Title: **Associations between multisensory integration and several domains of cognitive function in a large cohort of older adults**

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**Abstract**

Age-related sensory decline impacts cognitive performance and exposes individuals to a greater risk of cognitive decline; sensory integration across different senses also changes with age, yet the association between multisensory perception and cognitive ageing is poorly understood. We explored the relationship between multisensory integration and cognitive function in 2875 adults aged 50 + from The Irish Longitudinal Study on Ageing. Multisensory integration was assessed at several temporal asynchronies using the Sound Induced Flash Illusion (SIFI). More precise (young-like) integration (i.e. less illusion susceptibility with larger temporal asynchronies) was associated with faster Choice Response Times and Colour Trail Task performance, and fewer errors on the Sustained Attention to Response Task. We then used k-means clustering to identify groups with different 10-year cognitive trajectories on measures of delayed recall, immediate recall and verbal fluency. Across measures, groups with healthier cognitive trajectories had more precise multisensory integration. These findings support broad links between multisensory integration and cognitive function rather than associations with specific subdomains.

**Keywords** - Sound-Induced Flash Illusion, Ageing, Cognitive function, Audiovisual, Multisensory

**Introduction**

Increasing evidence suggests sensory function is a modifiable predictor of cognitive decline. However the strength of this evidence appears dependant both on the measures of sensory function used and domains of cognition examined (for review see Roberts & Allen, 2016). When exploring sensory function and cognitive ageing, a wealth of information can be learnt from large-scale ageing studies; these typically have very large sample sizes, contain a wide range of covariates and often assess measures longitudinally – facilitating exploration of how factors change over time. To date, most large-scale studies linking sensory function and cognition in ageing, have focused on unisensory measures, such as pure-tone audiometry (see Loughrey et al. 2018 for meta-analysis) or visual acuity (Lin et al., 2004; Lim et al., 2020). Only recently has the field of cognitive ageing started to consider how multiple senses are combined, a process known as *multisensory integration*, which is an important function to facilitate coherent perception, whilst also balancing asymmetries in age-related decline across the senses.

In their review of the literature, Roberts and Allen (2016) noted that the link between sensory function and cognition in ageing appeared stronger if measures extended beyond peripheral, and unisensory, measures of sensory acuity. For example, Humes et al., (2013) used several measures oftemporal sensory processing (e.g. gap detection, temporal order judgements and temporal masking) in hearing, vision and touch. They found that the relationship between age and “global cognitive function” was mediated by “global sensory function” across the acquired measures. These findings indicate the value of exploring perceptual function in a more global, multisensory, manner. Experimental evidence has shown that multisensory integration is altered in cases of mild cognitive impairment (MCI; Chan et al., 2015), reliably predicts MCI diagnosis (Murray et al., 2018) and plays an important role in cognitive functions more generally (Lehmann & Murray, 2005; for reviews see Shams & Seitz, 2008; Wallace, Woynaroski, & Stevenson, 2020). Collectively, these findings warrant further consideration in large-scale ageing studies.

In 2014, The Irish Longitudinal Study on Ageing (TILDA) included a measure of multisensory integration within its healthcare assessment; the Sound-Induced Flash Illusion (SIFI) (Shams et al., 2000, 2002; for reviews see Hirst, McGovern, et al., 2020; Keil, 2020). The illusion occurs when presenting one visual flash with two auditory beeps results in the perception of two flashes, even though only one occurred. Critically, if the second beep is shifted in time from the flash-beep pair (i.e. at longer Stimulus-Onset Asynchrony, SOA) illusion susceptibility, in young adults, typically decreases; following the known temporal properties of multisensory neurones (Meredith et al., 1987; Meredith & Stein, 1983; Stein & Meredith, 1993). SIFI susceptibility has been linked to cross-sensory interactions during early stimulus encoding (Mishra et al., 2007; Shams et al., 2005) as well as pre-stimulus brain states influencing the likelihood of integration (Chan et al., 2021; Keil et al., 2014). The appeal of this paradigm to large-scale studies is that it provides a quick-to-administer index of multisensory function with simple task instructions (“how many flashes did you see”).

Several studies using the SIFI have shown that, relative to young adults, older adults remain susceptible to the illusion over long SOAs, and may even be less susceptible at very short SOAs (Chan et al., 2021; McGovern et al., 2014; Merriman et al., 2015; Setti et al., 2011, 2014; Stapleton et al., 2014). Sustained illusion perception at long SOAs suggests an increased tendency to integrate irrelevant information over a broader time window in ageing. On the other hand, reduced illusion perception at very short SOAs may reflect reduced temporal acuity.

In the first exploration of multisensory integration within the TILDA dataset, Hernández et al. (2019) found that lower Montreal Cognitive Assessment (MoCA) scores, a measure of global cognitive function, were associated with increased SIFI susceptibility at longer SOAs, i.e. less precise multisensory integration. What remains unclear is whether SIFI susceptibility is associated with specific subdomains of cognition and, moreover, whether SIFI is associated with differing trajectories of cognition over time. The goal of the current study was to better understand the relationship between multisensory integration and cognition in ageing; first, by utilising several more specific cognitive and sensory measures included in TILDA and second, by identifying groups from within the TILDA sample showing different 10-year trajectories of cognitive function and comparing their patterns of multisensory integration.

**Methods**

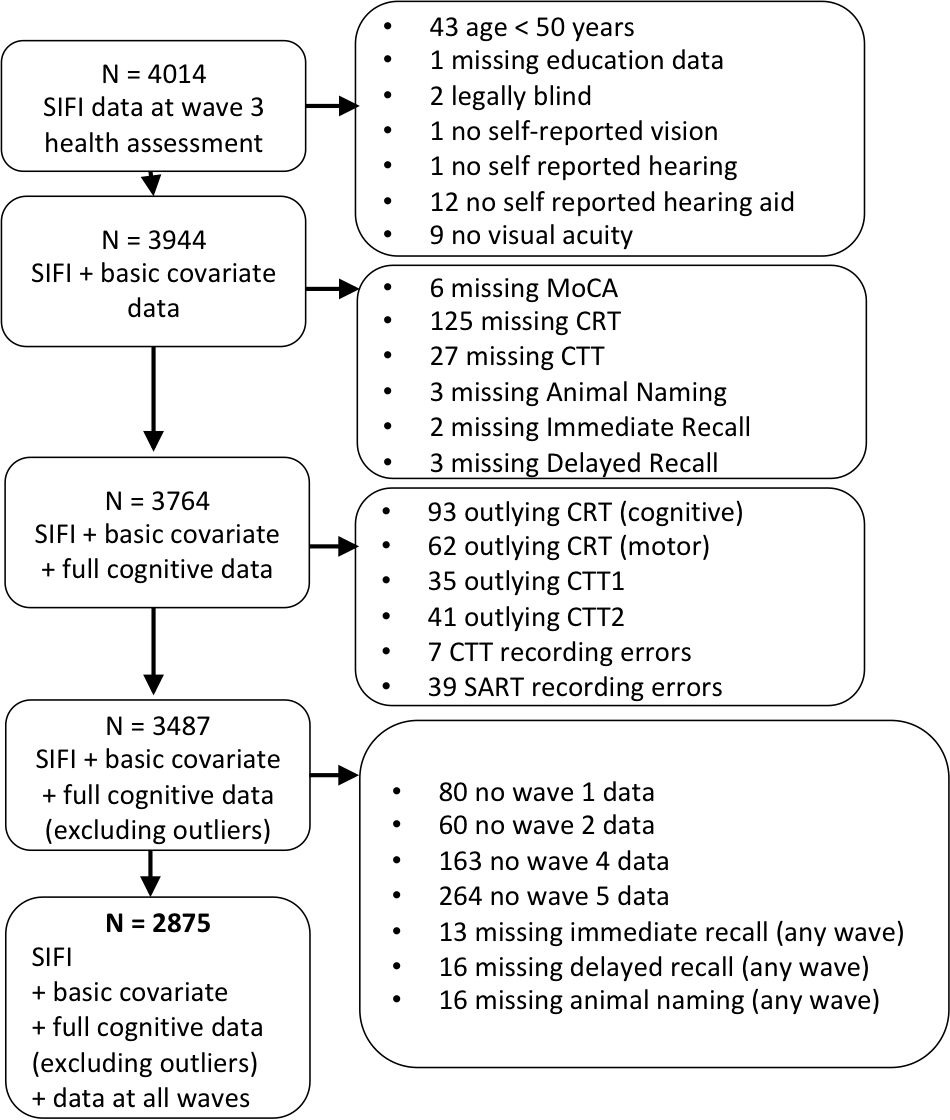
TILDA is a population representative sample of individuals aged over 50 from the Republic of Ireland (for sampling design see Whelan and Savva, 2013). TILDA started in 2009 with data collection scheduled every 2 years. Figure 1 illustrates the structure of the TILDA study and the specific measures from each wave included in the current analysis. At the time of the current analysis, five waves of data from TILDA were available; two of these (wave 1 and wave 3) included full comprehensive healthcare assessments. Our primary measure, the Sound Induced Flash Illusion (SIFI), was included at wave 3.

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**Figure 1.** *a)* Four measures were used in cross-sectional analyses from wave 3 of the healthcare assessments; left-right: the Sound Induced Flash Illusion (SIFI); the Choice Reaction Time (CRT) task; the Sustained Attention to Response Task (SART); The Colour Trails Task (CTT), see text for details *b)* Outline of the longitudinal measures taken in the TILDA study that are included in our longitudinal analysis. The green/shaded boxes indicate those measures which are focused on in the current study.

**Participants**

To ease interpretation, the same participants were included in cross-sectional and longitudinal analyses, an outline of inclusion/exclusion criteria is illustrated in Figure 2 (to test the robustness of the results to this selective sampling we also repeated analyses with the full sample, this did not change any of our results, see Supplementary section S8). Participants must have completed the SIFI at wave 3 of TILDA alongside a full cognitive assessment and the longitudinal cognitive measures assessed from waves 1 through to wave 5 in our longitudinal analysis (see Figure 1). The study was approved by the Trinity College Faculty of Health Sciences Ethics Committee, testing protocols conformed with the Declaration of Helsinki and data were stored in accordance with Irish and European Data Protection Legislation. All participants provided written, informed consent when they first participated in the study (at wave 1) and written and verbal consent was repeated at following waves.



**Figure 2.** Protocol for selecting participants for this study from Wave 3 of TILDA.

**Measures**

The measures and analysis of the current investigation were twofold. First, we examined cross-sectional relationships between multisensory perception and cognition using the measures available in the healthcare assessment at the same time-point as the SIFI. Second, we used cognitive measures available across waves 1 through to 5 to create cognitive trajectory groups and explore the relationship between SIFI and 10-year cognitive profiles. Here we outline the measures that were available cross-sectionally (at wave 3) followed by longitudinal measures.

***Cross-sectional measures***

At wave 3, participants attended a health assessment for approximately 3 hours. All assessments were carried out by trained health nurses using a Standard Operating Procedure, a summary of the measures we focus on from wave 3 of TILDA are shown in Figure 1a.

**The Sound Induced Flash Illusion:** Our primary measure of interest was susceptibility to the Sound-Induced Flash Illusion (SIFI; Shams et al., 2000). The SIFI procedure lasted approximately 6 minutes within the healthcare assessment. If the participant usually wore glasses or hearing aids, they also wore them during this assessment. The parameters of the paradigm used in TILDA have also been outlined elsewhere (Hernández et al., 2019; Hirst et al., 2019; Hirst, Setti, et al., 2020). Participants were seated in a testing room in front of a computer (Dell Latitude E6400 with Intel Core 2 Duo CPU, 2Gb RAM, 60 Hz refresh rate, using Windows 7 Professional OS) with a nurse who conducted the assessment. A fixation cross lasting 1000 ms marked the start of each trial. The visual and/or auditory stimuli were then presented. The visual stimulus comprised a white disc (1.5°visual angle, ~32 fl luminance), projected onto a black background 5 cm below the central fixation cross for 16 ms. Viewing distance was approximately 60 cm. Auditory beeps were brief bursts of 3500 Hz sounds (10 ms, 1 ms ramp, approximately 80 dB) presented via the inbuilt laptop speakers.

In the first block, participants were asked to report how many flashes they saw. Visual stimuli could be presented alone (0B1F or 0B2F with an SOA of 70 ms), with a congruent number of auditory beeps (1B1F or 2B2F with the SOAs 70, 150 or 230 ms) or with an incongruent number of auditory beeps (2B1F, where the second beep was presented at one of six SOAs relative to the flash-beep pair; -230, -150, -70, 70, 150, and 230 ms, with negative SOAs indicating an auditory lead). Two trials from each condition were presented, in a random order for each participant. This block was preceded by a practice block containing one trial from each of the following conditions; 2B1F (SOAs; 70, 150, 230 ms), 2B2F (70 ms SOA), 1B1F, and 0B2F (70 ms SOA).

In the second block participants were asked to judge how many beeps they heard. This block contained two conditions 2B0F (SOAs; 70, 150 and 230 ms) and 1B0F in which auditory beeps were presented in the absence of visual stimuli. Two trials were presented from each condition, in a random order for each participant.

**Choice Reaction Time (CRT) task:** Participants were presented with a keypad containing three buttons. One labelled “YES” one labelled “NO” and one central button which participants held down with their finger. Participants were instructed to hold their finger down on the central button and, as soon as they saw the onscreen word, release the button and press one of the “YES”/”NO” keys depending on the word presented onscreen. The words “YES” or “NO” were presented on screen 50 times with varied onset from 800 – 1100 ms from the time when the participant pressed the central button, indicating the start of the trial. Each stimulus remained onscreen until the participant made a “YES”/”NO” response. This procedure obtains two measures of reaction time, the time at which the finger was released from the central key (cognitive reaction time) and the time at which the “YES”/”NO” key was pressed (motor response time) (Cronin et al., 2013).

**Sustained Attention to Response Task (SART):** Participants were presented with the digits 1 - 9 sequentially on screen in consecutive order. Each digit appeared for 300 ms, with an inter-stimulus-interval of 800 ms. The cycle of digits 1 – 9 was repeated 23 times (207 trials in total). Participants were instructed to press the spacebar in response to every digit, but to withhold a response to the number ‘3’. Commission errors (pressing in response to the number 3) and omission errors (failing to press in response to any of the other digits) were considered for analysis.

**Colour Trails Test (CTT):** The CTT is a pen-to-paper task comprised of two subtasks. For the Colour Trails 1 test (CTT1), the participant is instructed to draw a line connecting circles numbered 1 through 25 in consecutive order. The fact that colour of the circle alternates with each succeeding number is not mentioned to the participant. For the Colour Trails 2 trail (CTT2), the examiner instructs the participant to draw a line between numbered circles, maintaining the sequence of numbers, but this time alternating between pink and yellow colours (in CTT2, each number has both a yellow and pink circle, so the participant must choose the correct circle). Both tasks must be performed as quickly as possible without errors. If an error is made, the examiner points it out and instructs the participant to correct the error and proceed with the task. Up to 10 seconds are allowed for the participant to make a connection between one circle and the next. After the 10-second period has elapsed, the examiner provides a non-verbal prompt (i.e. by pointing) indicating the position of the next correct circle. We explored the total time required to complete CTT1 (basic processing speed) and the CTT2-CTT1 difference score (i.e. CTTdelta, indicating the effect of the additional task CTT2 element) in our analysis.

***Longitudinal measures***

Longitudinal measures of cognitive function were obtained from a Computer Assisted Personal Interview (CAPI), which is delivered at every wave of TILDA. A trained interviewer attended the participant’s home and delivered a standardised set of questions. Three measures were selected for the current analysis on the basis that these measures had been shown to be more sensitive to longitudinal change within the TILDA cohort (Feeney & Tobin, 2018); Immediate recall, Delayed recall and Animal naming (verbal fluency).

**Immediate recall:** Participants were presented with an audio recording of 10 wordswith one word presented every 2 seconds(the list of words wasrandomly selected from the lists shown in Supplementary Table S7). Before presenting the word list, a sample audio recording of the computer voice was presented so that participants could adjust the volume of the computer to an appropriate level. If the participant could not hear the computer voice the word list was read aloud by the interviewer, who was instructed to deliver the words at approximately the same pace (1 word every 2 seconds). Immediately following the presentation of the word list participants were asked to recall as many words as they could within a minute. The list was then repeated and participants were again asked to recall as many words as they could, including the words they recalled earlier. The scores from both attempts are then summed to derive an immediate recall score out of a total of 20.

**Verbal fluency:** Following the test of immediate recall participants were asked to freely name as many animals as they could within one minute. The total number of animals recorded was taken as the measure of verbal fluency included in our analysis.

**Delayed recall:** Following the test of immediate recall and animal naming, participants were then asked several questions regarding their physical and cardiovascular health, which acted as intermediatory tasks. The exact number of questions asked of each participant on these topics varied depending on whether follow-up questions needed to be asked. The average time between the first and delayed recall session was estimated to be 12 min 37 seconds, *SD* = 5 mins, based on time stamps for participants who received the computer read out lists obtained at wave 2 of TILDA. Following the intermediatory questions, participants were asked to recall the word list delivered earlier in the test of immediate memory. Each participant’s score out of a total of 10 was used as our measure of delayed recall.

**Analyses**

All statistical analyses were performed within the R statistical programming environment, version 3.5.2 (R CoreTeam, 2018). Our dependent variable for all models was accuracy for judging the number of flashes on the illusory 2B1F trials of the SIFI. This score represented the proportion correct (0, 0.5 or 1) for each participant. In both cross-sectional and longitudinal analyses, we therefore implemented generalized logistic mixed-effect models using “glmer” in the “lme4” package (family = “binomial”) (Bates et al., 2015). All tables and figures were created using the sjPlot package (Lüdecke, 2021). All analysis scripts and resulting tables/figures can be found here <https://github.com/RebeccaHirst/TILDA_multisensory_cognitive> (for peer review this can be accessed here <https://osf.io/9de5z/?view_only=7f94fde12cec4e96a9cc022095ccc515> ). The difference between our cross-sectional and longitudinal analyses was that our longitudinal analysis was preceded by cluster analysis, used to identify groups with differing longitudinal cognitive trajectories. The primary analysis in both cross-sectional and longitudinal approaches was a set of logistic mixed effects models with SIFI susceptibility as an outcome measure and cognitive function, or cognitive-trajectory group, as the dependant variable. Thus enabling us to address whether current cognitive functions, or cognitive trajectories, are associated with multisensory integration i.e. susceptibility to the SIFI.

***Cross-sectional statistical analysis***

For each model (CRT, SART and CTT), our dependant variable was accuracy on the 2B1F condition of the SIFI. Fixed-effects of interest were Stimulus Onset Asynchrony (SOA; 70 ms 150 ms or 230 ms), cognitive performance (defined individually for each model) and whether there was an interaction between SOA and cognitive performance (indicating different patterns of multisensory integration dependant on cognitive performance). Participant ID was held as a random effect. All models are reported adjusted for the following factors: whether the second beep preceded/lead or followed the flash beep pair (termed “Pre/Post” respectively), age in years, sex (male/female), education (Primary, Secondary, Third/Higher), self-reported vision and self-reported hearing (Excellent, Very Good, Good, Fair, Poor), Visual Acuity Score (VAS = 100 – 50 x LogMAR, so that a VAS of 100 represents a LogMAR score of 0 (20/20 vision), higher scores therefore indicate better acuity), accuracy for judging 2 beeps alone (2B0F) at 70 ms, accuracy for judging 2 flashes alone (0B2F) at 70 ms and accuracy for judging 1 beep and 1 flash together (1B1F). Because age and sex had previously been shown to interact with SOA (Hernández et al., 2019), we also controlled for these interaction terms across models. All continuous, numeric variables were scaled prior to inclusion in the model.

To answer our primary research question, which was whether cognitive performance was associated with multisensory integration, we tested whether each cognitive measure significantly interacted with SOA (indicating different patterns of multisensory integration). The significance of each cognitive score by SOA interaction term was assessed using likelihood ratio tests to compare the model with the interaction term to the model without the interaction term (the additive model) using the “anova()” function in R. Because we conducted three parallel models (CRT, SART & CTT), each with two subdomains that could interact with SOA (i.e. the CRT task had motor and cognitive response times; the SART had omission and commission errors; the CTT had CTT1 and CTTdelta), six likelihood ratio tests were conducted. We thus considered a Bonferroni adjusted alpha of .008 as significant, correcting for 6 likelihood tests in total.

***Longitudinal statistical analysis***

Measures of immediate recall, delayed recall and verbal fluency were available for 5 waves of the TILDA study (providing 10 years-worth of data per participant). We used k-means clustering (using the kml package in R; Genolini et al., 2015; Genolini & Falissard, 2011), followed by cluster validation, to identify subgroups with different 10-year cognitive trajectories for each of these measures independently. Each algorithm was set to test up to 5 clusters with 100 permutations. Cluster solutions were then compared across several validation metrics used to compare within-cluster similarity to between-cluster distinctness (i.e. “cluster compactness”). The metrics used were the Calinski and Harabatz (standard, Kryszcuzuk and Genolini variants), Ray and Turi and Davis and Bouldin criterion. In the kml package, scores closer to 1, across validation metrics, are considered better (for details see Genolini et al., 2015). Since utilising several validation metrics may increase the reliability of cluster selection (Genolini & Falissard, 2011), we selected the number of clusters yielding the highest value across all metrics.

To explore the relationship between cognitive trajectories and multisensory integration at wave 3, the identified groups were included as predictors in logistic mixed effects models with SIFI accuracy as an outcome measure (as described for cross-sectional analyses). We report all models adjusted for the same covariates reported in the cross-sectional analyses.

**Results**

***Cross-sectional results***

A summary of the results from each cross-sectional model is shown in Figure 3 (for full results of all model terms see Supplementary material). As expected based on previous studies from TILDA, age and sex interacted with SOA, showing that older participants and females were less accurate on the SIFI (i.e. more susceptible) at longer SOAs.

**Choice Reaction Time (CRT) task:** The CRT task comprises both cognitive response time (the time taken to lift the finger off the central button) and motor response time (the time taken from the initial lift to press the selected response key). We tested if each of these terms interacted with SOA.

A likelihood ratio test comparing the full model to a model without the cognitive response time \* SOA interaction term indicated inclusion of this term significantly improved the model fit χ2(2) = 21.42, *p* = < 2.232-e05.Similarly, a comparison of the full model to a model without the motor response time \* SOA interaction term indicated this term significantly improved the model fit χ2(2) = 73.124, *p* < 2.2e-16. As shown in Figure 3a, longer motor and cognitive response times were associated with less accurate performance at longer SOAs (indicating stronger illusion susceptibility).

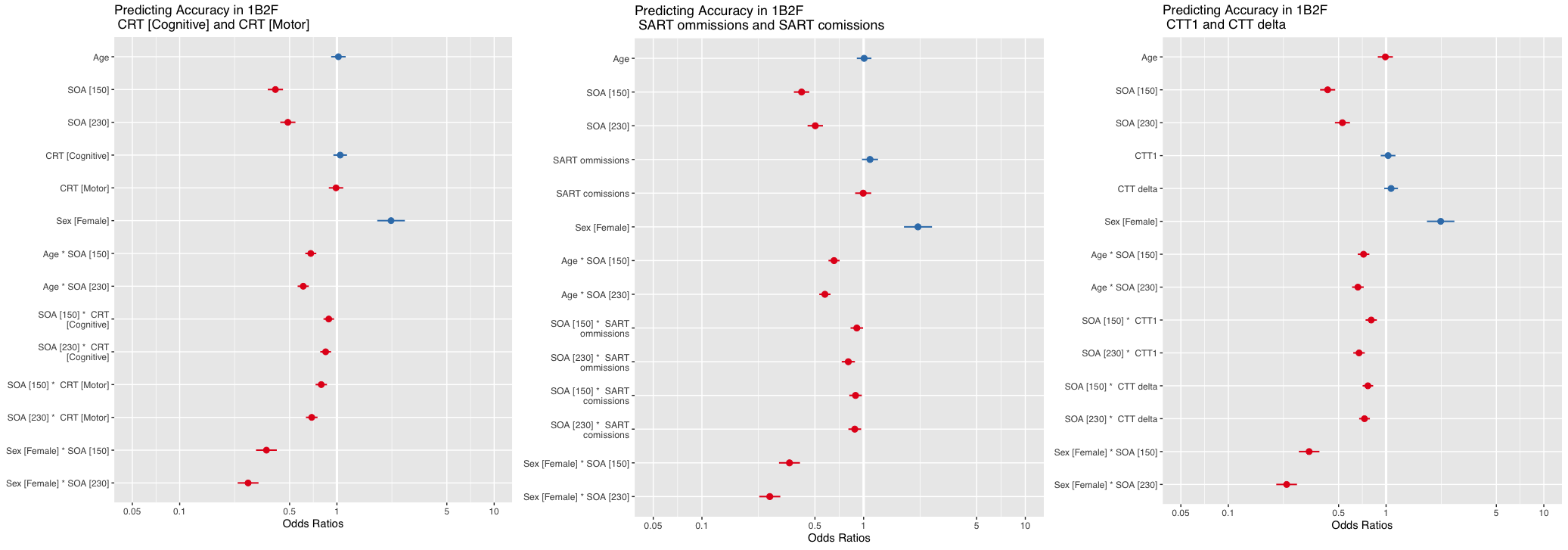
**Sustained Attention to Response Task (SART):** The SART task comprises both errors of omission (not responding to the numbers 1- 2 and 4 – 9 that require a button press) and commission (responding to the number 3, which does not require a button press). We considered if each of these error types interacted with SOA.

A likelihood ratio test comparing the full model to a model without the Commission error \* SOA interaction term indicated this term reached for significance, χ2(2) = 10.26, *p* = 0.005917. A comparison of the full model to a model without the Omission error \* SOA interaction term indicated this term significantly improved model fit χ2(2) = 18.097, *p* = 0.0001176. As shown in Figure 3b higher numbers of errors were associated with lower accuracy on the illusory SIFI condition at longer SOAs. When considering these factors independently of SOA, these effects were much smaller and non-significant.

**Colour Trails Task (CTT):**The CTT task also comprises two sub-measures, CTT1 (indicating the time taken to connect numbers without needing to consciously switch between colours) and the CTT2 (indicating the time taken to connect numbered circles whilst also selecting and alternating between pink and yellow circles), CTTdelta indicates the CTT2-CTT1 difference score, and is what we examined to understand the specific contribution of CTT2.

For CTT1 a likelihood ratio test comparing a model without the CTT1 \* SOA interaction to a model with the CTT1 \* SOA interaction term showed that by including this interaction term it significantly improved the model fit χ2(2) = 87.396, *p* = < 2.2e-16. Similarly, for CTTdelta a likelihood ratio test comparing a model without the CTTdelta \* SOA interaction to a model with the CTTdelta \* SOA interaction term was significant χ2(2) = 74.02, *p* = < 2.2e-16. Together these results suggested that both aspects of the CTT were significantly associated with SIFI susceptibility at longer SOAs.

Notably, across cognitive measures the interaction with SOA revealed the observed relationships, suggesting it is important to consider SOA when examining the relationship between cognitive function and multisensory perception in this task.



**Figure 3.** Cross sectional analysis of performance in *a)* Choice Reaction Time (CRT), including cognitive response time and motor response times *b)* Sustained Attention to Response Time (SART), including Omission and Commission errors and *c)* Colour Trials Task (CTT1 and CTTdelta). Odds ratios indicate the odds of a correct response on the illusory 2B1F condition of the SIFI task (lower odds of accuracy is equivalent to higher odds of being susceptible to the SIFI).

***Longitudinal results***

A solution of 3 clusters was selected as optimal for all cognitive measures (see Supplementary Figure 4). The resulting trajectory groups are shown in Figure 4. These groups were then used as predictors in logistic mixed-effect models with the ‘healthiest’ trajectory group (group A across models) set as the reference in each model.

For simple characterization of how each group changed in performance across 10 years, we performed t-tests comparing performance at wave 1 to wave 5. For immediate recall, the number of words recalled by group A increased between wave 1 (M = 7.98, SD = 1.65, range = 8 – 20, words recalled) and wave 5 (M = 8.21, SD = 1.58 range = 7 – 20 words recalled) *p* = 9.896e-08; in group B the number of words recalled remained relatively stable and did not significantly differ between wave 1 and 5 (M = 6.58, SD = 1.81, range = 2 – 20, at wave 1 and M = 6.38, SD = 1.91, range = 4 - 20 at wave 5) *p* = 0.1604; the number of words recalled in group C significantly decreased between waves (M = 4.93, SD = 1.85 range = 2 – 17 at wave 1 and M = 4.24, range 0 – 16 at wave 5) *p* = 4.051e-10.

For delayed recall, the number of words recalled by group A improved between wave 1 (M = 8.24, SD = 1.47, range = 1 – 10) and wave 5 (M = 8.52, SD = 1.28, range = 3 – 1), *p* = 0.02646; the number of words recalled increased between waves in group B (M = 7.98 , range = 8 – 20, at wave 1 and M = 8.21, range = 7 - 20 at wave 5) *p* = 9.896e-08; the number of words recalled in group C significantly decreased between waves (M = 4.93, range = 2 – 17 at wave 1 and M = 4.24, range 0 – 16 at wave 5) *p* = 4.051e-10.

For animal naming, all three groups showed significant declines between wave 1 and wave 5. Group A dropped from a mean of 29.9 (SD = 5.83, range 0 – 50) at wave 1 to 26.16 at wave 5 (SD = 4.70, range 9 – 46), *p* < 2.2e-16. Group B dropped from a mean of 23.75 (SD = 23.75, range 3 – 47) at wave 1 to 20.38 at wave 5 (SD = 20.38, range 1 - 38), *p* < 2.2e-16. Group C dropped from a mean of 16.89 (SD = 16.89, range 0 - 31) at wave 1 to 15 at wave 5 (SD = 15.00, range 0 - 32), *p* < 2.2e-16.



**Figure 5.** Cluster trajectory groups for measures of immediate recall, delayed recall and verbal fluency and sample percentage falling into each group. Groups were labelled as “A”, “B” and “C” reflecting the “healthiest” to “least healthy” trajectories. Note that different participants can be allocated to different groups depending on measure (i.e. an individual belonging to group A for immediate recall, does not necessarily belong to group A in delayed recall and verbal fluency).

**Immediate recall:** The interaction between immediate recall group and SOA significantly improved the model fit ((4)= 92.736, p < 2.2e-16). As shown in Figure 6a Groups B and C had lower accuracy relative to the most cognitively healthy group (group A) and this was most pronounced at longer SOAs. Moreover, this pattern was most evident in the least cognitively healthy group (group C).

**Delayed recall:** The interaction between the delayed recall group and SOA significantly improved the model fit ((4)= 62.448, p = 8.867e-13). Similar to immediate recall, groups B and C had lower accuracy relative to the most cognitively healthy group (group A) and this was most pronounced at longer SOAs (Figure 6b).

**Verbal fluency (animal naming):** The interaction between the verbal fluency group and SOA significantly improved the model fit ((4)= 87.9, p < 2.2e-16). Those scoring consistently lower across waves (groups B and C) had lower accuracy on the SIFI relative to the most cognitively healthy group (group C) and this was most pronounced at longer SOAs (Figure 6c).



**Figure 6.** Results of the logistic mixed effects models with the factor of longitudinal ‘cognitive trajectory group’ as a predictor. Across models the interaction between trajectory group and SOA was significant, with those in the less healthy trajectory groups scoring less accurately (i.e. greater susceptibility) on the illusory SIFI conditions.

**Discussion**

In this study we explored whether multisensory function was associated with specific subdomains of cognitive function and cognitive trajectories, in a sample of 2875 older adults. Cross-sectionally, multisensory function, assessed using the Sound-Induced Flash Illusion (SIFI), was associated with all measures of cognitive function considered. Those with slower motor and cognitive response times, more errors on the SART and slower performance on the Colour Trails Test and who made more errors of omission on the SART were all more susceptible to the SIFI at longer SOAs, though (when examining the odds ratios) these effects appeared most prominent for the CTT and the motor aspect of the CRT. Longitudinally, trajectories of immediate recall, delayed recall and animal naming were all similarly associated with SIFI. Those with consistently poorer performance on these cognitive tasks were more susceptible to SIFI at longer SOAs. The current findings indicate multisensory integration, measured using the SIFI, is associated broadly with measures of memory, processing speed, executive function and sustained attention, rather than being specifically associated with one or two types of cognitive measures.

Several empirical studies have investigated the relationship between SIFI susceptibility and cognitive function. In young adults, SIFI susceptibility increases with high cognitive load (Michail & Keil, 2018), suggesting illusion perception could be tied to cognitive resources. In older adults, Chan et al. (2015) reported increased illusion susceptibility at longer SOAs in older adults with MCI. However they did not find specific relationships with sub-dimensions of the Consortium to Establish Registry for Alzheimer’s disease (CERAD), and thus interpret SIFI as relating to global cognitive function. In younger and older adults, DeLoss et al., (2013) found that performing a dual visual or auditory go-no/go paradigm at the same time as SIFI influenced illusion susceptibility; performing a visual go-no/go task decreased illusion rate whilst auditory go-no/go task increased illusion rate, which DeLoss et al. interpret in the framework of attentional biasing. This effect of attention did not differ between age groups. DeLoss et al. therefore conclude that age-related differences in SIFI might not be associated with age differences in the ability to inhibit task-irrelevant information. The current findings align with the findings of Chan et al., (2015), in that multisensory integration did not appear tied to a specific domain of cognitive function. When considering the conclusions of DeLoss et al., we also saw that the interaction between age and SOA remained significant, even when the interaction between cognitive function and SOA was in the same model. This is also consistent with the conclusion that although cognitive functions were related to SIFI, age-related differences in SIFI may not be attributable to differences in cognitive function alone.

A question arising from these findings is whether multisensory integration is an indicator of general cognitive health or of current cognitive state. It is possible that the SIFI is influenced by global brain health because it shares a common neural mechanism with other cognitive measures. Existing literature has identified the prefrontal cortex as a seat of common cause, providing top-down modulation of processing in sensory cortices as well as playing an important role in cognition (Knight et al., 1999). In the TILDA cohort, we have observed that the SIFI is associated with specific volumetric changes in the right Angular Gyrus (Hirst et al., 2021), a structure that has been described as a hub for bottom up and top-down integration with several global functions ( for review see Seghier, 2013). Such integrative processes are likely to be required for a range of perceptual and cognitive functions in ageing, as such, it is possible that deterioration of a ‘domain general’ mechanism accounts for performance across several perceptual-cognitive tasks. Whilst it might be tempting to consider directional interpretation in terms of whether multisensory perception predicts cognition or vice versa, we cannot currently draw such conclusions from the available data, but it is likely that with future waves of TILDA data collection, such analyses will be possible.

An alternative explanation of the observed cross-sectional links could be that cognitive measures provided an indication of the current brain state of the individual at the time at which they completed the SIFI task. It is known that pre-stimulus brain states are critical to whether illusions are perceived or not in the SIFI (Chan et al., 2021; Keil et al., 2014). In the TILDA healthcare assessment, all cognitive measures are completed first followed by sensory measures, therefore it could be argued that cognitive measures reflect the current brain state (i.e. alertness), rather than a longer term cognitive profile. Nevertheless, the observed global links between multisensory integration and cognition applied both in our cross-sectional analysis as well as with longitudinal cognitive trajectories, suggesting the findings may provide a more general measure of brain health beyond the current state.

What did appear important across analyses was to consider the interaction between SOA in the SIFI task and cognition. This is in line with the broader SIFI literature showing that SOA typically interacts with group to reveal differences in multisensory dynamics (e.g. Setti et al., 2011). The relationship between SIFI and cognitive measures were most prominent across measures at the longer Stimulus Onset Asynchronies. This suggests that for studies wishing to explore the relationship between the SIFI and cognitive function, the manipulation of SOA in the SIFI task appears pertinent. The specific relationship between cognitive function and SOA in the SIFI appeals to the temporal dynamics of multisensory integration, rather than general multisensory performance. This is in line with previous studies reporting specific links between temporal aspects of multisensory processing and cognition (e.g. Hume et al., 2013).

Large-scale studies such as TILDA provide a unique avenue to exploring multisensory function and its relationship with cognition in ageing. Nevertheless there are several limitations and notes of caution of the current approach. First, despite the very large number of participants involved, the number of trials tested on the SIFI were necessarily limited. Due to time constraints of the TILDA protocol, there were two trials per SIFI condition tested (i.e. 12 illusory trials overall for each participant). Since perceptual learning is thought to play a key role in how we perceive multisensory events, for example exposure to more SOAs can decrease illusion susceptibility in the SIFI (Chan et al., 2018) we cannot confirm whether the current effects could be expected if more trials or conditions were included. Nevertheless our results, particularly those relating to age and SOA, are consistent with those reported from studies including a larger number of trials (see e.g. McGovern et al., 2014). Another limitation arises in our longitudinal analyses, in that currently our primary outcome measure is only available at wave 3 of TILDA (a central time-point), therefore it is difficult to determine directionality or causality in the relationship between multisensory function and cognition. We hope that this latter question will be addressable as future waves of TILDA progress, providing more cognitive and multisensory data for longitudinal exploration.

Understanding causality should be a key driver in the direction that future research in this field takes. In particular, if multisensory integration is predictive of cognitive decline, then multisensory training could in turn be considered an avenue to supporting healthy cognitive ageing. Studies have already begun exploring whether perceptual training (Merriman et al., 2015; O’Brien et al., 2020) or lifestyle factors such as exercise (O’Brien et al., 2017) can improve efficiency on the SIFI. Nevertheless, there is a need to understand individual differences in these effects and why not all individuals may show improvement (Setti et al., 2014).

**Conclusion**

In sum, we found that several cross-sectional and longitudinal measures of cognitive function were associated with multisensory function in a large cohort of older adults. The strengths of this study include the large sample size and range of measures that we were able to assess, in addition to the covariates that we were able to control for. Our findings do not point towards a single domain of cognition that appears most strongly associated with multisensory perception, but supports more global relationships between cognition and perception in ageing.

**Competing interests:** The authors have no conflict of interest to declare

**Acknowledgements:** This work was supported by the Health Research Board (HRB); Grant reference ILP-PHR-2017-014. We would also like to thank members of the TILDA team, for their helpful feedback in drafting previous versions of this manuscript.

**Author contribution statement:** The Irish Longitudinal Study on Ageing (TILDA) is an interdisciplinary project co-ordinated by R.A.K.A.S and F.N.N designed the protocol for the Sound-Induced Flash Illusion incorporated into TILDA. R.J.H., C.DL, A.S. and F.N.N. developed the analysis plan for this study; R.J.H. conducted the analysis and prepared the manuscript. A.S and F.N.N. contributed to the theoretical interpretation of the results. All authors provided feedback and revisions on the manuscript and approved the final version of the manuscript for submission.

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