

RUNNING HEAD: Memory precision in *APOE* ε4-carriers

Memory precision of object-location binding is unimpaired in *APOE* ε4-carriers with spatial navigation deficits

Helena M. Gellersen¹, Gillian Coughlan², Michael Hornberger³, Jon S. Simons^{1*}

¹Department of Psychology, University of Cambridge, United Kingdom

²Rotman Research Institute, Baycrest, Toronto, Canada

³ Norwich Medical School, University of East Anglia, Norwich, NR4 7QU, UK

*Corresponding author

jss30@cam.ac.uk

Department of Psychology

University of Cambridge

Downing Street

Cambridge CB2 3EB

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

Abstract

Research suggests that tests of memory fidelity, feature binding and spatial navigation are promising for early detection of subtle behavioural changes related to Alzheimer's disease (AD). In the absence of longitudinal data, one way of testing the early detection potential of cognitive tasks is through the comparison of individuals at different genetic risk for AD. Most studies have done so using samples aged 70 years or older. Here, we tested whether memory fidelity of long-term object-location binding may be a sensitive marker even among cognitively healthy individuals in their mid-60s by comparing participants at low and higher risk based on presence of the ϵ 4-allele of the apolipoprotein gene ($n=26$ ϵ 3 ϵ 3, $n=20$ ϵ 3 ϵ 4 carriers). We used a continuous report paradigm in a visual memory task that required participants to recreate the spatial position of objects in a scene. We employed mixture modelling to estimate the two distinct memory processes that underpin the trial-by-trial variation in localisation errors: retrieval success which indexes the proportion of trials where participants recalled any information about an object's position and the precision with which participants retrieved this information. Prior work has shown that these memory paradigms that separate retrieval success from precision are capable of detecting subtle differences in mnemonic fidelity even when retrieval success could not. Nonetheless, a Bayesian analysis found good evidence that ϵ 3 ϵ 4 carriers did not remember fewer object locations ($F(1, 42)=.450, p=.506, BF_{01}=3.02$), nor was their precision for the spatial position of objects reduced compared to ϵ 3 ϵ 3 carriers ($F(1, 42)=.12, p=.726, BF_{01}=3.19$). Because the participants in the sample presented here were a subset of a study on *APOE* effects on spatial navigation in the Sea Hero Quest game (Coughlan et al., 2019. *PNAS*, 116(9)), we obtained these data to contrast *APOE* effects on the two tasks within the same sample ($n=33$). Despite the smaller sample size, wayfinding deficits among ϵ 3 ϵ 4 could be replicated ($F(1, 33)=5.60, p=.024, BF_{10}=3.44$). Object-location memory metrics and spatial navigation scores were not correlated (all $r<.25, p>.1, 0<BF_{10}<3$). These findings show spared object-location binding in the presence of a detrimental *APOE* ϵ 4 effect on spatial navigation. This suggests that the sensitivity of memory fidelity and binding tasks may not extend to individuals with one ϵ 4-allele in their early to mid-60s. The results provide further support to prior proposals that spatial navigation may be a sensitive marker for the earliest AD-dependent cognitive changes, even before episodic memory.

Keywords: Alzheimer's disease, *APOE*, early detection, memory, spatial navigation

Abbreviations:

ACE: Addenbrookes Cognitive Examination

AD: Alzheimer's disease

***APOE*:** apolipoprotein

BF: Bayes Factor

ERC: entorhinal cortex

MCI: mild cognitive impairment

pU: proportion of incorrectly remembered trials as estimated in the mixture model approach

pT: proportion of correctly remembered trials as estimated in the mixture model approach

ROCF: Rey-Osterrieth Complex Figure

SD: standard deviation

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

1. Introduction

Alzheimer's disease (AD) has a long preclinical phase during which pathological neural changes occur without overt, detrimental effects on behaviour (Jack *et al.*, 2010; Sperling *et al.*, 2011; Jack and Holtzman, 2013; Sutphen *et al.*, 2015). This long preclinical phase offers the possibility of interventions that may target further pathological changes and prevent irreversible cell death (Chetelat *et al.*, 2010; Rentz *et al.*, 2013). Cognitive tests are the most cost-effective and simple way to screen for cognitive impairment related to dementia, yet standard neuropsychological tests typically fail to detect these subtle preclinical symptoms of AD pathology (Salmon, 2011; O'Donoghue *et al.*, 2018). In the absence of longitudinal data, individuals with high risk for late-onset AD based on the ϵ 4-allele of the apolipoprotein (*APOE*) gene are a good model to test the diagnostic sensitivity of cognitive tests because they are more likely than ϵ 3 ϵ 3 carriers to develop the disease, exhibit AD pathology at an earlier point in time and decline at a more rapid rate (Corder *et al.*, 1993; Raber *et al.*, 2004; Caselli *et al.*, 2011; Caselli and Reiman, 2013; Risacher *et al.*, 2013; Grilli *et al.*, 2018; Flowers and Rebeck, 2020). *APOE* ϵ 4-carriers exhibit deficits in tests of long-term feature binding, mnemonic fidelity and spatial navigation, making these tasks promising markers of incipient cognitive decline related to AD (Coughlan *et al.*, 2018; Stark *et al.*, 2019; Zokaei *et al.*, 2019). Yet, there are few studies testing these tasks in neuropsychologically unimpaired middle-aged ϵ 4-carriers, and even fewer studies looked at more than one of these different types of tasks in the same sample. Here, we determined whether a novel test of long-term object-location binding is sensitive to *APOE* effects in a sample that previously exhibited spatial navigation deficits (Coughlan *et al.*, 2019).

Older adults, individuals with mild cognitive impairment (MCI) and preclinical individuals with positive AD biomarkers exhibit significant deficits in mnemonic discrimination of novel and studied targets under conditions of high feature overlap (Trelle *et al.*, n.d.; Yassa *et al.*, 2010, 2011; Ally *et al.*, 2013; Stark *et al.*, 2013; Reagh *et al.*, 2014; Stark and Stark, 2017; Berron *et al.*, 2018, 2019; Leal and Yassa, 2018; Gellersen *et al.*, 2020; Webb *et al.*, 2020). Similarly, cognitively healthy preclinical adults (defined by *APOE* genotype or AD pathologies), as well as MCI and AD patients, also perform significantly worse in tests of feature binding, showing a marked decline in representational fidelity (Atienza *et al.*, 2011; Rentz *et al.*, 2011; Troyer *et al.*, 2012; Della Sala *et al.*, 2012; Hampel, 2013; Bastin *et al.*, 2014; Oedekoven *et al.*, 2015; Parra *et al.*, 2015, 2019; Van Geldorp *et al.*, 2015; Koppara *et al.*, 2015; Mowrey *et al.*, 2016; Pietto *et al.*, 2016; Chen and Chang, 2016; Liang *et al.*, 2016; Polcher *et al.*, 2017; Zokaei *et al.*, 2019; Delhay *et al.*, 2019; Konijnenberg *et al.*, 2019; Pavisic *et al.*, 2020; Valdés *et al.*, 2020; Korkki *et al.*, 2020).

We capitalise on current evidence for subtle cognitive deficits in preclinical AD by using a memory precision task with demands on memory binding and fidelity of mnemonic representations, abilities that are particularly affected by AD pathology even from preclinical stages onwards (Rentz *et al.*, 2013; Ritchie *et al.*, 2017; Berron *et al.*, 2019). We use study-test delays that preclude the use of short-term memory. *APOE* ϵ 4-carriers have an advantage in short study-test delays but may be predisposed to accelerated rate of forgetting thereafter (Zokaei *et al.*, 2019; Pavisic *et al.*, 2020). A longer study-test delay may be able to index such faster forgetting. We hypothesised that our task design may detect ϵ 4-dependent differences because 1) the task involves entorhinal and hippocampal mediated relational binding of objects and locations, which is impaired in prodromal AD (Charles *et al.*, 2004; Reagh *et al.*, 2014; Hampstead *et al.*, 2018; McIlvain *et al.*, 2018; Weigard *et al.*, 2020), 2) a continuous metric may be a more sensitive index than categorical measures of retrieval (Zokaei *et al.*, 2015; Korkki *et al.*, 2020), and 3) memory fidelity relies on communication between hippocampus and cortical regions, which exhibit altered connectivity in the early

RUNNING HEAD: Memory precision in *APOE* $\epsilon 4$ -carriers

course of AD (Buckner *et al.*, 2005; Sperling *et al.*, 2011; Jack *et al.*, 2015; Richter *et al.*, 2016; Xie, 2018; Stevenson *et al.*, 2018; Cooper and Ritchey, 2019; Harrison *et al.*, 2019; Sullivan *et al.*, 2019; Berron *et al.*, 2020; Foo *et al.*, 2020).

Only one study has tested the fidelity of relational binding with longer memory retention intervals using continuous report paradigms in an *APOE* genotyped cohort in their 60s (Zokaei *et al.*, 2019), showing a reduction in the fidelity of object-location binding for preclinical $\epsilon 4$ homozygote older adults. No such effect for was present in $\epsilon 3\epsilon 4$ heterozygotes when using the mean error between target location and response as a performance metric. The presence of an effect of the $\epsilon 4$ -allele on the fidelity of long-term object-memory binding is promising as it suggests that this task is potentially sensitive to preclinical AD-related changes even in individuals in their 60s. Performance reductions might be observed not just in $\epsilon 4$ homozygotes but also heterozygotes for object-location binding when using a more sensitive index than mean localisation error, such as localisation precision which controls for accessibility of any information from memory. Another option may be to increase interference by adding more objects to studied scenes to place further demands on transentorhinal and hippocampal processes, (Kirwan and Stark, 2007; Newsome *et al.*, 2012; Reagh and Yassa, 2014) thereby resulting in more misbinding errors among individuals with poorer mnemonic representations (Liang *et al.*, 2016; Hampstead *et al.*, 2018). Here, we use both approaches to investigate whether continuous report paradigms can be made even more sensitive to AD risk.

We examine the utility of this novel test of memory fidelity of relational binding that engages regions vulnerable to early AD, supplemented with a mixture modelling approach that specifically indexes precision, to test the effect of the $\epsilon 4$ -allele on the precision of object-location binding beyond short-term memory retention. We compare model-derived metrics with those used in prior studies with continuous report paradigms such as those by Zokaei *et al.* (2019) to determine if the separation of precision and retrieval success may be able to tease apart subtle *APOE* effects on memory abilities. We apply our test to a sample that has previously been characterised in terms of spatial navigation abilities (Coughlan *et al.*, 2019). An added benefit of our study is therefore to test whether a fidelity metric for spatial memory will be similarly sensitive to AD risk as spatial navigation measures. To our knowledge, no other study to date provides data on the effect of the $\epsilon 4$ -allele on spatial memory fidelity and spatial navigation in the same *APOE*-genotyped sample.

2. Methods and methods

2.1 Participants

The study was carried out at the University of East Anglia, Norwich with ethical approval from the Faculty of Medicine and Health Sciences Ethics Committee at UEA (Reference FMH/2016/2017-11). Exclusion criteria were cognitive impairment and neuropsychiatric conditions. Participants provided written informed consent before participation. The sample presented here was previously described by Coughlan and colleagues (2019). The sample size was based on that of prior studies that investigated the effect of the $\epsilon 4$ -allele on spatial navigation (Kunz *et al.*, 2015).

Forty-nine participants completed the spatial precision memory task. We included $n=26$ individuals with the $\epsilon 3\epsilon 3$ genotype aged 53 to 74 ($M=63.38$, $SD=6.07$; 13 females) and $n=20$ individuals with the $\epsilon 3\epsilon 4$ genotype aged 54 to 80 ($M=64.80$, $SD=6.83$; 5 females) for our main analysis. Three volunteers with the $\epsilon 4\epsilon 4$ genotype aged 63 or 64 years also completed the test battery ($M=63.33$, $SD=.58$; 1 female). Given the small number of $\epsilon 4$ homozygotes and the differences between $\epsilon 3\epsilon 4$ and $\epsilon 4\epsilon 4$ carriers in general, our main

RUNNING HEAD: Memory precision in *APOE* $\epsilon 4$ -carriers

analysis focused on a comparison of $\epsilon 3\epsilon 3$ carriers and $\epsilon 4$ heterozygotes to avoid the admixture of different genotypes. In a sensitivity analysis, we determined whether the addition of the high risk $\epsilon 4$ homozygotes influenced the results. Sample demographics and standard neuropsychological scores are shown in Table 1.

In this sample, Coughlan and colleagues previously tested spatial navigation performance at two time points (Coughlan *et al.*, 2019, 2020). Sixty participants (29 $\epsilon 3\epsilon 3$, 31 $\epsilon 3\epsilon 4$) completed the SHQ at baseline. At follow-up, 59 remained to complete the spatial navigation tasks, 49 of whom were also given the precision memory task and are included in this study. We then compared the spatial navigation data from the baseline assessment with our object-location precision memory task from the follow-up session. Although this has the caveat that the spatial navigation data were obtained 18 months prior to the memory data, we decided that the issue of practise effects at re-test was a greater confound because it could have allowed participants to develop strategies to better cope with the demands the spatial navigation task. In their test-retest analysis, Coughlan *et al.* (2020) suggest that this may have indeed been the case and that the reduction of novelty in the spatial navigation task may reduce its diagnostic utility because poor performers improved more than those with initially better scores. Using the first assessment of both memory and spatial navigation tasks is therefore more informative to determine whether effects of *APOE* can be observed in each cognitive function.

2.2 Precision memory task

Details of the precision memory task can be found in the Supplementary Material. Briefly, participants were asked to remember the identity and locations of objects in a scene. Each encoding display consisted of a trial-unique background image with three objects pseudorandomly arranged around an invisible circle centred at the midpoint of the image. Object positions were constrained to maintain a minimum of 62.04° between objects to avoid spatial overlap. Participants undertook five practice trials before beginning the actual task. The main task comprised five study-test blocks. In each of the five blocks, participants first viewed five displays during the study phase. After encoding, an interference task required participants to count backwards from a random number between 50 and 100 for 12 seconds to prevent active rehearsal of memorised displays. Each test trial began with an identification question where participants were asked to determine which of two presented objects had previously been shown. If they chose correctly, the associated background image appeared, and participants were asked to move the object around the screen to recreate its studied location as precisely as possible. Participants viewed 25 displays and completed 75 test trials, each containing an identification and a localisation question.

2.3 Spatial navigation task

To compare the effects of *APOE* on the object-location memory task and spatial navigation in this same sample, we obtained the previously published spatial navigation data (Coughlan *et al.*, 2019, 2020), from the Sea Hero Quest (SHQ) app (Coutrot *et al.*, 2018). The SHQ has previously been described in detail. Briefly, SHQ is a game in which participants navigate through a virtual environment to reach checkpoints described on a map they study at the beginning of each level. Crucially, the maps are shown in an allocentric perspective but once a level begins, participants navigate based on an egocentric viewpoint. Participants played three different levels. Performance metrics were wayfinding distance and average distance to the border of an environment to index border bias (Coughlan *et al.*, 2019).

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

2.4 *APOE* genotyping

DNA was collected using a Darcon tip buccal swab (LE11 5RG; Fisher Scientific). Buccal swabs were refrigerated at 2–4 °C until DNA was extracted using the QIAGEN QIAamp DNA Mini Kit (M15 6SH; QIAGEN). DNA was quantified by analyzing 2- μ L aliquots of each extraction on a QUBIT 3.0 fluorometer (LE11 5RG; Fisher Scientific). DNA extractions were confirmed by the presence of a DNA concentration of 1.5 μ g or higher per 100 μ g of AE buffer as indicated on the QUBIT reading. PCR amplification and plate read analysis was performed using Applied Biosystems 7500 Fast Real-Time PCR System (TN23 4FD; Thermo Fisher Scientific). TaqMan Genotyping Master Mix was mixed with two single-nucleotide polymorphisms of *APOE* (rs429358 at codon 112 and rs7412 at codon 158). These two single-nucleotide polymorphisms determine the genotype of *APOE*2, E3, and E4 (2007; Applied Biosystems).

2.5 Statistical analysis

2.5.1 Mixture modelling

Models fitted to the data and distribution of responses across all participants by genotype are shown in Fig. 2. We fit probabilistic mixture models to the location placement errors expressed as the degrees separating the response from the target (Zhang and Luck, 2008; Bays *et al.*, 2011; Suchow *et al.*, 2013; Richter *et al.*, 2016; Zokaei *et al.*, 2020). The approach aims to determine the distribution of trial responses in order to examine which retrieval mechanisms best explain the observed responses: i) correctly recalled locations, ii) random guesses or iii) a misbinding error in which the location of the target is confused with that of another object from the same display. Guess trials were modelled using a uniform distribution. The proportion of trials within the uniform distribution represents the guess rate pU and $1-pU$ expresses retrieval success pT . Correctly remembered items were modelled by a circular Gaussian (von Mises) distribution centred at the target location with its standard deviation reflecting the precision with which locations are recalled. Larger standard deviations (SD) correspond to lower localisation fidelity. Misbinding errors were modelled by von Mises distributions centred around the two distractor items.

To maximise comparability with the only other study on the effect of the *APOE* genotype on location memory precision (Zokaei *et al.*, 2020), we also used Bayesian modelling implemented with the MemToolbox in MATLAB 2016a (Suchow *et al.*, 2013). We fit three models to the error data collapsed across all participants by *APOE* genotype group to test whether which components could explain localisation performance. The models contained the following components (Fig. 2A): Model 1 (von Mises distribution) assumes that no guessing occurred; Model 2 (uniform + von Mises distribution) assumes that responses reflect a mixture of guessed trials and correctly recalled locations with response-to-target distance varying across trials; Model 3 (uniform + von Mises + von Mises for non-targets) extends Model 2 by assuming that some incorrect responses were due to object-location misbinding. Deviance Information Criterion favoured Model 2. All further analyses are conducted using this model. For more details on modelling and comparison with an alternative model fitting procedure based on work by Bays and colleagues (Richter *et al.*, 2016; Korkki *et al.*, 2020) refer to the Supplementary Material.

This approach allowed us to test if the *APOE* ϵ 4-allele affects the probability of correctly retrieving information from memory and/or mnemonic fidelity (i.e. precision with which this information is recalled). Mixture modelling is superior to other approaches that distinguish between retrieval success and fidelity of retrieved information because the estimation of the uniform distribution accounts for guess responses placed near the target item.

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

We calculated retrieval success and precision for each subject. To improve robustness of estimates for precision and retrieval success, we calculated a cut-off for guessing from the mixture modelling approach across the full sample following the examples of prior studies (for details see Supplementary Material) (Richter *et al.*, 2016; Korkki *et al.*, 2020). Localisation errors exceeding 63° response-to-target distance were deemed as failure to retrieve an object's location. For each subject we calculated retrieval success as the proportion of trials with errors $\leq 63^\circ$. A measure of imprecision was derived from the standard deviation across all responses with localisation errors $\leq 63^\circ$.

2.5.2 *APOE* group differences memory performance.

We employed a combination of frequentist (two-tailed tests with a statistical significance level of $p < .05$) and Bayesian methods to test for *APOE* genotype effects.

2.5.2.1 Mixture modelling by *APOE* genotype group. We first tested for differences in guessing (g) and imprecision (SD) estimates for the standard mixture models fit to all responses across subjects in the $\epsilon 3\epsilon 3$ -carrier and $\epsilon 3\epsilon 4$ -carrier group, respectively. To obtain a p -value, true group differences were compared to the distribution of standardised differences obtained from random group assignments over 1000 permutations (sample 1 with $n=26$ to match the number of participants in the $\epsilon 3\epsilon 3$ group; sample 2 with $n=20$, as in the $\epsilon 3\epsilon 4$ group). This approach has the advantage of operating on more robust model parameters due to reduced noise resulting from larger number of trials available for mixture modelling.

2.5.2.2 *APOE* effects based on single-subject scores. Next, we carried out analyses on individual subject data while controlling for nuisance variables using a linear model with sex and age as covariates and *APOE* genotype as between-subjects factor of interest. Dependent variables were the proportion of correctly identified items, and the measures of retrieval success and precision. Cohen's f^2 was used to denote the effect size of the R^2 -change from a model with covariates (age, sex) to a model with *APOE* genotype ($\epsilon 3\epsilon 3$ vs. $\epsilon 3\epsilon 4$). We also calculated the Bayes Factor for the contrast of the model with covariates and the full model with covariates and *APOE* genotype as between-subjects factor of interest using the R package *BayesFactor* (<https://CRAN.R-project.org/package=BayesFactor>). A Bayes Factor of >3 was deemed as good evidence in support of the alternative hypothesis if indexed by B_{10} and for the null hypothesis if indexed by B_{01} (Jeffreys, 1961; Keyesers *et al.*, 2020; Korkki *et al.*, 2020).

2.5.2.3 Supplementary analyses for precision memory. In order to make our results more comparable with prior studies that used a similar object-location binding paradigm without mixture modelling to separate retrieval success from precision (Zokaei *et al.*, 2017, 2019), we also calculated the mean absolute error between targets and responses to determine whether a modelling approach to separate retrieval success and memory precision may be more sensitive to detect *APOE* effects.

We conducted a control analysis termed 'nearest neighbour analysis' as used in prior work (Pertsov *et al.*, 2013; Zokaei *et al.*, 2019). This analysis allowed us to test whether there was a difference in the nature of incorrect responses between genetic groups by considering the occurrence of misbinding errors. A significant *APOE* effect on the distance to the nearest neighbour would suggest that error responses in the two groups are not caused by the same mechanisms. The group with significantly smaller nearest neighbour difference is likely to commit more misbinding errors.

Prior work has demonstrated an interaction between study-test delay and the *APOE* $\epsilon 4$ -allele on short-term memory versions of continuous object-location tests with $\epsilon 4$ -carriers at an advantage at short delays of 1s which subsides at longer delays beyond 4s (Zokaei *et al.*, 2017, 2020). Using the correlation between localisation error and study-test delay in each

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

subject, we tested whether ϵ 4-carriers exhibit steeper performance decline as a function of delay.

Finally, we carried out robustness analyses to determine whether inclusion of high-risk homozygous ϵ 4 ϵ 4 carriers affected our results using the same models described above. In these analyses the between-subjects factor was ϵ 4-allele carrier status (none vs. any)..

2.5.3 *APOE* group differences in spatial navigation performance and its relationship to object-location memory. We tested whether the *APOE* effect previously observed in the full sample of $n=60$ participants persisted in this smaller subset of participants who also completed the memory task ($n=37$). We did so by running general linear models with *APOE*, sex and age on the spatial navigation outcome measures. Dependent variables were mean wayfinding distance and border bias in the Sea Hero Quest game (Coughlan *et al.*, 2019). We also tested for an association between spatial navigation and object-location memory by running Pearson correlations, supplemented with Bayesian analyses.

2.6 Data availability

Summary data for precision memory metrics and spatial navigation are available [through](https://osf.io/42sp9/) the Open Science Framework (memory: <https://osf.io/42sp9/>; spatial navigation: <https://osf.io/6adqk/>). The code for Bayesian mixture modelling with the MemToolbox can be obtained through <http://visionlab.github.io/MemToolbox/> (Suchow *et al.*, 2013). Code for mixture modelling using a maximum likelihood estimation implemented by Paul Bays and colleagues is available at <https://www.bayslab.com/toolbox/index.php> (Bays *et al.*, 2011).

3. Results

A summary of the memory performance metrics as a function of *APOE* group is shown in Table 2. Fig. 3 shows memory and spatial navigation performance by genotype.

3.1 Group differences based on memory metrics derived from modelling across subjects by *APOE* group. The results of the permutation analysis are shown in Fig. 3A. The error distributions across subjects in each *APOE* group exhibited considerable overlap. The distribution of permutation-based group differences derived from random assignments to groups confirmed that guessing and imprecision was equivalent in the two *APOE* groups (guessing: $z=.31$, $p=.704$; imprecision: $z=-.59$, $p=.555$).

3.2 Group differences based on single-subject memory metrics. The linear models controlling for age and sex found no significant effect of *APOE* on identification of objects ($F_{(1,42)}=1.14$, $p=.292$, $f^2=.03$, $BF_{01}=2.17$), retrieval success for object locations ($F_{(1,42)}=.45$, $p=.506$, $f^2=.01$, $BF_{01}=3.02$), the precision of recreating locations of correctly retrieved items ($F_{(1,42)}=.12$, $p=.726$, $f^2<.01$, $BF_{01}=3.19$), or the mean absolute angular disparity between targets and responses across all trials ($F_{(1,42)}=0.12$, $p=.729$, $f^2<.01$, $BF_{01}=3.37$).

3.3 Misbinding errors and study-test delay. ϵ 4-carriers did not commit more misbinding errors ($F_{(1,42)}=.83$, $p=.367$, $f^2=.02$, $BF_{01}=2.54$) or exhibited accelerated forgetting as a function of study-test delay ($F_{(1,42)}=.02$, $p=.890$, $f^2<.01$, $BF_{01}=3.37$). All null results held even after inclusion of ϵ 4 homozygotes (Supplementary Material).

3.4 Effects of *APOE* ϵ 4 on spatial navigation

In line with the findings from the full sample in Coughlan and colleagues (2019), among participants who completed both the memory precision and the Sea Hero Quest task ϵ 3 ϵ 4 carriers had a longer mean wayfinding distance than ϵ 3 ϵ 3 carriers ($F_{(1,33)}=5.60$, $p=.024$, $f^2=.17$, $BF_{10}=3.44$). ϵ 3 ϵ 4 carriers in our sub-sample also showed a significant the border bias, although the Bayes Factor did not quite reach the required cut-off of 3 ($F_{(1,33)}=4.54$, $p=.041$, $f^2=.14$, $BF_{10}=2.55$), as it did in the original larger sample ($BF_{10}=4.22$).

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

Neither wayfinding distance, nor border bias significantly correlated with retrieval success, precision, mean absolute localisation error, or swap errors (all $r < .25$, $p > .1$). However, the Bayesian analysis could not establish clear support for the null hypothesis for the absence of associations between the object-location memory and spatial navigation performance metrics (all $0 < \text{BF}_{10} < 3$).

4. Discussion

In this study, we tested whether the precision of long-term memory for object-location binding is affected in healthy middle- and older-aged *APOE* ϵ 4-carriers who do not exhibit impairments on standard neuropsychological tests. We used a continuous report paradigm in which participants were asked to recreate object locations as precisely as possible (Richter *et al.*, 2016) and employed Bayesian mixture modelling to separate memory retrieval success from the precision of retrieved locations (Bays *et al.*, 2011; Suchow *et al.*, 2013). We hypothesised that the precision task combined with mixture modelling may be capable of identifying subtle changes in memory fidelity in preclinical *APOE* ϵ 4-carriers. Previously, preclinical ϵ 4 homozygotes at high risk of AD were impaired on a similar long-term memory fidelity task, while heterozygotes were not (Zokaei *et al.*, 2019). Here, we aimed to increase sensitivity of such continuous report paradigms by increasing the to-be-recalled information per test display and by separating memory precision from retrieval success. We then tested if these adjustments may be capable of picking up subtle differences between controls and a genetic risk group, even if the risk group was comprised of individuals with moderate genetic risk of AD (ϵ 4 heterozygotes), around half of whom are expected to develop the disease (Corder *et al.*, 1993).

However, we found robust evidence for the absence of an effect of the ϵ 4-allele on object-location long-term memory performance in middle-aged and older adults, regardless of whether the risk groups included only ϵ 4 heterozygotes or additionally added the ϵ 4 high-risk homozygotes. Carriers of the ϵ 4-allele did not recall fewer locations of objects, nor was the precision of their retrieved object-location associations affected. ϵ 4-carriers also did not commit more misbinding errors of item identity and location. There was no evidence for accelerated forgetting in ϵ 4-carriers as opposed to non-carriers. To our knowledge, this is the first study comparing cognitively healthy *APOE* genotype groups, while using a mixture modelling approach to separate retrieval success from retrieval precision in a task with study-test delays that prevented the involvement of short-term memory. Intriguingly, despite this absence of spatial memory deficits, the ϵ 4-carriers in this sample did exhibit altered wayfinding trajectories in real-time while navigating a virtual environment in the Sea Hero Quest game (Coughlan *et al.*, 2019). Moreover, performance on object-location memory and spatial navigation were unrelated.

Few studies have previously investigated memory fidelity in individuals at higher risk for AD during preclinical stages of the disease. Preclinical individuals with higher AD risk based on biomarkers or the *APOE* genotype have been reported to show poorer performance in mnemonic discrimination (combined group of heterozygotes and homozygotes) and continuous report tasks of feature binding in long-term memory (homozygotes) (Liang *et al.*, 2016; Sinha *et al.*, 2018; Berron *et al.*, 2019). Specifically, they exhibit a greater tendency to falsely label as old novel lures that are similar to studied stimuli (Sheppard *et al.*, 2016; Sinha *et al.*, 2018; Berron *et al.*, 2019). They also have higher rates of misbinding, larger object localisation errors (Zokaei *et al.*, 2019) and exhibit accelerated forgetting (Zokaei *et al.*, 2019; Pavisic *et al.*, 2020).

These prior findings suggest that both, aspects of mnemonic discrimination and precision of relational binding may be sensitive to early AD. However, comparisons between

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

these two tasks in terms of their relative sensitivity to AD risk cannot be made at this point given the differences in samples of studies with these tasks in terms of age, neuropsychological deficits, proportion of ϵ 4 heterozygotes and homozygotes and presence of AD pathology (Liang *et al.*, 2016; Sheppard *et al.*, 2016; Sinha *et al.*, 2018; Berron *et al.*, 2019, Leal *et al.*, 2019a; Maass *et al.*, 2019; Zokaei *et al.*, 2019). Based on one prior study, performance on these two tasks is related and may involve similar but also somewhat dissociable mechanisms (Clark *et al.*, 2017). Future studies should aim to compare the sensitivity of mnemonic discrimination tasks and relational binding tasks for the early detection of AD in the same sample.

Based on prior findings of memory fidelity metrics as potentially sensitive markers of preclinical AD, it may be surprising that we did not find an *APOE* effect on memory. However, previous studies have included individuals at higher genetic risk due to presence of the ϵ 4 ϵ 4 genotype or familial AD markers (Liang *et al.*, 2016; Zokaei *et al.*, 2019) or included samples that were on average 5 years older than ours (mean ages of 70 vs. 65 years) and which included neuropsychologically impaired individuals (Sheppard *et al.*, 2016; Sinha *et al.*, 2018). Our findings therefore suggest that the deficit in object-location memory previously identified could not be detected in individuals that were younger and in a lower genetic risk category, even when using high-sensitivity metrics derived from mixture modelling. As a result, our results do not stand in contrast to prior findings but rather provide information on the potential diagnostic reach of these tasks.

An alternative strategy to test the sensitivity of early detection tasks is to classify cognitively normal preclinical older adults based on tau and amyloid AD biomarker status. To date, this has been done to test for the sensitivity of mnemonic discrimination tests, which show a correlation between both tau and amyloid beta loads with mnemonic discrimination performance (Marks *et al.*, 2017; Berron *et al.*, 2019, Leal *et al.*, 2019b; Maass *et al.*, 2019; Webb *et al.*, 2020). Mean ages in these samples (70+) tend to be significantly older than the participants in the present study (~65), although in one study the association between tau levels and object mnemonic discrimination could still be observed in individuals aged below 70 years (Berron *et al.*, 2019). Interestingly, the association of AD biomarker concentration and mnemonic discrimination deficits remained even after accounting for *APOE* status (Webb *et al.*, 2020). Findings from these studies suggest that risk classification based on biomarkers, as opposed to ϵ 4-genotype, may be a better strategy to test the sensitivity of memory precision for early detection of AD in preclinical samples aged 70 or younger without cognitive signs on standard tests (Sperling *et al.*, 2020).

Despite the absence of a precision memory deficit in the present sample, Coughlan and colleagues (2019) described suboptimal navigation patterns in these same ϵ 3 ϵ 4 carriers 18-months prior to testing (a subset of whom were enrolled in this study). Here, we could reproduce the same wayfinding deficit in the subsample of participants who also completed the precision memory task. This subtle navigational deficit was attributed to a bias toward navigating close to environmental boundaries, as previously documented in an independent cohort (Kunz *et al.*, 2015). This very specific impairment may be a result of early tau pathology in the ERC thought to alter the integrity of grid cell representations, which are essential for updating self-motion during navigation (Lithfous *et al.*, 2013; Kunz *et al.*, 2015; Coughlan *et al.*, 2019; Bierbrauer *et al.*, 2020; Levine *et al.*, 2020). This interpretation is in line with recent evidence suggesting that preclinical ϵ 4-carriers only exhibit spatial navigation deficits in the absence of nearby landmarks or environmental boundaries that normally correct for accumulating temporal error in the grid-cell code (Hardcastle *et al.*, 2015; Bierbrauer *et al.*, 2020).

Although grid cells are most famously involved in spatial navigation, they also support visual memory (Killian *et al.*, 2012). Research suggests that both visual and

RUNNING HEAD: Memory precision in *APOE* $\epsilon 4$ -carriers

navigational processes are supported by the entorhinal cortex via common mechanisms that include the formation of spatial or visual maps via grid cells (Nau *et al.*, 2018; Bicanski and Burgess, 2019). Specifically, grid cells code for spatial locations in a visual scene much in the same way in which they code for space during exploration of a 3D environment (Killian *et al.*, 2012; Nau *et al.*, 2018). Based on these findings it has been proposed that grid cells support both spatial navigation and relational memory (Bicanski and Burgess, 2019). It may therefore be surprising that we did not find any effect in our spatial memory precision task and that object-location memory was unrelated to spatial navigation deficits. However, the border bias is a very specific behaviour in $\epsilon 4$ -carriers that appears when arenas have larger open spaces where anchoring spatial maps to nearby landmarks cannot be used as a corrective strategy (Kunz *et al.*, 2015; Coughlan *et al.*, 2019; Bierbrauer *et al.*, 2020). Therefore, it has no direct equivalent in 2D visual scene memory in our precision task. This may explain why there is an effect of the $\epsilon 4$ -allele on virtual reality spatial navigation but not in object-location memory precision in our sample. A preference for environmental borders may indeed be the very first sign of AD risk dependent behavioural changes, whereas impairment in relational memory may arise at a later stage (Berteau-Pavy *et al.*, 2007; Sheppard *et al.*, 2016; Sinha *et al.*, 2018).

Despite our relatively small sample size, our power analysis suggested that our study had moderate power to detect an *APOE* effect on precision memory similar in magnitude to that that in Coughlan *et al.* (2019) (Supplementary Material). Even though power was moderate, we could replicate the navigation deficit in this smaller subsample and our Bayesian analysis provided good evidence in favour of a null effect for memory, suggesting that the absence of a genotype effect was not simply due to an inadequate sample size. If a genotype effect on object-location precision does indeed exist in this sample, it is likely to be rather small and may be less meaningful for early detection efforts. This small effect may in part be due to the high heterogeneity of $\epsilon 3\epsilon 4$ carriers, given that only a subgroup will move on to actually develop AD (Raber *et al.*, 2004). However, the fact that spatial navigation deficits can still be detected even with a small sample as seen here and elsewhere (Kunz *et al.*, 2015; Coughlan *et al.*, 2019; Bierbrauer *et al.*, 2020), suggests that it is indeed possible to find genotype effects on cognition with a sensitive task, even though only 47% of $\epsilon 3\epsilon 4$ carriers will move on to develop AD. Our key conclusion, namely that there is no clear object-location memory deficit in $\epsilon 3\epsilon 4$ carriers at this age and therefore tests of relational memory may only detect $\epsilon 4$ -dependent deficits at a later point along the AD continuum can still be supported.

To test whether this is indeed the case, it would be informative to follow up the present sample longitudinally to compare participants who do or do not subsequently exhibit cognitive decline associated with AD. Additionally, as discussed above, a promising strategy to test the sensitivity of the precision task in preclinical cases in future studies may be to use biomarkers for classifying individuals into risk groups. This would not only allow studies to determine the sensitivity of memory fidelity metrics but to also assess the specificity of these tasks to AD-related cognitive decline. This is particularly important given the high heterogeneity of $\epsilon 4$ -carriers and MCI patients. To date there is still a lack of studies on memory fidelity that stratify MCI patient groups based on AD biomarkers (Troyer *et al.*, 2012; Koppara *et al.*, 2015; Mowrey *et al.*, 2016; Lu *et al.*, 2020).

Finally, we argue that it is unlikely that the null findings for object-location memory can be explained on the basis of antagonistic pleiotropy where middle-aged $\epsilon 4$ -carriers still have an advantage over $\epsilon 3\epsilon 3$ carriers or could stave off the presence of early AD pathology. This explanation is supported for short-term object-location memory (Zokaei *et al.*, 2017, 2020; Lu *et al.*, 2020). However, it may be less applicable in the case of our results in a task that is more reliant on long-term memory processes and the medial temporal lobe (Berteau-

RUNNING HEAD: Memory precision in *APOE* ε4-carriers

Pavy *et al.*, 2007; De Blasi *et al.*, 2009; Haley *et al.*, 2010; Wolk and Dickerson, 2010; Greenwood *et al.*, 2014; Emrani *et al.*, 2020). Large-scale studies and meta-analyses across the lifespan have called into question the antagonistic pleiotropy hypothesis in the case of long-term memory (Salvato, 2015; O'Donoghue *et al.*, 2018; Weissberger *et al.*, 2018; Henson *et al.*, 2020) (Salvato, 2015; Weissberger *et al.*, 2018; Henson *et al.*, 2020). There is only little support for an ε4-dependent advantage in young age (Stening *et al.*, 2016) but none for midlife (G. *et al.*, 2016), and by older age (comparable to the age in our sample), homozygotes exhibit greater localisation errors than ε3ε3 carriers (Zokaei *et al.*, 2019). These prior studies suggest that any potential positive effects of the ε4-allele on spatial memory tasks similar to our object-location paradigm in young adulthood may not carry into late midlife. The effects of the ε4-genotype on long- and short-term memory may unfold differently across the lifespan and we deliberately designed our task to tap into long-term retention processes for which the prodromal hypothesis of *APOE*-ε4 is a more likely explanation.

To our knowledge this is the first study to employ a modelling approach to separate episodic memory retrieval success and precision and test the sensitivity of mnemonic fidelity metrics to preclinical AD risk as measured in a contrast of ε3ε3 and ε3ε4 carriers. Prior work in high risk AD individuals (familial, ε3ε4/ε4ε4, tau and amyloid positive cases) has suggested that object-location memory fidelity may be a sensitive marker for preclinical AD cases and that this effect can be detected in samples aged 70 and older (Liang *et al.*, 2016; Sheppard *et al.*, 2016; Sinha *et al.*, 2018; Zokaei *et al.*, 2019; Webb *et al.*, 2020). We provide robust evidence that this may not be the case for middle-aged ε3ε4 carriers who were, on average, five years younger than individuals in prior studies. The sensitivity of memory fidelity tasks may therefore not extend to ε4 heterozygotes in their early to mid-60s. Despite no *APOE* genotype effect on object-location memory precision, ε3ε4 carriers in the same sample did exhibit subtle behavioural deficits in spatial navigation. These results provide further support to prior proposals that spatial navigation may be a sensitive marker for the earliest AD-dependent cognitive changes, even before episodic memory (Kunz *et al.*, 2015; Coughlan *et al.*, 2018). More research in preclinical AD is needed to confirm this hypothesis by direct comparisons of memory fidelity and spatial navigation tasks.

Acknowledgements: The authors would like to thank their funders and all volunteers who have participated in this study.

Funding: This work was supported by an Alzheimer's Research UK grant (ARUK-SHQ2018-001). HMG is funded by a Medical Research Council doctoral training grant (#RG86932) and a Pinsent Darwin Award. GC was funded by a Foundation Grant from the Canadian Institutes of Health Research (#143311), MH by the Biotechnology and Biological Sciences Research Council, National Institute for Health Research, Wellcome Trust and the UK Department for Transport and JSS by a James S. McDonnell Foundation Scholar award #220020333. The funders had no role in the conceptualisation, analysis or publication of this data.

Competing interests: The authors have no competing interests to declare.

Data availability statement: Data are available at <https://osf.io/42sp9/>

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

References

- Ally BA, Hussey EP, Ko PC, Molitor RJ. Pattern separation and pattern completion in Alzheimer's disease: Evidence of rapid forgetting in amnesic mild cognitive impairment. *Hippocampus* 2013; 23: 1246–58.
- Atienza M, Atalaia-Silva KC, Gonzalez-Escamilla G, Gil-Neciga E, Suarez-Gonzalez A, Cantero JL. Associative memory deficits in mild cognitive impairment: The role of hippocampal formation. *Neuroimage* 2011; 57: 1331–42.
- Bastin C, Bahri MA, Miévis F, Lemaire C, Collette F, Genon S, et al. Associative memory and its cerebral correlates in Alzheimer's disease: Evidence for distinct deficits of relational and conjunctive memory. *Neuropsychologia* 2014; 63: 99–106.
- Bays PM, Catalao RFG, Husain M. The precision of visual working memory is set by allocation of a shared resource. *J Vis* 2011; 9
- Berron D, Cardenas-blanco A, Bittner D, Metzger CD, Spottke A, Heneka MT, et al. Higher CSF Tau Levels Are Related to Hippocampal Hyperactivity and Object Mnemonic Discrimination in Older Adults. *J Neurosci* 2019; 39: 8788–97.
- Berron D, Neumann K, Maass A, Schütze H, Fliessbach K, Kiven V, et al. Age-related functional changes in domain-specific medial temporal lobe pathways. *Neurobiol Aging* 2018; 65: 86–97.
- Berron D, van Westen D, Ossenkoppele R, Strandberg O, Hansson O. Medial temporal lobe connectivity and its associations with cognition in early Alzheimer's disease. *Brain* 2020; 143: 1233–48.
- Berteau-Pavy F, Park B, Raber J. Effects of sex and *APOE* ϵ 4 on object recognition and spatial navigation in the elderly. *Neuroscience* 2007; 147: 6–17.
- Bicanski A, Burgess N. A Computational Model of Visual Recognition Memory via Grid Cells. *Curr Biol* 2019; 29: 979-990.e4.
- Bierbrauer A, Kunz L, Gomes CAA, Luhmann M, Deuker L, Getzmann S, et al. Unmasking selective path integration deficits in Alzheimer's disease risk carriers. *Sci Adv* 2020; 6: 1–22.
- De Blasi S, Montesanto A, Martino C, Dato S, De Rango F, Bruni AC, et al. *APOE* polymorphism affects episodic memory among non demented elderly subjects. *Exp Gerontol* 2009; 44: 224–7.
- Buckner RL, Snyder AZ, Shannon BJ, LaRossa G, Sachs R, Fotenos AF, et al. Molecular, Structural, and Functional Characterization of Alzheimer's Disease: Evidence for a Relationship between Default Activity, Amyloid, and Memory. *J Neurosci* 2005; 25: 7709–17.
- Caselli RJ, Dueck AC, Locke DEC, Hoffman-Snyder CR, Woodruff BK, Rapcsak SZ, et al. Longitudinal modeling of frontal cognition in *APOE* ϵ 4 homozygotes, heterozygotes, and noncarriers. *Neurology* 2011; 76: 1383–8.
- Caselli RJ, Reiman EM. Characterizing the preclinical stages of Alzheimer's disease and the prospect of presymptomatic intervention. *J Alzheimer's Dis* 2013; 33
- Charles DP, Browning PGF, Gaffan D. Entorhinal cortex contributes to object-in-place scene memory. *Eur J Neurosci* 2004; 20: 3157–64.
- Chen P-C, Chang Y-L. Associative memory and underlying brain correlates in older adults with mild cognitive impairment. *Neuropsychologia* 2016; 85: 216–25.
- Chetelat G, Villemagne VL, Bourgeat P, Pike KE, Jones G, Ames D, et al. Relationship between atrophy and beta-amyloid deposition in Alzheimer disease. *Ann Neurol* 2010; 67: 317–24.
- Clark R, Tahan AC, Watson PD, Severson J, Cohen NJ, Voss M. Aging affects spatial reconstruction more than spatial pattern separation performance even after extended practice. *Hippocampus* 2017; 27: 716–25.

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

- Cooper RA, Ritchey M. Cortico-hippocampal network connections support the multidimensional quality of episodic memory. *Elife* 2019; 8: 1–37.
- Corder EH, Saunders AM, Strittmatter WJ, Schmechel DE, Gaskell PC, Small GW, et al. Gene dose of apolipoprotein E type 4 allele and the risk of Alzheimer’s disease in late onset families. *Science* (80-) 1993; 261: 921–3.
- Coughlan G, Coutrot A, Khondoker M, Minihane AM, Spiers H, Hornberger M. Toward personalized cognitive diagnostics of at-genetic-risk Alzheimer’s disease. *Proc Natl Acad Sci* 2019; 116: 201901600.
- Coughlan G, Laczó J, Hort J, Minihane AM, Hornberger M. Spatial navigation deficits — overlooked cognitive marker for preclinical Alzheimer disease? *Nat Rev Neurol* 2018; 14: 1–11.
- Coughlan G, Puthusseryppady V, Lowry E, Gillings R, Spiers H, Minihane AM, et al. Test-retest reliability of spatial navigation in adults at-risk of Alzheimer’s disease. *PLoS One* 2020; 15: 9–11.
- Coutrot A, Silva R, Manley E, de Cothi W, Sami S, Bohbot VD, et al. Global Determinants of Navigation Ability. *Curr Biol* 2018; 28: 2861-2866.e4.
- Delhaye E, Bahri MA, Salmon E, Bastin C. Impaired perceptual integration and memory for unitized representations are associated with perirhinal cortex atrophy in Alzheimer’s disease. *Neurobiol Aging* 2019; 73: 135–44.
- Emrani S, Arain HA, DeMarshall C, Nuriel T. APOE4 is associated with cognitive and pathological heterogeneity in patients with Alzheimer’s disease: a systematic review. *Alzheimer’s Res Ther* 2020; 12: 1–19.
- Flowers SA, Rebeck GW. APOE in the normal brain. *Neurobiol Dis* 2020; 136
- Foo H, Mather KA, Jiang J, Thalamuthu A, Wen W, Sachdev PS. Genetic influence on ageing-related changes in resting-state brain functional networks in healthy adults: A systematic review. *Neurosci Biobehav Rev* 2020; 113: 98–110.
- G. S, E.Z. P, T. M, A.C. N, Salvato G, Patai EZ, et al. Apolipoprotein ϵ 4 breaks the association between declarative long-term memory and memory-based orienting of spatial attention in middle-aged individuals. *Cortex* 2016; 82: 206–16.
- Van Geldorp B, Heringa SM, Van Den Berg E, Olde Rikkert MGM, Biessels GJ, Kessels RPC. Working memory binding and episodic memory formation in aging, mild cognitive impairment, and Alzheimers dementia. *J Clin Exp Neuropsychol* 2015; 37: 538–48.
- Gellersen HM, Trelle AN, Henson RNRN, Simons JS. Executive function and high ambiguity perceptual discrimination contribute to individual differences in mnemonic discrimination in older adults. *PsyArXiv* 2020
- Greenwood PM, Espeseth T, Lin MK, Reinvang I, Parasuraman R. Longitudinal change in working memory as a function of APOE genotype in midlife and old age. *Scand J Psychol* 2014; 55: 268–77.
- Grilli MD, Wank AA, Berceel JJ, Ryan L. Evidence for Reduced Autobiographical Memory Episodic Specificity in Cognitively Normal Middle-Aged and Older Individuals at Increased Risk for Alzheimer’s Disease Dementia. *J Int Neuropsychol Soc* 2018; 24: 1073–83.
- Haley GE, Berteau-Pavy F, Park B, Raber J. Effects of ϵ 4 on Object Recognition in the Non-Demented Elderly. *Curr Aging Sci* 2010; 3: 127–37.
- Hampel H. Amyloid- β and cognition in aging and Alzheimer’s disease: Molecular and neurophysiological mechanisms. *J Alzheimer’s Dis* 2013; 33
- Hampstead BM, Towler S, Stringer AY, Sathian K. Continuous measurement of object location memory is sensitive to effects of age and mild cognitive impairment and related to medial temporal lobe volume. *Alzheimer’s Dement Diagnosis, Assess Dis Monit* 2018; 10: 76–85.
- Hardcastle K, Ganguli S, Giocomo LM. Environmental Boundaries as an Error Correction

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

Mechanism for Grid Cells. *Neuron* 2015; 86: 827–39.

Harrison TM, Maass A, Adams JN, Du R, Baker SL, Jagust WJ. Tau deposition is associated with functional isolation of the hippocampus in aging [Internet]. *Nat Commun* 2019;

10 Available from: <http://dx.doi.org/10.1038/s41467-019-12921-z>

Henson RN, Suri S, Knights E, Rowe JB, Kievit RA, Lyall DM, et al. Effect of apolipoprotein E polymorphism on cognition and brain in the Cambridge Centre for Ageing and Neuroscience cohort. *Brain Neurosci Adv* 2020; 4: 239821282096170.

Jack CR, Holtzman DM. Biomarker modeling of Alzheimer’s disease. *Neuron* 2013; 80: 1347–58.

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: 119–28.

Jack CR, Wiste HJ, Weigand SD, Knopman DS, Vemuri P, Mielke MM, et al. Age, Sex, and *APOE* ϵ 4 Effects on Memory, Brain Structure, and β -Amyloid Across the Adult Life Span. *JAMA Neurol* 2015; 72: 511.

Jeffreys H. *Theory of Probability*. 3rd ed. Oxford, UK: Oxford University Press; 1961

Keyesers C, Gazzola V, Wagenmakers EJ. Using Bayes factor hypothesis testing in neuroscience to establish evidence of absence. *Nat Neurosci* 2020; 23: 788–99.

Killian NJ, Jutras MJ, Buffalo EA. A map of visual space in the primate entorhinal cortex. *Nature* 2012; 491: 761–4.

Kirwan CB, Stark CEL. Overcoming interference: An fMRI investigation of pattern separation in the medial temporal lobe. *Learn Mem* 2007; 14: 625–33.

Konijnenberg E, den Braber A, ten Kate M, Tomassen J, Mulder SD, Yaqub M, et al.

Association of amyloid pathology with memory performance and cognitive complaints in cognitively normal older adults: a monozygotic twin study. *Neurobiol Aging* 2019; 77: 58–65.

Koppara A, Frommann I, Polcher A, Parra MA, Maier W, Jessen F, et al. Feature Binding Deficits in Subjective Cognitive Decline and in Mild Cognitive Impairment. *J Alzheimer’s Dis* 2015; 48: S161–70.

Korkki SM, Richter FR, Jeyarathnarajah P, Simons JS. Healthy Ageing Reduces the Precision of Episodic Memory Retrieval. *Psychol Aging* 2020; 35: 124–42.

Kunz L, Schröder TN, Lee H, Montag C, Lachmann B, Sariyska R, et al. Reduced grid-cell-like representations in adults at genetic risk for Alzheimer’s disease. *Science* (80-) 2015; 350: 430–3.

Leal SL, Ferguson LA, Harrison TM, Jagust WJ. Development of a mnemonic discrimination task using naturalistic stimuli with applications to aging and preclinical Alzheimer’s disease. *Learn Mem* 2019; 26: 219–28.

Leal SL, Ferguson LA, Harrison TM, Jagust WJ. Development of a mnemonic discrimination task using naturalistic stimuli with applications to aging and preclinical Alzheimer’s disease. 2019: 219–29.

Leal SL, Yassa MA. Integrating new findings and examining clinical applications of pattern separation. *Nat Neurosci* 2018; 21: 163–73.

Levine TF, Allison SL, Stojanovic M, Fagan AM, Morris JC, Head D. Spatial navigation ability predicts progression of dementia symptomatology. *Alzheimer’s Dement* 2020; 16: 491–500.

Liang Y, Pertzov Y, Nicholas JM, Henley SMD, Crutch S, Woodward F, et al. Visual short-term memory binding deficit in familial Alzheimer’s disease. *Cortex* 2016; 78: 150–64.

Lithfous S, Dufour A, Després O. Spatial navigation in normal aging and the prodromal stage of Alzheimer’s disease: Insights from imaging and behavioral studies. *Ageing Res Rev* 2013; 12: 201–13.

RUNNING HEAD: Memory precision in *APOE* ε4-carriers

- Lu K, Nicholas JM, Pertzov Y, Grogan J, Husain M, Pavisic IM, et al. APOE-ε4 carriers have superior recall on the ‘What was where?’ visual short-term memory binding test at age 70, despite a detrimental effect of β-amyloid. *Alzheimer’s Dement* 2020; 16: 1–3.
- Maass A, Berron D, Harrison TM, Adams JN, La Joie R, Baker S, et al. Alzheimer’s pathology targets distinct memory networks in the ageing brain. *Brain* 2019; 142: 2492–509.
- Marks SM, Lockhart SN, Baker SL, Jagust WJ. Tau and β-amyloid are associated with medial temporal lobe structure, function, and memory encoding in normal aging. *J Neurosci* 2017; 37: 3192–201.
- McIlvain G, Schwarb H, Cohen NJ, Telzer EH, Johnson CL. Mechanical properties of the in vivo adolescent human brain. *Dev Cogn Neurosci* 2018; 34: 27–33.
- Mowrey WB, Lipton RB, Katz MJ, Ramratan WS, Loewenstein DA, Zimmerman ME, et al. Memory Binding Test Predicts Incident Amnesic Mild Cognitive Impairment. *J Alzheimer’s Dis* 2016; 53: 1585–95.
- Nau M, Julian JB, Doeller CF. How the Brain’s Navigation System Shapes Our Visual Experience. *Trends Cogn Sci* 2018; 22: 810–25.
- Newsome RN, Duarte A, Barense MD. Reducing perceptual interference improves visual discrimination in mild cognitive impairment: Implications for a model of perirhinal cortex function. *Hippocampus* 2012; 22: 1990–9.
- O’Donoghue MC, Murphy SE, Zamboni G, Nobre AC, Mackay CE. APOE genotype and cognition in healthy individuals at risk of Alzheimer’s disease: A review. *Cortex* 2018; 104: 103–23.
- Oedekoven CSH, Jansen A, Keidel JL, Kircher T, Leube D. The influence of age and mild cognitive impairment on associative memory performance and underlying brain networks. *Brain Imaging Behav* 2015; 9: 776–89.
- Parra MA, Calia C, García AF, Olazarán-Rodríguez J, Hernandez-Tamames JA, Alvarez-Linera J, et al. Refining memory assessment of elderly people with cognitive impairment: Insights from the short-term memory binding test. *Arch Gerontol Geriatr* 2019; 83: 114–20.
- Parra MA, Saarimäki H, Bastin ME, Londoño AC, Pettit L, Lopera F, et al. Memory binding and white matter integrity in familial Alzheimer’s disease. *Brain* 2015; 138: 1355–69.
- Pavisic IM, Nicholas JM, Pertzov Y, O’Connor A, Liang Y, Collins JD, et al. Visual Short-term Memory Impairments in Presymptomatic Familial Alzheimer’s Disease : a Longitudinal Observational Study. *ResearchSquare* 2020
- Pertzov Y, Miller TD, Gorgoraptis N, Caine D, Schott JM, Butler C, et al. Binding deficits in memory following medial temporal lobe damage in patients with voltage-gated potassium channel complex antibody-associated limbic encephalitis. *Brain* 2013; 136: 2474–85.
- Pietto M, Parra MA, Trujillo N, Flores F, García AM, Bustin J, et al. Behavioral and Electrophysiological Correlates of Memory Binding Deficits in Patients at Different Risk Levels for Alzheimer’s Disease. *J Alzheimer’s Dis* 2016; 53: 1325–40.
- Polcher A, Frommann I, Koppara A, Wolfsgruber S, Jessen F, Wagner M. Face-Name Associative Recognition Deficits in Subjective Cognitive Decline and Mild Cognitive Impairment. *J Alzheimer’s Dis* 2017; 56: 1185–96.
- Raber J, Huang Y, Ashford JW. ApoE genotype accounts for the vast majority of AD risk and AD pathology. *Neurobiol Aging* 2004; 25: 641–50.
- Reagh ZM, Roberts JM, Ly M, Diprospero N, Murray E, Yassa MA. Spatial discrimination deficits as a function of mnemonic interference in aged adults with and without memory impairment. *Hippocampus* 2014
- Reagh ZM, Yassa MA. Object and spatial mnemonic interference differentially engage lateral and medial entorhinal cortex in humans. *Proc Natl Acad Sci U S A* 2014; 111: E4264–73.
- Rentz DM, Amariglio RE, Becker JA, Frey M, Olson LE, Frishe K, et al. Face-name associative memory performance is related to amyloid burden in normal elderly.

RUNNING HEAD: Memory precision in *APOE* ε4-carriers

Neuropsychologia 2011; 49: 2776–83.

Rentz DM, Parra Rodriguez MA, Amariglio R, Stern Y, Sperling R, Ferris S. Promising developments in neuropsychological approaches for the detection of preclinical Alzheimer's disease: A selective review. *Alzheimer's Res Ther* 2013; 5: 1.

Richter FR, Cooper RA, Bays PM, Simons JS. Distinct neural mechanisms underlie the success, precision, and vividness of episodic memory. 2016: 1–18.

Risacher SL, Kim S, Shen L, Nho K, Foroud T, Green RC, et al. The role of apolipoprotein E (APOE) genotype in early mild cognitive impairment (E-MCI). *Front Aging Neurosci* 2013; 5: 1–12.

Ritchie K, Carrière I, Su L, O'Brien JT, Lovestone S, Wells K, et al. The midlife cognitive profiles of adults at high risk of late-onset Alzheimer's disease: The PREVENT study. *Alzheimer's Dement* 2017; 13: 1089–97.

Della Sala S, Parra MA, Fabi K, Luzzi S, Abrahams S. Short-term memory binding is impaired in AD but not in non-AD dementias. *Neuropsychologia* 2012; 50: 833–40.

Salmon DP. Neuropsychological Features of Mild Cognitive Impairment and Preclinical Alzheimer's Disease. In: *Behavioral Neurobiology of Aging*. Springer, Berlin, Heidelberg; 2011. p. 187–212

Salvato G. Does apolipoprotein e genotype influence cognition in middle-aged individuals? *Curr Opin Neurol* 2015; 28: 612–7.

Sheppard DP, Graves L V., Holden HM, Delano-Wood L, Bondi MW, Gilbert PE. Spatial pattern separation differences in older adult carriers and non-carriers for the apolipoprotein E epsilon 4 allele. *Neurobiol Learn Mem* 2016; 129: 113–9.

Sinha N, Berg CN, Tustison NJ, Shaw A, Hill D, Yassa MA, et al. APOE ε4 status in healthy older African Americans is associated with deficits in pattern separation and hippocampal hyperactivation. *Neurobiol Aging* 2018; 69: 221–9.

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. *Alzheimer's Dement* 2011; 7: 280–92.

Sperling RA, Donohue MC, Raman R, Sun C, Yaari R, Holdridge K, et al. Association of Factors With Elevated Amyloid Burden in Clinically Normal Older Individuals. 2020; 02115: 735–45.

Stark SM, Kirwan CB, Stark CEL. Mnemonic Similarity Task: A Tool for Assessing Hippocampal Integrity. *Trends Cogn Sci* 2019; 23: 938–51.

Stark SM, Stark CEL. Age-related deficits in the mnemonic similarity task for objects and scenes. *Behav Brain Res* 2017; 333: 109–17.

Stark SM, Yassa MA, Lacy JW, Stark CEL. A task to assess behavioral pattern separation (BPS) in humans: Data from healthy aging and mild cognitive impairment. *Neuropsychologia* 2013; 51: 2442–9.

Stening E, Persson J, Eriksson E, Wahlund LO, Zetterberg H, Söderlund H. Apolipoprotein E ε4 is positively related to spatial performance but unrelated to hippocampal volume in healthy young adults. *Behav Brain Res* 2016; 299: 11–8.

Stevenson RF, Zheng J, Mnatsakanyan L, Vadera S, Knight RT, Lin JJ, et al. Hippocampal CA1 gamma power predicts the precision of spatial memory judgments. *Proc Natl Acad Sci* 2018; 115: 10148–53.

Suchow JW, Brady TF, Fougner D, Alvarez GA. Modeling visual working memory with the MemToolbox. *J Vis* 2013; 13: 1–8.

Sullivan MD, Anderson JAE, Turner GR, Spreng RN. Intrinsic neurocognitive network connectivity differences between normal aging and mild cognitive impairment are associated with cognitive status and age. *Neurobiol Aging* 2019; 73: 219–28.

RUNNING HEAD: Memory precision in *APOE* ε4-carriers

Sutphen CL, Jasielec MS, Shah AR, Macy EM, Xiong C, Vlassenko AG, et al. Longitudinal cerebrospinal fluid biomarker changes in preclinical Alzheimer disease during middle age. *JAMA Neurol* 2015; 72: 1029–42.

Trelle AN, Carr VA, Wilson EN, Swarovski MS, Hunt MP, Toueg TN, et al. Association of CSF biomarkers with hippocampal-dependent memory in preclinical Alzheimer disease. *Neurology*

Troyer AK, Murphy KJ, Anderson ND, Craik FIM, Moscovitch M, Maione A, et al. Associative recognition in mild cognitive impairment: Relationship to hippocampal volume and apolipoprotein E. *Neuropsychologia* 2012; 50: 3721–8.

Valdés MC, Clark R, Wang S, Guazzo F, Calia C, Pattan V, et al. The striatum , the hippocampus , and short-term memory binding : Volumetric analysis of the subcortical grey matter ' s role in mild cognitive impairment. *NeuroImage Clin* 2020; 25: 102158.

Webb CE, Foster CM, Horn MM, Kennedy KM, Rodrigue KM. NeuroImage Beta-amyloid burden predicts poorer mnemonic discrimination in cognitively normal older adults. *Neuroimage* 2020; 221: 117199.

Weigard AS, Sathian K, Hampstead BM. Model-based assessment and neural correlates of spatial memory deficits in mild cognitive impairment. *Neuropsychologia* 2020; 136: 107251.

Weissberger GH, Nation DA, Nguyen CP, Bondi MW, Han SD. Meta-analysis of cognitive ability differences by apolipoprotein e genotype in young humans. *Neurosci Biobehav Rev* 2018; 94: 49–58.

Wolk DA, Dickerson BC. Apolipoprotein E (APOE) genotype has dissociable effects on memory and attentional-executive network function in Alzheimer's disease. *Proc Natl Acad Sci U S A* 2010; 107: 10256–61.

Xie W. A neurocognitive mechanism for precision of visual working memory representations. 2018

Yassa MA, Mattfeld AT, Stark SM, Stark CEL. Age-related memory deficits linked to circuit-specific disruptions in the hippocampus. *Proc Natl Acad Sci* 2011; 108: 8873–8.

Yassa MA, Stark SM, Bakker A, Albert MS, Gallagher M, Stark CEL. High-resolution structural and functional MRI of hippocampal CA3 and dentate gyrus in patients with amnesic Mild Cognitive Impairment. *Neuroimage* 2010; 51: 1242–52.

Zhang W, Luck SJ. Discrete fixed-resolution representations in visual working memory. 2008; 453: 233–6.

Zokaei N, Burnett Heyes S, Gorgoraptis N, Budhdeo S, Husain M. Working memory recall precision is a more sensitive index than span. *J Neuropsychol* 2015; 9: 319–29.

Zokaei N, Čepukaitytė G, Board AG, Mackay CE, Husain M, Nobre AC. Dissociable effects of the apolipoprotein-E (APOE) gene on short- and long-term memories. *Neurobiol Aging* 2019; 73: 115–22.

Zokaei N, Giehl K, Sillence A, Neville MJ, Karpe F, Nobre AC, et al. Sex and APOE: A memory advantage in male APOE ε4 carriers in midlife. *Cortex* 2017; 88: 98–105.

Zokaei N, Grogan J, Fallon SJ, Slavkova E, Hadida J, Manohar S, et al. Short-term memory advantage for brief durations in human APOE ε 4 carriers. *Sci Rep* 2020: 1–10.

RUNNING HEAD: Memory precision in *APOE* ε4-carriers

Table 1. Demographics and standard neuropsychological test scores by *APOE* genotype group.

	ε3ε3 (n=26) Mean (SD)	ε3ε4 (n=20) Mean (SD)	ε4ε4 (n=3) Mean (SD)
Age	63.4 (6.07)	64.8 (6.83)	63.3 (.58)
Sex			
Female	13 (50%)	5 (25%)	1 (33%)
Male	13 (50%)	15 (75%)	2 (67%)
Education	14.25 (2.31)	13.80 (2.26)	14.67 (.58)
ACE Total	93.9 (4.91)	94.6 (2.42)	93.0 (3.61)
ACE Memory	25.0 (1.50)	25.1 (1.00)	24.7 (1.53)
ROCF immediate	33.3 (2.59)	31.8 (2.69)	32.0 (2.65)
ROCF delayed	21.4 (5.73)	21.9 (4.67)	22.2 (9.78)

Note: ACE: Addenbrookes Cognitive Examination; ROCF: Rey-Osterrieth Complex Figure. Delayed copy was three minutes after presentation. The genotype groups did not differ significantly in terms of age ($F_{(2,46)}=.30$, $p=.739$) or scores on the Addenbrookes Cognitive Examination (ACE) regardless of whether the total score ($F_{(2,46)}=.11$, $p=.90$) or the memory sub-score was used ($F_{(2,46)}=.28$, $p=.760$).

Table 2. Summary of memory performance across subjects by *APOE* genotype.

Metric	ε3ε3 (n=26)	ε3ε4 (n=23)	All ε4 carriers (n=26)
Identification accuracy	.83 (.06)	.82 (.08)	.83 (.08)
Location retrieved success	.80 (.13)	.80 (.16)	.81 (.15)
Localisation Precision	22.4 (5.31)	22.1 (3.97)	22.16 (4.09)
Mean target-response distance	36.5 (16.1)	35.1 (16.2)	34.10 (15.7)
Mean distance to nearest item	20.7 (5.60)	21.0 (5.00)	20.67 (4.84)
Model-derived estimates calculated across all subjects per group			
<i>pU</i> [95% CI]	.31 [.28; .34]	.29 [.26; .33]	.30 [.28; .33]
<i>SD</i> [95% CI]	17.90 [16.82; 19.32]	18.84 [17.54; 20.49]	18.35 [17.43; 19.30]

Note: Retrieval success and precision were calculated based on a model derived cut-off score for guessing at a response-to-target distance of 63° (see Supplementary Material for details). *CI*: credibility interval of the posterior distribution derived from the Bayesian estimation procedure.

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

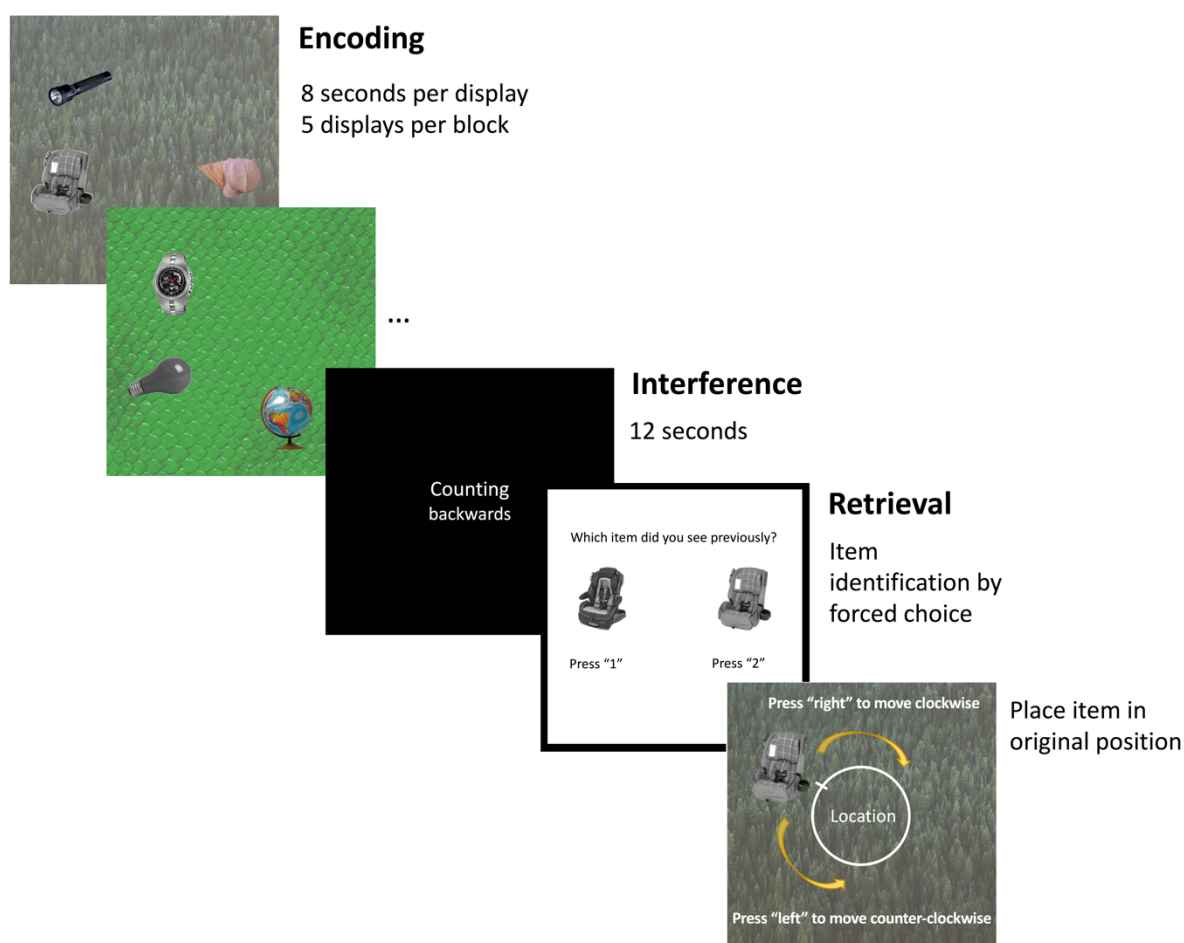


Figure 1. Schematic of the precision memory task.

RUNNING HEAD: Memory precision in *APOE* ε4-carriers

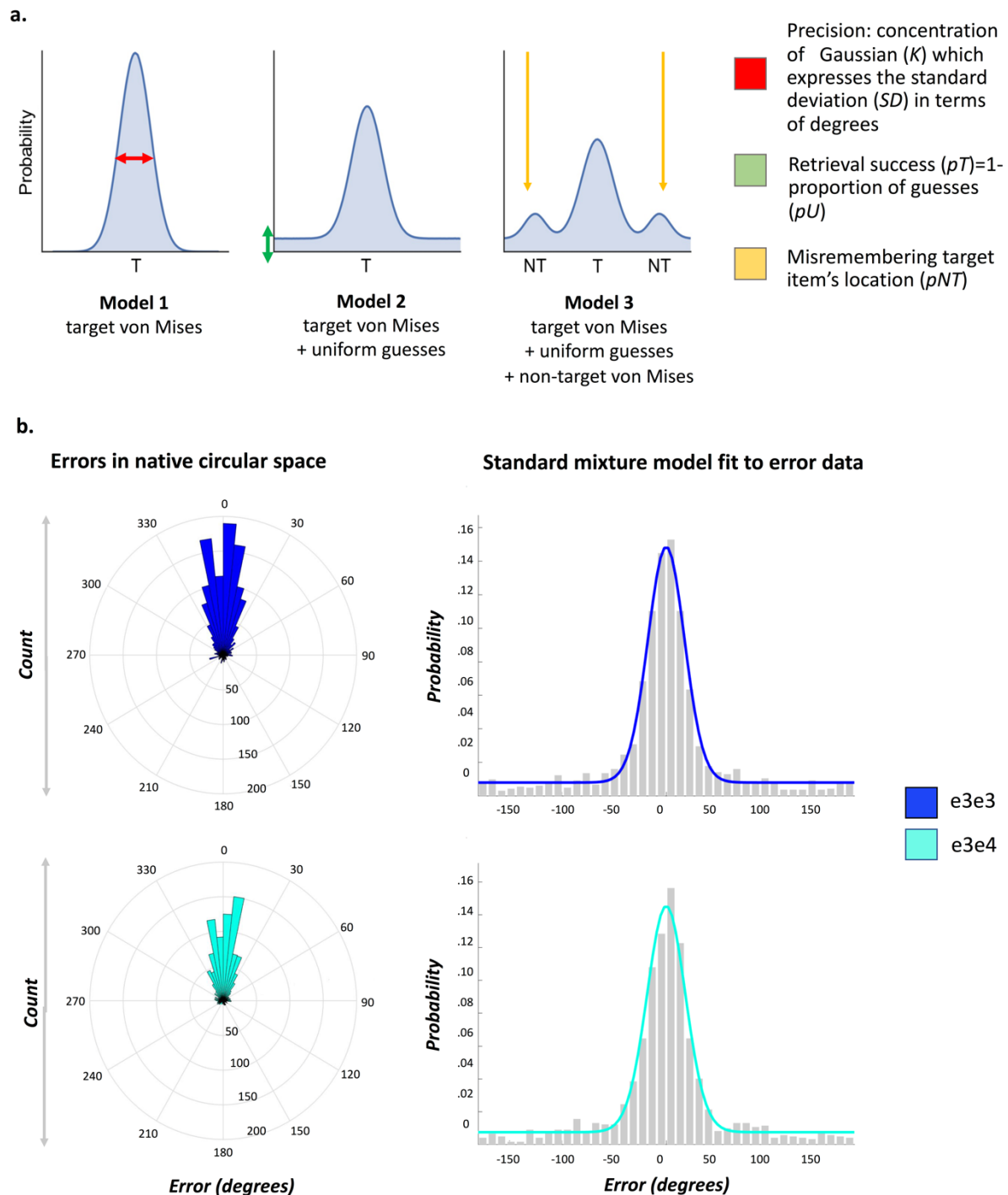


Figure 2. Tested models and results from the mixture modelling approach.

(a) Proposed models to capture location memory performance. In Model 1, all object locations are assumed to be correctly recalled without any guess responses (probability of guessing: $pU=0$). The mean distance of responses from the target can be represented by the width of the von Mises (circular Gaussian) distribution, expressing the precision of memory recall (expressed as the standard deviation (SD) of the von Mises distribution where higher values reflect less precision; for a more intuitive interpretation where higher values reflect better performance, the SD value can be converted to the von Mises distribution concentration parameter K ; see Supplementary Material). Model 2 assumes a mixture of guessed and correctly remembered responses, where the proportion of responses that fall within the uniform distribution is denoted by the parameter pU that captures the proportion of guessed responses. For a more intuitive understanding where higher values reflect higher performance this parameter can also be expressed as retrieval success denoted by pT , the proportion of trials within the von Mises distribution, i.e. trials in which the target location was correctly recalled. Model 3 assumes that responses reflect a combination of guessing, correctly remembered responses with variable degree

RUNNING HEAD: Memory precision in *APOE* ϵ 4-carriers

of precision, and swaps of target and distractor locations, represented as von Mises distributions centered at the locations of distractor objects. **(b) Distribution of location errors by ϵ 4-status in native circular space (left hand side) and the Standard Mixture Model (von Mises + uniform) fit to responses.** Model 2 was identified as the best fitting model in a model comparison procedure detailed in the Supplementary Material.

RUNNING HEAD: Memory precision in *APOE* $\epsilon 4$ -carriers

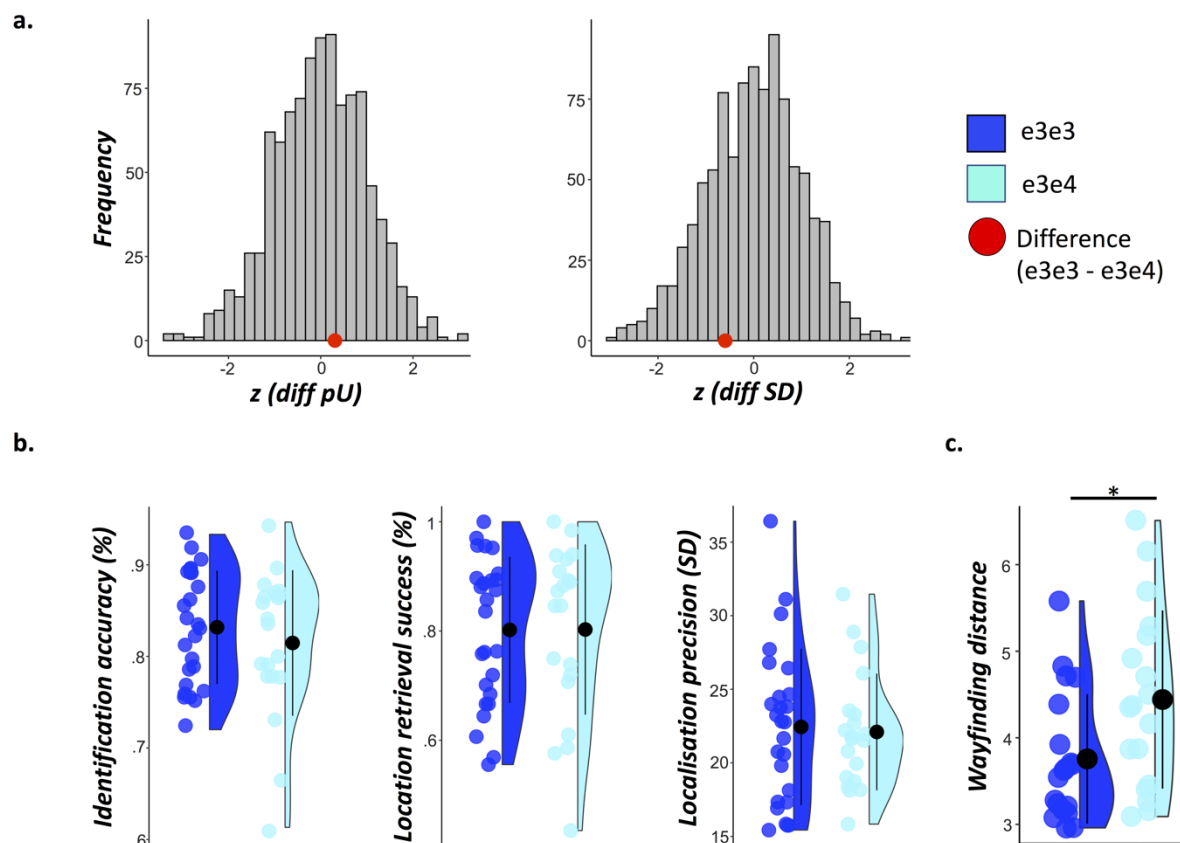


Figure 3. Precision memory and spatial navigation performance by *APOE* genotype.

(a) Distribution of standardised group differences derived from 1000 permutations where $n=26$ subjects were randomly assigned to one sample and $n=20$ subjects to another (to match the actual group sizes in our sample). Retrieval success and precision were obtained using mixture modelling on all trials across subjects for the $\epsilon 3\epsilon 4$ and the $\epsilon 3\epsilon 3$ group, respectively. The red dots represent the standardised true differences in model metrics calculated by subtracting the scores of the $\epsilon 3\epsilon 4$ from those of the $\epsilon 3\epsilon 3$ group (for *guessing*: $z = .31$; for *SD*: $z = -.5$). (b) Mean $\pm$ standard deviation of identification accuracy, retrieval success and precision for each *APOE* group. Retrieval success refers to the proportion of trials falling within 63° of the target object. Precision reflects the standard deviation in response-to-target distance for all trials within 63° of the target object. The *APOE* effect on memory scores and spatial navigation is assessed using general linear models and Bayesian analysis. (c) Mean $\pm$ standard deviation of wayfinding distance in the Sea Hero Quest game (Coughlan et al., 2019).

* $p < .05$