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## **Tau-PET is superior to phospho-tau when predicting cognitive decline in symptomatic AD patients**

**Ruben Smith**1,2, **Nicholas C. Cullen**1, **Alexa Pichet Binette**1, **Antoine Leuzy**1, **Kaj Blennow**3,4, **Henrik Zetterberg**3,4,5,6,7, **Gregory Klein**8, **Edilio Borroni**8, **Alzheimer's Disease Neuroimaging Initiative**#,

**Rik Ossenkoppele**1,9, **Shorena Janelidze**1, **Sebastian Palmqvist**1,10, **Niklas Mattsson-Carlgren**1,2,11, **Erik Stomrud**1,10, **Oskar Hansson**1,10,\*

<sup>1</sup>Clinical Memory Research Unit, Department of Clinical Sciences, Malmö, Lund University, Sweden

<sup>2</sup>Department of Neurology, Skåne University Hospital, Lund, Sweden

<sup>3</sup>Department of Psychiatry and Neurochemistry, Institute of Neuroscience and Physiology, the Sahlgrenska Academy at the University of Gothenburg, Mölndal, Sweden

<sup>4</sup>Clinical Neurochemistry Laboratory, Sahlgrenska University Hospital, Mölndal, Sweden

<sup>5</sup>Department of Neurodegenerative Disease, UCL Institute of Neurology, Queen Square, London, UK

<sup>6</sup>UK Dementia Research Institute at UCL, London, UK

<sup>7</sup>Hong Kong Center for Neurodegenerative Diseases, Hong Kong, China

<sup>8</sup>F. Hoffmann-La Roche Ltd, Basel, Switzerland

<sup>9</sup>Alzheimer Center Amsterdam, Department of Neurology, Amsterdam Neuroscience, Vrije Universiteit Amsterdam, Amsterdam UMC, Amsterdam, The Netherlands

<sup>\*</sup>Corresponding author: Oskar Hansson. MD. PhD., Memory Clinic, Skåne University Hospital, SE-205 02, Malmö, Sweden, Oskar.Hansson@med.lu.se, Tel : +46722267745. #Part of the data used in preparation of this article were obtained from the Alzheimer's Disease Neuroimaging Initiative (ADNI)

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**Disclosures** 

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<sup>10</sup>Memory Clinic, Skåne University Hospital, Malmö, Sweden

<sup>11</sup>Wallenberg Center for Molecular Medicine, Lund University, Lund, Sweden.

## **Abstract**

**INTRODUCTION:** Biomarkers for prediction of cognitive decline in patients with amnestic mild cognitive impairment and amnestic mild dementia are needed for both clinical practice and clinical trials.

**METHODS:** We evaluated the ability of tau-PET, cortical atrophy on MRI, baseline cognition, APOE-status, plasma and cerebrospinal fluid levels of phosphorylated tau-217, neurofilament light, and amyloid- $\beta_{42/40}$  (individually and in combination) to predict cognitive decline over two years in BioFINDER-2 and ADNI.

**RESULTS:** Baseline tau-PET and a composite baseline cognitive score were the strongest independent predictors of cognitive decline. Cortical thickness and neurofilament light provided some additional information. Using a predictive algorithm to enrich patient selection in a theoretical clinical trial led to a significantly lower required sample size.

**DISCUSSION:** Models including baseline tau-PET and cognition consistently provided the best prediction of change in cognitive function over 2 years in patients with amnestic mild cognitive impairment or mild dementia.

## **Keywords**

AD; Tau; PET; blood biomarkers; cognition

## **Introduction**

Amyloid  $\beta$  (A $\beta$ ) plaques and tau tangles are the pathologies that define Alzheimer's disease (AD).[1] Cerebrospinal fluid (CSF) Aβ was shown to be associated with an increased risk of progression from mild cognitive impairment (MCI) to AD dementia already 20 years ago,[1-3] and the first PET tracer for Aβ was developed shortly thereafter.[4] More recently, methods to accurately measure  $\mathbf{A}\beta$  in plasma have been developed. [1, 5-7] Over the past several years, new methods have been developed to visualize tau pathology in vivo using tau positron emission tomography (PET) imaging[8] and to determine levels of phosphorylated tau (p-tau) in CSF[9, 10] and plasma.[1, 11-16] The rapid development of tau-PET tracers has led to the recent approval, by the United States Food and Drug Administration, of  $[{}^{18}F]$ flortaucipir as a diagnostic agent in AD dementia.[17] Tau-PET has been shown to reliably detect the tau aggregates formed in AD,[18, 19] and shows strong associations with both cognitive decline [20-24] and neurodegeneration. [25, 26] Levels of p-tau in CSF and plasma have been shown to begin increasing at the asymptomatic (preclinical) stage of AD in response to very early Aβ pathology. [27-30] Higher baseline concentrations of p-tau have also been shown to accurately predict progression to AD dementia in both cognitively unimpaired (CU) individuals and in patients with MCI.[12, 31-33] Neurofilament Light (NfL), a more general marker of neurodegeneration, has been reported to be increased in AD [34], and to be associated with conversion from MCI to AD dementia.[32]

As mentioned above, we and others have recently shown that blood-based biomarkers of  $\mathsf{A}\mathsf{B}(A)$ , tau (T) and neurodegeneration (N) can predict both future cognitive decline and conversion to AD dementia.[11-16, 31-33] Further, tau-PET has also been shown to be an important predictor of cognitive decline in AD.[26, 35, 36] However, there is a clear lack of head-to-head comparisons of these type of promising fluid and imaging biomarkers, and there is also an urgent need to determine optimal biomarker combinations for prediction of cognitive decline in patients with MCI or mild dementia over a clinically relevant time span such as 24 months. This information is of great importance both in clinical settings to establish the risk of cognitive decline in symtomatic patients at a subject level, and in the settings of clinical trials directed against symptomatic AD where follow-up time typically ranges between 18 and 24 months [37-39].

We therefore aimed to determine the ability of different blood and CSF, as well as imaging ATN biomarkers associated with AD, to independently predict cognitive decline in patients with objective memory impairment. To this end, we analysed the ability of i) the most relevant plasma and CSF biomarkers (i.e. p-tau217, neurofilament light (NfL) and the ratio of Aβ42 to Aβ40 [Aβ<sub>42/40</sub>]), ii) tau-PET ([<sup>18</sup>F]RO948 standardized uptake value ratios (SUVRs)) in three different regions-of-interest (ROIs)), iii) baseline cognition, iv) MRI (cortical thickness in an "AD-signature" temporal-ROI[40]), and v) the main genetic risk variant for sporadic AD (the *APOE e4* allele), to predict longitudinal cognitive performance over two years in patients presenting with amnestic mild cognitive impairment (MCI) or amnestic mild dementia. We included patients with amnestic MCI or mild amnestic dementia without requiring them to already have evidence of Aβ pathology (defined by CSF or PET) to be able to identify which markers best predict cognitive decline indepedent of Aβ-status. This is a relevant situation in clinical practice, where most patients with amnestic memory impairment have an unknown Aβ-status. In a sensitivity analysis we restricted the participants to only include Aβ-positive participants to mimic a clinical trial setting. Based on the main results presented in this study, including all participants, we have developed a prototype of an on-line prognostic tool that can be used to predict cognitive decline over 24 months, either to provide indvidualized prognostic information in clinic practice or when recruiting suitable participants to clinical trials. Importantly, the main results were replicated in an independent cohort (ADNI).

## **Methods**

## **Participants**

We included participants from the Swedish BioFINDER-2 study ( $n=118$ ; May 2017 – March 2021; [www.biofinder.se](http://www.biofinder.se/)). The inclusion criteria for the present study were 1) either amnestic MCI (n=90) or early amnestic dementia (n=28) and 2) a baseline Mini-Mental State Examination (MMSE) score of 22 points. 3) A complete dataset for all studied biomarkers. In addition to presenting with amnestic memory problems patients with MCI either fulfilled established DSM-5 clinical criteria for mild neurocognitive disorder, or met the DSM-5 criteria for major neurocognitive disorder possibly due to AD.

BioFINDER-2 participants underwent a medical history and neurological examination, brain MRI, blood and CSF sampling, [<sup>18</sup>F]RO948 tau-PET and repeated neuropsychological

testing after 1, 2 and 3 years. Only participants with cognitive follow-up data extending over ≥2 years were included in the analysis, but results from all available time points were used for cognitive slope calculation. At baseline, participants also underwent a cognitive battery including trailmaking test-A & B (TMT-A, TMT-B), animal fluency (AF) and the wordlist delayed recall part of the ADAS-cog. These tests were used to calculate a baseline cognitive composite score by computing z-scores based on the mean and standard deviation of cognitively unimpaired (CU) participants (n=465) from the BioFINDER2 study. The baseline cognitive composite was calculated as -ADAS-cog<sub>z-score</sub> + -TMT-B<sub>z-score</sub> +  $AF_{z\text{-}score}$ . These three cognitive tests were used in combination since they were shown to be the best predictors of conversion to AD dementia.[33] For a sensitivity analysis using a modified Preclinical Alzheimer Cognitive Composite (PACC) as an outcome we calculated a modified PACC z-scores using the formula:  $MMSE_{z-score} + 2x$  (-ADAS-cog<sub>z-score</sub>) + -TMT- $A_{z-score}$  +  $AF_{z-score}$ . TMT-A was used instead of TMT-B in the longitudinal analysis to minimize the loss of AD participants at follow-up visits. Written informed consent was obtained from all participants prior to entering the study and the study was approved by the regional review board for human research ethics at Lund University. Details on ADNI participants are provided in the supplement.

#### **Image acquisition, processing and biofluid biomarker collection and processing**

Image acquisition and processing as well as biofluid biomarker handling are described in detail in the supplementary information. In an initial analysis we found that Braak III/IV was the best predictor (highest t-value) of cognitive decline of these three meta-ROIs, and consequently only the Braak III/IV (temporal ROI) region was used in further analyses, to avoid multiple dependent tau-PET predictors (Supplementary Table 1).

## **Statistics**

Linear regression modelling was used to predict change in cognition with each biomarker measured separately as the main predictor and in combination. Age, sex, education and baseline MMSE were included as covariates. Change in MMSE (slope) was calculated for each individual as the slope of a linear regression based on all available follow-up visits. Only individuals who had all available biomarker measurements were included in order to ensure direct comparability of model results. Models were evaluated using t-values,  $R^2$  and change in Akaike Information Criterion (AIC) values. A model with an AIC value more than two points lower than another model can be considered significantly different.[32] To find the most parsimonious model that could predict cognitive decline we performed an initial selection using the R package MuMIn, which tests all possible variable combinations and then ranks the models according to their AIC.[41] As a complementary model, stepwise removal of the variable with the highest p-value from the full model was performed and the model with the lowest AIC was considered as the optimal model with the best tradeoff between model fit and complexity. The parsimonious model selected was the model with the fewest predictors within 2 AIC points from the optimal model. Note that before starting the analyses, to limit the number of biomarkers studied and minimize the risk of random false-positive findings, we selected biomarkers shown in previous studies to be associated to cognitive decline in AD. To avoid collinearity due to dependent predictors (such as for example pTau measured in CSF and plasma), and since in clinical practice or clinical trial

settings often blood, but not CSF, is sampled, we performed the analysis of plasma and CSF biomarkers separately.

Finally, we performed a simulated clinical trial power analysis in which the ability of each measure to increase trial power was determined when used for inclusion screening. First, the number of trial participants needed to achieve 80% power to detect a reduction in cognitive change was calculated for each group without any additional inclusion criteria ("unenriched scenario"). Next, the same calculation was performed when assuming that only individuals in the 25%, 30%, 35% etc. top percentile of risk for cognitive decline as predicted by the parsimonius model would be included in the trial ("enriched scenario"). The percent difference in number of trial participants needed between the unenriched and enriched scenarios was then reported along with p-values based on the proportion of 1000 boostrap trials in which the enriched scenario required fewer participants than the unenriched scenario. All statistical tests were two-tailed with a significance level of 0.05. All analyses were performed using the R programming language (v 4.0).

## **Results**

## **Participants and biomarkers**

118 participants presenting with memory impairment (either amnestic MCI or amnestic mild AD dementia) from the Swedish BioFINDER-2 study were included in the study. The mean age was  $71.0 \pm 8.6$  years, mean education duration was  $12.8 \pm 4.4$  years, 48% were females, and mean baseline MMSE was  $26.4 \pm 2.4$  (range 22-30). Participant demographics for the included cohort are provided in Table 1. MMSE scores were obtained at baseline and at annual follow-up for up to three years. Cognitive decline was computed as the change (slope) in MMSE score per year and correlated to ten biomarkers: plasma and CSF p-tau217, plasma and CSF NfL, plasma and CSF  $\mathsf{A}\beta_{42/40}$  ratio, tau-PET SUVR in a temporal ROI (corresponding to Braak imaging stages III-IV), APOE ε<sup>4</sup> status, cortical thickness in "AD-signature" cortex and the cognitive baseline composite score.

## **Prediction of cognitive decline by individual biomarkers**

We found that baseline tau-PET SUVR in the temporal ROI showed the highest t-values,  $R<sup>2</sup>$  and lowest AIC values when each biomarker was used individually to predict change in cognition (t = –6.26,  $R^2 = 0.33$ , AIC –33 compared to a model including only the covariates; Figure 1 and Supplementary Tables 2 and 3). Baseline cognition, cortical atrophy, CSF NfL and plasma and CSF p-tau217 also individually significantly predicted cognitive decline (Figure 1, Supplementary Tables 2 and 3). As expected, models including all biomarkers provided better model fit (higher  $R^2$ -values). They also provided better ΔAIC-values as compared to the best single predictor tau-PET (Supplementary Tables 2 and 3).

#### **Prediction of cognitive decline by biomarker combinations**

We next determined the most parsimonious model that could provide a non-inferior prediction of future cognitive decline compared to the full models combining all predictors. We therefore sequentially removed one biomarker at a time from the full model in a stepwise

fashion (the biomarker with the highest p-value in the model was removed) and refit the model. Data showing the change in AIC and  $R^2$  upon biomarker removal are presented in Table 2. The combination of tau-PET, baseline cognition, cortical atrophy and NfL provided the most parsimonious models (with the fewest number of predictors, and AIC within  $\langle$  2 from the model with the lowest AIC), where tau-PET and baseline cogntion were the strongest predictors (Table 2). We next confirmed this model using an automated data-driven model selection (MuMin) to evaluate the ability of all possible biomarker combinations to predict cognitive decline. Again we found that for both plasma and CSF analyses, the combination of tau-PET, cortical atrophy, NfL and baseline cognition provided the lowest AICs.

In a sensitivity analysis, when restricting the analysis to only amnestic MCI participants (n=90), we found similar results (Supplementary Table 4). Further, when including only participants that were Aβ-positive (Supplementary Table 5) to mimic the scenario of a clinical trial, tau-PET and baseline cognition were significant predictors, while NfL and cortical atrophy were no longer significant predictors. Finally, when using change in modified PACC over time as the cognitive outcome (instead of change in MMSE), we again found that tau-PET and baseline cognition were the strongest predictors of cognitive decline in the parsimonious models, but with minor contributions from plasma NfL and plasma p-tau217 (Supplementary Table 6). In another sensitivity analysis we found no added value of plasma or CSF glial fibrillary acidic protein (GFAP) or CSF levels of the synaptic marker Neurogranin in the BioFINDER cohort (data not shown).

To validate our findings we included 50 participants from the ADNI cohort, having a complete set of biomarkers for: age, sex, education, baseline and longitudinal MMSE, baseline cognition, tau-PET ( $[18F]$ flortaucipir), APOE e4-status, Aβ-status, plasma NfL, plasma p-tau181 and cortical thickness. We found that tau-PET and baseline cognition were again the best predictors for longitudinal cognitive decline, but plasma NfL and cortical atrophy did not contribute to the model (Supplementary Table 7).

## **Enrichment for clinical trials using biomarkers**

With the aim of studying the importance of screening biomarker data for clinical trial design we next calculated the impact of biomarker enrichment on group sizes needed to achieve a preset statistical power of 80%. We found that using the parsimonious models defined in BioFINDER-2, i.e. tau-PET, baseline cognition, NfL and cortical thickness, to enrich for higher risk of cognitive decline resulted in significant reduction in group sizes with preserved statistical power (Figure 2 and Supplementary Figure 1; full details provided in Supplementary Table 8). These results are independent of the assumed treatment effect. There were no statistically significant differences in the reduced group sizes between using CSF or plasma biomarkers (Supplementary Figure 1). The results indicated that restricting inclusion to the 50% of participants with the highest predicted risk for cognitive decline resulted in a need for ~52% fewer participants compared to having no enrichment strategy (Figure 2). Biomarker enrichment further resulted in removal of Aβ negative individuals even if Aβ biomarkers were not used in the parsimonious selection model. For example, in an unselected population, 65% of amnestic individuals were Aβ-positive, compared to ~80%

using a 75% cut off (i.e. including the 75% with the most pathological values, and excluding the 25% with most normal values), 92-93% using a 50% cut off and 97% using a 25% cut off. In a sensitivity analysis, a more simple model only containing the most important predictors (that is: tau-PET and cognition) performed similarly to the full models for study enrichment (Supplementary Figure 2).

#### **Generation of a prediction algorithm for future cognitive decline**

To simplify the use of the data provided herein we have generated a web-based application for calculating the risk for cognitive decline over a two-year period, based on the full BioFINDER2 dataset. The web-application is available at: [https://brainapps.shinyapps.io/](https://brainapps.shinyapps.io/PredictMMSE/) [PredictMMSE/](https://brainapps.shinyapps.io/PredictMMSE/) (Figure 3).

## **Discussion**

Plasma[12, 33], CSF [42, 43] and imaging biomarkers [35, 36, 42-48] of A, T and N have previously been used individually or in combination to predict cognitive decline and conversion to AD dementia. However, a comprehensive direct head-to-head comparison of the relative contributions of plasma, CSF and tau-PET biomarkers to the prediction of cognitive decline is lacking. To address this gap and to allow direct comparisons of the relative contribution of the different biomarkers to the prediction we used a dataset where data for all studied biomarkers were available in all participants. In short we found that models consisting of tau-PET and baseline cognition, were most strongly and consistently associated with subsequent cogntive decline in heterogenous populations of patients with amnestic MCI or mild amnestic dementia. Further, there were more modest and more variable contributions of NfL and cortical thickness, but neither plasma (or CSF) p-tau, plasma (or CSF) Aβ42/Aβ40, or APOE4 genotype were included in the main models.

The present results are in line with a recent study showing that tau-PET is superior to Aβ-PET and MRI when predicting subsequent cognitive change in AD,[35] but in that large multicenter cohort neither plasma biomarkers, CSF biomarkers, nor baseline cognition were studied.

The present finding that NfL and cortical atrophy provides modest, but independent, information compared to tau-PET alone might be expected, considering that NfL and cortical atrophy reflects ongoing axonal degeneration and substance loss of the brain, which is clearly different to the tau aggregates detected with tau-PET imaging.[1] Previous studies have suggested a role for structural cortical volumetric or thickness MRI measures[43, 45, 48, 49] in prediction of cognitive decline in AD. Cross-sectionally we and others have reported that temporal cortical atrophy on MRI and tau-PET are associated with cognitive performance.[42, 44, 46, 47, 50] However, neither NfL, nor cortical atrophy were significant predictors in the ADNI validation cohort, possibly reflecting the smaller sample size and potentially also the lower number of early AD dementia participants in the ADNI dataset.

The main explanation why plasma (or CSF) p-tau was not selected in the main parsimonious models is likely because this biomarker, similar to Aβ42/Aβ40 and Aβ-PET, becomes abnormal much earlier than tau-PET, in the case of Aβ42/Aβ40 likely already 10-30 years

before onset of objective memory impairment.[1, 11, 15] Tau-PET is more closely related to neurodegeneration and cognitive decline during the symptomatic stages of AD[1, 35], likely explaining why we found that plasma (and CSF) p-tau does not seem to contribute with independent information beyond tau-PET in patients with MCI and mild dementia. CSF p-tau 217 was pathological in 60% of participants at baseline (including all AD-dementia participants). In comparison, 38% of participants had a pathological RO948 PET at baseline. That said, plasma p-tau might be more useful during preclinical stages of AD, where it can predict future increase in tau-PET uptake.[51]

Further, baseline cognition (here evaluated using composites of memory and executive function) showed an association with future cognitive decline even after adjusting for baseline MMSE, but performed significantly inferior compared to the parsimonious model or tau-PET when used alone (Table 2, Supplementary tables 2 and 3). Still, including baseline cognition added independent information to the parsimonious models on top of tau-PET, cortical thickness and NfL data, showing the value of brief cognitive testing in the clinic when predicting subsequent cognitive decline. Similarily, we have previously found that the same three cognitive tests together with plasma p-tau can predict conversion to AD dementia in patients with SCD or MCI, but again tau-PET was not available in that study.[33]

Conducting clinical studies is very expensive since large populations need to be included to have a sufficient number of progressors over a relatively short time interval to show an effect of the treatment. In an unselected population, only a minority of patients with MCI or mild dementia will progress significantly over a two-year period. Optimizing the trial design by selecting patients that are more likely to progress is therefore of great importance for reducing the number of required participants. We consequently aimed to see whether preselecting study participants for a theoretical clinical trial based on their baseline biomarker levels could reduce the number of required participants without compromising statistical power. Restricting the study population using the parsimonious model to more pathological biomarker values resulted in a significant reduction in sample sizes needed (Figure 2; Supplementary Table 8 and Supplementary Figure 1). Importantly for the use of these biomarkers in selection of participants for future clinical studies of AD, selection based on the parsimonious model including only tau-PET, baseline cognition, cortical atrophy, and NfL also selected for  $\mathsf{A}\beta$  positivity, thereby decreasing the need for performing both Aβ- and tau-PET in the selection process.

In light of the recently published Phase II study of donanemab in early AD[38] where cognitive decline continued despite the clearance of  $A\beta$  plaques as assessed by  $A\beta$ -PET, it may be argued that including patients based on tau-positivity, as assessed by tau-PET, may be too late since the treatment may not be able to halt disease progression. The parsimonius model presented in this article may therefore prove more suitable for anti-tau trials, acting at a later stage of the disease progression.

From a clinical perspective, knowing the likelihood that a patient in the clinic will remain stable or is likely to significantly deteriorate over a relevant time interval is of great importance. "How quickly does my memory deteriorate?" was recently listed as the most

important question to be answered by both AD patients and caregivers in a survey study[52], followed by other questions related to cognition. Being able to address these questions is therefore of large interest to meet the concerns of the patients affected by the disease. By knowing the tau-PET status, the baseline performance on a few brief cognitive screening tests, NfL, a prediction can now be made using an easy-to-use on-line tool developed using the results of the present study (<https://brainapps.shinyapps.io/PredictMMSE/>).

There are limitations of this study. First, the follow-up period is rather short, although it is within the range of many therapeutical trials in symptomatic AD [\(ClinicalTrials.gov](http://ClinicalTrials.gov): Clarity AD, EMERGE, GRADUATE 1&2, and ENGAGE, and [37-39]), and represents a foreseeable time perspective from a clinical point of view. Second, the number of participants is relatively low, especially for the number of AD dementia participants, and the majority are of European descent. We cannot exclude that there may be small predictive effects seen with the non-significant biomarkers if the sample size was increased, and the results would benefit from being replicated in additional large independent cohorts. Likewise, we cannot exclude that other biomarkers may show better predictive abilities with a more diverse ethnic background. Third, MMSE may not be the optimal readout for longitudinal cognition in all settings, even though it often performs well to detect decline in populations with patients with MCI or mild dementia and it is often included in clinical trials as a secondary outcome. A sensitivity analysis using a modified PACC, designed to be an earlier marker of cognitive decline, as the cognitive outcome resulted in a similar outcome compared to using longitudinal MMSE. Fourth, we aimed at making a comprehensive comparative study of biomarkers for cognitive decline in early AD, but still important biomarkers, such as for example FDG PET, were not available in the dataset and have not been included in the present study.

## **Conclusions**

We found that tau-PET, baseline cognition, cortical thickness, p-tau217-levels in blood and CSF as well as CSF NfL, can all individually predict future cognitive decline in patients with amnestic MCI or mild dementia. However, models including tau-PET and baseline cognition consistently provided the best prediction of cognitive decline in this heterogenous patient population, implying that tau-PET might be an important addition to the diagnostic work-up in situations when prognostic information is of importance. We further found that selecting a study population based on these biomarkers can result in clearly reduced number of participants needed in clinical trials, e.g. anti-tau trials, with cognitive decline as primary outcome.

## **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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## **Data Sharing**

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 Swedish Ethical Review Authority, which should be regulated in a material transfer agreement.

## **References**

- [1]. Hansson O Biomarkers for neurodegenerative diseases. Nat Med. 2021;27:954–63. [PubMed: 34083813]
- [2]. Andreasen N, Minthon L, Vanmechelen E, Vanderstichele H, Davidsson P, Winblad B, et al. Cerebrospinal fluid tau and Abeta42 as predictors of development of Alzheimer's disease in patients with mild cognitive impairment. Neurosci Lett. 1999;273:5–8. [PubMed: 10505638]
- [3]. Buchhave P, Minthon L, Zetterberg H, Wallin AK, Blennow K, Hansson O. Cerebrospinal fluid levels of beta-amyloid 1-42, but not of tau, are fully changed already 5 to 10 years before the onset of Alzheimer dementia. Arch Gen Psychiatry. 2012;69:98–106. [PubMed: 22213792]
- [4]. Klunk WE, Engler H, Nordberg A, Wang Y, Blomqvist G, Holt DP, et al. Imaging brain amyloid in Alzheimer's disease with Pittsburgh Compound-B. Ann Neurol. 2004;55:306–19. [PubMed: 14991808]

- [5]. Janelidze S, Teunissen CE, Zetterberg H, Allue JA, Sarasa L, Eichenlaub U, et al. Head-to-Head Comparison of 8 Plasma Amyloid-beta 42/40 Assays in Alzheimer Disease. JAMA Neurol. 2021;78:1375–82. [PubMed: 34542571]
- [6]. Nakamura A, Kaneko N, Villemagne VL, Kato T, Doecke J, Dore V, et al. High performance plasma amyloid-beta biomarkers for Alzheimer's disease. Nature. 2018;554:249–54. [PubMed: 29420472]
- [7]. Ovod V, Ramsey KN, Mawuenyega KG, Bollinger JG, Hicks T, Schneider T, et al. Amyloid beta concentrations and stable isotope labeling kinetics of human plasma specific to central nervous system amyloidosis. Alzheimers Dement. 2017;13:841–9. [PubMed: 28734653]
- [8]. Leuzy A, Chiotis K, Lemoine L, Gillberg PG, Almkvist O, Rodriguez-Vieitez E, et al. Tau PET imaging in neurodegenerative tauopathies-still a challenge. Mol Psychiatry. 2019;24:1112–34. [PubMed: 30635637]
- [9]. Janelidze S, Stomrud E, Smith R, Palmqvist S, Mattsson N, Airey DC, et al. Cerebrospinal fluid p-tau217 performs better than p-tau181 as a biomarker of Alzheimer's disease. Nat Commun. 2020;11:1683. [PubMed: 32246036]
- [10]. Leuzy A, Janelidze S, Mattsson-Carlgren N, Palmqvist S, Jacobs D, Cicognola C, et al. Comparing the Clinical Utility and Diagnostic Performance of CSF P-Tau181, P-Tau217, and P-Tau231 Assays. Neurology. 2021;97:e1681–e94. [PubMed: 34493616]
- [11]. Janelidze S, Berron D, Smith R, Strandberg O, Proctor NK, Dage JL, et al. Associations of Plasma Phospho-Tau217 Levels With Tau Positron Emission Tomography in Early Alzheimer Disease. JAMA Neurol. 2020.
- [12]. Janelidze S, Mattsson N, Palmqvist S, Smith R, Beach TG, Serrano GE, et al. Plasma P-tau181 in Alzheimer's disease: relationship to other biomarkers, differential diagnosis, neuropathology and longitudinal progression to Alzheimer's dementia. Nat Med. 2020;26:379–86. [PubMed: 32123385]
- [13]. Karikari TK, Pascoal TA, Ashton NJ, Janelidze S, Benedet AL, Rodriguez JL, et al. Blood phosphorylated tau 181 as a biomarker for Alzheimer's disease: a diagnostic performance and prediction modelling study using data from four prospective cohorts. Lancet Neurol. 2020;19:422–33. [PubMed: 32333900]
- [14]. Mielke MM, Hagen CE, Xu J, Chai X, Vemuri P, Lowe VJ, et al. Plasma phospho-tau181 increases with Alzheimer's disease clinical severity and is associated with tau- and amyloidpositron emission tomography. Alzheimers Dement. 2018;14:989–97. [PubMed: 29626426]
- [15]. Palmqvist S, Janelidze S, Quiroz YT, Zetterberg H, Lopera F, Stomrud E, et al. Discriminative Accuracy of Plasma Phospho-tau217 for Alzheimer Disease vs Other Neurodegenerative Disorders. JAMA. 2020;324:772–81. [PubMed: 32722745]
- [16]. Thijssen EH, La Joie R, Wolf A, Strom A, Wang P, Iaccarino L, et al. Diagnostic value of plasma phosphorylated tau181 in Alzheimer's disease and frontotemporal lobar degeneration. Nat Med. 2020;26:387–97. [PubMed: 32123386]
- [17]. Jie C, Treyer V, Schibli R, Mu L. Tauvid: The First FDA-Approved PET Tracer for Imaging Tau Pathology in Alzheimer's Disease. Pharmaceuticals (Basel). 2021;14.
- [18]. Fleisher AS, Pontecorvo MJ, Devous MD Sr., Lu M, Arora AK, Truocchio SP, et al. Positron Emission Tomography Imaging With [18F]flortaucipir and Postmortem Assessment of Alzheimer Disease Neuropathologic Changes. JAMA Neurol. 2020;77:829–39. [PubMed: 32338734]
- [19]. Smith R, Wibom M, Pawlik D, Englund E, Hansson O. Correlation of In Vivo [18F]Flortaucipir With Postmortem Alzheimer Disease Tau Pathology. JAMA Neurol. 2019;76:310–7. [PubMed: 30508025]
- [20]. Nelson PT, Alafuzoff I, Bigio EH, Bouras C, Braak H, Cairns NJ, et al. Correlation of Alzheimer disease neuropathologic changes with cognitive status: a review of the literature. J Neuropathol Exp Neurol. 2012;71:362–81. [PubMed: 22487856]
- [21]. Ossenkoppele R, Smith R, Ohlsson T, Strandberg O, Mattsson N, Insel PS, et al. Associations between tau, Abeta, and cortical thickness with cognition in Alzheimer disease. Neurology. 2019;92:e601–e12. [PubMed: 30626656]

- [22]. Pontecorvo MJ, Devous MD Sr., Navitsky M, Lu M, Salloway S, Schaerf FW, et al. Relationships between flortaucipir PET tau binding and amyloid burden, clinical diagnosis, age and cognition. Brain. 2017;140:748–63. [PubMed: 28077397]
- [23]. Scholl M, Lockhart SN, Schonhaut DR, O'Neil JP, Janabi M, Ossenkoppele R, et al. PET Imaging of Tau Deposition in the Aging Human Brain. Neuron. 2016;89:971–82. [PubMed: 26938442]
- [24]. Aschenbrenner AJ, Gordon BA, Benzinger TLS, Morris JC, Hassenstab JJ. Influence of tau PET, amyloid PET, and hippocampal volume on cognition in Alzheimer disease. Neurology. 2018;91:e859–e66. [PubMed: 30068637]
- [25]. Pereira JB, Harrison TM, La Joie R, Baker SL, Jagust WJ. Spatial patterns of tau deposition are associated with amyloid, ApoE, sex, and cognitive decline in older adults. Eur J Nucl Med Mol Imaging. 2020;47:2155–64. [PubMed: 31915896]
- [26]. Sperling RA, Mormino EC, Schultz AP, Betensky RA, Papp KV, Amariglio RE, et al. The impact of amyloid-beta and tau on prospective cognitive decline in older individuals. Ann Neurol. 2019;85:181–93. [PubMed: 30549303]
- [27]. Palmqvist S, Insel PS, Stomrud E, Janelidze S, Zetterberg H, Brix B, et al. Cerebrospinal fluid and plasma biomarker trajectories with increasing amyloid deposition in Alzheimer's disease. EMBO Mol Med. 2019;11:e11170. [PubMed: 31709776]
- [28]. Suarez-Calvet M, Karikari TK, Ashton NJ, Lantero Rodriguez J, Mila-Aloma M, Gispert JD, et al. Novel tau biomarkers phosphorylated at T181, T217 or T231 rise in the initial stages of the preclinical Alzheimer's continuum when only subtle changes in Abeta pathology are detected. EMBO Mol Med. 2020:e12921. [PubMed: 33169916]
- [29]. Mattsson-Carlgren N, Andersson E, Janelidze S, Ossenkoppele R, Insel P, Strandberg O, et al. Abeta deposition is associated with increases in soluble and phosphorylated tau that precede a positive Tau PET in Alzheimer's disease. Sci Adv. 2020;6:eaaz2387. [PubMed: 32426454]
- [30]. Mattsson-Carlgren N, Janelidze S, Bateman RJ, Smith R, Stomrud E, Serrano GE, et al. Soluble P-tau217 reflects amyloid and tau pathology and mediates the association of amyloid with tau. EMBO Mol Med. 2021;13:e14022. [PubMed: 33949133]
- [31]. Karikari TK, Benedet AL, Ashton NJ, Lantero Rodriguez J, Snellman A, Suarez-Calvet M, et al. Diagnostic performance and prediction of clinical progression of plasma phospho-tau181 in the Alzheimer's Disease Neuroimaging Initiative. Mol Psychiatry. 2020.
- [32]. Cullen NC, Leuzy A, Palmqvist S, Janelidze S, Stomrud E, Pesini P, et al. Individualized prognosis of cognitive decline and dementia in mild cognitive impairment based on plasma biomarker combinations. Nature Aging. 2021;1:114–23. [PubMed: 37117993]
- [33]. Palmqvist S, Tideman P, Cullen N, Zetterberg H, Blennow K, Dage JL, et al. Prediction of future Alzheimer's disease dementia using plasma phospho-tau combined with other accessible measures. Nature Medicine. 2021.
- [34]. Ashton NJ, Janelidze S, Al Khleifat A, Leuzy A, van der Ende EL, Karikari TK, et al. A multicentre validation study of the diagnostic value of plasma neurofilament light. Nat Commun. 2021;12:3400. [PubMed: 34099648]
- [35]. Ossenkoppele R, Smith R, Mattsson-Carlgren N, Groot C, Leuzy A, Strandberg O, et al. Accuracy of Tau Positron Emission Tomography as a Prognostic Marker in Preclinical and Prodromal Alzheimer Disease: A Head-to-Head Comparison Against Amyloid Positron Emission Tomography and Magnetic Resonance Imaging. JAMA Neurol. 2021.
- [36]. Pontecorvo MJ, Devous MD, Kennedy I, Navitsky M, Lu M, Galante N, et al. A multicentre longitudinal study of flortaucipir (18F) in normal ageing, mild cognitive impairment and Alzheimer's disease dementia. Brain. 2019;142:1723–35. [PubMed: 31009046]
- [37]. Honig LS, Vellas B, Woodward M, Boada M, Bullock R, Borrie M, et al. Trial of Solanezumab for Mild Dementia Due to Alzheimer's Disease. N Engl J Med. 2018;378:321–30. [PubMed: 29365294]
- [38]. Mintun MA, Lo AC, Duggan Evans C, Wessels AM, Ardayfio PA, Andersen SW, et al. Donanemab in Early Alzheimer's Disease. N Engl J Med. 2021;384:1691–704. [PubMed: 33720637]

- [39]. Swanson CJ, Zhang Y, Dhadda S, Wang J, Kaplow J, Lai RYK, et al. A randomized, doubleblind, phase 2b proof-of-concept clinical trial in early Alzheimer's disease with lecanemab, an anti-Abeta protofibril antibody. Alzheimers Res Ther. 2021;13:80. [PubMed: 33865446]
- [40]. Jack CR Jr., Wiste HJ, Weigand SD, Therneau TM, Lowe VJ, Knopman DS, et al. Defining imaging biomarker cut points for brain aging and Alzheimer's disease. Alzheimers Dement. 2017;13:205–16. [PubMed: 27697430]
- [41]. Burnham KP, Anderson DR. Multimodel inference understanding AIC and BIC in model selection. Sociol Method Res. 2004;33:261–304.
- [42]. Brier MR, Gordon B, Friedrichsen K, McCarthy J, Stern A, Christensen J, et al. Tau and Abeta imaging, CSF measures, and cognition in Alzheimer's disease. Sci Transl Med. 2016;8:338ra66.
- [43]. Vemuri P, Wiste HJ, Weigand SD, Shaw LM, Trojanowski JQ, Weiner MW, et al. MRI and CSF biomarkers in normal, MCI, and AD subjects: predicting future clinical change. Neurology. 2009;73:294–301. [PubMed: 19636049]
- [44]. Cho H, Choi JY, Hwang MS, Lee JH, Kim YJ, Lee HM, et al. Tau PET in Alzheimer disease and mild cognitive impairment. Neurology. 2016;87:375–83. [PubMed: 27358341]
- [45]. Jack CR Jr., Barnes J, Bernstein MA, Borowski BJ, Brewer J, Clegg S, et al. Magnetic resonance imaging in Alzheimer's Disease Neuroimaging Initiative 2. Alzheimers Dement. 2015;11:740– 56. [PubMed: 26194310]
- [46]. Johnson KA, Schultz A, Betensky RA, Becker JA, Sepulcre J, Rentz D, et al. Tau positron emission tomographic imaging in aging and early Alzheimer disease. Ann Neurol. 2016;79:110– 9. [PubMed: 26505746]
- [47]. Mattsson N, Insel PS, Donohue M, Jogi J, Ossenkoppele R, Olsson T, et al. Predicting diagnosis and cognition with (18)F-AV-1451 tau PET and structural MRI in Alzheimer's disease. Alzheimers Dement. 2019;15:570–80. [PubMed: 30639421]
- [48]. Risacher SL, Shen L, West JD, Kim S, McDonald BC, Beckett LA, et al. Longitudinal MRI atrophy biomarkers: relationship to conversion in the ADNI cohort. Neurobiol Aging. 2010;31:1401–18. [PubMed: 20620664]
- [49]. Bauer CM, Cabral HJ, Killiany RJ. Multimodal Discrimination between Normal Aging, Mild Cognitive Impairment and Alzheimer's Disease and Prediction of Cognitive Decline. Diagnostics (Basel). 2018;8.
- [50]. Ossenkoppele R, Schonhaut DR, Scholl M, Lockhart SN, Ayakta N, Baker SL, et al. Tau PET patterns mirror clinical and neuroanatomical variability in Alzheimer's disease. Brain. 2016;139:1551–67. [PubMed: 26962052]
- [51]. Leuzy A, Smith R, Cullen NC, Strandberg O, Vogel JW, Binette AP, et al. Biomarker-Based Prediction of Longitudinal Tau Positron Emission Tomography in Alzheimer Disease. JAMA Neurol. 2021.
- [52]. Mank A, van Maurik IS, Bakker ED, van de Glind EMM, Jonsson L, Kramberger MG, et al. Identifying relevant outcomes in the progression of Alzheimer's disease; what do patients and care partners want to know about prognosis? Alzheimers Dement (N Y). 2021;7:e12189. [PubMed: 34458555]



**Figure 1. Prediction of cognitive decline using biomarkers individually or in combination.** The figure shows the effect sizes for each biomarker in predicting future cognitive decline either alone (orange bars, on top) or in a combined model (black bars, below). Significant biomarkers are represented with a star. The model using cerebrospinal fluid (CSF) biomarkers is shown in the left panel and the model using plasma biomarkers in the right panel. Bars represent 95% Confidence Intervals.



**Figure 2. Enrichment for clinical trials using the parsimonious model biomarkers.**

The top panel of the graph shows the effect on group size needed to include in a clinical trial to retain statistical power when enriching for pathological values for the tau-PET, Baseline cognition, cortical thickness and NfL biomarkers (cerebrospinal fluid (CSF) NfL in black, plasma NfL in orange). The bottom panel shows the rate of Aβ positivity with the different inclusion thresholds (CSF in black, plasma in orange).



#### **MMSE** prediction

#### **Figure 3. Prediction algorithm for cognitive decline**

Example of the implementation of the regression models at [https://brainapps.shinyapps.io/](https://brainapps.shinyapps.io/PredictMMSE/) [PredictMMSE/.](https://brainapps.shinyapps.io/PredictMMSE/) At this web-site it is possible to enter basic demographic data (age, sex and education), biomarker data (tau-PET temporal ROI SUVR and plasma NfL (pg/ml)) as well as raw cognitive test scores (MMSE, ADAS delayed recall, TMT-B and animal fluency). The example shows the predicted individual change in cognition for a 70-year old female who has 14 years of education, a pathological tau-PET (2.44 SUVR), a plasma NfL of 4.5 pg/ml, and a cortical thickness of 2.3 mm (please note that entering cortical thickness is optional). She has a baseline MMSE score of 27, scores seven errors on a ten-word delayed recall test, completes the Trail-Making Test B in 124 seconds and names twelve animals in 1 min.

## **Table 1.**

## Demographic information



 $CSF =$  cerebrospinal fluid;  $F =$  female;  $M =$  male;  $MMSE =$  minimental state exam;  $SD =$  standard deviation;  $SUVR =$  standardized uptake value ratio.

 $\frac{\cancel{S}}{\cancel{S}}$  modified PACC measurement used for a sensitivity analysis (n=103).

## **Table 2.**

Selection of the most parsimonious model for predicting cognitive decline in patients with amnestic MCI and amnestic mild dementia



Results from the stepwise regression model. The variable with the highest p-value was removed from the model and the  $R^2$  and AIC of the new model assessed. For both plasma and CSF analyses the lowest AIC was achieved with models containing [18F]RO948 (tau-PET), Neurofilament Light (NfL), and baseline cognitive data (data highlighted with light orange). All models included sex, education, age, and baseline MMSE as covariates. Tau-PET = [18F]RO948 Standardized Uptake Ratio values in a temporal ROI; MR AD cortex = Cortical thickness in "AD signature cortex" (see methods for details); Aβ ratio = Aβ42/40 ratio. Biomarker values indicate t-values (p-values).