BRAIN COMMUNICATIONS

REVIEW ARTICLE

Online clinical tools to support the use of new plasma biomarker diagnostic technology in the assessment of Alzheimer's disease: a narrative review

DJemma Hazan,¹ Kathy Y. Liu,¹ Nick C. Fox^{2,3} and Robert Howard¹

Recent advances in new diagnostic technologies for Alzheimer's disease have improved the speed and precision of diagnosis. However, accessing the potential benefits of this technology poses challenges for clinicians, such as deciding whether it is clinically appropriate to order a diagnostic test, which specific test or tests to order and how to interpret test results and communicate these to the patient and their caregiver. Tools to support decision-making could provide additional structure and information to the clinical assessment process. These tools could be accessed online, and such 'e-tools' can provide an interactive interface to support patients and clinicians in the use of new diagnostic technologies for Alzheimer's disease. We performed a narrative review of the literature to synthesize information available on this research topic. Relevant studies that provide an understanding of how these online tools could be used to optimize the clinical utility of diagnostic technology were identified. Based on these, we discuss the ways in which e-tools have been used to assist in the diagnosis of Alzheimer's disease and propose recommendations for future research to aid further development.

- 1 Division of Psychiatry, University College London, London W1T 7BN, UK
- 2 Dementia Research Centre, UCL Queen Square Institute of Neurology, University College London, London, WC1N 3BG, UK
- 3 UK Dementia Research Institute at UCL, London, W1T 7NF, UK

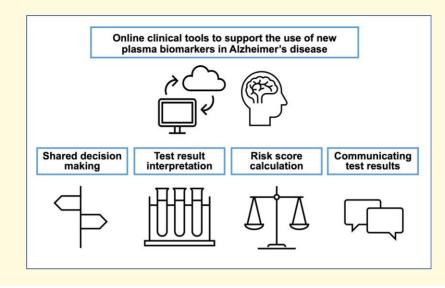
Correspondence to: Jemma Hazan Division of Psychiatry, University College London Maple House, 149 Tottenham Court Road London W1T 7BN, UK E-mail: j.hazan@ucl.ac.uk

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Graphical Abstract



The evolution of diagnostic technology for Alzheimer's disease

Diagnostic technologies for Alzheimer's disease have seen large advances in the last decade, with extensive research in the discovery and validation of new biomarker technology. There is an increasing focus on their use in both the research and clinical domains, to increase certainty in diagnosis, particularly with the advent of potential diseasemodifying treatments. Such biomarkers can be used to detect in vivo pathological hallmarks of Alzheimer's disease. A diagnostic research framework was proposed in 2018 with a shift in the definition of Alzheimer's disease to a biological construct.¹ Within this, biomarkers are grouped into three categories to reflect amyloid deposition, tau pathology, and neurodegeneration. The recommendations set out in the 2021 International Working Group by Dubois et al. in Lancet Neurology provide guidance on incorporating Alzheimer's disease biomarkers to aid in the diagnosis of Alzheimer's disease in clinical practice.^{2,3} The National Institute on Aging and the Alzheimer's Association's Clinical Guidelines for Alzheimer's Disease were revised in 2023. They recommend that a diagnosis of Alzheimer's disease should be defined biologically and through in vivo detection of abnormal biomarkers.⁴

Neuroimaging using MRI or CT of the brain can provide information on the effects of disease, such as patterns of atrophy and hippocampal volume loss.⁵ Newer neuroimaging techniques such as amyloid-PET provide the evidence of amyloid deposition in the brain.⁶ Such diagnostic technology may reveal disease pathology, which may or may not be clinically apparent at the time of scan. Moreover, such scans are relatively costly and scarce, and require intravenous radioactive tracers.⁷⁻⁹ Nevertheless, studies have shown that amyloid-PET has clinical utility in US community settings with implications for the number of Alzheimer's disease diagnoses made and patient management.⁹

Cerebrospinal fluid (CSF) biomarkers can be collected via lumbar puncture to provide evidence of amyloid or tau pathology and neurodegeneration. However, lumbar puncture is invasive, requires specialist training and equipment, and is not always acceptable to patients.^{10,11}

There has been a drive to develop blood biomarker technology that can provide equivalent information about CSF, and is quick, simple, and cost-effective to deliver. Blood biomarkers could 'democratize' the access to Alzheimer's disease biomarkers, where most UK memory services do not utilize amyloid-PET or CSF technologies.^{12,13} Frisoni et al.¹⁴ set out a strategic roadmap in 2017 to aid the systematic and coordinated research on new biomarker technology with the aim of incorporating them into the clinical setting. They described the clinical validation of Alzheimer's disease biomarkers through five phases, first by establishing analytical validity, and subsequently clinical validity, and clinical utility, using an approach adapted from the earlier validation of cancer biomarkers. With the advent of disease-modifying treatments for Alzheimer's disease, there will be increasing onus on the importance of biomarker technology to confirm the presence of amyloid pathology.¹⁵

The field is investigating other types of biomarkers, specifically focusing on digital biomarkers that integrate artificial intelligence and machine learning.^{16,17} Although still in the developmental stage and less extensively studied compared with blood or CSF biomarkers, these digital biomarkers are now more in demand. It is important to make the distinction between such digital biomarkers, which gather data, and online support tools that aid in synthesizing and contextualizing biomarker information. These digital biomarkers are beyond the scope of this narrative review.

Challenges in the use of diagnostic technology in clinical practice

The translation of dementia diagnosis biomarker research into clinical practice involves nuance and complexity. While the research sphere offers much information on candidate biomarkers and their potential sensitivity and specificity, there is much less focus on how this technology is integrated into clinical practice. Furthermore, coupled with this potential for greater biomarker access are a number of potential diagnostic challenges for clinicians.^{18,19}

First, which diagnostic technology should be used in the clinical assessment? The inherent properties of the investigation may act as barriers to utilization. As mentioned previously, some are physically invasive and costly. There is limited access to specialized tests such as amyloid-PET and MRI in the UK with long waiting times for referral.⁸ In a US simulation study, patients waited, on average, for an estimated 18 months to commence disease-modifying treatments, because of the limitations in diagnostic capacity and the lack of access to amyloid-PET imaging to confirm Alzheimer's disease pathology.²⁰

The patient and carer's choice is a cornerstone of the diagnostic assessment.²¹ Towards this, the clinician must ascertain how much information they want to receive. Patients will need to be provided with information about the benefits and risks of available biomarker investigations, so that they can make an informed choice.²² The clinician will need to feel confident in understanding what these tests can tell and what their limitations are, as well as in conveying this information using understandable and non-jargonistic terms.²³ It is essential to understand a patient's wishes and needs when considering whether or not to organize biomarker testing, because patients will differ in how they weigh the pros and cons of testing.²⁴ These decisions should occur through a process of shared decision-making, ensuring that it is patient-centred and tailored to each individual.¹⁸ Yet, in practice, shared decision-making is usually restricted by the information provided.^{18,25}

The clinician and patient will also need to consider the number of diagnostic tests appropriate to order and the patient burden associated with it. For example, a patient may be offered a form of neuroimaging alongside a blood biomarker investigation. While this may provide more information on multiple pathological domains, auch as neurodegeneration (CT/MRI scan) and amyloid/tau (blood biomarker), this could introduce direct conflict between two or more test results, or subject patients to unnecessary testing.

How does the clinician interpret the biomarker result? This is a particularly complex task, even in the research space, where blood biomarkers are continuous measures but most of them do not have validated cut-off points for real-world study populations. Ultra-sensitive assays have been developed for the detection of plasma amyloid β pathology, e.g. Aβ42/Aβ40 ratio, and tau pathophysiology, e.g. plasma phosphorylated tau species.²⁶ One p-tau181 assay and several plasma Aβ42/Aβ40 ratio assays have received FDA Breakthrough Device Designation in the USA. In Europe, several Aβ42/Aβ40 ratio assays have been CE marked.²⁷ Plasma neurofilament light (NfL) chain has been introduced in a UK clinical laboratory with an established reference range.²⁸ A clinician may need to manage a test result that is unclear or ambiguous.²⁹ Furthermore, currently there is no consensus on the best way to present biomarker results in a way that is meaningful and accessible to both clinicians and patients. The US Alzheimer's Association recently published the appropriate use of recommendations for blood biomarkers in Alzheimer's disease, which includes the need to develop tools for the interpretation of results and for communicating them to clinicians and patients.²⁶ While the main driver for diagnostic investigation is to increase certainty, this may not always be the outcome after testing.²⁴

New developments in the research field of clinical decision tools and training to support Alzheimer's disease diagnosis

Computerized clinical decision support systems have been developed to enhance and support clinicians in complex decision-making processes and are categorized by their ability to facilitate support in patient communication, clinical management decisions or diagnostic support, including the interpretation of laboratory results.³⁰

While there are many recommendations on the use of such 'e-tools' to broadly support clinicians in education and training around biomarker use and communicate this with patients, there is little specific guidance on how this should be achieved.²⁹ There are examples of web-based risk-stratifying tools to aid clinician decision-making in other fields of medicine.^{31,32} However, the use of these tools in the diagnosis of Alzheimer's disease has been less well investigated. Within dementia research, the Alzheimer Biomarkers in Daily Practice project is one of the most comprehensive studies to have addressed this.^{19,25} This group developed a webbased ('ADappt') tool for clinicians in the memory clinic, which is designed to calculate the personalized risk estimates of progression from mild cognitive impairment to dementia, to help clinicians interpret biomarker results, communicate results with patients and caregivers and engage patients in shared decision-making regarding diagnostic testing.^{19,33} The pilot data reported that usability was high. Clinicians found the tool was well integrated and easy to use.

No previous systematic review has been conducted to address this area of research, and few published studies addressed this. In this narrative review, we will focus on salient areas in the implementation of this technology to support clinicians alongside recommendations for their further development.

Online tools could be used to support clinicians and patients in a memory clinic setting in the diagnosis of Alzheimer's disease in the following ways:

- 1. To help clinicians decide which biomarker investigation (and any further tests) to order through shared decisionmaking with patients.
- 2. To support the interpretation of biomarker test results to an individual.
- 3. To calculate an individual's risk score.
- 4. To support clinicians in explaining and communicating biomarker test results.

A summary table of the available online tools is reported in Table 1.

Deciding which biomarker investigation to order through shared decision-making with patients

Clinicians need access to up-to-date information on the qualities of individual biomarkers and their potential benefits and drawbacks.³⁴ This information can then be distilled and discussed with patients. A clinician will often search for available information from several sources.³⁵ An online tool could provide a pooled resource summary of available evidence and information. The ADappt tool contains summarized information on current diagnostic tests available in the memory clinic, as well as the test's purpose, strengths and limitations.^{33,36}

Shared decision-making is an approach within which clinicians and patients, together with caregivers, share evidence and understand and agree with individualized preferences to reach a decision when there is more than one option available.³⁷ Shared decision-making is appropriate in the diagnostic assessment of Alzheimer's disease where more than one diagnostic option may be available.¹⁹ Shared decisionmaking in the setting of cognitive impairment may be more complex and will often require a collaborative approach involving the patient, clinician and another individual, such as the next of kin, an individual with Lasting Power of Attorney for health or someone in a caregiving role. Decision aids can assist in this shared decision-making. However, few are available in public access websites.³⁸ Further work is required to use thee consistent plain language terminology for biomarkers when communicating with patients and their families.²³ Accessing online-constructed example phrases may provide a conversation starter for clinicians to involve patients in shared decision-making.¹⁹

To support the interpretation of biomarker test results to an individual

Currently, biomarkers in the clinical setting (e.g. blood biomarkers) do not have validated health disease cut-points.²⁶ Clinicians who are used to having biomarker reference ranges for health and disease would need to interpret this result. Consideration is needed on how to present the result data and provide context for interpretation. This could involve calculating potential confounding factors or adjustments that may be necessary, such as weight or renal function. In this scenario, an online tool could serve as a prompt for the clinician to actively consider these factors and perform the required calculations and adjustments.^{30,39} This result could be plotted on a graph, e.g. using biomarker data ranges available from validation cohorts.⁴⁰ The NfL interface for physicians is an online tool in the research setting to aid clinicians in interpreting the plasma NfL levels in The Netherlands.⁴¹ The clinician enters the patient's age and plasma NfL result. The result is plotted on a figure, which shows the result in the context of the percentile NfL levels of controls and other diagnoses.

Computerized diagnostic systems have been programmed to perform automated tumour grading, electrocardiographic analysis, and arterial blood gas interpretation.³⁰ Unidimensional results are relatively easy for clinicians to interpret and have clearly defined decision boundaries. However, the transition from a normal to an abnormal result is more gradual with an Alzheimer's disease blood biomarker. The clinician may also need to hold in mind several parameters that can affect the test result interpretation. The parameters may include several biomarker results that need to be combined, such as a patient's age and another patient-specific factor, e.g. renal function. It therefore becomes increasingly difficult to 'visualize' the separation between a normal and an abnormal result.⁴² This is illustrated using a hypothetical Alzheimer's disease biomarker in Fig. 1. This figure illustrates just two parameters that need to be considered: age and biomarker result.

A pilot study to assess the acceptability of a blood biomarker, plasma phosphorylated-tau181 in a UK memory service, reported that clinicians wanted access to additional online tools to aid in the interpretation of the result.⁴⁰ This included video information and an interactive website with educational elements. Simulated case vignettes with multiple-choice biomarker results could provide clinicians with active examples of biomarker interpretation and mimic the clinical scenarios they may encounter.⁴³ An e-tool could also guide the clinician in the need for further investigations.

Table | A summary table of available online tools to support clinicians and patients in a memory clinic setting

	Tool	Summary of characteristics	Strengths	Limitations
Information on biomarker quality	ADappt tool	Provides a summary of currently available diagnostic tests in the memory clinic. Each test is summarized with information provided on test purpose, pros and cons	Interactive and easy to understand summaries. High usability. Effective design and interface	Difficulty in maintaining up-to-date information
Decision support aids	ADappt tool	Provides guidance on how to structure a discussion around diagnostic testing to facilitate shared decision-making	Example phrases are constructed	The tool is not integrated within electronic medical records
Biomarker test interpretation	ADappt tool	Summary of the information available from each diagnostic test, followed by the interpretation of the test result. Explanation on how the test result affects the chance of Alzheimer's disease dementia	Simplified summary of MRI head results, e.g. definite atrophy/ possible atrophy/no atrophy	Possibility of conflicting test results
	Plasma neurofilament light chain interface for physicians	Online tool. The clinician enters the patient's age and plasma neurofilament light chain result. The result is plotted on a figure that shows the result in the context of the percentile neurofilament light chain levels of controls and other diagnoses	Personalized and interactive tool. The summary information provided on neurofilament light chain and its interpretation	Data are not currently available to interpret the neurofilament light chain level in the context of other co-morbidities, e.g. renal function or body mass index
Risk score calculators	ADappt tool	Risk calculation module. Risk score calculator to understand an individual's risk of progression from mild cognitive impairment to Alzheimer's disease dementia based on patient demographics and biomarker results	The risk of I- and 3-year progression from mild cognitive impairment to Alzheimer's disease dementia is provided as a percentage score	Clinicians must be appropriately trained to provide information on risk to patients
	Cates Plot	A visual decision aid, usually to explain the number needed to treat when comparing placebo with treatment. Available for commencing/stopping a cholinesterase inhibitor and antipsychotic medications in dementia	Effective visualization strategy. This tool can be used to support shared decision-making with patients	Requires adequate explanation by the clinician to ensure patients understand the data presented
Support in communicating results	ADappt tool	Provides a personalized printable report sheet with a text explanation and their investigation results	A clear and concise overview of information	Currently unable to provide patient's personalized MRI brain image, instead uses a stock image

To calculate an individual's risk score

Clinician decision support tools can help clinicians in managing the amount and array of available information in the diagnostic assessment of Alzheimer's disease. The healthcare setting is sometimes seen as 'information rich' but 'knowledge poor'.^{44,45} While within healthcare systems there is an abundance of available data, analysis methods are required to extract pertinent information. Analysis tools can aid clinicians in making sense of and extracting meaningful information from the data. Some tools can be designed by drawing on large datasets, using algorithms to detect patterns, and supporting clinician decision-making using risk stratification, through novel machine learning.⁴⁵

Online risk score calculators are available to support clinicians in their decision-making in several medical specialties and have been successfully integrated into clinical practice. The Fracture Risk Assessment Tool is a frequently used fracture risk calculator.⁴⁶ Adjuvant Online is a tool used in oncology to calculate the risk of breast cancer recurrence if patients are treated with or without adjuvant therapy.^{19,32} The Q-RISK score and U-Prevent are online tools to calculate therapy benefits related with cardiovascular risk prevention.^{31,47}

Decision aids are available to support clinicians in prescribing antidementia medications (benefit) and antipsychotics (risk of harm) in the UK.^{48,49} An individual's risk score is

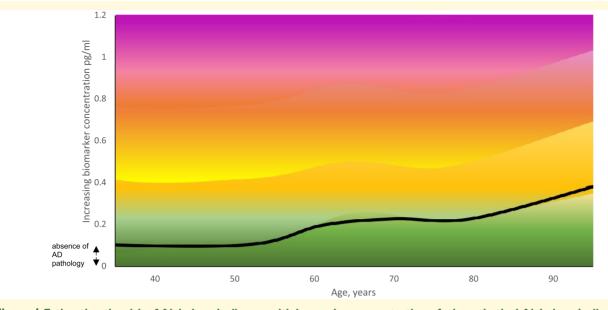


Figure 1 Estimating the risk of Alzheimer's disease with increasing concentration of a hypothetical Alzheimer's disease biomarker by increasing age (years). The black line represents the threshold between the presence or absence of Alzheimer's disease pathology. Alzheimer's disease pathology risk thresholds are represented by a graduation from green (low risk) to red (high risk).

sometimes depicted using a Cates plot,⁵⁰ which is a visual decision aid that provides four face categories, via a traffic light system, to explain the risk or benefit of an event (usually the number needed to treat) when comparing placebo with treatment in 100 people.⁵⁰⁻⁵² These tools and any future online calculator for Alzheimer's disease biomarker results could also provide further education and training for clinicians.

A risk score calculator could assist a clinician in a memory clinic setting to understand an individual's risk of progression from mild cognitive impairment to Alzheimer's disease dementia, as illustrated in the 'ADappt' tool or alternatively via a composite score to assess an individual's probability of Alzheimer's disease by drawing information on demographic and biomarker data.^{19,53} As the number of biomarkers increases, there will be a growing need for tools that can address differential diagnosis in a more nuanced manner. Currently, the most established markers identify the presence or absence of Alzheimer's disease amyloid pathology. However, with advancements in research, it is anticipated that a wider array of biomarkers may become available in the future, providing information for differential diagnoses including Alzheimer's disease, neurodegeneration or Lewy body pathology, among others.

Support clinicians in explaining and communicating biomarker test results

There are no current guidelines for communicating Alzheimer's disease biomarker results in a clinic setting.⁵⁴ There is,

however, detailed guidance published in research settings for explaining amyloid-PET results to individuals who are asymptomatic or have a diagnosis of mild cognitive impairment.⁵⁵⁻⁵⁷ These communication models use standardized language when describing the clinical significance of amyloid biomarkers.⁵⁸ Adjuncts to support clinicians in explaining results could be via interactive visual aids such as a traffic light system, where green indicates normal, amber intermediate and red abnormal biomarker results.¹⁹

Patients could be provided with a personalized printable report sheet with text explanation and their investigation results.¹⁹ This could include a stock image of, for example, an MRI head result or the patient's personalized image.

Barriers to implementation

There are barriers in the implementation of an e-tool in the clinical pathway and its translation from the research setting, and there may be difficulty in integrating tools into the existing workflow.^{59,60} Clinicians need to be aware of existing technology and buy into its use. Any information or data will need to be kept up to date and in line with a developing field. Separation of any e-tool from existing electronic medical records could create extra work for the clinician and a lack of harmony if it does not marry up with the existing system. An e-tool that uses existing system data must comply with data security standards such as General Data Protection Regulation.³⁰ The cost of implementing, integrating and maintaining an e-tool must be justified.³⁰ Clinicians have expressed a distrust of the output from such tools in previous studies.⁶¹ When piloting the 'ADappt' tool in Dutch memory services, barriers faced included technical difficulty, being

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blocked by the trust firewall and clinicians not having time available to use an additional e-tool in a consultation.¹⁹ Clinicians overcame these barriers by using the tool on a different device and using a discrete section of the website, e.g. the results page in the clinical discussion.

Conclusion and recommendations for future directions

Currently, there have been few studies that explore the use of online tools to support clinicians in using new diagnostic technology for Alzheimer's disease. Predominantly, the published literature has explored the use of an e-tool to support clinicians and patients in communicating biomarker results and the risk of progression in mild cognitive impairment. Further work is needed to develop effective e-tools, which must be both acceptable to clinicians, patients and carers and easily integrated into the local or national clinical pathway to ensure the feasibility of use. Such e-tools should be designed to provide support in key areas of Alzheimer's disease diagnosis: ordering biomarker investigations, calculating individual risk scores and interpretation and communication of results.

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Competing interests

The authors report no competing interests.

Data availability

Data sharing is not applicable to this article as no new data were created or analysed in this study.

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