



Rationale and design of the BeyeOMARKER study: prospective evaluation of bloodand eye-based biomarkers for early detection of Alzheimer's disease pathology in the eye clinic

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Abstract

Background Alzheimer's disease (AD) is a common, complex and multifactorial disease that may require screening across multiple routes of referral to enable early detection and subsequent future implementation of tailored interventions. Blood- and eye-based biomarkers show promise as low-cost, scalable and patient-friendly tools for early AD detection given their ability to provide information on AD pathophysiological changes and manifestations in the retina, respectively. Eye clinics provide an intriguing real-world proof-of-concept setting to evaluate the performance of these potential AD screening tools given the intricate connections between the eye and brain, presumed enrichment for AD pathology in the aging population with eye disorders, and the potential for an accelerated diagnostic pathway for under-recognized patient groups.

Methods The BeyeOMARKER study is a prospective, observational, longitudinal cohort study aiming to include individuals visiting an eye-clinic. Inclusion criteria entail being \geq 50 years old and having no prior dementia diagnosis. Excluded eye-conditions include traumatic insults, superficial inflammation, and conditions in surrounding structures of the eye that are not engaged in vision. The BeyeOMARKER cohort (n = 700) will undergo blood collection to assess plasma p-tau217 levels and a brief cognitive screening at the eye clinic. All participants will subsequently be invited for annual longitudinal follow-up including remotely administered cognitive screening and questionnaires. The BeyeOMARKER + cohort (n = 150), consisting of 100 plasma p-tau217 positive participants and 50 matched negative controls selected from the BeyeOMARKER cohort, will additionally undergo A β -PET and tau-PET, MRI, retinal imaging including hyperspectral imaging (primary), widefield imaging, optical coherence tomography (OCT) and OCT-Angiography (secondary), and cognitive and cortical vision assessments.

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Results We aim to implement the current protocol between April 2024 until March 2027. Primary outcomes include the performance of plasma p-tau217 and hyperspectral retinal imaging to detect AD pathology (using Aβ- and tau-PET visual read as reference standard) and to detect cognitive decline. Initial follow-up is ~ 2 years but may be extended with additional funding.

Conclusions We envision that the BeyeOMARKER study will demonstrate the feasibility of early AD detection based on blood- and eye-based biomarkers in alternative screening settings, and will improve our understanding of the eye-brain connection.

Trial registration The BeyeOMARKER study (Eudamed CIV ID: CIV-NL-23–09-044086; registration date: 19th of March 2024) is approved by the ethical review board of the Amsterdam UMC.

Keywords Alzheimer's disease, Screening, Blood-based biomarkers, Plasma p-tau, Hyperspectral retinal imaging, Retinal imaging, Eye clinic, Visual impairment, Age-related eye disorder

Background

The hallmark pathophysiological processes of Alzheimer's disease (AD; i.e., amyloid β [A β] plaques and neurofibrillary tau tangles) may emerge 20-30 years prior to the onset of dementia, and the earliest incipient symptoms often go unnoticed by patients and their caregivers [1-3]. Early AD, prior to extensive atrophy and cognitive impairment, is the optimal window for intervention and may be essential to achieve the most beneficial long-term outcomes [4-6]. This notion has led to a paradigm shift towards a focus on early biomarker-confirmed diagnosis and biological staging of AD [1], which is further fueled by the first regulatory approvals of monoclonal antibodies against A β [7, 8] and by clinical trial results that have hinted towards more beneficial outcomes in the early, pre-symptomatic stages of AD [9]. These developments are major advances in the field but also emphasize longstanding challenges concerning the rising demand for large-scale accessibility of early AD detection to facilitate early intervention [10]. The current diagnostic process in memory clinics is inadequate to accommodate large-scale early detection of AD pathology due to the reliance on expensive and invasive procedures (i.e., a lumbar puncture or Positron Emission Tomography [PET]) [1, 3]. Furthermore, PET and cerebrospinal fluid (CSF) biomarkers are only clinically approved (e.g., European Commission [CE-marked] or US Food and Drug Administration [FDA] approved) to diagnose individuals at symptomatic stages of AD and are only accessible in highly specialized clinics that are mainly situated in highincome countries. To prepare for a future wherein disease-modifying treatment may become widely available, there is a need towards building an efficient and inclusive infrastructure to detect individuals at risk of AD. This will require low-cost, patient-friendly and scalable biomarkers for AD that are also suitable for implementation outside of a specialized memory clinic setting, such as blood-based and eye-based biomarkers [11]. Bloodbased biomarkers for AD have advanced rapidly and hold promise for future real-world clinical implementation to detect AD pathophysiology [12, 13]. Eye-based biomarkers derived from retinal imaging are emerging to screen for AD-associated structural changes and A β - or taurelated lesions, which may be of particular relevance in ophthalmological settings [14–16]. The BeyeOMARKER study aims to evaluate the real-world implementation of blood-based biomarkers, and the potential (additional) value of eye-based biomarkers, to screen for AD pathophysiology in eye-clinics. In this design paper, we provide a rationale for early detection of AD in eye clinics, present the BeyeOMARKER study design and population, and elaborate on several aspects of the study including ethical considerations, potential challenges, and future opportunities.

Rationale

Based on previous epidemiological and pathophysiological evidence, eye clinics provide a prime opportunity to investigate the feasibility of blood- and eye-based biomarkers to detect early AD. From an epidemiological perspective, eye clinics are known for a high-throughput of patients within the typical age-range when AD pathological changes first manifest, highlighted by the overlap in age-of-onset (i.e., >50 years of age) for acquired eye-disorders [17–19] and AD [1, 20–26]. Moreover, epidemiological investigations indicate that eye patients may be at increased risk for dementia and AD [27-35] (Table 1). These associations are reported for glaucoma, age-related macular degeneration, diabetic retinopathy, cataract, and for vision impairment as a whole. Possible mechanisms underlying this increased risk may differ per eye condition, and could be related to embryological, anatomical, physiological and functional connections between the eyes and the brain. Through these intricate connections, diseases affecting the brain may affect the eye and vice versa [36, 37]. Indeed, ocular manifestations of AD are myriad and include the retinal presence of AD pathology, neurodegenerative changes and vascular

Table 1 Epidemiological eye-brain connections

Epidemiological eye-brain connections

Accumulating evidence suggests an association between eye diseases and visual impairment with (AD) dementia. Results for specific eye disease are mixed and effect sizes vary considerably, possibly due to different definitions for eye diseases and visual impairment (e.g. subjective and objective), different criteria for AD (e.g. not always biomarker-confirmed) and cohort differences (e.g. age and presence of comorbidities). Reported association include:

• Co-existence of eye disease and cognitive impairment: In a systematic review and meta-analysis across 57 studies, the estimated co-existence between eye disease and cognitive impairment varied but was estimated to be 8.4–52.4%, 12.3–90.2% and 3.9–77.8% for AMD, glaucoma and DR patients, respectively [27].

• Eye disease as risk factor: In a first meta-analysis, increased risk on AD was reported for DR (HR = 1.29 [95%Cl: 1.03-1.61]) and cataract (HR = 1.26, [1.07-1.48]) but not for AMD and glaucoma [28]. In contrast, subsequent meta-analyses did report associations for AMD and glaucoma. The first reported an association between AMD and AD (HR = 1.21 [1.03-1.43]) and observed that the association was stronger in dry AMD than wet AMD [172]. The second reported an association between AD and glaucoma (HR = 1.39 [1.35-1.43]) particularly at older age, which applied specifically to primary open-angle glaucoma (HR = 1.31 [1.27-1.36]) and normal-tension glaucoma (HR = 1.28 [1.20-1.36]), but not primary narrow angle glaucoma [173].

• Visual impairment as risk factor: Visual impairment has been consistently associated with an increased risk on dementia [34] and this association appears stronger with increasing levels of visual impairment severity [29, 30]. For specifically AD, an association for at least mild visual impairment compared to no visual impairment (RR = 1.47 [95%CI: 1.43–1.50]) has been reported across two studies but this evidence is more sparse [28].

Abbreviations: AD Alzheimer's disease, AMD Age-related macular degeneration, DR Diabetic retinopathy, HR Hazard ratio, RR Risk ratio, CI Confidence interval

changes [15, 16, 37-41] (Table 2). Various hypotheses have been postulated to explain the association between eve disorders and AD, such as shared (genetic) risk factors, the common-cause hypothesis, or the sensory deprivation and information degradation hypotheses [29, 34, 42-48] (Table 3). For example, glaucoma and age-related macular degeneration are neurodegenerative diseases of the eye that share pathological features with AD, such as the presence of $A\beta$ - and tau deposits and inflammatory and neurodegenerative processes [49-51]. For cataract on the other hand, alternative reversible cognitive or psychosocial processes may be involved given that cataract extraction appears to reverse dementia risk [52, 53]. Taking together these close connections between the eyes and the brain, the eye is considered an accessible 'window to the brain' and eye-based biomarkers have potential as a prognostic tool to identify risk of cognitive impairment due to neurodegenerative disease [15, 36, 37, 39]. Moreover, vison impairment represents an established modifiable risk factor (population attributable fraction 1.8% [54]) and early and effective treatment of eye disorder may hence lower the odds of developing dementia [55, 54, 56].

Another highly relevant factor contributing to the suitability of eye clinics as a screening setting for AD is related to the potential for an accelerated diagnostic pathway for currently under-recognized or underserved patient groups. First, individuals with an eye disorder represent a large portion of the aging population (e.g. prevalence of mild and moderate/severe visual impairment in individuals \geq 50 years is estimated to be 7.7% and 11.2%, respectively [57]), and they appear to be disproportionately affected by AD [28–31]. This group

 Table 2
 Pathophysiological eye-brain connections

Pathophysiological eye-brain connections

The eyes are described as 'window to the brain' based on many commonalities:

• Embryological: The retina and the brain both originate from the diencephalon during embryonic development and remain structurally and functionally connected throughout life.

• Anatomical: Both the retina and the brain are characterized by presence of a layered cytological structure, containing similarly structured neurons and axons, and a similar (micro)vascular structure that includes presence of a blood-retina/brain barrier,

• Physiological: The retina and the brain share multiple physiological processes, including neural processing, myelination by oligodendrocytes, and degenerative and regenerative processes.

Based on these commonalities, diseases affecting the brain can be expected to affect the eye and *vice versa* [36]. Indeed, ocular manifestations of AD are myriad and include retinal presence of AD pathology, neurodegeneration and changes in vasculature. Retinal AD pathology includes presence of amyloid peptides and plaques, vascular amyloid depositions, and tau pathology [42, 174, 175] which correlate with AD pathology burden in the brain and general cognition [42, 175]. For retinal neurodegenerative and vascular changes, the most extensively reviewed parameters are derived from OCT (e.g. retinal thinning and loss of retinal ganglion cells) and OCT-A (e.g. vessel density and tortuosity). These parameters generally differ between AD patients versus controls and correlate with cognition [14–16, 37–39]. Though the discriminative specificity for AD for single OCT and OCT-A parameters is debated, the retina can be imaged using a diverse array of non-invasive techniques, thereby providing access to a wide range of biomarkers that can serve as biomarkers to predict pathology in the brain.

Abbreviations: AD Alzheimer's disease, OCT Optical Coherence Tomography, OCT-A OCT-Angiography

Table 3 Hypothesized explanations for the eye-brain connection

Hypothesized explanations for the eye-brain connection

The exact mechanisms linking eye disease and sensory deficits with Alzheimer's disease are yet to be elucidated, but could involve (a combination of) the following hypotheses [47, 48, 58, 59, 176]:

• Common cause hypothesis: Both visual and cognitive impairment are a result of a shared (possibly age-related, vascular or inflammatory) pathological mechanisms that affect both the eyes and the brain.

• Shared risk factors: Risk factors including age, smoking, diabetes, obesity, lower socio-economic status and vascular risk factors could (independently) lead to both eye and brain disorders.

• Sensory deprivation hypothesis: visual impairment leads to reduced visual stimulation of cortical vision areas, resulting in atrophy and reorganization. These physical changes in turn affect cognitive processing and performance.

• Information degradation hypothesis: Impaired vision leads to degraded visual input which results in perceptual processing errors and increases the cognitive load required to adequately perform visual tasks. As more cognitive resources are allocated to perception, higher-order cognitive processes may be compromised.

• **Consequences of visual impairment are a risk factor:** The connection between visual impairment and cognition could be mediated by an association between visual impairment and social isolation, decreased physical activity and depression.

• Detection bias: Alternatively, use of vision-dependent neuropsychological testing could lead to underperformance in individuals who have a visual impairment, leading to cognitive test bias affecting the relation between visual impairment and cognitive impairment.

experiences particular diagnostic challenges and underrepresentation in clinical research and trials due to accessibility issues (e.g., difficulties in traveling) and confounding of visually-mediated neuropsychological assessment [58–62]. Second, individuals with a low income, relatively low education attainment and a minority status are known to be disproportionally affected by AD [63–65]. These individuals typically experience difficulties in cognitive testing due to cultural bias and/or language barriers [66] and are currently underrepresented in memory clinic populations [67] and in clinical trial samples [62, 68]. Eye clinics provide an alternative route to connect with individuals who are otherwise unlikely to seek help if they experience cognitive complaints, for example due to dementia-related stigma or lack of awareness in some diverse communities [69]. Third, individuals with an atypical clinical presentation of AD generally experience significant morbidity and impact on daily life, but are diagnosed relatively late due to their atypical (non-amnestic) clinical presentation and overrepresentation in younger-onset AD [70–72]. Of particular interest in the eye clinic are individuals suffering from posterior cortical atrophy (PCA), also referred to as the visualvariant AD. PCA is characterized by early and prominent impairment in visual perception or visuospatial processing accompanied by pathology and atrophy that disproportionally affects the visual and visual association cortices [73, 74]. These individuals may present at the eye clinic due to their visual impairments but, as the cause is rooted in the brain rather than the eye, the complaints often remain unexplained by an ophthalmologist [72, 75, 76]. These factors may contribute to the long interval of on average 3.8 years between symptom onset and a formal PCA diagnosis [74]. Shortening this interval is essential to provide these patients with more equal access to patient management and to move towards clinical trial opportunities [75]. For all of the aforementioned individuals, eye clinics may provide an accelerated diagnostic pathway where the use of a biological (rather than cognitive) marker for AD could mitigate cognitive test(ing) bias, and the use of patient-friendly tools may reduce barriers to participation in research [77, 78]. By exploring the potential for AD detection in diverse and alternative setting, the BeyeOMARKER study aims to contribute to a more inclusive healthcare system.

Screening biomarkers in the BeyeOMARKER study

The main biomarkers of interest for the BeyeOMARKER study are the blood-based plasma phosphorylated tau (p-tau217) biomarker and eye-based hyperspectral (HS) retinal scans.

Blood-biomarker measurement: plasma p-tau217

Blood-based biomarkers have seen a rapid rise to prominence as minimally invasive tools to detect AD pathology [12]. Emerging blood-based biomarkers for AD include markers for the hallmark pathologies (p-tau isoforms and $A\beta$) and markers of axonal degeneration (neurofilament light; NfL) or astrocytosis (glial fibrillary acidic protein; GFAP [12]). Since future high-throughput analysis of blood-based AD biomarkers will require the use of standardized and commercially available assays [12], we will screen participants based on the commercially available Quanterix single-molecule array (Simoa) for plasma p-tau217. Several p-tau isoforms exhibit high analytical and clinical performance [79–86], are specific to AD [87], and have adequate predictive value for atrophy and cognitive measures [82, 83, 88-90]. However, p-tau217 appears to be most accurate in detecting the earliest AD

pathological changes [91-95] and correlates strongly with postmortem A β plaques and tau tangle load [93].

Eye-based screening: hyperspectral retinal scanning

Eye-based biomarkers have gained attention over the years within the field of neurodegenerative diseases since the retina shares many characteristics with the brain [96] (Table 2). Moreover, it is the only part of the central nervous system that is not shielded by bone which makes non-invasive and high-resolution imaging relatively easy. In the BeyeOMARKER study, a subset of participants will undergo retinal scanning including a HS retinal scan developed by Optina Diagnostics (Canada). Standard retinal imaging techniques provide spatial information and have been used to show vascular and neurodegenerative changes in AD [14-16, 37-39]. HS retinal imaging additionally incorporates reflective properties of the retina in response to monochromatic light waves, and thereby produces retinal images containing both spectral and spatial information [97]. Retinal spectral differences (i.e., differences in reflection in response to certain wavelengths) have been detected between control and AD mouse models that accumulate amyloid, both *in vivo* [98, 99] and ex vivo [100, 101]. The data-rich retinal images provided by the HS retinal scan were used to train an artificial intelligence (AI) algorithm to detect retinal features associated with AD. This AI paradigm has demonstrated good discriminative ability between amyloid negative and amyloid positive individuals [97, 98, 102-104], as well as between clinically diagnosed AD cases versus cognitively unimpaired participants [105]. These earlier preliminary findings using HS retinal imaging highlight the potential of this biomarker in a prospective screening setting.

Knowledge gaps

Despite the promising performance of blood- and eyebased biomarkers for AD, several aspects remain to be evaluated to ascertain their (potentially complementary) utility as early AD screening tools outside specialized memory clinics. First, clinical performance studies on blood-based biomarkers to date have included relatively homogeneous samples with high diagnostic certainty, were mostly retrospective in design, and did not use a priori defined cut-offs [13]. These study design aspects could have favored biomarker performance and hamper generalizability to many real-world clinical settings. Similarly, validation studies of HS retinal imaging against Aβ-PET have only been performed in selected populations without eye conditions and with a high diagnostic certainty for AD [15, 97, 98, 102-104, 106]. Secondly, the clinical value of blood- and eye-based biomarkers has been studied separately but they have not yet been examined as potentially complementary markers in a combined prediction model. We hypothesize that combining these biomarkers into an integrative or step-wise model will provide complementary or even additive diagnostic and prognostic value for AD since plasma p-tau217 allows highly specific detection of a hallmark of AD pathology whereas the (HS) retinal scans also allow minimally invasive visualization of a multitude of neurodegenerative, inflammatory, vascular, and AD-related pathological changes that are reflective of changes in the brain [10, 13, 14, 107]. Of note, the efficacy of AD screening in an eye clinic population also partially relies on whether this population is indeed enriched for AD pathology. Although individuals with an eye disorder are at increased risk for (AD) dementia [28-34], risk estimates vary, and a precise prevalence estimate for AD biomarker positivity within the eye clinic population is currently lacking.

Study objectives

The primary aim of the BeyeOMARKER study is to evaluate and compare the performance of plasma p-tau217 and HS retinal scans to predict AD pathophysiology and cognitive decline (1). In addition, we envision that the BeyeOMARKER will provide a multimodal dataset for a diverse sample of patients visiting the eye clinic to secondarily (2) assess the individual and complementary clinical predictive value of other blood- and eye-based biomarkers, (3) explore the potential mechanisms contributing to the link between AD and conditions in the visual system, and (4) investigate enrichment for AD in an eye clinic population. The specific aims and their corresponding endpoints are also listed in Table 4 and visualized in Fig. 1. Findings of the BeyeOMARKER could ultimately aid in providing a roadmap for future studies on minimally invasive early detection of AD in alternative diagnostic settings.

Methods

Study design

The BeyeOMARKER study is a single-center prospective, observational, longitudinal cohort study aiming to include individuals from a clinic for comprehensive eye-care who have no prior dementia diagnosis and are \geq 50 years of age. As illustrated in Fig. 2, the BeyeO-MARKER study comprises an initial screening phase, including the plasma p-tau217 assessment, followed by two longitudinal arms for subsequent follow-up. All BeyeOMARKER participants (prospected *n*=700) will be followed-up remotely at T1 (9–12 months after screening) and T2 (9–12 months after T1). This will include online questionnaires and a web-based cognitive test (cCOG; [108]) partly in collaboration with the online ABOARD ("A Personalized Medicine Approach

Table 4 Objectives and endpoints of the BeyeOMARKER study

	Objectives of the BeyeOMARKER study	Corresponding endpoints
Primary	1. Evaluate and compare the performance of plasma p-tau217 and HS retinal scans to predict AD pathophysiology and cognitive decline	Accuracy of plasma p-tau217 and HS retinal scanning to detect 1) AD pathophysiology based on Aβ-PET and tau-PET visual read, and 2) clinical decline based on cognition (mPACC5)
Secondary	2. Assess the individual and complementary clinical predic- tive value of other blood- and eye-based biomarkers	Associations between blood-based biomarkers and eye-based biomarkers with down-stream effects of AD (e.g. atrophy, cognition and cortical vision)
	3. Explore the potential mechanisms contributing to the link between AD and the conditions of the visual system	Group-comparisons of neurobiological and cognitive manifesta- tions in the BeyeOMARKER cohort versus a traditional memory clinic cohort, including suspected and confirmed PCA patients
	4. Investigate enrichment for AD in an eye clinic population	The observed prevalence of AD biomarker positivity in an eye clinic population compared to a modeled prevalence estimate for the general population

Abbreviations: p-tau Phosphorylated tau, HS Hyperspectral, mPACC5 Modified preclinical Alzheimer cognitive composite 5, AD Alzheimer's Disease, Aβ Amyloid beta, PET Positron Emission Tomography, PCA Posterior Cortical Atrophy

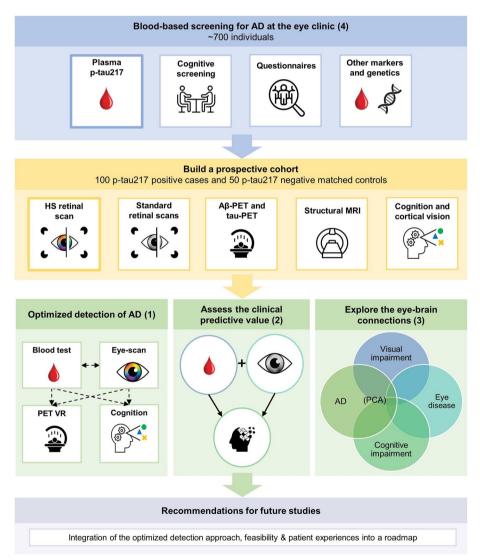


Fig. 1 BeyeOMARKER study aims. Abbreviations: AD = Alzheimer's Disease, PET = Position Emission Tomography, MRI = magnetic resonance imaging, $A\beta = Amyloid beta$, PCA = Posterior Cortical Atrophy

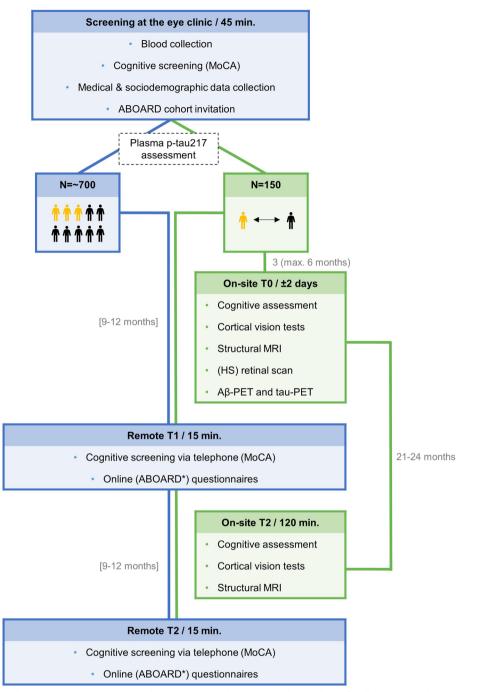


Fig. 2 Study design including study visits, study procedures, time-intervals and the study population for all participants (blue route) and the BeyeOMARKER + cohort (green route). *Abbreviations*: MoCA = Montreal Cognitive Assessment, MRI = magnetic resonance imaging, HS = hyperspectral, ABOARD = A Personalized Medicine Approach for Alzheimer's Disease cohort study, yellow and black individuals represent the estimated plasma p-tau217 positive and negative individuals, respectively. *only applicable if the required optional consent has been provided

for Alzheimer's Disease") platform [109], and cognitive screening via telephone (Fig. 2, blue route). In addition, from the full BeyeOMARKER cohort a BeyeO-MARKER+subcohort will be recruited, which will consist of 100 plasma p-tau217 positive individuals and 50 plasma p-tau217 negative individuals matched on age, sex and eye condition. The BeyeOMARKER+cohort (n=150) will be invited to the Amsterdam UMC for assessment at T0 (±3 months and maximum 6 months after screening) and T2 (21–24 months after T0).

Assessment at T0 includes standard and HS retinal imaging, structural MRI, A β -PET, tau-PET, and a cognitive and cortical vision test battery. Assessment at T2 includes a follow-up MRI and cognitive and cortical vision assessment (Fig. 2, green route). Outcomes available for the BeyeOMARKER and BeyeOMARKER + cohort are listed in Table S2 and will be described in further detail below. Additional funding will be sought to allow extended follow-up and repeated assessments.

Targeted sample size

A conservative estimate of the prevalence of plasma p-tau217 positivity in cognitively unimpaired subjects between 65 to 69 years of age is 17.0% based on the lower bound of the 95%-confidence interval derived from a large meta-analysis on amyloid abnormality across the AD spectrum [110]. We estimated the plasma p-tau217 prevalence based on amyloid-based estimates since the two are strongly related to each other [111]. Based on an open access sample size calculator for prevalence studies [112], we subsequently estimated a required screening sample size of n = 700 (prevalence = 17.0%, level of confidence (Z) = 95%, precision estimate (D) = 3.0%, expected attrition rate = 10%). Given the expected prevalence of amyloid positivity (i.e., 17.0%), the screening sample of 700 subjects is expected to be sufficient to identify 100 p-tau217 positive cases for the BeyeOMARKER+cohort, and to determine a reliable prevalence estimate of AD pathology in our eye-clinic population.

Participants

Participants will be recruited from a clinic for comprehensive eye-care (i.e., Bergman clinics) located in an area of Amsterdam known for its socio-culturally and socioeconomically diverse population. To be eligible to participate, a subject 1) must be \geq 50 years of age, and 2) did not receive a formal dementia diagnosis. Individuals visiting the eye clinic based on solely the following reasons are excluded from participation: 1) a traumatic insult, 2) a superficial inflammatory eye disease, and 3) a condition in a structure surrounding the eye that is not directly involved in visual processing (e.g. the tear-ducts and eye muscles). Individuals who are eligible and express their interest in the BeyeOMARKER study will receive written and oral information and are invited to the eye clinic for informed consent procedures and a screening visit at the Bergman eye-clinic after the mandatory consideration time (i.e., one week after receiving the participant information form).

For enrolment in the BeyeOMARKER+cohort, results of the plasma p-tau217 measurement will be prospectively evaluated based on an *a priori* defined cut-off for plasma p-tau217 positivity, established in

a large independent data-set of patients and controls from the Amsterdam Dementia Cohort [113]. Subsequently, all p-tau217 positive participants (n=100)and a group of matched p-tau217 negative controls (ratio 2:1, n=50) will be selected to be included in the BeyeOMARKER+cohort (n=150). Matching will be based on age, sex and eye condition categorized into 1) anterior eye conditions, 2) posterior eye conditions, 3) refractive errors, and 4) unexplained visual impairment to allow identification of individuals with suspected PCA(Table S1). Selected participants who are eligible (e.g., based on safety criteria described in Text S1) to participate will receive additional written and oral information on the BeyeOMARKER+study and will be invited to the Amsterdam UMC (location VUmc) for informed consent procedures and additional assessments after the mandatory consideration time.

Base clinical dataset for all BeyeOMARKER participants Pre-specified blood-based AD biomarkers: screening for AD pathology

For each participant, at least one EDTA blood tube (6 mL) is collected. This will primarily be used for evaluating the plasma p-tau217 level and secondarily for assessing the levels of plasma A β 40, A β 42, GFAP, and NfL using the N4PE (Neurology 4-Plex E) assay [114]. The complete panel of plasma p-tau217, A β 40, A β 42, GFAP and NfL has demonstrated diagnostic and prognostic performance for AD and neurodegenerative diseases, and their combined use has the potential to further improve the diagnostic and prognostic performance of blood tests [12, 115–117]. Both assays will be performed using the Simoa HD-X automated platform in line with standard lab procedures and in accordance with pre-analytical handling recommendations [114].

Future blood-biomarkers and genetic analyses: the BeyeOMARKER biobank

For participants who provide consent for the BeyeO-MARKER biobank, three additional 6 mL EDTA blood tubes will be collected for storage of plasma and wholeblood in the BeyeOMARKER biobank. This will serve to conduct future genetic and biomarker research into (risk factors for) AD and dementia, for instance by investigating newly emerging plasma biomarkers and by exploring genetic risk modifiers. For example, APOE4 carriership is a known genetic risk factor for AD but findings related to the visual system have been counterintuitive. First, compared to amnestic AD, the prevalence of APOE4carriership is lower in visual-variant AD and associations appear weaker [74, 118]. Second, even though eye diseases like age-related macular degeneration [50, 119] and glaucoma [120, 121] are associated with increased AD risk, APOE4-carriership appears a protective factor for these eye conditions. The BeyeOMARKER biobank will enable a rapid response to developments in the field to further optimize biomarker-based diagnostic algorithms, and may provide more insight into genetic risk factors for AD and conditions of the visual system.

Sociodemographic and medical data collection

The collection of sociodemographic information serves to evaluate how representative our study sample is to the general population, and to investigate whether there are group-differences associated with sociodemographic factors that call for stratification and/or tailored interpretation of AD risk-estimates. Variables include sex, age, marital status, socio-economic status (SES), country of birth (age of immigration, if applicable) and country of birth of the parents and ancestors. Collection of country of birth is based on the updated guidelines provided by the Dutch central bureau of statistics (CBS) in 2022 [122]. SES is based on overall SES of the resident living community (information provided by the CBS), educational attainment [123, 124] and occupational attainment [125].

General and ophthalmological medical history will be collected to evaluate their associations with biomarker measurements and to investigate shared risk factors and pathological features between eye-disease and dementia. General medical history includes current diagnoses, medication use, relevant family history, and an assessment of cardiovascular risk factors (e.g. length and weight for body mass index, smoking, alcohol use, diabetes, blood pressure, treatment status [126]). Ophthalmological medical history includes presence of eye disorders, ophthalmological interventions and self-reported (functional) visual impairment with use of visual aids based on the Dutch EyeQ itembank [127].

Repeated cognitive screening and questionnaires

Cognitive screening will be performed using the Dutch or English version of the Montreal Cognitive Assessment (MoCA) standard or MoCA blind. The MoCA is a validated tool to screen for cognitive impairment and covers all cognitive domains (visuospatial function, executive function, language, memory and attention/processing speed [128]). The MoCA blind [129, 130] is similar to the standard MoCA but leaves out the vision-dependent subtasks making it suitable to administer to visually impaired participants. The MoCA blind also allows annual remote cognitive screening via telephone, which will be combined with online follow-up questionnaires to track medical and ophthalmological changes. Additional questionnaires including patient-centered outcomes (e.g. health, mobility, work-status, social environment and use of healthcare) and a web-based cognitive test (cCOG; [108]) can be incorporated from the ABOARD platform [109].

Extended clinical dataset for the BeyeOMARKER + cohort (Hyperspectral) Retinal imaging

In the current study, HS retinal imaging will be performed using the Optina Mydriatic Hyperspectral Retinal Camera (MHRC). Unlike conventional retinal cameras, the Optina MHRC contains an integrated light source that emits monochromatic light of different wavelengths onto the retinal surface. The camera images a 31° fieldof-view of the retina and acquires 92 retinal images for successive monochromatic wavelengths in one second (5 nm increments across a visible to near-infrared spectral range of 450-905 nm). This way, a HS retinal scan provides a stack of monochromatic images containing both spatial and spectral information (i.e., each spatial locus has an associated reflectance across wavelengths). Parameters from these data-rich retinal images have been correlated to amyloid status (positive or negative) to build a 'Retinal Deep Phenotyping' model. This model incorporates phenotypic features that provides a probability of amyloid positivity [97, 98, 102-104]. Optina's existing model will be used to predict the A β -PET and Tau-PET status of BeyeOMARKER participants.

Other imaging modalities that have been extensively reviewed [15, 16, 37-39] and are in line with a recommended minimum data set framework provided by experts in neuroscience, neurology, optometry and ophthalmology [16] are optical coherence tomography (OCT; Heidelberg spectralis), OCT-A (OCT-angiography; Zeiss plex elite 9000), and (blue autofluorescence) widefield fundus imaging (Optos). OCT provides structural information, such as the thickness of the retinal layers at the macular region and at the optic disc. The OCT-A yields vascular parameters, such as vessel density in the macular area and around the optical nerve head. In addition, a widefield fundus photo allows visualization of the far periphery of the retina (i.e., 200 degrees or 80% of the retinal surface), which has been shown to contain significant AD pathology as well [42]. Finally, blue autofluorescence imaging adds information on fluorescent properties of pigments in the retina, which is informative for various retinal disorders (e.g. age related macular degeneration, macular dystrophies) and potentially AD-related pathological changes [15, 131, 132]. Altogether, these imaging techniques could provide more insight into the eye-brain connection and in which of the parameters provided by a HS retinal scan contribute (the most) to the classification of AD biomarker status, particularly since HS imaging specifically for AD detection purposes has been validated in populations without eye conditions.

To ensure retinal image quality, participants first undergo pupil mydriasis achieved by administration of Tropicamide 0.5% drops into both eyes according to standard procedure ophthalmological clinical practice. If one eye is not suitable for retinal imaging, pupil mydriasis and subsequent scanning is performed on a single eye.

Structural MRI

Structural MRI will be performed to assess associations with our primary screening biomarkers (plasma p-tau217 and HS retinal scans) and to gain a deeper understanding of the interplay between conditions of the visual system, AD pathology and the down-stream effects of pathology (e.g. atrophy and white matter damage). Images are acquired on a 3T MR scanner at the Amsterdam UMC (location VUmc). To minimize participant burden we only include the following standard sequences: sagittal 3D T1, axial T2, Axial Susceptibility Weighted Image (SWI), Axial Diffusion Weighted Image (DWI) and Sagittal 3D Fluid-attenuated inversion recovery (FLAIR). These sequences are part of the standard diagnostic protocol for dementia at the Amsterdam UMC and provide neurodegenerative markers including cortical thickness, grey matter volume, white matter volume, and cerebrovascular outcomes such as white matter hyperintensities, lacunes and microbleeds.

Aβ-PET and tau-PET visual read and quantification

Aβ-PET and tau-PET are a validated reference standard to evaluate novel AD biomarkers [13]. Abnormality on both Aβ-PET and tau-PET is strongly associated with short-term subsequent cognitive decline [133] and, beyond binary classification, PET allows valuable insight into the extent and regional distribution of pathology [134, 135]. PET scans will be performed on a Siemens Whole-Body PET-CT-scanner (Biograph Vision Quadra) as this scanner provides excellent imaging results at lower tracer dosages. For the Aβ-PET scan acquisition, participants receive a single intravenous bolus injection of approximately 140 MBq [¹⁸F]florbetapir and undergo a static scan from 50 until 70 min post-injection. For the tau-PET scan, participants receive a single intravenous bolus of approximately 140 MBq [18F]flortaucipir and undergo a static scan from 80 until 100 min post-injection. Scanning procedures also include acquisition of a low-dose Computerized Tomography (CT) scan prior to the PET scan for attenuation and motion correction. After PET scan acquisition, the scans will be reconstructed into 4×5-min frames, corrected for movement when necessary, co-registered to the corresponding T1 MR image, and reoriented to remove head tilt. Visual reads will then be performed in correspondence with company guidelines for [¹⁸F]florbetapir (Amyvid) and [¹⁸F]flortaucipir (Tauvid) [136, 137]. Furthermore, semiquantification will be performed by calculating standardized uptake value ratios (SUVR) to address our secondary study objectives [137–145].

Cognitive and cortical vision assessment

Cognitive and cortical vision assessment will be performed to assess the clinical effects of AD pathophysiological changes, to assess clinical trajectories in the BeyeOMARKER cohort and to the determine the presence of suspected PCA based on positive AD biomarkers and adherence to clinical criteria for PCA (i.e., based on cognitive and cortical vision tests) [73].

The comprehensive cognitive test battery (Table S3) covers all cognitive domains based on vision-dependent as well as non-vision-dependent tasks (with exception of the visuospatial domain, which includes the Visual Object and Space Perception Battery [VOSP] and is inherently vision dependent). Of note, given the expected cultural and educational diversity of the study population, a short 20-item version of the Naming Assessment in Multicultural Europa (NAME) task will be administered [146], which is less culture- and education-dependent compared to other naming tasks. Furthermore, most tasks are suitable administer and execute in English when appropriate (e.g., Rey-complex figure, digit-span task, trail making task, and the VOSP). Additional cortical vision tests (Table S4) will cover all basic visual perception and visual spatial processing domains based on tasks from the Cortical Vision Screening Test (CORVIST) and the selfreport Colorado screening questionnaire for posterior cortical symptoms [147] as recommended by the Atypical AD Professional Interest Area of the Alzheimer's association [148].

Outcome measures

The performance of plasma p-tau217 and AI-based Aβ-status classification from the HS retinal scan will be evaluated for detecting AD pathophysiology and cognitive decline. First, it is essential to evaluate novel AD biomarkers against an extensively validated reference standard like PET [13]. Therefore, the primary pathophysiological outcome of interest is the visual read of the A β -PET and tau-PET scan to determine positivity for AD biomarkers. Visual examination will be performed by by a trained nuclear medicine physician in accordance with the company guidelines for [¹⁸F]florbetapir (Amyvid) and ^{[18}F]flortaucipir (Tauvid) [136, 137]. Second, the primary clinical outcome of interest is change on the modified preclinical Alzheimer cognitive composite 5 (mPACC5 [133, 149]) across a 21–24 month interval (i.e., timepoint T0 to T2). For the BeyeOMARKER study, the mPACC5 will be compiled as a vision-independent composite of the Rey Auditory verbal Learning test delayed recall (episodic memory), digit-span backward (executive function), animal fluency (semantic memory) and the MoCA blind (global cognition).

Statistics

Statistical analyses will be performed using R studio. First, the performance of plasma p-tau217 and AI-based Aβ-status classification from the HS retinal scan will be determined based on logistic regression and Receiver operating characteristic (ROC) analysis for 1) presence of AD pathophysiology defined as a positive Aβ-PET and/or tau-PET visual read and 2) clinical decline defined as ≤ -1 versus > -1 standard deviation decline on the mPACC5). The logistic regression models will be performed including plasma p-tau217, the HS scan, and both methods combined to compare their performance to detect cognitive decline and AD pathophysiology. Models will be corrected for age and sex, and additionally for educational attainment when assessing cognitive outcomes. The ROC curve will be calculated using the predicted probabilities from the logistic regression models and sensitivity, specificity, accuracy, positive predictive value, negative predictive value and the Area Under the Curve (AUC) will be derived to assess the models' discriminative power. Appropriate tests will be used to compare the performance between biomarkers (e.g., the DeLong test to compare AUCs).

In secondary analyses (Table 4), general linear and nonlinear models will be explored to assess and compare the performance of p-tau217 and the retinal scan to predict down-stream effects of AD (e.g. MRI markers and cognitive and cortical vision outcomes). We will additionally compare MRI features and cognitive measures between the BeyeOMARKER cohort and an independent reference sample from the Amsterdam Dementia Cohort [113] to explore how comorbid eye-disease affects the neurobiological and clinical manifestations of AD. Since these outcomes may also be affected by other comorbid conditions (e.g. other neurological or psychiatric conditions), this will be evaluated in post-hoc assessments. Lastly, we aim to report the observed prevalence of plasma p-tau217 positivity in the BeyeOMARKER cohort and compare our findings with a memory clinic cohort and the general population, while also exploring the effect of demographic features (such as age, sex, SES and APOE genotype) using general linear models.

Ethical considerations

General ethical considerations

The BeyeOMARKER study will be conducted in accordance with the Medical Research Involving Human Subjects Act (WMO) and according to the principles of the World Medical Association (WMA) Declaration of Helsinki, version 64 WMA General Assembly, Fortaleza October 2013. The study will be conducted in compliance with the protocol Clinical Trials Regulation No 536/2014 and with the principles of good clinical practice (GCP). Data and human material will be handled confidentially and in agreement with the Dutch Act on Implementation of the General Data Protection (GDPR) (in Dutch: algemene verordening gegevensbescherming; AVG).

The study has been reviewed and approved by the Medical Ethics Committee from the Amsterdam UMC. Adequate time, a week at minimum, will be given for the subject to consider his or her decision to participate in the study. Consent procedures will clarify that consent can be withdrawn at any stage, and research participants can refuse participation in any of the BeyeOMARKER study procedures at any time without consequence. Optional consent will be obtained with regard to sharing of data for countries outside the European Union. Consent procedures make it clear that data protection is either at an adequate level of data protection based on article 45 of Regulation (EU) 2016/679 (Adequacy decisions (europa.eu) (e.g. for Canada) or will be at the best possible level of confidence when other standards apply (e.g. for the United States).

Ethical considerations around biomarker disclosure

For all personal data, BeyeOMARKER follows a non-disclosure policy, meaning that one's own personal data will never be automatically disclosed to the individual. However, participants may still learn their study results when the treating physician considers it clinically relevant and responsible to disclose a result or when legal requirements around personal data oblige the study to return personal data to the participant when this is requested.

A recent systematic review reported high interest in biomarker disclosure (72-81% for individuals involved in research and 50% in the general population) and no significant short-term psychological effects. Moreover, disclosure was generally considered actionable in terms of implementing lifestyle changes, seeking clinical trial participation and preparing for the future (e.g. financial, legal and living arrangements) [150]. However, the personal attitude towards biomarker disclosure and the consequent impact is highly personal and remains dependent on the clinical, personal and societal context. Furthermore, as the landscape around Alzheimer biomarkers and care will continue to change, so will the ethical considerations around biomarkers disclosure. In the BeyeO-MARKER study we aim to further minimize the risk of negative impacts. First, the BeyeOMARKER study is initiated by a specialized memory clinic with longstanding experience at the forefront of innovative biomarker

research, which has provided extensive experience with novel biomarker interpretation, disclosure and communication. Second, the BeyeOMARKER study implements a disclosure protocol in order to standardize procedures that ensure understanding and mitigate the impact of receiving information on one's own AD biomarker status. With these strategies in place, participants are supported in making informed decisions concerning their own biomarker data.

Results

The Medical Ethics Committee approved the BeyeO-MARKER study in March 2024. We aim to implement the current protocol between April 2024 and March 2027 and are intending to seek additional funding for extended annual follow-up. Primary outcomes include the performance of plasma p-tau217 and HS retinal scanning for 1) A β -PET and tau-PET visual read as reference standard, and 2) cognitive change (Table 4).

Discussion

The BeyeOMARKER study is a single-center prospective, observational, longitudinal cohort study that aims to evaluate both blood- and eye-based screening tools for early detection of AD in a cohort of patients from a clinic for comprehensive eye-care. First, the implementation of optimized multimodal screening outside of a specialized memory clinic setting has the potential to make early AD detection more accessible and cost-effective, thereby reducing the per-person cost for an AD diagnosis compared to existing tools [84]. This will aid in facilitating accessibility of early interventions that improve patientand caregiver wellbeing [4-6], which will in turn reduce long-term care costs [151, 152]. Second, the multimodal dataset in a unique study population of eye patients could increase our understanding of the eye-brain connection and provide new routes for early intervention, potentially even for both classes of disease (i.e., brain and eye disease). Recently, the population attributable fraction (PAF) of vision impairment of dementia was estimated to be 1.8%, meaning that a proportion of these dementia cases could have been prevented by appropriate management of eye disorders [54]. Despite this seemingly low percentage, vision impairment is deemed an important factor to consider in life-course models of potentially modifiable dementia risk factors [54] given that 9 out of 10 cases of vision impairment are preventable or treatable by relatively simple and cost-effective interventions (e.g. corrective lenses or cataract surgery). The observed co-existence of visual and cognitive impairment and the availability of effective, yet underused, ophthalmological interventions suggest an important interplay between ophthalmological and memory clinic practice that could allow relatively easily obtainable health and quality of life benefits [52, 153].

Complementary value of blood- and eye-based biomarkers Thus far, blood- and eye-biomarkers have not been applied in a combined multimodal screening approach. Hence, the (extent of) added value of applying these biomarker modalities in conjunction remains a key question to be addressed in the BeyeOMARKER study. Multimodal biomarker approaches for AD are gaining traction to improve AD detection, prognosis, and monitoring. After all, AD is a complex disease with many pathophysiological contributors and each modality has its own strengths and limitations in capturing different aspects and stages of AD-related pathophysiological changes [13, 14, 154, 155]. Currently, several blood tests allow detection of AD-pathology with high accuracy, including the core pathophysiological hallmarks, as well as neurodegenerative and inflammatory markers [12]. However, the interpretation of blood-based biomarkers may be affected by variability due to interindividual differences in general systemic metabolism, or comorbidities (e.g., obesity, chronic kidney disease, cardiovascular conditions) and/or sociodemographic factors (e.g., sex, diversity in race or ethnicity) that potentially affect metabolic rates [156, 157]. In contrast, retinal imaging provides an accessible way to directly visualize the retinal component of the CNS, thereby offering a direct insight into molecular changes (e.g., protein depositions) and structural changes (e.g., neurodegenerative and vascular changes) [14, 107]. Interindividual differences in, and dynamic changes of, systemic metabolism will less likely impact structural retinal imaging parameters compared to dynamic bloodbiomarker concentrations. However, retinal changes may occur in other (neurodegenerative) diseases and are less AD-specific [36, 39, 107] than markers of plasma p-tau. We therefore hypothesize that retinal markers should not be regarded as an alternative to blood-based biomarkers but rather that combining eye- and blood-based could have complementary value in detecting AD pathophysiology and cognitive decline.

Future opportunities

The characterization of the BeyeOMARKER cohort provides multiple avenues for future research beyond the objectives outlined in this report. First, the field of bloodbiomarkers is evolving rapidly and creating a biobank allows future assessment of novel and potentially better performing biomarkers. Secondly, questionnaires implemented in the online ABOARD platform [109] provides low burden collection of long-term functional outcomes in relation to AD(-related) blood-biomarkers or to eye disease and visual impairment. Third, multiple

opportunities exist for AI-based classification of HS retinal scans. For example, it is thus far unclear which of the myriad of parameters provided by a HS retinal scan contribute (the most) to the classification of AD biomarker status, and whether these parameters are directly reflective of amyloid pathology or of other pathological processes like iron accumulation, mitochondrial dysfunction, or inflammation [98, 158, 159]. Furthermore, retinal depositions of tau are observed in glaucoma [160] as well as in AD [161, 162] and a recent study suggests spectral signature related to retinal tau ex vivo [163]. Currently, the question remains whether AI-driven classification of data-rich HS images could provide retinal-indices that 1) relate to tau-PET status or to a combination of AB-PET and tau-PET status, and 2) remain specific to AD in cases with a simultaneous eye disease affecting the retina. These developments, alongside the rapid developments of novel blood-based biomarkers, may provide novel multimodal screening approaches for optimized prognostication. Fourth, implementation of PCA screening tasks may give an estimate on the number of patients that present at the eye clinic with cortical (rather than ocular) vision complaints, indicative of early PCA [164]. Depending on the sample size, this subgroup is highly suitable to examine the role ophthalmological practice in identifying potential PCA cases and to further characterize the first symptoms and progression of these early PCA cases. Other future ambitions include the implementation of additional longitudinal follow-up for blood-based and eye-based assessment to study the dynamics of these markers and to assess the predictive value of changes over time.

Challenges

Given the novelty and ambitious nature of the BeyeO-MARKER study design, a number of challenges are anticipated. First, although screening for cognitive complaints in eye care settings has been proposed before [34, 46], little is known about the willingness of patients to undergo screening, or of eye care professionals to perform this screening. Recent literature suggests that out of 210 participants from a senior center, 194 (92.4%) would want to know their dementia risk based on retinal scanning, particularly to be able to plan for the future [165]. A supportive attitude towards cognitive screening was also reported for audiology services, but training of the audiologist and sufficient explanation was deemed important [166]. The latter finding points out the general challenge regarding investment of time and staff resources, and the degree of willingness to make these investments is currently unknown among ophthalmologists. Secondly, the targeted sample size of 700 participants is ambitious, particularly in currently under-represented socio-culturally and socio-economically diverse populations where enrollment barriers are relatively high [62, 167, 168]. Recruitment will be continuously monitored, and our criteria and recruitment strategies may be adapted throughout the study when deemed necessary. Alternatively, the BeyeOMARKER project will continue as planned but with reduced sample sizes. Third, additional study procedures for the BeyeOMARKER+cohort can be experienced as relatively burdensome. Even though the procedures are standard clinical procedures with known and acceptable risks, in this part of the study we may encounter reduced willingness to participate [169]. Therefore, we aim to minimize study burden where possible by scheduling visits at a familiar location (i.e., the eye clinic), implementation of home-based online questionnaires, providing flexibility in scheduling, providing a clear and accessible point of contact and ensuring understanding of the relevance and burdens of study procedures. The latter may be particularly relevant for the PET scan procedures as this is a known study enrolment barrier, especially in some previously underrepresented groups [170]. Therefore, the study team will follow recommendations on the communication regarding PETscanning, such as efforts to improve understanding of the (minimal) risks of radiotracers by avoiding jargon, using visualization aids, providing understandable risk estimates and implementing active listening strategies [171]. Finally, challenges remain in cognitive assessment of participants with a visual impairment or culturally diverse background, particularly as the solutions can be counteracting. For example, tasks adapted for participants with a visual impairment are often more language-dependent, while tasks adapted to culturally and linguistically diverse populations are often more vision-dependent. Any potential language- or vision-dependent bias in cognitive testing will be documented and will be taken into account through sensitivity analyses when evaluating the clinical outcomes. We will report on our findings with regard to the performance of our clinical measures to inform future investigations.

Conclusions

The BeyeOMARKER study will provide a well-characterized cohort to 1) investigate the feasibility of early AD detection based on blood- and eye-based biomarkers in alternative screening settings, and 2) improve our understanding of the eye-brain connection. Findings, future opportunities, challenges and limitations of the BeyeO-MARKER study will be integrated into a roadmap for large-scale implementation of early AD detection, which will aid towards building an efficient and inclusive infrastructures to detect individuals at risk of AD and allow intervention to those who need it.

Abbreviations

Abbreviations		
ABOARD	A Personalized Medicine Approach for Alzheimer's Disease	
AD	Alzheimer's disease	
Αβ	Amyloid beta	
Al	Artificial Intelligence	
APOE	Apolipoprotein E	
CBS	Dutch central bureau of statistics	
CORVIST	Cortical Vision Screening Test	
EU	European Union	
GCP	Good Clinical Practice	
GDPR	General Data Protection (GDPR) (in Dutch: algemene verorden-	
	ing gegevensbescherming (AVG))	
HR	Hazard Ratio	
HS	Hyperspectral	
MHRC	Mydriatic Hyperspectral Retinal Camera	
MoCA	Montreal Cognitive Assessment	
MRI	Magnetic Resonance Imaging	
N4PE assay	Neurology 4-Plex E assay	
OCT	Optical coherence tomography	
OCT-A	OCT-Angiography	
PAF	Population Attributable Fraction	
PCA	Posterior Cortical Atrophy	
PET	Positron Emission Tomography	
p-tau	Phosphorylated tau	
RR	Relative Risk	
SES	Socioeconomic status	
Simoa	Single-molecule assay	
TMT	Trail Making Task	
VI	Visual impairment	
VOSP	Visual Object and Space Perception Battery	
VUmc	VU University Medical Center	
WMA	World Medical Association	
WMO	Medical Research Involving Human Subjects Act	

Supplementary Information

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Supplementary Material 1.

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Author's contributions

IB, CG, ST, JH, IV, KY, AH, PK, WF, YP, FB, EG, CT, FH, and RO contributed intellectually to the study protocol and have made a substantial contribution to the conception and design of the current study. IB and JM contributed to project administration and set-up of the study infrastructure. ST supported crucial access to the location of recruitment. PK provides study support at this location of recruitment. JO, SC and DW supported crucial access to study instrumentation. RO is principal investigator of the BeyeOMARKER study and supervises the project. All authors have approved the final manuscript.

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Availability of data and materials

No datasets were generated or analysed during the current study.

Declarations

Ethics approval and consent to participate

The BeyeOMARKER study (Eudamed CIV ID: CIV-NL-23–09-044086) and the BeyeOMARKER biobank were approved by the ethical review board of the VU Medical Center (VUmc). All of the participants will be asked to provide written informed consent to participate in the study.

Consent for publication

Not applicable.

Competing interests

CT is editor-in-chief of Alzheimer Research and Therapy. RO is part of the editorial board of Alzheimer's Research and Therapy.

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References

- 1. Jack CR Jr, Bennett DA, Blennow K, Carrillo MC, Dunn B, Haeberlein SB, et al. NIA-AA Research Framework: Toward a biological definition of Alzheimer's disease. Alzheimers Dement. 2018;14(4):535–62.
- Sperling RA, Aisen PS, Beckett LA, Bennett DA, Craft S, Fagan AM, et al. Toward defining the preclinical stages of Alzheimer's disease: recommendations from the National Institute on Aging-Alzheimer's Association workgroups on diagnostic guidelines for Alzheimer's disease. Alzheimers Dement. 2011;7(3):280–92.
- Porsteinsson AP, Isaacson RS, Knox S, Sabbagh MN, Rubino I. Diagnosis of Early Alzheimer's Disease: Clinical Practice in 2021. J Prev Alzheimers Dis. 2021;8(3):371–86.
- Aisen PS, Jimenez-Maggiora GA, Rafii MS, Walter S, Raman R. Early-stage Alzheimer disease: getting trial-ready. Nat Rev Neurol. 2022;18(7):389–99.
- Rasmussen J, Langerman H. Alzheimer's Disease Why We Need Early Diagnosis. Degener Neurol Neuro. 2019;9:123–30.
- van der Flier WM, de Vugt ME, Smets EMA, Blom M, Teunissen CE. Towards a future where Alzheimer's disease pathology is stopped before the onset of dementia. Nature Aging. 2023;3(5):494–505.
- Budd Haeberlein S, Aisen PS, Barkhof F, Chalkias S, Chen T, Cohen S, et al. Two Randomized Phase 3 Studies of Aducanumab in Early Alzheimer's Disease. J Prev Alzheimers Dis. 2022;9(2):197–210.
- van Dyck CH, Swanson CJ, Aisen P, Bateman RJ, Chen C, Gee M, et al. Lecanemab in Early Alzheimer's Disease. N Engl J Med. 2023;388(1):9–21.

- Sims JR, Zimmer JA, Evans CD, et al. Donanemab in early symptomatic Alzheimer disease: the TRAILBLAZER-ALZ 2 randomized clinical trial. JAMA. 2023;330(6):512–27. https://doi.org/10.1001/jama.2023.13239.
- Whelan R, Barbey FM, Cominetti MR, Gillan CM, Rosicka AM. Developments in scalable strategies for detecting early markers of cognitive decline. Transl Psychiatry. 2022;12(1):473.
- Klyucherev TO, Olszewski P, Shalimova AA, Chubarev VN, Tarasov VV, Attwood MM, et al. Advances in the development of new biomarkers for Alzheimer's disease. Transl Neurodegener. 2022;11(1):25.
- 12. Teunissen CE, Verberk IMW, Thijssen EH, Vermunt L, Hansson O, Zetterberg H, et al. Blood-based biomarkers for Alzheimer's disease: towards clinical implementation. Lancet Neurol. 2022;21(1):66–77.
- Hansson O, Edelmayer RM, Boxer AL, Carrillo MC, Mielke MM, Rabinovici GD, et al. The Alzheimer's Association appropriate use recommendations for blood biomarkers in Alzheimer's disease. Alzheimers Dement. 2022;18(12):2669–86.
- Alber J, Goldfarb D, Thompson LI, Arthur E, Hernandez K, Cheng D, et al. Developing retinal biomarkers for the earliest stages of Alzheimer's disease: What we know, what we don't, and how to move forward. Alzheimers Dement. 2020;16(1):229–43.
- Snyder PJ, Alber J, Alt C, Bain LJ, Bouma BE, Bouwman FH, et al. Retinal imaging in Alzheimer's and neurodegenerative diseases. Alzheimers & Dementia. 2021;17(1):103–11.
- Alber J, Arthur E, Sinoff S, DeBuc DC, Chew EY, Douquette L, et al. A recommended "minimum data set" framework for SD-OCT retinal image acquisition and analysis from the Atlas of Retinal Imaging in Alzheimer's Study (ARIAS). Alzh Dement-Dadm. 2020;12(1):e12119.
- Swenor BK, Ehrlich JR. Ageing and vision loss: looking to the future. Lancet Glob Health. 2021;9(4):e385–6.
- Varma R, Vajaranant TS, Burkemper B, Wu S, Torres M, Hsu C, et al. Visual Impairment and Blindness in Adults in the United States: Demographic and Geographic Variations From 2015 to 2050. JAMA Ophthalmol. 2016;134(7):802–9.
- Flaxman AD, Wittenborn JS, Robalik T, Gulia R, Gerzoff RB, Lundeen EA, et al. Prevalence of Visual Acuity Loss or Blindness in the US: A Bayesian Meta-analysis. JAMA Ophthalmology. 2021;139(7):717–23.
- 20. Jack CR. Biomarker Modeling of Alzheimer 's Disease. 2014;80(6):1347–58.
- 21. Jack CR, Holtzman DM. Biomarker modeling of Alzheimer's disease. Neuron. 2013;80(6):1347–58.
- Jack CR Jr, Knopman DS, Jagust WJ, Petersen RC, Weiner MW, Aisen PS, et al. Tracking pathophysiological processes in Alzheimer's disease: an updated hypothetical model of dynamic biomarkers. Lancet Neurol. 2013;12(2):207–16.
- Jack CR, Knopman DS, Jagust WJ, Shaw LM, Aisen PS, Weiner MW, et al. Hypothetical model of dynamic biomarkers of the Alzheimer's pathological cascade. Lancet Neurol. 2010;9(1):119–28.
- Altomare D, de Wilde A, Ossenkoppele R, Pelkmans W, Bouwman F, Groot C, et al. Applying the ATN scheme in a memory clinic population: The ABIDE project. Neurology. 2019;93(17):e1635–46.
- Baker JE, Lim YY, Pietrzak RH, Hassenstab J, Snyder PJ, Masters CL, Maruff P. Cognitive impairment and decline in cognitively normal older adults with high amyloid-β: A meta-analysis. Alzheimer's & dementia (Amsterdam, Netherlands). 2017;6:108–21.
- Caselli RJ, Dueck AC, Osborne D, Sabbagh MN, Connor DJ, Ahern GL, et al. Longitudinal modeling of age-related memory decline and the APOE epsilon4 effect. N Engl J Med. 2009;361(3):255–63.
- Xu Y, Phu J, Aung HL, Hesam-Shariati N, Keay L, Tully PJ, et al. Frequency of coexistent eye diseases and cognitive impairment or dementia: a systematic review and meta-analysis. Eye. 2023;37(15):3128–36.
- Kuzma E, Littlejohns TJ, Khawaja AP, Llewellyn DJ, Ukoumunne OC, Thiem U. Visual Impairment, Eye Diseases, and Dementia Risk: A Systematic Review and Meta-Analysis. J Alzheimers Dis. 2021;83(3):1073–87.
- Littlejohns TJ, Hayat S, Luben R, Brayne C, Conroy M, Foster PJ, et al. Visual Impairment and Risk of Dementia in 2 Population-Based Prospective Cohorts: UK Biobank and EPIC-Norfolk. J Gerontol A Biol Sci Med Sci. 2022;77(4):697–704.
- Paik JS, Ha M, Jung YH, Kim GH, Han KD, Kim HS, et al. Low vision and the risk of dementia: a nationwide population-based cohort study. Sci Rep. 2020;10(1):9109.

- Nagarajan N, Assi L, Varadaraj V, Motaghi M, Sun Y, Couser E, et al. Vision impairment and cognitive decline among older adults: a systematic review. BMJ Open. 2022;12(1):e047929.
- Hwang PH, Longstreth WT Jr, Brenowitz WD, Thielke SM, Lopez OL, Francis CE, et al. Dual sensory impairment in older adults and risk of dementia from the GEM Study. Alzheimers Dement (Amst). 2020;12(1):e12054.
- Hu W, Wang Y, Wang W, Zhang X, Shang X, Liao H, et al. Association of Visual, Hearing, and Dual Sensory Impairment With Incident Dementia. Front Aging Neurosci. 2022;14:872967.
- Shang X, Zhu Z, Wang W, Ha J, He M. The Association between Vision Impairment and Incidence of Dementia and Cognitive Impairment: A Systematic Review and Meta-analysis. Ophthalmology. 2021;128(8):1135–49.
- Lee CS, Gibbons LE, Lee AY, et al. Association between cataract extraction and development of dementia. JAMA Intern Med. 2022;182(2):134– 41. https://doi.org/10.1001/jamainternmed.2021.6990.
- 36. London A, Benhar I, Schwartz M. The retina as a window to the brainfrom eye research to CNS disorders. Nat Rev Neurol. 2013;9(1):44–53.
- Gupta VB, Chitranshi N, den Haan J, Mirzaei M, You YY, Lim JK, et al. Retinal changes in Alzheimer's disease- integrated prospects of imaging, functional and molecular advances. Prog Retin Eye Res. 2021;82:100899.
- Costanzo E, Lengyel I, Parravano M, Biagini I, Veldsman M, Badhwar A, et al. Ocular Biomarkers for Alzheimer Disease Dementia: An Umbrella Review of Systematic Reviews and Meta-analyses. JAMA Ophthalmol. 2023;141(1):84–91.
- Cheung CY, Mok V, Foster PJ, Trucco E, Chen C, Wong TY. Retinal imaging in Alzheimer's disease. J Neurol Neurosur Ps. 2021;92(9):983–94.
- Csincsik L, Quinn N, Yong KXX, Crutch SJ, Peto T, Lengyel I. Retinal phenotyping of variants of Alzheimer's disease using ultra-widefield retinal images. Alzheimers Dement (Amst). 2021;13(1):e12232.
- Majeed A, Marwick B, Yu H, Fadavi H, Tavakoli M. Ophthalmic Biomarkers for Alzheimer's Disease: A Review. Front Aging Neurosci. 2021;13:720167.
- Koronyo Y, Rentsendorj A, Mirzaei N, Regis GC, Sheyn J, Shi H, et al. Retinal pathological features and proteome signatures of Alzheimer's disease. Acta Neuropathol. 2023;145(4):409–38.
- Wang L, Mao X. Role of Retinal Amyloid-β in Neurodegenerative Diseases: Overlapping Mechanisms and Emerging Clinical Applications. Int J Mol Sci. 2021;22(5):2360.
- 44. Ohno-Matsui K. Parallel findings in age-related macular degeneration and Alzheimer's disease. Prog Retin Eye Res. 2011;30(4):217–38.
- 45. Ramirez AI, de Hoz R, Salobrar-Garcia E, Salazar JJ, Rojas B, Ajoy D, et al. The Role of Microglia in Retinal Neurodegeneration: Alzheimer's Disease, Parkinson, and Glaucoma. Front Aging Neurosci. 2017;9:214.
- 46. Dickens P, Ramaesh K. The evolving role of ophthalmology clinics in screening for early Alzheimer's disease: a review. Vision. 2020;4(4):46.
- Reed NS, Oh ES. New Insights Into Sensory Impairment and Dementia Risk. JAMA Netw Open. 2022;5(5):e2210740.
- Whitson HE, Cronin-Golomb A, Cruickshanks KJ, Gilmore GC, Owsley C, Peelle JE, et al. American Geriatrics Society and National Institute on Aging Bench-to-Bedside Conference: Sensory Impairment and Cognitive Decline in Older Adults. J Am Geriatr Soc. 2018;66(11):2052–8.
- 49. Davis BM, Crawley L, Pahlitzsch M, Javaid F, Cordeiro MF. Glaucoma: the retina and beyond. Acta Neuropathol. 2016;132(6):807–26.
- Ratnayaka JA, Serpell LC, Lotery AJ. Dementia of the eye: the role of amyloid beta in retinal degeneration. Eye. 2015;29(8):1013–26.
- Rinaldi M, Pezone A, Quadrini GI, Abbadessa G, Laezza MP, Passaro ML, et al. Targeting shared pathways in tauopathies and age-related macular degeneration: implications for novel therapies. Front Aging Neurosci. 2024;16:1371745.
- Lee CS, Gibbons LE, Lee AY, Yanagihara RT, Blazes MS, Lee ML, et al. Association Between Cataract Extraction and Development of Dementia. Jama Intern Med. 2022;182(2):134–41.
- Ma L-Z, Zhang Y-R, Li Y-Z, Ou Y-N, Yang L, Chen S-D, et al. Cataract, Cataract Surgery, and Risk of Incident Dementia: A Prospective Cohort Study of 300,823 Participants. Biol Psychiat. 2023;93(9):810–9.
- Ehrlich JR, Goldstein J, Swenor BK, Whitson H, Langa KM, Veliz P. Addition of Vision Impairment to a Life-Course Model of Potentially Modifiable Dementia Risk Factors in the US. Jama Neurol. 2022;79(6):623–6.

- Deal J, Rojas JC. Visual Impairment as a Modifiable Risk Factor in Dementia Prevention and Management. Jama Neurol. 2022;79(6):542–3.
- 56. Livingston G, et al. Dementia prevention, intervention, and care: 2020 report of the Lancet Commission. Lancet. 2020;396(10248):413–46.
- Burton MJ, Ramke J, Marques AP, Bourne RRA, Congdon N, Jones I, et al. The Lancet Global Health Commission on Global Eye Health: vision beyond 2020. Lancet Glob Health. 2021;9(4):e489–551.
- Pye A, Charalambous AP, Leroi I, Thodi C, Dawes P. Screening tools for the identification of dementia for adults with age-related acquired hearing or vision impairment: a scoping review. Int Psychogeriatr. 2017;29(11):1771–84.
- Macnamara A, Schinazi VR, Chen C, Coussens S, Loetscher T. The effect of age-related macular degeneration on cognitive test performance. Sci Rep. 2022;12(1):4033.
- Jongsma KR, van Bruchem-Visser RL, van de Vathorst S, Mattace Raso FUS. Has dementia research lost its sense of reality? A descriptive analysis of eligibility criteria of Dutch dementia research protocols. (1872–9061 (Electronic)). Neth J Med. 2016;74(5):201–9.
- DeCormier PW, Ne'eman A, Silverman BC, Strauss DH, Francis LP, Stein MA, Bierer BE. Excluding People With Disabilities From Clinical Research: Eligibility Criteria Lack Clarity And Justification. Health Aff (Millwood). 2022;41(10):1423–32.
- Franzen S, Smith JE, van den Berg E, Rivera Mindt M, van Bruchem-Visser RL, Abner EL, et al. Diversity in Alzheimer's disease drug trials: The importance of eligibility criteria. Alzheimers Dement. 2022;18(4):810–23.
- 63. Beydoun MA, Beydoun HA, Banerjee S, Weiss J, Evans MK, Zonderman AB. Pathways explaining racial/ethnic and socio-economic disparities in incident all-cause dementia among older US adults across income groups. Transl Psychiat. 2022;12(1):478.
- 64. Cadar D, Lassale C, Davies H, Llewellyn DJ, Batty GD, Steptoe A. Individual and area-based socioeconomic factors associated with dementia incidence in England: evidence from a 12-year follow-up in the English Longitudinal Study of Ageing. JAMA Psychiatry. 2018;75(7):723–32.
- Marden JR, Tchetgen EJT, Kawachi I, Glymour MM. Contribution of Socioeconomic Status at 3 Life-Course Periods to Late-Life Memory Function and Decline: Early and Late Predictors of Dementia Risk. Am J Epidemiol. 2017;186(7):805–14.
- Werry AE, Daniel M, Bergstrom B. Group Differences in Normal Neuropsychological Test Performance for Older Non-Hispanic White and Black/African American Adults. Neuropsychology. 2019;33(8):1089–100.
- Abigail L, Aditi G, Inez O, Suzanne ES, Nupur G, Zachary A, et al. The Association Between Socioeconomic Factors, Race, and Usage of a Specialty Memory Clinic. Neurology. 2023;101(14):e1424–33. https:// doi.org/10.1212/WNL.000000000207674.
- Grill JD, Sperling RA, Raman R. What Should the Goals Be for Diverse Recruitment in Alzheimer Clinical Trials? Jama Neurol. 2022;79(11):1097–8.
- Siette J, Meka A, Antoniades J. Breaking the barriers: overcoming dementia-related stigma in minority communities. Front Psychiatry. 2023;14:1278944.
- Graff-Radford J, Yong KXX, Apostolova LG, Bouwman FH, Carrillo M, Dickerson BC, et al. New insights into atypical Alzheimer's disease in the era of biomarkers. Lancet Neurol. 2021;20(3):222–34.
- Griffin P, Apostolova L, Dickerson BC, Rabinovici G, Salloway S, Brandt K, et al. Developments in understanding early onset Alzheimer's disease. Alzheimers Dement. 2023;19 Suppl 9(Suppl 9):S126–31.
- 72. Emma H, Mary Pat S, Rachel W, Keir XXY, Anne M, Mary LG, et al. 'Because my brain isn't as active as it should be, my eyes don't always see': a qualitative exploration of the stress process for those living with posterior cortical atrophy. BMJ Open. 2018;8(2):e018663.
- Crutch SJ, Schott JM, Rabinovici GD, Murray M, Snowden JS, van der Flier WM, et al. Consensus classification of posterior cortical atrophy. Alzheimers Dement. 2017;13(8):870–84.
- 74. Chapleau M, La Joie R, Yong K, Agosta F, Allen IE, Apostolova L, et al. Demographic, clinical, biomarker, and neuropathological correlates of posterior cortical atrophy: an international cohort study and individual participant data meta-analysis. The Lancet Neurology. 2024;23(2):168–77.

- Yong KXX, Graff-Radford J, Ahmed S, Chapleau M, Ossenkoppele R, Putcha D, et al. Diagnosis and Management of Posterior Cortical Atrophy. Curr Treat Options Neurol. 2023;25(2):23–43.
- Holden SK, Bettcher BM, Pelak VS. Update on posterior cortical atrophy. Curr Opin Neurol. 2020;33(1):68–73.
- Gleason CE, Zuelsdorff M, Gooding DC, Kind AJH, Johnson AL, James TT, et al. Alzheimer's disease biomarkers in Black and non-Hispanic White cohorts: A contextualized review of the evidence. Alzheimers Dement. 2022;18(8):1545–64.
- Howell JC, Parker MW, Watts KD, Kollhoff A, Tsvetkova DZ, Hu WT. Research Lumbar Punctures among African Americans and Caucasians: Perception Predicts Experience. Front Aging Neurosci. 2016;8:296.
- 79. Suarez-Calvet M, Karikari TK, Ashton NJ, Rodriguez JL, 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 A beta pathology are detected. Embo Mol Med. 2020;12(12):e12921.
- Moscoso A, Grothe MJ, Ashton NJ, Karikari TK, Rodriguez JL, Snellman A, et al. Time course of phosphorylated-tau181 in blood across the Alzheimer's disease spectrum. Brain. 2021;144:325–39.
- Mielke MM, Frank RD, Dage JL, Jeromin A, Ashton NJ, Blennow K, et al. Comparison of Plasma Phosphorylated Tau Species With Amyloid and Tau Positron Emission Tomography, Neurodegeneration, Vascular Pathology, and Cognitive Outcomes. Jama Neurol. 2021;78(9):1108–17.
- Simren J, Leuzy A, Karikari TK, Hye A, Benedet AL, Lantero-Rodriguez J, et al. The diagnostic and prognostic capabilities of plasma biomarkers in Alzheimer's disease. Alzheimers & Dementia. 2021;17(7):1145–56.
- 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(3):379–86.
- Karikari TK, Ashton NJ, Brinkmalm G, Brum WS, Benedet AL, Montoliu-Gaya L, et al. Blood phospho-tau in Alzheimer disease: analysis, interpretation, and clinical utility. Nat Rev Neurol. 2022;18(7):400–18.
- Thijssen EH, La Joie R, Wolf A, Strom A, Wang P, laccarino L, et al. Diagnostic value of plasma phosphorylated tau181 in Alzheimer's disease and frontotemporal lobar degeneration. Nat Med. 2020;26(3):387–97.
- Janelidze S, Mattsson N, Smith R, Stomrud E, Palmqvist S, Dage JL, Hansson O. Plasma phospho-tau217 is a potential early diagnostic and prognostic biomarker of Alzheimer's disease. Alzheimers Dement. 2020;16(S4):e042489.
- Thijssen EH, La Joie R, Strom A, Fonseca C, laccarino L, Wolf A, et al. Plasma phosphorylated tau 217 and phosphorylated tau 181 as biomarkers in Alzheimer's disease and frontotemporal lobar degeneration: a retrospective diagnostic performance study. The Lancet Neurology. 2021;20(9):739–52.
- Pereira JB, Janelidze S, Stomrud E, Palmqvist S, van Westen D, Dage JL, et al. Plasma markers predict changes in amyloid, tau, atrophy and cognition in non-demented subjects. Brain. 2021;144(9):2826–36.
- Ashton NJ, Janelidze S, Mattsson-Carlgren N, Binette AP, Strandberg O, Brum WS, et al. Differential roles of Abeta42/40, p-tau231 and p-tau217 for Alzheimer's trial selection and disease monitoring. Nat Med. 2022;28(12):2555–62.
- Rodriguez JL, Karikari TK, Suarez-Calvet M, Troakes C, King A, Emersic A, et al. Plasma p-tau181 accurately predicts Alzheimer's disease pathology at least 8 years prior to post-mortem and improves the clinical characterisation of cognitive decline. Acta Neuropathol. 2020;140(3):267–78.
- Bayoumy S, Verberk IMW, den Dulk B, Hussainali Z, Zwan M, van der Flier WM, et al. Clinical and analytical comparison of six Simoa assays for plasma P-tau isoforms P-tau181, P-tau217, and P-tau231. Alzheimers Res Ther. 2021;13(1):198.
- 92. Gonzalez-Ortiz F, Kac PR, Brum WS, Zetterberg H, Blennow K, Karikari TK. Plasma phospho-tau in Alzheimer's disease: towards diagnostic and therapeutic trial applications. Mol Neurodegener. 2023;18(1):18.
- 93. Salvadó G, Ossenkoppele R, Ashton NJ, Beach TG, Serrano GE, Reiman EM, et al. Specific associations between plasma biomarkers and

postmortem amyloid plaque and tau tangle loads. Embo Mol Med. 2023;15(5):e17123.

- 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(17):e1681–94.
- 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. 2021;78(2):149–56.
- Alber J, Bouwman F, den Haan J, Rissman RA, De Groef L, Koronyo-Hamaoui M, et al. Retina pathology as a target for biomarkers for Alzheimer's disease: Current status, ophthalmopathological background, challenges, and future directions. Alzheimers Dement. 2024;20(1):728–40.
- Sharafi SM, Sylvestre JP, Chevrefils C, Soucy JP, Beaulieu S, Pascoal TA, et al. Vascular retinal biomarkers improves the detection of the likely cerebral amyloid status from hyperspectral retinal images. Alzheimers Dement (N Y). 2019;5:610–7.
- Hadoux X, Hui F, Lim JKH, Masters CL, Pebay A, Chevalier S, et al. Non-invasive in vivo hyperspectral imaging of the retina for potential biomarker use in Alzheimer's disease. Nat Commun. 2019;10(1):4227.
- 99. More SS, Beach JM, Vince R. Early Detection of Amyloidopathy in Alzheimer's Mice by Hyperspectral Endoscopy. Invest Ophth Vis Sci. 2016;57(7):3231–8.
- More SS, Vince R. Hyperspectral Imaging Signatures Detect Amyloidopathy in Alzheimer's Mouse Retina Well before Onset of Cognitive Decline. ACS Chem Neurosci. 2015;6(2):306–15.
- Lim JKH, Li QX, Ryan T, Bedggood P, Metha A, Vingrys AJ, et al. Retinal hyperspectral imaging in the 5xFAD mouse model of Alzheimer's disease. Sci Rep-Uk. 2021;11(1):6387.
- 102. Soucy J-P, Chevrefils C, Osseiran S, Sylvestre J-P, Lesage F, Beaulieu S, et al. A retinal deep phenotypingTM platform to predict the cerebral amyloid PET status in older adults. Alzheimers Dement. 2021;17(S5):e054582.
- Soucy J-P, Chevrefils C, Osseiran S, Sylvestre J-P, Beaulieu S, Pascoal TA, et al. Evaluation of a retinal deep phenotyping platform to detect the likely cerebral amyloid PET status in humans. Alzheimers Dement. 2020;16(S4):e043395.
- Soucy J-P, Chevrefils C, Sylvestre J-P, Arbour JD, Rhéaume M-A, Beaulieu S, et al. IC-P-190: An amyloid ligand-free optical retinal imaging method to predict cerebral amyloid pet status. Alzheimer's and Dementia. 2018;14(7S_Part_2):158.
- More SS, Beach JM, McClelland C, Mokhtarzadeh A, Vince R. In Vivo Assessment of Retinal Biomarkers by Hyperspectral Imaging: Early Detection of Alzheimer's Disease. ACS Chem Neurosci. 2019;10(11):4492–501.
- Tadokoro K, Yamashita T, Kimura S, Nomura E, Ohta Y, Omote Y, et al. Retinal Amyloid Imaging for Screening Alzheimer's Disease. J Alzheimers Dis. 2021;83(2):927–34.
- Gaire BP, Koronyo Y, Fuchs D-T, Shi H, Rentsendorj A, Danziger R, et al. Alzheimer's disease pathophysiology in the Retina. Prog Retin Eye Res. 2024;101:101273.
- Rhodius-Meester HFM, Paajanen T, Koikkalainen J, Mahdiani S, Bruun M, Baroni M, et al. cCOG: A web-based cognitive test tool for detecting neurodegenerative disorders. Alzh Dement-Dadm. 2020;12(1):e12083.
- Dreves MAE, van Harten AC, Visser LNC, Rhodius-Meester H, Kohler S, Kooistra M, et al. Rationale and design of the ABOARD project (A Personalized Medicine Approach for Alzheimer's Disease). Alzheimers Dement (N Y). 2023;9(2):e12401.
- Jansen WJ, Janssen O, Tijms BM, Vos SJB, Ossenkoppele R, Visser PJ. Amyloid Biomarker Study G. prevalence estimates of amyloid abnormality across the Alzheimer disease clinical spectrum. JAMA Neurol. 2022;79(3):228–43.
- 111. Therriault J, Vermeiren M, Servaes S, et al. Association of phosphorylated tau biomarkers with amyloid positron emission tomography vs tau positron emission tomography. JAMA Neurol. 2023;80(2):188–99. https://doi.org/10.1001/jamaneurol.2022.4485.
- 112. Naing L, Nordin RB, Abdul Rahman H, Naing YT. Sample size calculation for prevalence studies using Scalex and ScalaR calculators. BMC Med Res Methodol. 2022;22(1):209.
- 113. van der Flier WM, Scheltens P. Amsterdam Dementia Cohort: Performing Research to Optimize Care. J Alzheimers Dis. 2018;62:1091–111.

- 114. Verberk IMW, Misdorp EO, Koelewijn J, Ball AJ, Blennow K, Dage JL, et al. Characterization of pre-analytical sample handling effects on a panel of Alzheimer's disease-related blood-based biomarkers: Results from the Standardization of Alzheimer's Blood Biomarkers (SABB) working group. Alzheimers Dement. 2022;18(8):1484–97.
- Schindler SE, Bollinger JG, Ovod V, Mawuenyega KG, Li Y, Gordon BA, et al. High-precision plasma β-amyloid 42/40 predicts current and future brain amyloidosis. Neurology. 2019;93(17):e1647–59.
- 116. Verberk IMW, Laarhuis MB, van den Bosch KA, Ebenau JL, van Leeuwenstijn M, Prins ND, et al. Serum markers glial fibrillary acidic protein and neurofilament light for prognosis and monitoring in cognitively normal older people: a prospective memory clinic-based cohort study. Lancet Healthy Longev. 2021;2(2):e87–95.
- 117. Pichet Binette A, Palmqvist S, Bali D, Farrar G, Buckley CJ, Wolk DA, et al. Combining plasma phospho-tau and accessible measures to evaluate progression to Alzheimer's dementia in mild cognitive impairment patients. Alzheimers Res Ther. 2022;14(1):46.
- Schott JM, Crutch SJ, Carrasquillo MM, Uphill J, Shakespeare TJ, Ryan NS, et al. Genetic risk factors for the posterior cortical atrophy variant of Alzheimer's disease. Alzheimers Dement. 2016;12(8):862–71.
- Rasmussen KL, Tybjærg-Hansen A, Nordestgaard BG, Frikke-Schmidt R. Associations of Alzheimer Disease-Protective APOE Variants With Age-Related Macular Degeneration. JAMA Ophthalmology. 2023;141(1):13–21.
- 120. Margeta MA, Yin Z, Madore C, Pitts KM, Letcher SM, Tang J, et al. Apolipoprotein E4 impairs the response of neurodegenerative retinal microglia and prevents neuronal loss in glaucoma. Immunity. 2022;55(9):1627–44.e7.
- Margeta MA, Letcher SM, Igo RP Jr, Cooke Bailey JN, Pasquale LR, Haines JL, et al. Association of APOE With Primary Open-Angle Glaucoma Suggests a Protective Effect for APOE ɛ4. Invest Ophth Vis Sci. 2020;61(8):3.
- Centraal Bureau voor de Statistiek Nieuwe indeling bevolking naar herkomst CBS2022. Available from: https://www.cbs.nl/nl-nl/longread/ statistische-trends/2022/nieuwe-indeling-bevolking-naar-herkomst.
- Groot C, Van Loenhoud AC, Barkhof F, Van Berckel BNM, Koene T, Teunissen CC, et al. Differential effects of cognitive reserve and brain reserve on cognition in Alzheimer disease. Neurology. 2018;90(2):e149–56.
- van Loenhoud AC, Wink AM, Groot C, Verfaillie SCJ, Twisk J, Barkhof F, et al. A neuroimaging approach to capture cognitive reserve: Application to Alzheimer's disease. Hum Brain Mapp. 2017;38(9):4703–15.
- 125. van Loenhoud AC, de Boer C, Wols K, Pijnenburg YA, Lemstra AW, Bouwman FH, et al. High occurrence of transportation and logistics occupations among vascular dementia patients: an observational study. Alzheimers Res Ther. 2019;11(1):112.
- Rezaei F, Seif M, Gandomkar A, Fattahi MR, Hasanzadeh J. Agreement between laboratory-based and non-laboratory-based Framingham risk score in Southern Iran. Sci Rep-Uk. 2021;11(1):10767.
- 127. Rausch-Koster TP, Luijten MAJ, Verbraak FD, van Rens G, van Nispen RMA. Calibration of the Dutch EyeQ to Measure Vision Related Quality of Life in Patients With Exudative Retinal Diseases. Transl Vis Sci Technol. 2022;11(4):5.
- Nasreddine ZS, Phillips NA, Bedirian V, Charbonneau S, Whitehead V, Collin I, et al. The Montreal Cognitive Assessment, MoCA: a brief screening tool for mild cognitive impairment. J Am Geriatr Soc. 2005;53(4):695–9.
- 129. Nasreddine ZS. MoCA Test: Validation of a five-minute telephone version. Alzheimers Dement. 2021;17(S8):e057817.
- Katz MJ, Wang CL, Nester CO, Derby CA, Zimmerman ME, Lipton RB, et al. T-MoCA: A valid phone screen for cognitive impairment in diverse community samples. Alzh Dement-Dadm. 2021;13(1):e12144.
- 131. Yung M, Klufas MA, Sarraf D. Clinical applications of fundus autofluorescence in retinal disease. Int J Retina Vitreous. 2016;2:12.
- Snyder PJ, Johnson LN, Lim YY, Santos CY, Alber J, Maruff P, Fernández B. Nonvascular retinal imaging markers of preclinical Alzheimer's disease. Alzh Dement-Dadm. 2016;4(1):169–78.
- Ossenkoppele R, Pichet Binette A, Groot C, Smith R, Strandberg O, Palmqvist S, et al. Amyloid and tau PET-positive cognitively unimpaired individuals are at high risk for future cognitive decline. Nat Med. 2022;28(11):2381–7.
- 134. Pemberton HG, Collij LE, Heeman F, Bollack A, Shekari M, Salvadó G, et al. Quantification of amyloid PET for future

clinical use: a state-of-the-art review. Eur J Nucl Med Mol Imaging. 2022;49(10):3508–28.

- 135. Colin G, Sylvia V, Ruben S, Oskar H, Rik O. Tau PET Imaging in Neurodegenerative Disorders. J Nucl Med. 2022;63(Supplement 1):20S.
- 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(7):829–39.
- Clark CM, Schneider JA, Bedell BJ, Beach TG, Bilker WB, Mintun MA, et al. Use of Florbetapir-PET for Imaging β-Amyloid Pathology. JAMA. 2011;305(3):275–83.
- Ossenkoppele R, Rabinovici GD, Smith R, Cho H, Scholl M, Strandberg O, et al. Discriminative Accuracy of [18F]flortaucipir Positron Emission Tomography for Alzheimer Disease vs Other Neurodegenerative Disorders. JAMA. 2018;320(11):1151–62.
- 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(1):110–9.
- Breault C, Piper J, Joshi AD, Pirozzi SD, Nelson AS, Lu M, et al. Correlation between two methods of florbetapir PET quantitative analysis. Am J Nucl Med Molec. 2017;7(3):84–91.
- Schreiber S, Landau SM, Fero A, Schreiber F, Jagust WJ. Alzheimer's Disease Neuroimaging I. Comparison of Visual and Quantitative Florbetapir F 18 Positron Emission Tomography Analysis in Predicting Mild Cognitive Impairment Outcomes. JAMA Neurol. 2015;72(10):1183–90.
- 142. Matsuda H, Okita K, Motoi Y, Mizuno T, Ikeda M, Sanjo N, et al. Clinical impact of amyloid PET using 18F-florbetapir in patients with cognitive impairment and suspected Alzheimer's disease: a multicenter study. Ann Nucl Med. 2022;36(12):1039–49.
- 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(3):205–16.
- 144. Braak H, Braak E. Neuropathological stageing of Alzheimer-related changes. Acta Neuropathol. 1991;82(4):239–59.
- Abhinay DJ, Michael JP, Ming L, Daniel MS, Mark AM, Michael D, Devous Sr. A Semiautomated Method for Quantification of F 18 Florbetapir PET Images. J Nuclear Med. 2015;56(11):1736.
- 146. Franzen S, van den Berg E, Ayhan Y, Satoer DD, Turkoglu O, Genc Akpulat GE, et al. The Naming Assessment in Multicultural Europe (NAME): Development and Validation in a Multicultural Memory Clinic. J Int Neuropsychol Soc. 2023;29(1):92–104.
- Holden SK, Pelak VS, Sooy T, Heffernan KS, McConnell BV, Pressman PS, Bettcher BM. Development of the Colorado posterior cortical questionnaire within an Alzheimer's disease study cohort. J Clin Exp Neuropsyc. 2022;44(3):226–36.
- 148. Pelak VS, Tang-Wai DF, Boeve BF, Bouwman FH, Graff-Radford J, Rabinovici G, et al. Consensus recommendations for clinical assessment tools for the diagnosis of posterior cortical atrophy syndrome from the Atypical AD PIA of ISTAART. Alzh Dement-Dadm. 2023;15(3):e12474.
- 149. Papp KV, Rentz DM, Orlovsky I, Sperling RA, Mormino EC. Optimizing the preclinical Alzheimer's cognitive composite with semantic processing: The PACC5. Alzheimer's & Dementia: Translational Research & Clinical Interventions. 2017;3(4):668–77.
- 150. van der Schaar J, Visser LNC, Ket JCF, Groot C, Pijnenburg YAL, Scheltens P, et al. Impact of sharing Alzheimer's disease biomarkers with individuals without dementia: A systematic review and meta-analysis of empirical data. Alzheimer's Dement. 2023;19(12):5773–94.
- 151. Alzheimer's disease facts and figures. Alzheimers Dement. 2021;17(3):327–406.
- 152. Alzheimer's disease facts and figures. Alzheimers Dement. 2020;16(3):391–460.
- Marquie M, Castilla-Marti M, Valero S, Martinez J, Sanchez D, Hernandez I, et al. Visual impairment in aging and cognitive decline: experience in a Memory Clinic. Sci Rep-Uk. 2019;9(1):8698.
- Counts SE, Ikonomovic MD, Mercado N, Vega IE, Mufson EJ. Biomarkers for the Early Detection and Progression of Alzheimer's Disease. Neurotherapeutics. 2017;14(1):35–53.
- 155. Wang C, Tachimori H, Yamaguchi H, Sekiguchi A, Li Y, Yamashita Y. for Alzheimer's Disease Neuroimaging I. A multimodal deep learning approach for the prediction of cognitive decline and its effectiveness in clinical trials for Alzheimer's disease. Transl Psychiat. 2024;14(1):105.
- Mielke MM, Fowler NR. Alzheimer disease blood biomarkers: considerations for population-level use. Nat Rev Neurol. 2024.

- 157. Mielke MM, Dage JL, Frank RD, Algeciras-Schimnich A, Knopman DS, Lowe VJ, et al. Performance of plasma phosphorylated tau 181 and 217 in the community. Nat Med. 2022;28(7):1398–405.
- Lemmens S, Van Eijgen J, Van Keer K, Jacob J, Moylett S, De Groef L, et al. Hyperspectral Imaging and the Retina: Worth the Wave? Transl Vis Sci Technol. 2020;9(9):9.
- 159. Berkowitz BA, Podolsky RH, Childers KL, Roberts R, Waseem R. Multiple Bioenergy-Linked OCT Biomarkers Suggest Greater-Than-Normal Rod Mitochondria Activity Early in Experimental Alzheimer's Disease. Invest Ophth Vis Sci. 2023;64(3):12.
- 160. Gupta N, Fong J, Ang LC, Yucel YH. Retinal tau pathology in human glaucomas. Can J Ophthalmol. 2008;43(1):53–60.
- 161. FJ, Hart de Ruyter FJ, Morrema THJ, den Haan J, Netherlands Brain B, Twisk JWR, de Boer JF, et al. Correction to: Phosphorylated tau in the retina correlates with tau pathology in the brain in Alzheimer's disease and primary tauopathies. Acta Neuropathol. 2023;145(2):263.
- 162. den Haan J, Morrema THJ, Verbraak FD, de Boer JF, Scheltens P, Rozemuller AJ, et al. Amyloid-beta and phosphorylated tau in post-mortem Alzheimer's disease retinas. Acta Neuropathol Commun. 2018;6(1):147.
- Du X, Koronyo Y, Mirzaei N, Yang C, Fuchs DT, Black KL, et al. Label-free hyperspectral imaging and deep-learning prediction of retinal amyloid beta-protein and phosphorylated tau. PNAS Nexus. 2022;1(4):pgac164.
- 164. Kaeser PF, Ghika J, Borruat FX. Visual signs and symptoms in patients with the visual variant of Alzheimer disease. BMC Ophthalmol. 2015;15:65.
- 165. Taylor KL, Aebi BE. Do you want to know your future? A qualitative study of patient perspectives on knowing the risk of an incurable disease through ophthalmologic screening. JFO Open Ophthalmology. 2023;2:100020.
- Broome EE, Tannirandorn P, Straus J, Beale P, Heffernan E, Dening T, Henshaw H. Patient perceptions of cognitive screening in adult audiology services: A qualitative exploration. Front Neurol. 2023;14:1143128.
- 167. Indorewalla KK, O'Connor MK, Budson AE, Guess C, Jackson J. Modifiable Barriers for Recruitment and Retention of Older Adults Participants from Underrepresented Minorities in Alzheimer's Disease Research. J Alzheimers Dis. 2021;80:927–40.
- Langbaum JB, Zissimopoulos J, Au R, Bose N, Edgar CJ, Ehrenberg E, et al. Recommendations to address key recruitment challenges of Alzheimer's disease clinical trials. Alzheimers Dement. 2023;19(2):696–707.
- 169. Nuño MM, Gillen DL, Dosanjh KK, Brook J, Elashoff D, Ringman JM, Grill JD. Attitudes toward clinical trials across the Alzheimer's disease spectrum. Alzheimer's Research & Therapy. 2017;9(1):81.
- Gilmore-Bykovskyi AL, et al. Recruitment and retention of underrepresented populations in Alzheimer's disease research: A systematic review. Alzh Dement. 2019;5:751–70.
- Dauer LT, Thornton RH, Hay JL, Balter R, Williamson MJ, St GJ. Fears, feelings, and facts: interactively communicating benefits and risks of medical radiation with patients. AJR Am J Roentgenol. 2011;196(4):756–61.
- 172. Tsai H-R, Lo RY, Liang K-H, Chen T-L, Huang H-K, Wang J-H, Lee Y-C. Risk of Subsequent Dementia or Alzheimer Disease Among Patients With Age-Related Macular Degeneration: A Systematic Review and Metaanalysis. Am J Ophthalmol. 2023;247:161–9.
- 173. Crump C, Sundquist J, Sieh W, Sundquist K. Risk of Alzheimer's Disease and Related Dementias in Persons With Glaucoma: A National Cohort Study. Ophthalmology. 2023;131(3):302–9.
- 174. Hart de Ruyter FJ, Morrema THJ, den Haan J, Twisk JWR, de Boer JF, Scheltens P, et al. Phosphorylated tau in the retina correlates with tau pathology in the brain in Alzheimer's disease and primary tauopathies. Acta Neuropathol. 2023;145(2):197–218.
- 175. Haoshen S, Nazanin M, Yosef K, Miyah RD, Edward R, Gila MB, et al. Identification of retinal tau oligomers, citrullinated tau, and other tau isoforms in early and advanced AD and relations to disease status. bioRxiv. 2024:2024.02.13.579999.
- 176. Baltes PB, Lindenberger U. Emergence of a powerful connection between sensory and cognitive functions across the adult life span: a new window to the study of cognitive aging? Psychol Aging. 1997;12(1):12–21.

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