarkers on predicting Aß PET positivity in cognitively impaired patients of the BioFINDER-2 cohort.** a, b, Prediction of Aß PET positivity in cognitively impaired participants (n = 304) from the BioFINDER-2 cohort, using a single-cutoff (**a**) and a two-cutoffs (**b**) approach, respectively. In the first approach, the threshold was calculated, maximizing sensitivity and fixing specificity at 90%. In the second approach, the lower threshold was obtained by maximizing specificity with sensitivity fixed at 95%, whereas the upper threshold was obtained by maximizing sensitivity while fixing specificity at 95%. Participants who fall between these two cutoffs were classified in the intermediate group. Dots and error bars represent the actual statistic and 95% CI (from bootstrapped n = 1,000 samples with replacement), respectively. **c**, Bootstrapped differences (n = 1,000 resamples with replacement stratifying by the output) between the statistics using plasma %p-tau217 (reference) and CSF biomarkers are shown in **c** for both single cutoff and two cutoffs. The horizontal dashed line is plotted at zero, representing the lack of difference between plasma and CSF biomarkers. We considered plasma and CSF biomarkers clinically equivalent if the 95% CI of the mean difference included zero and clinically superior if it did not include zero and favored plasma (>0). Differences in the number of participants in the intermediate group were scaled to a maximum of 1 to be comparable with the other differences. Dots and error bars represent the mean and 95% CI estimate from a bootstrapped sample. Vertical dashed lines represent the maximal statistical value possible (1). For the intermediate value plots, colored bars represent the actual percentage and the error bar the 95% CI. **d**, Histograms represent the distribution of the data colored by the imaging biomarker status. The vertical black line represents the threshold derived from the first approach (**a**), and red lines represent the lower and upper thresholds from the second approach (**b**). A β PET positivity was assessed as Centiloids \geq 37. CSF, cerebrospinal fluid; CI, confidence interval; NPV, negative predictive value; PPV, positive predictive value.

biomarkers were considered clinically equivalent when the range of 95% confidence intervals (CIs) of the mean difference included zero. Superiority was considered when the range of 95% CI did not include zero and favored the plasma biomarker. In classification of A β PET status in the entire BioFINDER-2 cohort, plasma %p-tau217 had very high performance (AUC = 0.97, 95% CI: 0.95, 0.98), which was clinically equivalent to

that of CSF Elecsys p-tau181/A β 42 (AUC = 0.97, 95% CI: 0.96, 0.98) or CSF Elecsys A β 42/40 (AUC = 0.96, 95% CI: 0.95, 0.97) (Fig. 1a and Extended Data Table 1). Similar results were obtained for classification of A β PET status in the entire Knight ADRC cohort: plasma %p-tau217 had an AUC (0.97, 95% CI: 0.95, 0.99) that was clinically equivalent to CSF Lumipulse A β 42/40 (AUC = 0.96, 95% CI: 0.94, 0.98) and CSF Lumipulse p-tau181/

CSF Aβ42/40

Table 2 | Comparison among fluid biomarkers on predicting Aβ positivity in cognitively impaired BioFINDER-2 patients with in-bag estimates

Single-cutoff approach										
	A	ccuracy	PPV			NPV	Se	ensitivity		
	Mean	Difference	Mean	Difference	Mean	Difference	Mean	Difference		
Plasma %p-tau217	0.90 (0.86, 0.93)	Ref.	0.91 (0.88, 0.93)	Ref.	0.89 (0.81, 0.96)	Ref.	0.89 (0.80, 0.96)	Ref.		
CSF p-tau/Aβ42	0.91 (0.86, 0.94)	-0.01 (-0.06, 0.05)	0.91 (0.88, 0.93)	0.00 (-0.02, 0.02)	0.91 (0.82, 0.97)	-0.02 (-0.10, 0.08)	0.91 (0.81, 0.97)	-0.02 (-0.12, 0.10)		
CSF Aβ42/40	0.87 (0.77, 0.93)	0.03 (-0.04, 0.13)	0.90 (0.87, 0.93)	0.01 (-0.02, 0.04)	0.85 (0.71, 0.96)	0.04 (-0.08, 0.19)	0.83 (0.64, 0.96)	0.05 (-0.09, 0.26)		
			Two	-cutoffs approach						
	А	ccuracy		PPV	NPV			Number of intermediate participants		
	Mean	Difference	Mean	Difference	Mean	Difference	Mean	Difference*		
Plasma %p-tau217	0.95 (0.94, 0.97)	Ref.	0.95 (0.94, 0.97)	Ref.	0.96 (0.94, 0.98)	Ref.	16.3 (5.9, 25.3)	Ref.		
CSF p-tau/Aβ42	0.95 (0.94, 0.96)	0.00 (-0.01, 0.02)	0.94 (0.91, 0.96)	0.01 (-0.02, 0.04)	0.95 (0.95, 0.97)	0.00 (-0.02, 0.03)	16.5 (4.6, 33.6)	0.00 (-0.13, 0.18)		

Comparison estimates among fluid biomarkers on predicting Aβ PET positivity in BioFINDER-2 cognitively impaired individuals. For the single-cutoff approach, cutoffs of fluid biomarkers were derived by maximizing sensitivity and fixing specificity at 90% against each imaging outcome. For the two-cutoffs approach, the lower cutoff was obtained by maximizing specificity with sensitivity fixed at 95%, whereas the upper cutoff was obtained by maximizing sensitivity and fixing specificity at 95%. Participants who fall between these two cutoffs were classified in the intermediate group. Differences between the statistics using plasma %p-tau217 (reference) and CSF biomarkers are shown together with the mean values. We considered plasma and CSF biomarkers clinically equivalent if the 95% CI of the mean difference included zero and clinically superior if it did not include zero and favored plasma (>0). *Differences in the number of participants in the intermediate group were scaled to a maximum of 1 to be comparable with the other differences. Aβ PET positivity was assessed as Centiloids≥37. CSF, cerebrospinal fluid; NPV, negative predictive value; PPV, positive predictive value; CI, confidence interval.

0.03 (-0.01, 0.08)

0.95

(0.95, 0.97)

0.00

(-0.02, 0.02)

A β 42 (AUC = 0.97, 95% CI: 0.96, 0.99) (Fig. 1b). The AUCs were similar when cognitively impaired and cognitively unimpaired groups were analyzed separately (Fig. 1a,b and Extended Data Table 1). Differences between the AUCs of plasma %p-tau217 and CSF biomarker ratios are shown in Fig. 1c and Extended Data Table 1.

0.01 (-0.01, 0.03)

0.93

(0.88, 0.95)

0.94

(0.93, 0.96)

In classification of tau PET status in the entire BioFINDER-2 cohort, plasma %p-tau217 had very high performance (AUC = 0.95, 95% CI: 0.94, 0.97), which was superior to CSF Elecsys p-tau181/Aβ42 (AUC = 0.93, 95% CI: 0.92, 0.95) and CSF Elecsys Aβ42/40 (AUC = 0.88, 95% CI: 0.86, 0.90) (Fig. 1c). Similar results were obtained in the entire Knight ADRC cohort: plasma %p-tau217 had a higher AUC (0.98, 95% CI: 0.97, 0.99) compared to CSF Lumipulse p-tau181/Aβ42 (AUC = 0.96; 95% CI: 0.94, 0.98) or CSF Lumipulse Aβ42/40 (AUC = 0.90; 95% CI: 0.87, 0.94) (Fig. 1d). The AUCs were similar when cognitively impaired and cognitively unimpaired groups were analyzed separately (Fig. 1c, d and Extended Data Table 1).

Accuracy and predictive value of fluid biomarkers

Next, we focused on individuals with cognitive impairment (either MCI or dementia) who could be candidates for anti-Aß immunotherapies if amyloid biomarker testing were positive. We evaluated clinically relevant diagnostic metrics for plasma %p-tau217, CSF p-tau181/Aβ42 and CSF A β 42/40 when using a cutoff resulting in a specificity of 90% for A β PET status (\geq 37 Centiloids). In the BioFINDER-2 cohort, we found that plasma %p-tau217 predicted Aβ PET status with an overall accuracy of 90% (95% CI: 86%, 93%), a positive predictive value (PPV) of 91% (95% CI: 88%, 93%) and a negative predictive value (NPV) of 89% (95% CI: 81%, 96%). Notably, the performance of plasma %p-tau217 in prediction of Aβ PET status was not different from CSF Elecsys p-tau181/Aβ42 (accuracy, 91% (95% CI: 86%, 94%); PPV, 91% (95% CI: 88%, 93%); NPV, 91% (95% CI: 82%, 97%)) and CSF Elecsys Aβ42/40 (accuracy, 87% (95% CI: 77%, 93%); PPV, 90% (95% CI: 87%, 93%); NPV, 85% (95% CI: 71%, 96%)) (Fig. 2a and Table 2). Similar results were obtained when using clinical visual reads to determine Aβ PET status (Extended Data Fig. 1a and Supplementary Table 1). Similar results were also found in the Knight ADRC cohort, where plasma %p-tau217 had an overall accuracy of 94% (95% CI: 72%, 100%), a PPV of 99% (95% CI: 97%, 100%) and an NPV of 89% (95% CI: 48%, 100%), which was clinically equivalent to the performances of FDA-approved CSF Lumipulse A β 42/40 (accuracy, 78% (95% CI: 44%, 98%); PPV, 98% (95% CI: 96%, 100%); NPV, 62% (95% CI: 32%, 100%)) and CSF Lumipulse p-tau181/A β 42 (accuracy, 91% (95% CI: 68%, 100%); PPV, 99% (95% CI: 97%, 100%); NPV, 82% (95% CI: 45%, 100%)) (Supplementary Fig. 1a and Supplementary Table 2).

25.4

(8.9, 42.1)

0.09 (-0.07, 0.27)

When predicting tau PET status in cognitively impaired patients in the BioFINDER-2 cohort, plasma %p-tau217 had an overall accuracy of 88% (95% CI: 85%, 91%), a PPV of 88% (95% CI: 86%, 90%) and an NPV of 88% (95% CI: 82%, 94%), which was superior to the performance of CSF Elecsys p-tau181/Aβ42 (accuracy, 82% (95% CI: 76%, 87%); PPV, 86% (95% CI: 83%, 89%); NPV, 79% (95% CI: 72%, 87%)) and CSF Elecsys Aβ42/40 (accuracy, 68% (95% CI: 62%, 76%); PPV, 79% (95% CI: 73%, 84%); NPV, 65% (95% CI: 59%, 72%)) (Fig. 3a,c and Table 3). In the Knight ADRC cohort, the diagnostic metrics of plasma %p-tau217 were clinically equivalent to those of the CSF measures (Supplementary Fig. 2a,c and Supplementary Table 3).

Use of a two-cutoffs approach to improve diagnostic accuracy

We also evaluated for potential improvements in diagnostic accuracy by applying an approach with two cutoffs, which divides results into three categories: those with clearly normal values, those with clearly abnormal values and those with intermediate values. The upper cutoff was set at a value yielding a specificity of 95%, while maximizing sensitivity, and the lower cutoff was set at a value resulting in a sensitivity of 95%, while maximizing specificity. When the two-cutoffs approach was applied to predict A β PET positivity in cognitively impaired patients in the BioFINDER-2 cohort, plasma %p-tau217 had an overall accuracy of 95% (95% CI: 94%, 97%), a PPV of 95% (95% CI: 94%, 97%) and an NPV of 96% (95% CI: 94%, 98%), which were clinically equivalent to the performances of CSF Elecsys p-tau181/A β 42 (accuracy, 95% (95% CI: 94%, 96%);



Fig. 3 | **Comparison among fluid biomarkers on predicting tau PET positivity in cognitively impaired patients of the BioFINDER-2 cohort. a, b**, Prediction of tau PET positivity in cognitively impaired participants from the BioFINDER-2 cohort (*n* = 663), using a single-cutoff (**a**) and a two-cutoffs (**b**) approach, respectively. In the first approach, the threshold was calculated, maximizing sensitivity and fixing specificity at 90%. In the second approach, the lower threshold was obtained by maximizing specificity with sensitivity fixed at 95%, whereas the upper threshold was obtained by maximizing sensitivity and fixing specificity at 95%. Participants who fall between these two cutoffs were classified in the intermediate group. Dots and error bars represent the actual statistic and 95% CI, respectively. Vertical dashed lines represent the maximal statistical value possible (1). For the intermediate value plots, colored bars represent the actual percentage and the error bar the 95% CI. **c**, Bootstrapped differences (*n* = 1,000 resamples with replacement stratifying by the output) between the statistics using plasma %p-tau217 (reference) and CSF biomarkers are shown in c for both single cutoff and two cutoffs. The horizontal dashed line is plotted at zero, representing the lack of difference between plasma and CSF biomarkers. We considered plasma and CSF biomarkers clinically equivalent if the 95% CI of the mean difference included zero. Differences in the number of participants in the intermediate group were scaled to a maximum of 1 to be comparable with the other differences. Dots and error bars represent the mean and 95% CI estimate from a bootstrapped sample. d, Histograms represent the distribution of the data colored by the imaging biomarker status. The vertical black line represents the threshold derived from the first approach (a), and red lines represent the lower and upper thresholds from the second approach (b). Tau PET positivity was assessed using an in-house previously validated threshold (SUVR > 1.32). Three individuals were excluded from the histograms in d (only for visualization purposes) due to very low values of plasma %p-tau217. CSF, cerebrospinal fluid; CI, confidence interval; NPV, negative predictive value; PPV, positive predictive value; SUVR, standardized uptake value ratio.

PPV, 94% (95% CI: 91%, 96%); NPV, 95% (95% CI: 95%, 97%)) and CSF Elecsys Aβ42/40 (accuracy, 94% (95% CI: 93%, 96%); PPV, 93% (95% CI: 88%, 95%); NPV, 95% (95% CI: 95%, 97%)) (Fig. 2b and Table 2). The percentage of individuals with intermediate values was 16% (95% CI: 6%, 25%) for plasma %p-tau217, 17% (95% CI: 5%, 34%) for CSF Elecsys p-tau181/Aβ42 and 25% (95% CI: 9%, 42%) for CSF Elecsys Aβ42/40 (Fig. 2b). Similar results were obtained when FDA-approved visual reads were used to determine the A β PET status (Extended Data Fig. 1b and Supplementary Table 1) and in the Knight ADRC cohort (Supplementary Fig. 1b and Supplementary Table 2).

When predicting tau PET status in cognitively impaired individuals in the BioFINDER-2 cohort using the two-cutoffs approach, we found

Table 3 | Comparison among fluid biomarkers on predicting tau PET positivity in cognitively impaired patients with in-bag estimates

Single-cutoff approach								
	Accuracy		PPV		NPV		Sensitivity	
	Mean	Difference	Mean	Difference	Mean	Difference	Mean	Difference
Plasma %p-tau217	0.88 (0.85, 0.91)	Ref.	0.88 (0.86, 0.90)	Ref.	0.88 (0.82, 0.94)	Ref.	0.86 (0.78, 0.93)	Ref.
CSF p-tau/Aβ42	0.82 (0.76, 0.87)	0.06 (0.01, 0.12)	0.86 (0.83, 0.89)	0.02 (0.00, 0.04)	0.79 (0.72, 0.87)	0.09 (0.01, 0.16)	0.72 (0.60, 0.84)	0.14 (0.02, 0.25)
CSF Aβ42/40	0.68 (0.62, 0.76)	0.20 (0.14, 0.26)	0.79 (0.73 <i>,</i> 0.84)	0.10 (0.05, 0.15)	0.65 (0.59, 0.72)	0.24 (0.16, 0.31)	0.42 (0.31, 0.57)	0.44 (0.29, 0.56)

	Two-cutoffs approach							
	Accuracy		PPV		NPV		Number of intermediate participants	
	Mean	Difference	Mean	Difference	Mean	Difference	Mean	Difference*
Plasma %p-tau217	0.94 (0.94 <i>,</i> 0.95)	Ref.	0.93 (0.92, 0.94)	Ref.	0.95 (0.94, 0.96)	Ref.	19.5 (11.6, 27.5)	Ref.
CSF p-tau/Aβ42	0.93 (0.92, 0.94)	0.01 (0.00, 0.02)	0.90 (0.85, 0.92)	0.04 (0.01, 0.08)	0.95 (0.94, 0.96)	0.00 (-0.01, 0.01)	34.0 (24.1, 42.8)	0.14 (0.04, 0.24)
CSF Aβ42/40	0.91 (0.89, 0.92)	0.03 (0.02, 0.05)	0.81 (0.68, 0.88)	0.12 (0.06, 0.25)	0.94 (0.94, 0.95)	0.01 (0.00, 0.02)	49.1 (41.9, 57.0)	0.30 (0.20, 0.39)

Comparison estimates among fluid biomarkers on predicting tau PET positivity in cognitively impaired patients from the BioFINDER-2 cohort. For the single-cutoff approach, the cutoffs of fluid biomarkers were derived by maximizing sensitivity and fixing specificity at 90% against each imaging outcome. For the two-cutoffs approach, the lower cutoff was obtained by maximizing specificity with sensitivity fixed at 95%, whereas the upper cutoff was obtained by maximizing sensitivity and fixing specificity at 95%. Participants who fall between these two cutoffs were classified in the intermediate group. Differences between the statistics using plasma %p-tau217 (reference) and CSF biomarkers are shown together with the mean values. We considered plasma and CSF biomarkers clinically equivalent if the 95% CI of the mean difference included zero and clinically superior if it did not include zero and favored plasma (>0). *Differences in the number of participants in the intermediate group were scaled to a maximum of 1 to be comparable with the other difference. Tau PET positivity was assessed using an in-house previously validated cutoff (SUUR>1.32 for both cohorts in Braak I–IV). CSF, cerebrospinal fluid; NPV, negative predictive value; PPV, positive predictive value; SUVR, standardized uptake value ratio; CI, confidence interval

that plasma %p-tau217 had an overall accuracy of 94% (95% CI: 94%, 95%), a PPV of 93% (95% CI: 92%, 94%) and an NPV of 95% (95% CI: 94%, 96%), which was superior to the performances of CSF Elecsys p-tau181/Aβ42 (accuracy, 93% (95% CI: 92%, 94%); PPV, 90% (95% CI: 85%, 92%); NPV, 95% (95% CI: 94%, 96%)) and CSF Elecsys Aβ42/40 (accuracy, 91% (95% CI: 89%, 92%); PPV, 0.81% (95% CI: 68%, 88%); NPV, 94% (95% CI: 94%, 95%)) (Fig. 3b and Table 3). The percentage of individuals with intermediate values was lower for plasma %p-tau217 (20%, 95% CI: 12%, 28%) compared to those for CSF Elecsys p-tau181/Aβ42 (34%, 95% CI: 24%, 43%) and for CSF Elecsys Aβ42/40 (49%, 95% CI: 42%, 57%) (Fig. 3b). The results obtained in Knight ADRC showed a similar performance between plasma and CSF biomarkers (Supplementary Fig. 2b and Supplementary Table 3).

We investigated whether the groups with intermediate fluid biomarker values also had intermediate values for the reference standard that is, A β PET Centiloids or tau PET SUVR. We found that individuals with intermediate plasma %p-tau217 values had values for A β PET and tau PET that were near the cutoffs for abnormality (Extended Data Fig. 2). Additionally, the group with intermediate plasma %p-tau217 values had A β PET and tau PET values that were higher than the normal plasma %p-tau217 group and lower than the abnormal plasma %p-tau217 group (P < 0.001in all cases). In the BioFINDER-2 cohort, the mean (s.d.) Centiloids was 0.4 (20.3) for the %p-tau217 negative group, 49.1 (36.5) for the %p-tau217 intermediate group and 91.4 (30.1) for the %p-tau217 positive group.

Comparison to a clinical AD diagnosis

Finally, we examined the accuracy of plasma %p-tau217 for clinical diagnosis of symptomatic AD versus other neurodegenerative diseases. This diagnosis was made based on clinical symptoms assessed by a dementia specialist and included consideration of AD biomarker testing by either CSF or A β PET. It is important to highlight that, if the clinical symptoms were not related to AD, the participant was classified in the other neurodegenerative diseases group even with positive AD biomarkers, as these results may indicate concomitant AD pathology. A description of specific diagnosis for the cognitively impaired participants is shown

in Supplementary Table 4. In cognitively impaired individuals in the BioFINDER-2 cohort, we found that blood plasma %p-tau217 exhibited an AUC of 0.94 (95% CI: 0.92, 0.96) in distinguishing individuals with and without symptomatic AD (Supplementary Table 5), which was clinically equivalent to CSF p-tau181/Aβ42 (95%, 95% CI: 93%, 96%) and CSF Aβ42/40 (93%, 95% CI: 91%, 95%). Furthermore, plasma %p-tau217 had an overall accuracy of 86% (95% CI: 82%, 89%), a PPV of 89% (95% CI: 87%, 91%) and an NPV of 84% (95% CI: 77%, 89%) (Supplementary Table 6). Applying the two-cutoffs approach increased the diagnostic metrics to 93–94%, with 24% of the participants in the intermediate group (Supplementary Table 6).

Sensitivity analyses

Several sensitivity analyses were performed to support the results reported above. First, we assessed out-of-bag statistics in the BioFINDER-2 cohort for A β and tau PET positivity, in which the cutoffs and the statistics were derived in different individuals from the same cohort. These results were in line with the previous analyses, showing that plasma %p-tau217 was clinically equivalent to CSF biomarkers for predicting A β PET positivity using a single-cutoff approach (Supplementary Fig. 3a and Supplementary Table 7) and a two-cutoffs approach (Supplementary Fig. 3b and Supplementary Table 8). For tau PET, we generally observed higher estimates of plasma %p-tau217 compared to the two CSF biomarkers (Supplementary Fig. 4 and Supplementary Table 7 and 8).

Second, we derived fluid biomarker cutoffs in independent cohorts and tested them in BioFINDER-2 participants. Plasma %p-tau217 cutoffs were derived in Knight ADRC participants and CSF biomarker cutoffs in participants from the University of California, San Francisco (UCSF) (Supplementary Methods). The obtained results were similar to those detailed in the previous sections. In brief, the performances of plasma %p-tau217 were clinically equivalent to or slightly higher than those of CSF biomarkers when using both the single-cutoff approach (Extended Data Fig. 3a and Supplementary Table 7) and the two-cutoffs approach (Extended Data Fig. 3b and Supplementary Table 8) for prediction of $A\beta$ positivity.

Additionally, we examined whether the use of plasma p-tau217 as predictor with non-phosphorylated tau as covariate (rather than the ratio of p-tau217/non-phosphorylated tau (%p-tau217)) resulted in any significant change in our results. In summary, the differences between these two approaches were very small, as can be observed in Supplementary Figs. 5 and 6 and in Supplementary Tables 9 and 10.

Finally, we also tested the consistency across time of our results in a subcohort of 40 Knight ADRC participants with available longitudinal plasma %p-tau217 measures (mean (s.d.) time = 3.03 (0.65) years). Only one (2.5%) of these participants changed %ptau217 biomarker status during follow-up testing, supporting the consistency of plasma %p-tau217 measures when plasma sampling and %ptau217 testing is repeated (Supplementary Fig. 7).

Discussion

The major finding of this study was that plasma %p-tau217 classifies both A β and tau PET status with very high accuracy (AUCs of 0.96 and 0.98) across two independent cohorts. When compared to clinically used and FDA-approved CSF tests, the performance of plasma %p-tau217 was clinically equivalent in classification of A β PET status and was superior in classification of tau PET status. Notably, in the cognitively impaired subcohorts, the PPV of plasma %p-tau217 was equivalent to the CSF tests, demonstrating that the blood test could confirm the presence of A β pathology as accurately as CSF tests. A blood test with such high performance could replace CSF testing or A β PET when determining the presence of brain A β pathology in patients with cognitive symptoms. Given the widespread acceptance and accessibility of blood collection, high-performance blood tests could enable AD biomarker testing on a greater scale than is currently possible and to a much broader population, thereby enabling more accurate diagnosis of AD worldwide.

In patients with MCI and mild dementia who may be candidates for anti-amyloid treatments, plasma %p-tau217 classified Aβ PET status with an accuracy, a PPV and an NPV of approximately 90% when a standard approach using a single cutoff was applied. Accuracies of 90-95% are considered excellent or outstanding for the detection of pathology and match or exceed clinically used CSF tests. For instance, the FDA-approved Elecsys CSF p-tau181/AB42 test has, in previous studies, classified AB PET status with overall accuracies of 89-90% (refs. 39-41), which was replicated in the present study. The performance of the FDA-approved Lumipulse CSF AB42/40 test is more complex to evaluate because different approaches have been applied, including using two cutoffs^{42,43}, but in one large study the test classified A BPET status with an AUC of 0.97 (ref. 44). Notably, A BPET and tau PET are not perfectly accurate in detection of neuropathology 45,46 , and, in the small proportion of cases that have discordant CSF and PET results, it is not clear whether this is due to inaccuracy of CSF or PET measures. Given some imprecision in the reference standard for amyloid positivity, FDA-appproved CSF assays as well as plasma %p-tau217 may be performing at the maximum level that is achievable.

Plasma %p-tau217 also correctly classified A β PET positivity status for cognitively unimpaired participants with AUCs of 0.96 in both BioFINDER-2 and Knight ADRC. This is also consistent with a recent report from the AHEAD 3–45 study⁴⁷ supporting the utility of plasma %p-tau217 as a screening test for preclinical AD using a similar mass spectrometry platform. With such high performance, these blood tests have the potential to support A β pathology identification among preclinical populations and in participant recruitment for preventive trials assessing anti-amyloid drugs. Detection of A β positivity using mass spectrometry %p-tau217 in cognitively normal cohorts appears better than what has been reported when using plasma p-tau217 immunoassays, although this must be confirmed in head-to-head studies^{22,23,48–50}.

In this study, we used Centiloids \geq 37 as the primary measure of A β PET positivity based on the inclusion criteria of recent clinical trials for

donanemab⁷. Given that A β PET status is normally assessed by visual assessment in clinical care, and the FDA and the European Medicines Agency (EMA) have approved visual reads of A β PET, we also included visual read as an additional outcome in the main cohort. The obtained results were very similar for both A β PET outcomes, demonstrating very high accuracy of plasma %p-tau217 for detecting A β pathology, which was clinically equivalent to that of CSF biomarkers. Notably, there was very high agreement between quantitative and visual read for A β PET status in our cohort (-95%), consistent with previous studies showing very high agreement between visual assessment and A β PET quantification^{45,51-54}.

In addition to highly accurate classification of A β PET status, plasma %p-tau217 classified tau PET status with an overall accuracy, a PPV and an NPV of 87–88% in the cognitively impaired group of the main cohort. The CSF assays were also able to classify tau PET status but were inferior to plasma %p-tau217. Because tau PET is an excellent indicator of symptomatic AD⁵, the superior classification of tau PET status by plasma %p-tau217 suggests that this measure may have additional value in determining whether cognitive impairment is likely to be due to AD. Overall, the high performance of plasma %p-tau217 in classifying A β and tau PET status indicates that this BBM may be able to replace approved CSF and PET measures in the diagnostic workup of AD.

As expected, the performance of plasma %p-tau217 improved after applying an approach using two cutoffs to categorize individuals as positive, negative or intermediate. Use of this approach for plasma %p-tau217 resulted in a PPV and an NPV of 95% for AB PET status with fewer than 20% of participants in the intermediate zone, which was clinically equivalent to the CSF assays. Notably, individuals with intermediate values of plasma %p-tau217 also had Aß PET values close to the threshold used to determine AB PET status: they have borderline values across multiple modalities, indicating that they may have early AD brain pathological changes. For a more definitive result, these individuals could either repeat the same test at a later time or undergo testing with another type of diagnostic test (for example, PET or CSF). Notably, the two-cutoffs approach is currently employed for the FDA-approved CSF Lumipulse test^{42,43} and has been suggested for AD BBMs^{17,55}, especially when very high accuracy is needed. Very high confidence in A β status is especially important for patients who might be eligible for anti-amyloid immunotherapies, especially given the high costs associated with such therapies as well as the clinical resources required, including repeated infusions and magnetic resonance imaging scans. Tests with a PPV of at least 95% would be preferable so that fewer than 5% of patients receiving treatment would be amyloid negative. Such an approach using two cutoffs could also enable much faster and less expensive enrollment of participants into clinical trials because AB status could be determined using plasma %p-tau217 alone for the large majority of individuals⁵⁶.

The main strength of this study includes the use of a highperformance plasma %p-tau217 assay in combination with clinically used CSF and AB and tau PET biomarkers across two large and well-phenotyped cohorts. We also reported PPV and NPV estimates, in addition to sensitivity, as they are more clinically informative. Nonetheless, we acknowledge that these measures are influenced by the prevalence of the disease or pathology detected. In the present study, the A β positivity ranged between 50% and 74% in the two cognitively impaired populations, which agrees with most other memory clinic cohorts of patients with MCI or mild dementia. For example, in the large-scale IDEAS study, 55% of MCI and 70% of dementia cases were amyloid positive¹². Limitations include the relatively few individuals in the Knight ADRC cohort with cognitive impairment and the lack of a sufficiently large group of individuals with both antemortem biomarker and postmortem data available. In addition, although hundreds of millions of mass spectrometry clinical tests are run every year for several clinical applications (for example, newborn screening, analysis of drugs of abuse and steroid analysis)⁵⁷, they typically have a higher

cost per assay than immunoassays, and the corresponding analytical platforms are also less widely available and require more technical and operational expertise. Nonetheless, to date, mass spectrometry measures of plasma p-tau217 have shown the best performance for assessing the presence of A β pathology compared to immunoassays²⁹. Future head-to-head comparisons may address whether the benefits from higher accuracy provided by mass spectrometry assays outweigh the relative practicability and scalability offered by immunoassays. Finally, minoritized populations were not well enough represented in the study cohorts, even though many study participants had lower education levels and many comorbidities. Future studies should investigate the performance of plasma %p-tau217 in broader primary care–based populations.

In summary, plasma %p-tau217 can be used to determine A β status with a PPV and an accuracy of 95% in more than 80% of cognitively impaired patients and shows clinically equivalent or superior performance to clinically used FDA-approved CSF-based tests in classification of A β and tau PET status. Implementation of blood %p-tau217 in clinical practice would substantially reduce the need for PET or CSF testing, thereby enhancing access to accurate AD diagnosis in clinics worldwide, and enable determination of amyloid status in patients with MCI or mild dementia who might benefit from anti-amyloid immunotherapies.

Online content

Any methods, additional references, Nature Portfolio reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at https://doi.org/10.1038/s41591-024-02869-z.

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Methods

Study design

This study included participants from two independent observational cohorts: the BioFINDER-2 study from Sweden and the Knight ADRC study from the United States. The Swedish BioFINDER-2 study (NCT03174938) was described previously in detail⁵⁸. The participants were recruited at Skåne University Hospital and the Hospital of Ängelholm in Sweden (dates of enrollment: April 2017 to June 2022) and included individuals who were cognitively unimpaired (either no cognitive concerns or subjective cognitive decline (SCD)) or cognitively impaired (classified as having MCI, AD dementia or various other neurodegenerative diseases)²³. Participants were categorized as having MCI if they performed worse than -1.5 s.d. in any cognitive domain according to age and education stratified test norms, as previously described⁵⁸. AD dementia was diagnosed if the individual was AB positive by PET or CSF and met the Diagnostic and Statistical Manual of Mental Disorders, Fifth Edition, criteria for AD⁵⁹. The Knight ADRC cohort was previously described and enrolls individuals into longitudinal observational research studies of memory and aging; most participants live in the greater metropolitan area of St. Louis, Missouri, USA⁴⁴. Samples used for the current study were collected from participants between 6 February 2013 and 12 March 2020. Participants were assessed with the Clinical Dementia Rating (CDR)⁶⁰, and individuals included in the current study were either cognitively unimpaired (CDR = 0) or cognitively impaired (CDR > 0) with a clinical syndrome typical of AD (either MCI or dementia) based on standard criteria⁶¹. Additionally, participants included had undergone both an AB PET and a tau PET scan within 2 years of CSF and had sufficient plasma available for analysis.

Fluid biomarkers

CSF AD biomarker measurements. CSF samples were collected and handled according to current international recommendations^{44,62}. In the Swedish BioFINDER-2 study, CSF concentrations of Aβ42 and p-tau181 were measured using Roche Elecsys CSF electrochemiluminescence immunoassays on a fully automated cobas e 601 instrument (Roche Diagnostics). AB40 concentrations were measured with the Roche NeuroToolKit on cobas e 411 and e 601 instruments (Roche Diagnostics). The ratio of CSF p-tau181 to AB42 (p-tau181/AB42) as measured by Elecsys assays was validated⁶³ and FDA approved in December 2022 for the detection of AB plagues associated with AD for individuals with cognitive impairment. The Elecsvs AB42/40 ratio was also examined. In the Knight ADRC cohort, CSF AB42, AB40 and p-tau181 concentrations were measured with an automated immunoassay platform (Lumipulse G1200, Fujirebio). The ratio of CSF AB42 to AB40 (AB42/40) as measured by Lumipulse assays was validated⁶⁴ and FDA approved in May 2022 for the detection of A β plaques associated with AD for individuals with cognitive impairment, and, in addition, the Lumipulse $A\beta 42/p$ -tau181 ratio was also examined.

Blood %p-tau217 measurement. At the same session as CSF collection, blood was also collected from participants in a tube containing EDTA and centrifuged to separate plasma as previously described⁶⁵. Blood plasma p-tau217 and non-p-tau217 were measured by liquid chromatography-tandem high-resolution mass spectrometry (LC-MS/HRMS) analysis as detailed in the Supplementary Methods. The %p-tau217 measure was calculated as the ratio of tau phosphorylated at residue 217 divided by the concentration of non-phosphorylated mid-region tau.

Imaging biomarker outcomes. Detailed descriptions of imaging procedures in the BioFINDER-2 and Knight ADRC cohorts were previously reported^{23,66,67}. A β PET was performed with the EMA/FDA-approved tracer [¹⁸F]flutemetamol in the BioFINDER-2 cohort and with the FDA-approved tracer [¹⁸F]florbetapir (AV45) or [¹¹C]Pittsburgh Compound B (PiB) in the Knight ADRC cohort. Mean cortical SUVR was calculated using the average signal from neocortical ROIs (bilateral orbitofrontal, medial orbitofrontal, rostral middle frontal, superior frontal, superior temporal, middle temporal and precuneus) with cerebellar gray matter as reference. SUVR values were then transformed to Centiloids, which harmonizes measures from different tracers and studies⁶⁸. Aß PET positivity was set at \geq 37 Centiloids based on inclusion criteria in the TRAILBLAZER-ALZ studies that evaluated the clinical effects of the anti-Aß immunotherapy donanemab⁷. Additionally, in the BioFINDER-2 study, [¹⁸F]flutemetamol scans were also evaluated by visual read according to an FDA-approved protocol⁶⁹.

Tau PET scans were acquired with the [18 F]RO948 tracer in the BioFINDER-2 cohort and with the FDA-approved [18 F]flortaucipir tracer in the Knight ADRC cohort. These two tau PET tracers are structurally very similar and provide similar results in the cortex according to head-to-head comparisons⁷⁰. SUVR values were calculated in a commonly used temporal meta-ROI, which includes the Braak I–IV regions and captures the regions most affected by tau, with the inferior cerebelar gray matter as reference. Previously determined thresholds were used to determine tau PET positivity (SUVR > 1.32 in both cohorts)^{44,71}.

Endpoints. The primary outcome was the classification of amyloid pathology as determined by $A\beta$ PET imaging. Secondary outcomes included the detection of brain tau aggregates as determined by tau PET imaging and agreement with a clinical AD diagnosis based on clinical symptoms and clinically obtained biomarker results. Main analyses were performed in cognitively impaired participants as they are the population currently eligible for anti-amyloid treatments.

Statistical analysis. Blood plasma %p-tau217, CSF p-tau181/A β 42 and CSF A β 42/40 were used as predictors in independent models. To evaluate the performance of the three fluid biomarkers in predicting the main outcomes (A β and tau PET status and clinical AD diagnosis), we used receiver operating characteristic (ROC) curves (*pROC* package⁷²). AUCs were calculated in all participants as well as for cognitively impaired (MCI and dementia) and cognitively unimpaired (controls and SCD) subgroups. DeLong's test included in the same R package was used to calculate mean and 95% CI differences of the plasma and CSF AUCs.

Next, we evaluated the performance of these biomarkers using only cognitively impaired participants, as this group is more relevant to the intended use of these tests in clinical practice. We used two approaches to categorize patients based on their fluid biomarkers. First, we created two groups (that is, positive and negative) based on a threshold derived by maximizing the sensitivity while fixing the specificity at 90% against each outcome independently (*cutpointr* package⁷³). For this approach, we compared the accuracy, PPV, NPV and sensitivity of plasma %p-tau217 to the FDA-approved CSF biomarkers. In a second approach, we created three groups of participants (that is, positive, negative and intermediate) using two different thresholds, as recently described¹⁷. This was implemented independently for every outcome and cohort. The lower threshold was obtained by maximizing the specificity with the sensitivity fixed at 95%, whereas the upper threshold was obtained by the maximizing sensitivity with the specificity fixed at 95%. Participants with biomarker levels between these two thresholds were categorized as intermediate. For this approach, we compared the accuracy, PPV and NPV and the number of patients categorized as intermediate. In this approach, accuracy, PPV and NPV only took into account participants in the negative and positive groups as the intermediate group was assessed by the percentage of participants categorized on it.

Statistics were calculated as the mean of bootstrapped sample (n = 1,000 resamples with replacement stratifying by the output), from which we also calculated the 95% CI. The bootstrapped sample was also used to calculate the difference of all plasma %p-tau217 statistics (reference) and those from the CSF biomarkers. We considered plasma and CSF biomarkers clinically equivalent if the 95% CI of the mean difference included zero and superior if the 95% CI did not include zero while favoring plasma results.

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All statistics were calculated using the same sample in which the cutoff was derived (in-bag), due to the small sample size in the replication cohort. To assess the effect of deriving the cutoff in an independent sample, we performed two sensitivity analyses in the BioFINDER-2 cohort. First, we performed the bootstrap approach as done in the *cutpointr* package⁷³. This method derives the cutoffs in a bootstrapped sample (same sample size with replacement) and calculates the statistics in the individuals not included in the derivation of the cutoff. This completely independent remaining sample will include, on average, 36.8% of all individuals in the original sample when this procedure is done multiple times $(n = 1,000 \text{ here})^{74}$. Second, we also derived the plasma %p-tau217 cutoffs in the Knight ADRC cohort and tested them in the BioFINDER-2 cohort (Supplementary Methods). Given that the CSF biomarkers were measured using two different FDA-approved assays in the two cohorts (Roche Elecsys in BioFINDER-2 and Fujirebio Lumipulse in Knight ADRC), we derived the CSF biomarker cutoffs for the Roche Elecsys assay in a third independent cohort from UCSF⁷⁵ (Supplementary Methods), following the same approach.

As a sensitivity analysis, we also calculated the estimates using plasma p-tau217 as predictor while adjusting for plasma non-phosphorylated mid-region tau, instead of calculating the plasma ratio (that is, occupancy), using a logistic regression model.

AllstatisticalanalyseswereperformedinRversion4.1.0(https://www.r-project.org/).

Reporting summary

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

Data availability

Pseudonymized data from the BioFINDER-2 study will be shared upon request from a qualified academic investigator for the sole purpose of replicating procedures and results presented in this article and as long as the data transfer is in agreement with European Union legislation on general data protection regulations and decisions by the Swedish Ethical Review Authority and Region Skåne, which should be regulated in a material transfer agreement. Knight ADRC data are available to qualified investigators who have a proposal approved by an institutional committee that meets monthly (https://knightadrc.wustl.edu/Research/ResourceRequest.htm). The study must be approved by an institutional review board to ensure ethical research practices, and investigators must agree to the terms and conditions of the data use agreement, which includes not distributing the data without permission.

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Acknowledgements

We would like to express our gratitude to the research volunteers who participated in the studies from which these data were obtained and their supportive families. N.R.B. received funding from the Coins for Alzheimer's Research Trust and the Tracy Family SILQ Center. The BioFINDER-2 study was supported by the National Institute on Aging (NIA) (R01AG083740), the European Research Council (ADG-101096455), the Alzheimer's Association (SG-23-1061717 and ZEN24-1069572), the GHR Foundation, the Swedish Research Council (2022-00775), ERA PerMed (ERAPERMED2021-184), the Knut and Alice Wallenberg Foundation (2022-0231), the Strategic Research Area MultiPark (Multidisciplinary Research in Parkinson's Disease) at Lund University, the Swedish Alzheimer Foundation (AF-980907), the Swedish Brain Foundation (FO2021-0293), the Parkinson Foundation of Sweden (1412/22), the Cure Alzheimer's Fund, the Konung Gustaf V:s och Drottning Victorias Frimurarestiftelse, the Skåne University Hospital Foundation (2020-0000028), Regionalt Forskningsstöd (2022-1259) and the Swedish federal government under the ALF agreement (2022-Projekt0080). The precursor of ¹⁸F-flutemetamol was sponsored by GE Healthcare. The precursor of ¹⁸F-RO948 was provided by Roche. The funding sources had no role in the design and conduct of the study; in the collection, analysis and interpretation of the data; or in the preparation, review or approval of the manuscript. G.S. received funding from the European Union's Horizon 2020 Research and Innovation Program under Marie Sklodowska-Curie action grant agreement number 101061836, an Alzheimer's Association Research Fellowship (AARF-22-972612), the Alzheimerfonden (AF-980942), Greta och Johan Kocks research grants and travel grants from the Strategic Research Area MultiPark (Multidisciplinary Research in Parkinson's Disease) at Lund University. Data from the Knight ADRC

cohort were supported by National Institutes of Health (NIH) grant R01AG070941 (S.E.S.), the Coins for Alzheimer's Research Trust (N.R.B), Knight ADRC Developmental Projects (N.R.B.), P30AG066444 (J.C.M.), P01AG003991 (J.C.M.) and P01AG026276 (J.C.M.). Blood plasma measurements were supported by RF1AG061900 (R.J.B), R56AG061900 (R.J.B.) and the Tracy Family SILQ Center (R.J.B.). Avid Radiopharmaceuticals provided doses of 18F-AV45 (florbetapir) and precursor and technology transfer for 18F-AV1451 (flortaucipir) to Washington University but was not involved in the data analysis or interpretation. G.D.R. received funding from NIH/NIA P30-AG062422, U01 AG057195, R35 AG072362, the Alzheimer's Association (ZEN-21-848216), the American College of Radiology, the Rainwater Charitable Foundation and the Alliance for Therapeutics in Neurodegeneration.

Author contributions

N.R.B. and G.S. contributed equally as first authors. O.H. and R.J.B. jointly supervised this work. N.R.B., G.S., O.H. and R.J.B. conceived the project. N.R.B. designed the mass spectrometry experiments. N.R.B. and Y.H. performed mass spectrometry experiments. G.S. and B.S. analyzed the data. N.R.B., G.S., S.E.S., R.O., O.H. and R.J.B. interpreted the data. S.J. analyzed the CSF data. L.E.C. performed the visual reads. R.L.H., C.D.C., B.A.G., Y.L., R.L.J., T.L.S.B., N.M.-C., S.P., G.D.R., R.J.B. and O.H. contributed to the obtention and/or curation of the data. O.H. provided mentorship and founded and led the Swedish BioFINDER-2 study, which enabled recruitment of participants in this study. J.C.M. provided mentorship and founded and led the Knight ADRC study, which enabled recruitment of participants in this study. S.J. coordinated sample selection at BioFINDER-2, and S.J. and E.S. provided associated data. S.E.S. coordinated sample selection at the Knight ADRC and provided associated data. R.J.B. provided mass spectrometry resources and mentorship. N.R.B., G.S., S.E.S., R.J.B. and O.H. wrote the initial draft of the manuscript. All authors made substantial contributions to subsequent versions of the manuscript and approved the final version for submission.

Funding

Open access funding provided by Lund University.

Competing interests

N.R.B. and R.J.B. are co-inventors on US patent applications: 'Methods to detect novel tau species in CSF and use thereof to track tau neuropathology in Alzheimer's disease and other tauopathies' and 'CSF phosphorylated tau and amyloid beta profiles as biomarkers of tauopathies'. N.R.B. and R.J.B. are co-inventors on a non-provisional patent application: 'Methods of diagnosing and treating based on site-specific tau phosphorylation'. S.E.S. served on a scientific advisory board for Eisai. T.L.S.B. has investigator-initiated research funding from the National Institutes of Health, the Alzheimer's Association, the Barnes-Jewish Hospital Foundation and Siemens. She participates as a site investigator in clinical trials sponsored by Avid Radiopharmaceuticals, Eli Lilly, Biogen, Eisai, Janssen and Roche. She also serves as a consultant to Biogen, Eli Lilly, Eisai and Siemens. Neither J.C.M. nor his family owns stock or has equity interest (outside of mutual funds or other externally directed accounts) in any pharmaceutical or biotechnology company. O.H. has acquired research support (for the institution) from ADx, Avid Radiopharmaceuticals, Biogen, C2N Diagnostics, Eli Lilly, Eisai, Fujirebio, GE Healthcare, Pfizer and Roche. In the past 2 years, he has received consultancy/speaker fees from AC Immune, Alzpath, BioArctic, Biogen, Bristol Meyer Squibb, Cerveau, Eisai, Fujirebio, Genentech, Merck, Novartis, Novo Nordisk, Roche and Siemens. R.J.B. co-founded C2N Diagnostics. Washington University and R.J.B. have equity ownership interest in C2N Diagnostics and receive royalty income based on technology (stable isotope labeling kinetics, blood plasma assay and methods of diagnosing Alzheimer's disease with phosphorylation changes) that is licensed by Washington University to C2N Diagnostics. R.J.B. receives income from C2N Diagnostics for serving on the scientific advisory board. R.J.B. has received research funding from Avid Radiopharmaceuticals, Janssen, Roche/ Genentech, Eli Lilly, Eisai, Biogen, AbbVie, Bristol Myers Squibb and Novartis. O.H. has acquired research support (for the institution) from ADx, Avid Radiopharmaceuticals, Biogen, C2N Diagnostics, Eli Lilly, Eisai, Fujirebio, GE Healthcare, Pfizer and Roche. In the past 2 years, he has received consultancy/speaker fees from AC Immune, Alzpath, BioArctic, Biogen, Bristol Myers Squibb, Cerveau, Eisai, Eli Lilly, Fujirebio, Merck, Novartis, Novo Nordisk, Roche, Sanofi and Siemens. S.P. has acquired research support (for the institution) from ki:elements / Alzheimer's Drug Discovery Foundation. In the past 2 years, he has received consultancy/speaker fees from BioArtic, Biogen, Eli Lilly and Roche. L.E.C. has received research support from GE Healthcare (paid to institution). G.D.R. has received research support from Avid Radiopharmaceuiticals, GE Healthcare, Life Molecular Imaging and Genentech and consulting fees from Alector, Eli Lilly, Johnson & Johnson and Merck and serves as Associate Editor for JAMA Neurology. The other authors have no competing interests.

Additional information

Extended data is available for this paper at https://doi.org/10.1038/s41591-024-02869-z.

Supplementary information The online version contains supplementary material available at https://doi.org/10.1038/s41591-024-02869-z.

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Peer review information *Nature Medicine* thanks Paul Aisen, Marc Suárez-Calvet and the other, anonymous, reviewer(s) for their contribution to the peer review of this work. Primary Handling Editor: Jerome Staal, in collaboration with the *Nature Medicine* team.

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Visual read A_β PET positivity A Single cut-off 0.913 0.919 0.908⊢ Plasma %p-tau217 0.914 CSF p-tau181/Aβ42 0.927 0.922 0.933 0.940 CSF Aβ42/40 0.896 0.914 0.880 0.884 0.00 0.25 0.50 0.75 1.00 0.00 0.25 0.50 0.75 1.00 0.25 0.50 0.75 0.00 0.25 0.50 0.75 0.00 1.00 1 00 PPV NPV Sensitivity Accuracy **B** Two cut-offs Intermediate values(%) 100 Plasma %p-tau217 0.953 0.953 0.953 75 18.5% CSF p-tau181/Aβ42 0.954 0.956 0.951 50 15.2% 10.0% 25 0.948 0.942 0.952 CSF Aβ42/40 C 0.00 0.25 0.50 0.75 1.00 0.00 0.25 0.50 0.75 1.00 0.00 0.25 0.50 0.75 1.00 Accuracy **PPV** NPV **Biomarker C** Estimates differences Two cut-offs Single cut-off 0.6 0.6 Plasma Difference Plasma Difference better better 0.0 0.0 better better CSF CSF -0.6 -0.6 PPV NPV PPV NPV Acc Sens Acc Int val Plasma %p-tau217 CSF Aβ42/40 CSF p-tau181/Aβ42 **D** Histograms 25 25 20 20 20 Participants (n) 15 15 15 10 10 10 5 5 5 0 0 0 0.0 0.5 -0.5 1.0 -1.2 -1.4 -2.0 -1.6 -0.8 -1.6 -1.2 -1.0 -0.8 Plasma %p-tau217 (log) CSF p-tau/Aβ42 (log) CSF A642/40 (log) VR Aβ PET positive negative positive negative positive negative

Extended Data Fig. 1|See next page for caption.

Extended Data Fig. 1 | **Comparison among fluid biomarkers on predicting Aβ PET visual read positivity in cognitively impaired patients of the BioFINDER-2 cohort with in-bag estimates.** Prediction of Aβ PET visual read positivity in cognitively impaired participants from the BioFINDER-2 cohort, using a single cut-off (a) and two cut-offs (b) approaches, respectively. In the first approach, the cut-off was calculated maximizing sensitivity fixing specificity at 90%. In the second approach, the lower cut-off was obtained by maximizing specificity with sensitivity fixing specificity at 95%. Participants that fall between these two cut-offs were classified in the intermediate group. Dots and error bars represent the actual statistic and 95%CI, respectively. Bootstrapped differences (n = 1,000 resamples with replacement stratifying by the output) between the statistics using plasma %p-tau217 (reference) and CSF biomarkers are shown in (c) for both single and two cut-offs. A horizontal dashed line is plotted at zero representing the lack of difference between plasma and CSF biomarkers. We considered plasma and CSF biomarkers clinically equivalent if the 95%Cl of the mean difference included zero and clinically superior if it did not include zero and favored plasma (>0). Differences in number of participants in the intermediate group have been scaled to a maximum of one to be comparable to the other differences. Dots and error bars represent the mean and 95%Cl estimate from a bootstrapped sample. Vertical dashed lines represent the maximal statistical value possible (1). For the intermediate values plots, coloured bars represent the actual percentage and error bar the 95%Cl. Histograms (**d**) represent the distribution of the data coloured by the imaging biomarker status (coloured represent the positive group). Vertical black line represents the cut-off derived from the first approach (**a**), and red lines represent the lower and upper cut-offs from the second approach (B). Abbreviations: Aβ, amyloid-β, Cl, confidence interval; CSF, cerebrospinal fluid; NPV, negative predictive value; PPV, positive predictive value.



Extended Data Fig. 2 | See next page for caption.

Extended Data Fig. 2 | **Continuous Aß and tau PET measures by categorized fluid biomarkers groups.** Comparison between categorised fluid biomarkers levels and continuous measures of Aβ- (Centiloids, **a**, **b**) and tau PET (SUVR, **c**, **d**) quantification. Fluid biomarkers were categorised using the two-cut-off approach. The lower cut-off was obtained by maximizing specificity with sensitivity fixed at 95%, whereas the upper cut-off was obtained by maximizing sensitivity fixing specificity at 95%. Participants that fall between these two cut-offs were classified in the intermediate group. Dots represent individual participants. In all cases, central band of the boxplot represents the median of the group, the lower and upper hinges correspond to the first and third quartiles, and the whiskers represent the maximum/minimum value or the 1.5 IQR from the hinge, whatever is lower. Horizontal dashed lines represent the cut-off of positivity for each imaging marker (A β PET: \geq 37 Centiloids, Tau PET: \geq 1.32 SUVR for both cohorts). Abbreviations: A β , amyloid- β ; CI, confidence interval; CSF, cerebrospinal fluid; IQR, inter-quantile range; NPV, negative predictive value; PPV, positive predictive value; SUVR, standardized uptake value ratio.



Extended Data Fig. 3 | **Comparison among fluid biomarkers on predicting Aβ PET positivity in cognitively impaired patients of the BioFINDER-2 cohort using external cut-offs.** Prediction of Aβ PET positivity in cognitively impaired participants from the BioFINDER-2 cohort, using a single cut-off (a) and two cut-offs (b) approaches, respectively. In the first approach, the cut-off was calculated maximizing sensitivity fixing specificity at 90%. In the second approach, the lower cut-off was obtained by maximizing specificity with sensitivity fixing specificity at 95%, whereas the upper cut-off was obtained by maximizing sensitivity fixing specificity at 95%. Participants that fall between these two cut-offs were classified in the intermediate group. Dots and error bars represent the actual statistic and 95%CI, respectively. The external cut-off method derives the cut-offs in independent cohorts. Plasma %p-tau217 cut-offs were derived in the Knight ADRC cohort, and CSF biomarkers were derived in the UCSF cohort. Bootstrapped differences (n = 1,000 resamples with replacement stratifying by the output) between the statistics using plasma %p-tau217 (reference) and CSF biomarkers are shown in (c) for both single and two cut-offs. A horizontal dashed line is plotted at zero representing the lack of difference between plasma and CSF biomarkers. We considered plasma and CSF biomarkers clinically equivalent if the 95%CI of the mean difference included zero and clinically superior if it did not include zero and favored plasma (>0). Differences in number of participants in the intermediate group have been scaled to a maximum of one to be comparable to the other differences. Dots and error bars represent the mean and 95%CI estimate from a bootstrapped sample. Vertical dashed lines represent the maximal statistical value possible (1). For the intermediate values plots, coloured bars represent the actual percentage and error bar the 95%CI. A β PET positivity was assessed as Centiloids≥37. Abbreviations: A β , amyloid- β , CI, confidence interval; CSF, cerebrospinal fluid; NPV, negative predictive value; PPV, positive predictive value.

Extended Data Table 1 | Concordance of fluid and imaging biomarkers of AB and tau pathologies

	All			Cognitively impaired				Cognitively unimpaired				
	Ctrl	Case	AUC [95%CI]	Difference	Ctrl	Case	AUC [95%CI]	Difference	Ctrl	Case	AUC [95%CI]	Difference
						ΑβΡ	T positive					
BioFINDER-2												
Plasma %p-tau217	743	258	0.97 [0.95,0.98]	Ref.	153	151	0.96 [0.94,0.98]	Ref.	590	107	0.96 [0.94,0.98]	Ref.
CSF p-tau/Aβ42	743	258	0.97 [0.96,0.98]	-0.01 [-0.02, 0.01]	153	151	0.96 [0.94,0.98]	0.00 [-0.02, 0.02]	590	107	0.97 [0.95,0.98]	-0.01 [-0.02, 0.01]
CSF Aβ42/40	743	258	0.96 [0.95,0.97]	0.01 [-0.01, 0.02]	153	151	0.94 [0.92,0.97]	0.02 [-0.01, 0.04]	590	107	0.96 [0.95,0.97]	0.00 [-0.02, 0.02]
Knight ADRC												
Plasma %p-tau217	252	85	0.97 [0.95,0.99]	Ref.	13	37	0.98 [0.94,1.00]	Ref.	239	48	0.96 [0.93,0.98]	Ref.
CSF p-tau/Aβ42	252	85	0.97 [0.96,0.99]	0.00 [-0.02, 0.01]	13	37	0.96	0.02 [-0.05, 0.09]	239	48	0.97 [0.95,0.99]	-0.01 [-0.03, 0.01]
CSF Aβ42/40	252	85	0.96 [0.94,0.98]	0.01 [-0.01, 0.03]	13	37	0.92 [0.81,1.00]	0.06 [-0.05, 0.18]	239	48	0.96 [0.93,0.98]	0.00 [-0.03, 0.03]
						Tau P	ET positive					6
BioFINDER-2												
Plasma %p-tau217	1013	355	0.95 [0.94,0.97]	Ref.	357	306	0.95 [0.93,0.97]	Ref.	656	49	0.90 [0.85,0.95]	Ref.
CSF p-tau/Aβ42	1013	355	0.93 [0.92,0.95]	0.02	357	306	0.91 [0.89,0.94]	0.04 [0.02, 0.05]	656	49	0.89 [0.83,0.95]	0.01 [-0.03, 0.05]
CSF Aβ42/40	1013	355	0.88 [0.86,0.90]	0.07 [0.05, 0.08]	357	306	0.86 [0.83,0.88]	0.09 [0.07, 0.12]	656	49	0.83 [0.76,0.91]	0.07 [0.02, 0.12]
Knight ADRC	Knight ADRC											
Plasma %p-tau217	302	35	0.98 [0.97,0.99]	Ref.	22	28	0.94 [0.88,1.00]	Ref.	280	7	0.97 [0.94,1.00]	Ref.
CSF p-tau/Aβ42	302	35	0.96 [0.94,0.98]	0.02	22	28	0.90	0.04 [-0.06, 0.14]	280	7	0.96 [0.93,0.99]	0.01 [-0.01, 0.02]
CSF Aβ42/40	302	35	0.90 [0.87,0.94]	0.07	22	28	0.76 [0.62,0.91]	0.18	280	7	0.94 [0.91,0.97]	0.03 [0.00, 0.07]

Concordance of fluid biomarkers with A β and tau PET positivity in BioFINDER-2 and Knight ADRC participants. AUCs for all, cognitively impaired and cognitively unimpaired groups are shown from left to right. The number of negative (controls) and positive (cases) imaging-based groups are shown in each case. Differences between the statistics using plasma %p-tau217 (reference) and CSF biomarkers are shown together with the mean values. We considered plasma and CSF biomarkers clinically equivalent if the 95% CI of the mean difference included zero and clinically superior if it did not include zero and favored plasma (>0). A β PET positivity was assessed as Centiloids 37. Tau PET positivity was assessed using in-house previously validated cutoffs (SUVR>1.32 for both cohorts in Braak I–IV). Ctrl, control.

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Last updated by author(s): Jan 30, 2024

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For	all st	atistical analyses, confirm that the following items are present in the figure legend, table legend, main text, or Methods section.
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	\boxtimes	The exact sample size (n) for each experimental group/condition, given as a discrete number and unit of measurement
	\boxtimes	A statement on whether measurements were taken from distinct samples or whether the same sample was measured repeatedly
	\boxtimes	The statistical test(s) used AND whether they are one- or two-sided Only common tests should be described solely by name; describe more complex techniques in the Methods section.
	\boxtimes	A description of all covariates tested
	\boxtimes	A description of any assumptions or corrections, such as tests of normality and adjustment for multiple comparisons
	\boxtimes	A full description of the statistical parameters including central tendency (e.g. means) or other basic estimates (e.g. regression coefficient) AND variation (e.g. standard deviation) or associated estimates of uncertainty (e.g. confidence intervals)
\boxtimes		For null hypothesis testing, the test statistic (e.g. F, t, r) with confidence intervals, effect sizes, degrees of freedom and P value noted Give P values as exact values whenever suitable.
\boxtimes		For Bayesian analysis, information on the choice of priors and Markov chain Monte Carlo settings
\boxtimes		For hierarchical and complex designs, identification of the appropriate level for tests and full reporting of outcomes
\boxtimes		Estimates of effect sizes (e.g. Cohen's d, Pearson's r), indicating how they were calculated
		Our web collection on <u>statistics for biologists</u> contains articles on many of the points above.

Software and code

Policy information about availability of computer code

Data collection NanoLC-MS/MS experiments were performed using nanoAcquity UPLC system (Waters, Mildford, MA) coupled to Orbitrap Eclipse mass spectrometer (Thermo Scientific, San Jose, CA). MS/MS transitions peaks were extracted and quantified using Skyline-daily v23.1.1 (MacCoss Lab, Department of Genome Sciences, University of Washington, Seattle, WA).

Data analysis R (v4.1.0) was used for statistical analyses as described in the manuscript. The following packages were used: pROC, cutpointr and boot.

For manuscripts utilizing custom algorithms or software that are central to the research but not yet described in published literature, software must be made available to editors and reviewers. We strongly encourage code deposition in a community repository (e.g. GitHub). See the Nature Portfolio guidelines for submitting code & software for further information.

Data

Policy information about availability of data

All manuscripts must include a data availability statement. This statement should provide the following information, where applicable:

- Accession codes, unique identifiers, or web links for publicly available datasets
- A description of any restrictions on data availability
- For clinical datasets or third party data, please ensure that the statement adheres to our policy

For BioFINDER-2 data, anonymized data will be shared by request from a qualified academic investigator for the sole purpose of replicating procedures and results presented in the article and as long as data transfer is in agreement with EU legislation on the general data protection regulation and decisions by the Ethical

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Review Board of Sweden and Region Skåne, which should be regulated in a material transfer agreement. For Knight ADRC data are available to qualified investigators who have a proposal approbed by an institutional committee (https://knightadrc.wustl.edu/Research/ResourceRequest.htm) that meets monthly. the study must be approved by an institutional review board to ensure ethical reseearch practives and investigators must agree to the terms and conditions of the data use agreement, which includes not distributing the data without permission.

Human research participants

Policy information about studies involving human research participants and Sex and Gender in Research.

Reporting on sex and gender	Sex is reported in Table 1.
Population characteristics	Sample characteristics are shown in Table 1
Recruitment	n BioFINDER-2, the sample consisted of patients that had been referred to participting memory clinics (mostly from primary care) and most cognitively unimpaired participants were recruited from the general population in the south of Sweden.Knight ADRC cohort consisted of community-dwelling volunteers enrolled in studies of memory and aging at Washington University in St. Louis. All Knight ADRC participants underwent a comprehensive clinical assessment that included a detailed interview of a collateral source, a neurological examination of the participant, the Clinical Dementia Rating (CDR®) and the MMSE. Individuals with a CDR of 0.5 or greater were considered to have a dementia syndrome and the probable aetiology of the dementia syndrome was formulated by clinicians based on clinical features in accordance with standard criteria and methods.
Ethics oversight	All participants gave written informed consent and ethical approval was granted by the Regional Ethical Committee in Lund, Sweden and the Washington University Human Research Protection Office, respectively.

Note that full information on the approval of the study protocol must also be provided in the manuscript.

Field-specific reporting

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For a reference copy of the document with all sections, see <u>nature.com/documents/nr-reporting-summary-flat.pdf</u>

Life sciences study design

All studies must dis	close on these points even when the disclosure is negative.
Sample size	The study included two prospective studies (BioFINDER-2 [n=1,422] and Knight ADRC [n=337]) with large sample sizes. All participants with available plasma %p-tau217 and CSF Ab42/40 and CSF p-tau181/Ab42 measures at baseline were analyzed in this study.
Data exclusions	There was no data exclusion in this study.
Replication	We replicated key findings in two large independent cohorts (BioFINDER-2 and Knight ADRC) with significant differences in demographics and outcome measures.
Randomization	There was no randomization in this study. We did not perform any adjustment for covariates due to the comparison of biomarkers within the same sample.
Blinding	CSF and plasma measurments were performed blinded to the clinical data.

Reporting for specific materials, systems and methods

We require information from authors about some types of materials, experimental systems and methods used in many studies. Here, indicate whether each material, system or method listed is relevant to your study. If you are not sure if a list item applies to your research, read the appropriate section before selecting a response.

Materials & experimental systems

n/a	Involved in the study	n/a	Involved in the study
	X Antibodies	\boxtimes	ChIP-seq
\boxtimes	Eukaryotic cell lines	\boxtimes	Flow cytometry
\boxtimes	Palaeontology and archaeology	\boxtimes	MRI-based neuroimaging
\boxtimes	Animals and other organisms		
	🔀 Clinical data		
\boxtimes	Dual use research of concern		

Methods

Antibodies

Antibodies used	Tau1 (generated by Drs Nicholas Kanaan) and HJ series (HJ8.5, HJ8.7, HJ32.11 and HJ34.8) antibodies (generated by Dr. David Holtzman) were used. Detailed information of the immunoassays in the manuscript has been published previously (and is referred to in the manuscript).
Validation	Tau1, HJ8.5 and HJ8.7 were validated in the following studies: -Barthélemy NR, et al. Site-specific cerebrospinal fluid tau hyperphosphorylation in response to Alzheimer's disease brain patholgy: Not all tau phospho-sites are hyperphosphorylated. Journal of Alzheimer's disease, 2022, 85(1): 415-29. -Sato, et al. Tau kinetic in neurons and the human central nervous sytem. Neuron 2018. 98(4): 861-4. HJ32.11 and HJ34.8 were newly generated antibodies and we confirmed that immunoprecipitation procedures using there antibodies worked well by the two replicate cohorts analyses.

Clinical data

Policy information about <u>clinical studies</u>

All manuscripts should comply with the ICMJE guidelines for publication of clinical research and a completed CONSORT checklist must be included with all submissions.

Clinical trial registration	NCT03174938 (BioFINDER-2)
Study protocol	For BioFINDER-2: www.biofinder.se.
Data collection	BioFINDER-2 data are collected at the memory clinics of Skåne University Hospital and Ängelholm's hospital in Sweden between April 2017 and June 2022. Participants in Knight ADRC cohort were community-dwelling volunteers enrolled in studies of memory and aging between February 2013 and March 2020.
Outcomes	The primary outcome is amyloid status assessed by PET. Secondary outcomes include tau status assessed by PET and Alzheimer's disease diagnosis.