



Age-related changes in feature-based object memory retrieval as measured by event-related potentials

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ABSTRACT

To investigate neural mechanisms that support semantic functions in aging, we recorded scalp EEG during an object retrieval task in 22 younger and 22 older adults. The task required determining if a particular object could be retrieved when two visual words representing object features were presented. Both age groups had comparable accuracy although response times were longer in older adults. In both groups a left fronto-temporal negative potential occurred at around 750 ms during object retrieval, consistent with previous findings (Brier, Maguire, Tillman, Hart, & Kraut, 2008). In only older adults, a later positive frontal potential was found peaking between 800 and 1000 ms during no retrieval. These findings suggest younger and older adults employ comparable neural mechanisms when features clearly facilitate retrieval of an object memory, but when features yield no retrieval, older adults use additional neural resources to engage in a more effortful and exhaustive search prior to making a decision.

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1. Introduction

Many aspects of semantic memory are separable from the neural systems and mechanisms that underpin episodic and procedural memory (Binder & Desai, 2011; Martin, 2007; Tulving, 1972). Several current models of semantic memory are supported by evidence indicating that an object is represented in multiple neural systems that are closely related to those systems activated originally upon experiencing the features of that object (Allport, 1985; Hart & Gordon, 1992; Martin, 2007; Martin & Chao, 2001). Features associated with objects, either living or non-living things, typically span multiple sensorimotor and cognitive domains and are an essential part of object representation (Goldberg, Perfetti, & Schneider, 2006; Hart et al., 2007; Kellenbach, Brett, & Patterson, 2001; Noppeney & Price, 2002). For example, a lion can be linked to more concrete features such as its roar and mane as well as to more abstract features such

as being threatening (Kraut, Kremen, et al., 2002; Kraut, Moo, Segal, & Hart, 2002; Kraut, Pitcock, et al., 2006).

Since features are represented in a distributed fashion in the brain (Binder & Desai, 2011; Hart et al., 2007; Martin & Chao, 2001), one would expect age-related functional and/or structural alterations, including changes in the white matter that mediates synchronized connectivity between different brain regions (Grady, 2012; Hedden & Gabrieli, 2004), to affect long-range communication demanded by memory retrieval from this distributed representation. However, semantic memory, unlike other cognitive functions such as episodic memory, attention, and executive function, does not seem to undergo as much change with age (Levine, Svoboda, Hay, Winocur, & Moscovitch, 2002; Li et al., 2004). How then does the neural mechanism support semantic memory in normal older adults such that only minimal age-related changes are noticeable?

Our goal in this study is to examine how age affects semantic memory retrieval by studying younger and older adults using EEG, a non-invasive tool which provides a high temporal resolution measure of neural activity (Kiefer & Pulvermüller, 2012; Luck, 2005; Luck & Kappenman, 2012). We used the Semantic Object Retrieval Task (SORT), which examines how objects are retrieved via explicit evaluation of object-associated features (Kraut, Cherry, et al., 2006;

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Kraut, Kremen, et al., 2002; Kraut et al., 2007). For example, in the SORT paradigm, presenting the features “humps” and “desert” normally facilitates retrieval of “camel”. By eliciting the process of combining these features that are represented across the brain to retrieve an object memory, we could untangle the dynamic neural mechanisms that operate to integrate object features to form a coherent object representation. The SORT task has been applied as an effective measure to detect impairment in lexico-semantic memory retrieval in various clinical populations and thus serves a useful task to examine age-related changes in retrieval (Mild Cognitive Impairment, MCI, and Alzheimer’s disease, AD: Kraut, Cherry, et al., 2006; Kraut et al., 2007; schizophrenia: Assaf, Rivkin, et al., 2006; Gulf War Illness: Calley et al., 2010; aging effects of concussion in former professional football athletes: Hart, Kraut, et al., 2013).

Successful performance in the SORT requires successful retrieval of semantic object memory. Data from previous activation, brain stimulation, and lesion studies suggest that the retrieval process of semantic memory involves the left inferior frontal gyrus (IFG) with its sub-regions subserving semantic selection and controlled retrieval (Badre & Wagner, 2002; Thompson-Schill et al., 1998; Whitney, Kirk, O’Sullivan, Lambon Ralph, & Jefferies, 2012). Other areas that may also assist in semantic memory retrieval localize to the left angular gyrus (AG) and left poster middle temporal gyrus (MTG) (Noonan et al., 2013; Whitney et al., 2012). In addition to these regions, activation studies on the SORT have shown object memory retrieval elicited increased BOLD signal in the pre-supplementary area (pre-SMA) of the medial frontal cortex, caudate, and thalamus (Assaf, Calhoun, et al., 2006; Kraut, Calhoun, Pitcock, Cusick, & Hart, 2003; Kraut, Kremen, et al., 2002; Kraut, Moo, et al., 2002). Lesion studies using the SORT have shown relatively selective deficits in object memory retrieval compared to other semantic memory tasks (e.g., category, association) in patients with localized thalamic strokes (Pergola et al., 2013; Segal, Williams, Kraut, & Hart, 2003). Based on these findings, Hart, Maguire, et al. (2013) proposed a central role of the pre-Supplementary Motor Area (pre-SMA)-thalamus-caudate circuit in mediating the semantic memory retrieval process, especially in tasks such as the SORT that involves feature integration, as part of the Neural Hybrid Model of semantic memory (Hart et al., 2007; Hart, Maguire, et al., 2013).

An ERP study of young adults using the SORT showed a left fronto-temporal component starting at around 750 ms post-stimulus that was more negative in retrieval than non-retrieval stimulus pairs (Brier, Maguire, Tillman, Hart, & Kraut, 2008). A power analysis of the EEG changes during the SORT showed earlier alpha desynchronization (8–12 Hz)/delta synchronization (~1 Hz) as well as later frontal beta synchronization (20–35 Hz, after one second post-stimulus), which were posited to represent semantic search and object retrieval, respectively (Ferree, Brier, Hart, & Kraut, 2009; Hart, Maguire, et al., 2013). Moreover, Slotnick, Moo, Kraut, Lesser, and Hart (2002) recorded intra-thalamic electrical activity while a patient was performing the SORT task and found beta synchronization at long latency in both thalamic hemispheres time-locked to stimulus. This 750 ms ERP component appears later than typical N400, a negative scalp evoked potential considered to be a marker of semantic processing that peaks at about 400 ms post-stimulus onset in response to semantic/contextual incongruity (Kutas & Federmeier, 2000; Kutas & Hillyard, 1980).

The majority of the previous ERP studies involving the N400 effect have used tasks based on semantic priming, contextual constraints, etc. (Kutas & Federmeier, 2000; Wlotko, Lee, & Federmeier, 2010). Most of these tasks do not mandate retrieval of a specific concept (e.g., objects) but are related to processing of meaning, inquiring about category or semantic relatedness between stimuli (probed as individual words/pictures or in the context of

a sentence; Kiefer, 2001; Kutas & Hillyard, 1980). Tasks based on priming do not even require direct (explicit) evaluation of semantic information. For example, subjects are asked to judge if the second stimulus is a real word or not, while the relations between the first (prime) and second stimuli (target) are manipulated to examine priming effects due to semantic association, category, etc. (Holcomb and Anderson, 1993; Kiefer, 2005). The SORT task is characteristically different from these noted above in that participants are required to directly evaluate whether the features result in retrieval of an object memory or not and to indicate so by making an explicit response. In terms of the neural basis of semantically-based ERPs, N400 is most consistently associated with access to semantic memory storage represented in the temporal regions such as the left MTG, inferior temporal gyrus, and anterior medial temporal lobe (Lau, Phillips, & Poeppel, 2008; McCarthy, Nobre, Bentin, & Spencer, 1995; Nobre & McCarthy, 1995). On the other hand, the semantic retrieval process is more strongly associated with longer latency waveform characteristics (“post-N400 positivity”, Van Petten & Luka, 2006), especially in the case of semantic selection and effortful retrieval, which may involve frontal areas such as the left IFG (Lau et al., 2008; Van Petten & Luka, 2006). FMRI findings on the SORT (Assaf, Calhoun, et al., 2006; Kraut, Kremen, et al., 2002) also support this contention, finding that only object memory retrieval (during the SORT) elicited increased signal in the bilateral inferior frontal gyri, pre-SMA, caudate, and thalamus, whereas both SORT and object association (i.e., semantic association judgment) elicited increased BOLD in left MTG, angular gyrus, and inferior temporal gyrus. These findings suggest that the ERP marker related to the SORT task involves frontal (pre-SMA, left IFG) and/or temporal (left MTG, inferior temporal) semantic systems that are engaged in semantic selection and integrative retrieval processes.

Other late ERP effects that occur after the N400 time window, such as P600, a positive deflection occurring at around 600 ms post-stimulus onset, have been suggested to be associated with other semantic related processes such as processing sentences with conflicting semantic structure (Bornkessel-Schlesewsky & Schlesewsky, 2008), with conflicting thematic structures (Kuperberg, 2007; Kuperberg, Sitnikova, Caplan, & Holcomb, 2003), and with incongruous syntactic structures (Van Petten & Luka, 2012). These late components have been dissociated from N400 in some experiments, thus suggesting their functional roles different from N400 (Kuperberg, 2007). Also, these late effects are not exclusive to sentence-level processing or verbal content, and have also been observed when stimuli are single words (Hill, Strube, Roesch-Ely, & Weisbrod, 2002; Meyer & Federmeier, 2007; Swaab, Brown, & Hagoort, 1998) or pictures (Ganis & Kutas, 2003; McPherson & Holcomb, 1999; Mudrik, Lamy, & Deouell, 2010; Sitnikova, Holcomb, Kiyonaga, & Kuperberg, 2008).

ERP studies that have examined the effects of age on lexico-semantic tasks have shown varying age-related effects on several components. General findings include delayed N400 latency and/or decreased N400 amplitude as well as difference in lateralization due to age (Federmeier & Kutas, 2005; Giaquinto, Ranghi, & Butler, 2007; Kutas & Iragui, 1998) with some exceptions (Grieder et al., 2012). In terms of later components, prior studies have observed attenuated amplitude (Meyer & Federmeier, 2010) and qualitative changes in scalp distribution (Galdo-Alvarez, Lindín, & Díaz, 2009; Harbin, Marsh, & Harvey, 1984) in older adults. The reason for these variable findings in age-related effects might reflect variations in task designs. It has been posited that older adults may recruit a decreased amount of neural resources when message-level or executive processing is required, but they can still show comparable activity at word-level processing compared to younger adults (Federmeier, van Petten, Schwartz, & Kutas, 2003; Wlotko et al., 2010). Therefore, in view of the word stimuli used in the SORT, we hypothesized that older adults would present differences

between retrieval and non-retrieval stimulus pairs around 750 ms, similar to young adults in [Brier et al.'s study \(2008\)](#). In order to test this hypothesis, we undertook conventional windowed analyses between 750 and 1000 ms post-stimulus as in [Brier et al. \(2008\)](#) to replicate the results seen in younger adults and to examine the similarities between younger and older adults in the current study. To further examine qualitative differences in ERPs between younger and older adults that might not be easily detected by visual inspection and thus windowed ERP measures, we performed data-driven exploratory analyses that have been proven to be a useful tool for high-density ERPs ([Dien & Frishkoff, 2005](#); [Dien, Michelson, & Franklin, 2010](#); [Spence, Brier, Hart, & Ferree, 2013](#)). We expected the data-driven analysis to yield findings not only confirming results from our conventional windowed analyses, but also to provide further insights into age associated differences between groups for the SORT. Understanding typical age-related changes in semantic object memory retrieval will help develop a better functional marker of the breakdown in word/semantic memory retrieval abilities observed in individuals with MCI and AD; this also could be potentially useful in evaluating and monitoring therapeutic effects at the neural level.

2. Methods

2.1. Participants

We studied 22 younger adults (15 women; $M_{age} = 21.7$ years, $SD = 3.2$) and 22 older adults (17 women; $M_{age} = 63.9$ years, $SD = 6.4$). All participants were native English speakers and right handed. Younger adults were undergraduate students from the University of Texas at Dallas who completed this study for research credits. Community dwelling older adults were recruited from an exercise training study of normal aging population, who did not have subjective memory complaints or cognitive impairments, as confirmed by a standard neuropsychological battery ([Chapman et al., 2013](#)). Only the pre-training data were used for the current study. We excluded participants with a history of neurological or psychiatric disorders, traumatic brain injury, learning disabilities and communication disorders, uncorrected visual and hearing impairments. Informed consent was obtained from all participants in accordance with the protocols approved by the Institutional Review Boards of the University of Texas at Dallas and of the University of Texas Southwestern Medical Center.

2.2. Experimental paradigm and procedures

We administered the ERP version of the Semantic Object Retrieval Test (SORT) ([Brier et al., 2008](#)) to the participants. The stimuli in this paradigm comprise 112 pairs of words. The two words represent features or attributes of objects (living or non-living). In retrieval word pairs (56 pairs), the two words represent features of a particular object. Non-retrieval word pairs (56 pairs) were created by randomly pairing the words. For example, the word pair 'humps' and 'desert' would facilitate memory retrieval of 'camel' (retrieval pair). In contrast, 'humps' and 'monitor' should not facilitate memory retrieval of any object (non-retrieval pair). The retrieval and non-retrieval word pairs have been validated in previous studies with independent groups of subjects from different age groups ([Brier et al., 2008](#); [Kraut, Kremen, et al., 2002](#); [Kraut et al., 2007](#)).

Words were presented simultaneously, one pair at a time, with one word above the other, for 3 s. In between trials, a + sign was presented at the center for 3 s as a visual fixation target. Participants were instructed to respond 'yes' or 'no' depending on whether they could think of any particular object upon seeing each word pair. Responses were made by pressing a button under the right index finger for 'yes' and a button under the right middle finger for 'no'. Responses had to be made within the 3 s during which the word pairs remained on the screen. Any responses made after 3 s would be recorded as incorrect. Reaction time (RT) and accuracy were recorded for each trial. Retrieval and non-retrieval trials were presented in a pseudo-randomized order. The entire task lasted about 11 min.

Word stimuli were presented on an LCD screen placed about 46 in. from the participant using Stim software (Compumedics Neuroscan, USA). The two words in each pair spanned about 5° of both vertical and horizontal visual angle, with the horizontal measure varying slightly by word length. All the words were presented in black color, in lower case Times New Roman font, against a white background.

2.3. Behavioral analysis

We analyzed RT and accuracy separately using repeated-measures 2-way ANOVAs (between-subject factor: group [younger adults vs. older adults]; within-subject factor: condition [retrieval vs. non-retrieval]). All statistical analyses

of behavioral data were performed using IBM SPSS Statistics 21 (IBM Corp. Released 2012. IBM SPSS Statistics for Windows, Version 21.0. Armonk, NY: IBM Corp.).

2.4. EEG data acquisition and processing

Continuous EEG was recorded from a 64-electrode elastic cap (Neuroscan Quick-cap) while the participants were doing the task, through a Neuroscan SynAmps2 amplifier and using Scan 4.5 software (Compumedics Neuroscan, USA; sampling rate: 1 kHz, DC-200 Hz). Electrode impedances were typically below 10 kΩ. The reference electrode was located at midline between Cz and CPz and vertical electrooculogram (VEOG) was recorded at sites above and below left eye.

Data were processed off-line using Neuroscan Edit software (Compumedics Neuroscan). Poorly functioning electrodes were identified by visual inspection of the data and were excluded. Electrodes that had impedance over 20 kΩ were also excluded from analysis. No more than 5% of the total number of electrodes was rejected in any individual subject (following guidelines by [Picton et al., 2000](#); average percentage of bad electrodes: 1.6% and 1.9% in younger and older adult groups, respectively). The continuous EEG data were high-pass filtered at 0.15 Hz and corrected for eye blinks using the spatial filtering function in the Scan 4.5 software ([Semlitsch, Anderer, Schuster, & Presslich, 1986](#); Compumedics Neuroscan, USA).

EEG data were then processed using an in-house processing schema based on EEGLAB functions ([Delorme & Makeig, 2004](#)) in MATLAB (the MathWorks Inc.). EEG data were first segmented into multiple trial-by-trial EEG epochs (-200 to 1800 ms). Only correct trials were included for analysis. Additionally, we applied a digital low-pass filtering with a cutoff value of 30 Hz (linear finite impulse response function) to minimize high frequency noise, such as muscle activity. Epochs with peak signal amplitude of more than 75 μV were rejected. Finally, outlier epochs were identified by rejection algorithms in EEGLAB (rejecting improbable and abnormally distributed data lying over 5 standard deviations from the mean, using *pop_jointprob.m* and *pop_rejkurt.m* EEGLAB algorithms, respectively) and excluded from analysis. The average retaining rates were 78.3% (38 trials) and 77% (39 trials) in the younger adult group, and 81.6% (40 trials) and 83.1% (42 trials) in the older adult group, for retrieval and non-retrieval trials, respectively. All subjects except for one in the older group retained more than 30 trials in both retrieval and non-retrieval trials to be included for ERP analysis.

An algorithm computing the average based on spherical splines fitted to the data was then applied to interpolate EEG data to the sites of the bad electrodes ([Ferree et al., 2009](#)). This was based on the assumption that the number of bad electrodes typically consisted of less than 5% of all 62 electrodes, and that the bad electrodes were not all contiguous (as previously applied in [Maguire et al., 2010](#); [Spence et al., 2013](#)). After artifact/epoch rejection was done and the missing electrodes were replaced, the EEG epochs were then re-referenced (global average potential from all electrodes) and baseline corrected (average potential of the pre-stimulus period between -200 and 0 ms).

2.5. ERP analysis

2.5.1. Hypothesis-driven windowed measures

In order to examine if the current study replicated previous findings ([Brier et al., 2008](#)), we focused on the left fronto-temporal area (F7) during the time window between 750 and 1000 ms post-stimulus as observed previously. We measured the mean amplitude within the time window. We first examined the difference between retrieval and non-retrieval trials using paired-t tests in the younger adult group. Subsequently, we tested for group difference and interaction by running repeated-measures 2-way ANOVAs (between-subject factor: group [younger adults vs. older adults]; within-subject factor: condition [retrieval vs. non-retrieval]) on mean amplitude in IBM SPSS Statistics 21.

2.5.2. Data-driven STAT-PCA analysis

The pre-processed ERP data were analyzed by STAT-PCA ([Ferree et al., 2009](#); [Spence et al., 2013](#)), a procedure that utilizes statistical inference at each temporal and spatial unit (STAT) followed by a principal component (factoring) analysis (PCA) to isolate the most salient temporal and spatial properties of the ERPs.

In the current study, the spatial units were electrodes and the temporal units were 50-ms time windows within an epoch (0–1800 ms post-stimulus). We thus had $62 \times 36 = 2232$ combinations of space and time (62 electrodes and 36 time windows in an epoch). For each one of the 2232 spatial/temporal units, we implemented a linear mixed model

$$Y_{ijkl} = \mu + \lambda_i + b_{j(i)} + \Upsilon_k + (\lambda\Upsilon)_{ik} + \varepsilon_{ijkl},$$

to examine the effects of group (λ_i), condition (Υ_k) and the interaction between group and condition ($\lambda\Upsilon)_{ik}$, on the scalp potential Y_{ijkl} , where each subscript indexes group, subject, condition and trial, respectively. The statistical inference was performed in the SAS software 9.4 using Proc Mixed, and the variances associated with subject variability, $b_{j(i)}$, and trial variability, ε_{ijkl} , were estimated by restricted maximum likelihood. To account for multiple tests, we derived an inferential threshold based on the false discovery rate (FDR, [Benjamini & Hochberg, 1995](#)) rather than individual *p*-values, setting the FDR equal to 0.05 for each set of 2232 tests corresponding to group, condition and their interaction. The average potential of each

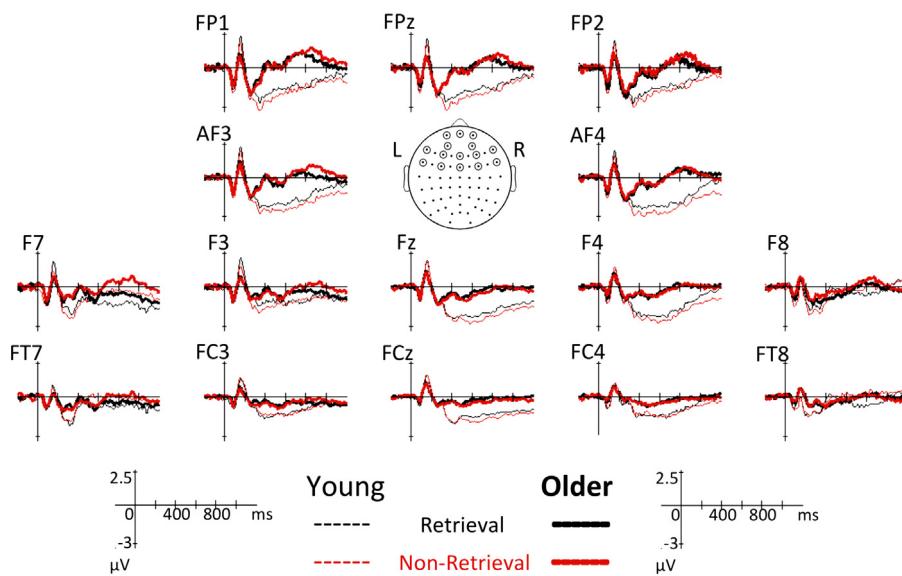


Fig. 1. Group average ERPs in retrieval and non-retrieval trials. Group average ERPs are overlaid for young (thin line) and older adults (thick line) at select electrodes at both hemispheres. Black line: retrieval trials; red line: non-retrieval trials. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of the article.)

of these three effects of interest was retained if the corresponding test was below threshold; otherwise, they were set to zero.

We then applied the principal components analyses (PCA) to the 3 matrices of thresholded average potentials (Ferree et al., 2009; Spence et al., 2013), each 36 temporal units by 62 electrodes, and retained the main spatial components by parallel analysis (Horn, 1965). For each retained spatial component, the temporal components were simply the resulting PCA scores. The retained spatial/temporal components can be visualized by plotting spatial PCA loadings in topographical distribution across scalp and temporal PCA scores as a time-series.

3. Results

3.1. Behavioral data

Younger adults had mean accuracy of 85.7% ($SD=5.7$) and 92.3% ($SD=5.1$) and mean RT of 1207 ms ($SD=195$) and 1476 ms ($SD=303$) for retrieval and non-retrieval trials, respectively. Older adults had mean accuracy of 87% ($SD=5.6$) and 92.6% ($SD=5.1$) and mean RT of 1394 ms ($SD=255$) and 1703 ms ($SD=396$) for retrieval and non-retrieval trials, respectively. While there was no significant difference in accuracy due to age ($p>.1$), the RTs were significantly longer in older adults (1548.5 ms) compared to younger adults (1341.7 ms), $F(1,42)=6.3$, $p=.016$. Overall, both groups took longer and were more accurate in responding to non-retrieval trials (mean RT = 1589.6 ms; mean accuracy = 92.4%) than to retrieval trials (mean RT = 1300.6 ms; mean accuracy = 86.3%); for RT, $F(1,42)=67.7$, $p<.001$, and for accuracy, $F(1,42)=31.9$, $p<.001$. There was no group by condition interaction in either RT or accuracy ($p>.1$).

3.2. ERP data

3.2.1. Results on hypothesis-driven windowed measures

The group average ERPs were plotted for visual inspection (Fig. 1). The analysis showed that for F7, mean amplitude between 750 and 1000 ms post-stimulus was significantly more negative in retrieval trials than non-retrieval in young adults, $t(21)=3.28$, $p=.004$ (Table 1 and Fig. 2). To examine whether this effect was different between the two age groups, the 2-way ANOVAs showed that regardless of group (age), the mean amplitude was more negative in retrieval trials ($-.93 \mu V$) than non-retrieval ($.05 \mu V$), $F(1,42)=21.4$, $p<.001$ (Table 1). No effects of group or group by

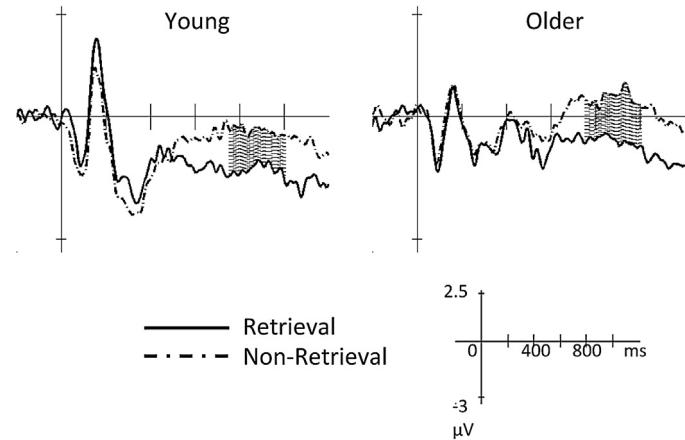


Fig. 2. Groups average ERPs of young (left) and older adults (right) showing the condition effect (retrieval vs. non-retrieval) at the left fronto-temporal site (F7) between 750 and 1000 ms post-stimulus (as represented within the shaded areas). Solid line: retrieval trials; dashed line: non-retrieval trials.

condition interaction were significant ($p>.1$). Therefore, the results replicated previous findings in Brier et al. (2008).

We performed further analyses to address the potential contribution of RT difference between retrieval and non-retrieval trials to the left fronto-temporal components, and found that RT difference did not contribute prominently to the ERP component of interest (see Supplementary Analysis 1).

Table 1
ERP mean amplitude at F7 (750–1000 ms).

Group	Retrieval (μV)	Non-retrieval (μV)	Paired t tests (p values)
Young-F7	−1.3 (2.1)	−.35 (2)	.004**
Older-F7	−.59 (2)	.46 (1.6)	.01*

Values: mean (standard error).

* $P<.05$.

** $P<.01$.

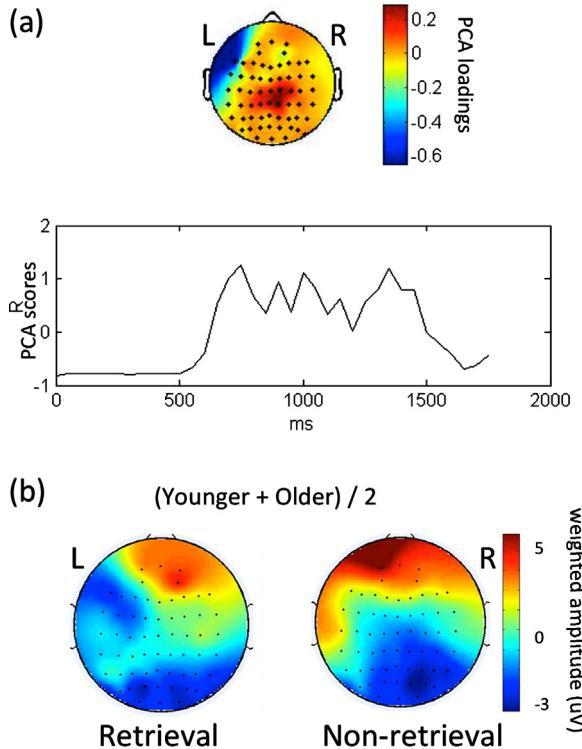


Fig. 3. PCA results of condition differences. The 1st spatial factor is depicted in (a) and the weighted ERP topography for each condition is shown in (b). In (a), the upper part of the figure illustrates a condition effect in the left fronto-temporal region (F7, FT7) accompanied by a weaker effect at the middle centro-parietal region (Cz, CP2); the lower part illustrates the spatial factor that peaked at around 750 ms post-stimulus and that lasted beyond 1400 ms. In (b), the ERPs weighted by the temporal PCA scores for each condition (averaged across groups) show that the left fronto-temporal effect was found with retrieval trials having more negative potentials than non-retrieval trials; the co-existing middle centro-parietal effect was found with non-retrieval having more negative potentials than retrieval trials.

3.2.2. Results on data-driven STAT-PCA analysis

For effects of condition, group, and their interaction we found 303, 208, 24 spatial/temporal units (out of total 2322 units), respectively, that survived at FDR = 0.05.

For condition differences (retrieval vs. non-retrieval), two spatial PCA factors were detected (48.6% and 20.9% of total variance, respectively). The first factor was found near the left fronto-temporal region (near F7, Fig. 3a) starting at around 750 ms post-stimulus, and of smaller magnitude, near the centro-parietal region (near Cz, CPz, Fig. 3a), which is consistent with the findings of Brier et al. (2008) study. In the left fronto-temporal region the retrieval condition contributed larger negative potentials relative to the non-retrieval condition, whereas in the centro-parietal region, negative potentials were larger in the non-retrieval trials relative to retrievals (Fig. 3b). ERP waveforms (Figs. 1 and 2) demonstrated that this effect was found at the left side (F7) but not on the right side (F8). This effect was again replicated here using STAT-PCA, consistent with our hypothesis-driven analysis in the previous section. The second spatial PCA factor was centered over the frontal region (near FP2, not shown) but was much less consistent in time and across subjects compared to the first factor. Most importantly, it had no clear peak and started after 1400 ms post-stimulus onset, which is later than the average RT in the younger adults and the RT of most of the older adults. Since we primarily focused on neural processes that occurred before a motor response was made, we did not pursue this finding further.

For group differences (young vs. old), one spatial PCA factor was found (71.5% of total variance), centered over the mid frontal

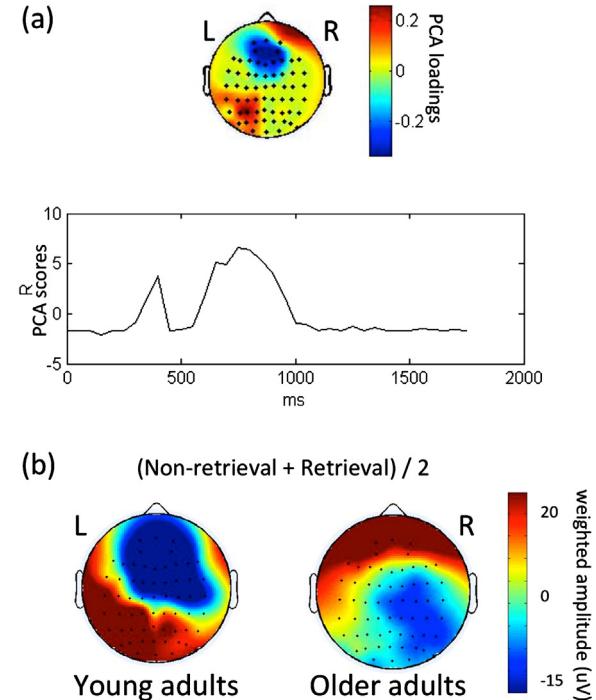


Fig. 4. PCA results of the group differences. The 1st spatial factor is shown in (a) and the weighted ERP topography for each group is shown in (b). In (a), the upper part of the figure illustrates a group effect in the frontal region (Fz, FCz); the lower part illustrates that the spatial factor peaked at around both 400 and 750 ms post-stimulus. In (b), the ERPs weighted by the temporal PCA scores for each group (averaged across retrieval and non-retrieval trials) show that the frontal effect was contributed by negative potentials in the younger and positive potentials in the older adults.

regions (near Fz, FCz) and peaked both at 400 ms and at 750 ms post-stimulus (Fig. 4a). While a more positive scalp potential was observed in the older group, in the same time frames, a negative scalp potential was observed in the younger group (Fig. 4b). ERP waveforms (Fig. 1) demonstrated that this effect was found at the frontal midline electrodes (Fz, FCz).

For the group by condition interaction, one spatial PCA factor was found (67.2% of total variance), focused in frontal electrodes (AF3, F3) that had the strongest effect between 800 and 1000 ms post-stimulus (Fig. 5a). This interaction was mostly a result of condition effects in the older group, with a more positive frontal potential in non-retrieval than in retrieval trials (Fig. 5b). The pattern seemed to be reversed in the younger group (Fig. 5b), but in the younger group, this waveform started long before the 800–1000 ms window and was not nearly as large in magnitude. ERP waveforms (Fig. 1) demonstrated that this effect was found in opposite directions for different age groups on the left (AF3) but not on the right (AF4). Finally, we conducted windowed measures analysis to confirm the PCA findings here could be replicated using a more conventional approach, keeping the caveat in mind, however, that this was a *post-hoc* approach and could not be ascertained temporally and spatially before the STAT-PCA was performed (see Supplementary Analysis 2).

4. Discussion

In this study, we used ERPs to investigate how age differences modulated semantic object memory retrieval during the SORT task. We observed differences in scalp potentials between retrieval and non-retrieval trials starting at around 750 ms in the left fronto-temporal regions, lasting longer than 1000 ms, in both younger and older adults. In addition, there was a frontal positive potential

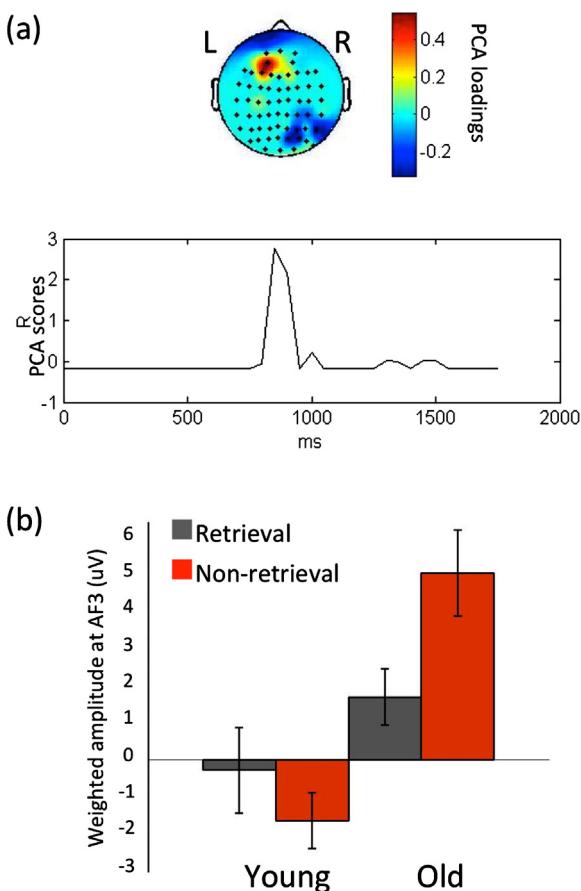


Fig. 5. PCA results of the group by condition interaction. The 1st spatial factor is illustrated in (a) and weighted amplitudes at the electrode AF3 for each condition and group are shown in (b). In (a), the upper part of the figure shows a condition effect that differs by group in the frontal region (AF3, F3); the lower part illustrates the spatial factor peaked between 800 and 1000 ms post-stimulus. In (b), the ERPs weighted by the temporal PCA scores at AF3 show that the frontal interaction effect was contributed by non-retrieval having more positive potentials than retrieval trials in the older adults, while non-retrieval having slightly more negative potentials than retrieval trials in the younger adults; error bars represent standard errors.

that was found to arise between 800 and 1000 ms in older adults. Behaviorally, we found that older adults performed as accurately as younger adults. Comparable accuracy in both groups indicates that the overall ability to bind features to retrieve object representations is relatively preserved with aging. Although RT differences between young and old were observed, these RT differences were not specific to either retrieval or non-retrieval trials, and hence may have been due to generalized age-related slowing (Lima, Hale, & Myerson, 1991; Salthouse, 1996).

The left fronto-temporal ERP component common to both age groups started late (around 750 ms) and lasted until around 1400 ms post-stimulus. The same effect was also shown in Brier et al. (2008) in young adults. The left fronto-temporal ERP component in the current study occurred later than the typical N400 time frame and is likely to be functionally different from N400. Such late effects have been observed by others in studies that have examined semantic related processes at the sentence level (Bornkessel-Schlesewsky & Schlesewsky, 2008; Kuperberg, 2007; Kuperberg et al., 2003; Van Petten & Luka, 2012) as well as processing of single words (Hill et al., 2002; Meyer & Federmeier, 2007; Swaab et al., 1998) and pictures (Ganis & Kutas, 2003; McPherson & Holcomb, 1999; Mudrik et al., 2010; Sitnikova et al., 2008). Overall, these late effects have not been found to be affected predominantly by the perceptual properties of the stimuli or the semantic relationships

between them, but instead are largely affected by how stimuli are interpreted and processed, as demonstrated when the instructions and experimental designs were manipulated at the conceptual level (Kuperberg, 2007). We postulate that the cognitive processes at this stage include the memory retrieval of an object facilitated by the probe words (such as humps and desert in the SORT; Hart, Maguire, et al., 2013). Object retrieval here requires integration of two concepts (features) to make an explicit, conscious connection. The effortful nature of the SORT was supported by the substantially longer RT for retrieval trials (>1 s) than what is normally observed in lexical judgment and object categorization tasks that also use words as stimuli (Grieder et al., 2012; Hill et al., 2002). Late ERP effects have also been observed in studies on truth verification (Wiswede, Koranyi, Müller, Langner, & Rothermund, 2013), metaphor processing (Arzouan, Goldstein, & Faust, 2007; Coulson & Van Petten, 2002), and creative thinking (Kröger et al., 2013). Finally, as we tested in the results, this component was much less likely to be contributed by RT difference between retrieval and non-retrieval trials (Supplementary Analysis 1).

Semantic memory studies that have used word pairs similar to ours have observed N400 between 250 and 500 ms (Kutas & Federmeier, 2000). These studies have found that the amplitude of N400 is modulated by the degree of semantic relatedness/congruity between word pairs. Specifically, smaller N400 amplitudes have been observed in pairs where a target word is followed by a related (dog-cat) as compared to an unrelated (dog-car) word (Bentin, McCarthy, & Wood, 1985). In our task, the retrieval pairs (humps and desert) had slightly more relatedness or congruity than non-retrieval pairs (humps and monitor), leading to the expectation of seeing a N400 effect, with larger amplitude during non-retrieval trials compared to retrieval trials. One possible reason for not observing the N400 effect in our study may be related to the fact that our task required participants to evaluate whether the word pairs yield retrieval of an object memory or not. It is likely that the focus on object retrieval in our task engages neural circuits beyond those that are essential for access to semantic storage (such as left MTG, superior temporal sulcus, and inferior temporal gyrus; see a comprehensive review by Lau et al., 2008), thus resulting in a late negative potential around 750 ms. It is plausible the pre-SMA-thalamus-caudate circuit in addition to the left IFG implicated in previous activation studies on the SORT are involved during the object retrieval process (Assaf, Calhoun, et al., 2006; Kraut, Kremen, et al., 2002). Furthermore, the SORT stimuli are feature pairs created based on whether they in combination would lead to retrieval of a particular object, rather than how closely related or congruous these two features may be. Therefore, the difference in semantic relatedness or congruity was not quantified and may not be large enough to elicit consistent N400 effects between retrieval and non-retrieval trials. Another possible reason for not observing N400 may be related to stimulus repetition. The N400 effect has been shown to be degraded after repetition (Besson, Kutas, & Van Petten, 1992; Kiefer, 2001). As a result, because the individual word stimuli were presented twice within the SORT experiment to balance between retrieval and non-retrieval trials, the N400 effect might have been diminished. Nevertheless, the extent to which the repetition of the stimuli once would eliminate the N400 effect is debatable (see Debraille & Renault, 2009; Renault, Wang, Mortimer, & Debraille, 2012).

While it appears that both younger and older adults used comparable neural mechanisms when features clearly facilitated retrieval of an object memory, we found a frontal positive ERP component between 800 and 1000 ms post-stimulus only in older adults. ERP showed that non-retrieval trials elicited a larger and more positive potential than retrieval trials, suggesting that this frontal component represents increased neural recruitment in response to non-retrieval trials. Maintaining an active search

process for potential linkage to an object during non-retrieval trials appeared to be more taxing than in retrieval trials. The longer RT in the non-retrieval trials suggests the search was more exhaustive and effortful before the search was terminated prior to making a response. It is likely that older adults recruited additional neural resources to test and rule out possibilities prior to making a behavioral response on non-retrieval trials. Given that there was no difference in the accuracy of response between younger and older adults, it is possible that these additional neural resources in older adults serve as a compensatory mechanism for maintaining and/or terminating search when features result in no retrieval. The frontal ERP component could be mediated by age-related changes in the frontal lobes, which are known to occur earlier than age-related changes in other brain regions (Grady, 2012; Hedden & Gabrieli, 2004). However, ERP studies provide high spatial-temporal but relatively poor spatial resolution. Future investigation using fMRI (previously done only in young adults; Assaf, Calhoun, et al., 2006; Kraut, Kremen, et al., 2002), which affords better spatial resolution than does EEG, will be needed to test this hypothesis in the aging population.

As we contended earlier, semantic relatedness and congruity could play a less important role in the SORT task and do not contribute significantly to the late ERP component we observed. Still, we acknowledge that a plausible account for the late ERP finding reported in the current study may be attributed to semantic relatedness or congruity effects that differ between retrieval and non-retrieval conditions. For example, the additional frontal component in older adults may reflect a delayed detection of congruity compared to young adults. Future studies should (1) include retrieval and non-retrieval trials contingent upon disparate degrees of semantic relatedness/congruity and (2) use non-repeated stimuli in order to examine these other possibilities.

The operation associated with non-retrieval trials has been observed to be dysfunctional in patients with Alzheimer's disease and schizophrenia performing the SORT (Assaf, Calhoun, et al., 2006; Assaf, Rivkin, et al., 2006; Kraut, Cherry, et al., 2006). In these studies, a predominant type of error noted was false positive answers on non-retrieval trials or 'overbinds'. For example, when asked for the name of the object in reading "humps" and "alarm", an Alzheimer's patient wrote "volcano" as the false positive error. Another example is "skywriter" for the word pair "propeller" and "writing". Thus it should be emphasized that semantic memory retrieval dysfunction could manifest in both ways: failure to retrieve (false negative) and failure to suppress inappropriate memory representations when falsely combining features to either an unrelated or a nonexistent object (false positive). We posit that the latter dysfunction can result from an inability to maintain and terminate search processes effectively. Normal older adults appear to maintain and terminate the search successfully by utilizing neural mechanisms as measured by the late frontal ERP component. Therefore, deviations to this late frontal component could potentially be used as a neurophysiological marker for detecting semantic dysfunction in patient populations. However, further research will be required to replicate the results with a larger sample of subjects to test the validity of using this ERP component as a marker.

Although condition differences in older adults seemed to contribute the most to the interaction observed in the frontal electrodes, we also observed a pattern reversal when comparing younger and older adults: while we observed frontal negativity in younger adults, a frontal positivity was noted in older adults. The group difference peaked twice at 400 and 750 ms post-stimulus and was not specific to trial type. It is plausible that structural differences or changes in the brain between the groups could be contributing to this pattern reversal. At the neural level, it could be that in one age group, different cellular populations are being synaptically impinged relative to the other age group. Those

different neural impingements could be happening within the same regions of brain, thus causing activation of distinct neural generators with different polarities. Alternatively, the activity could be in different brain regions altogether, with consequent opposite-polarity summations at the scalp. The neural bases for these ERP differences cannot be ascertained at this point.

We acknowledge that the older adult participants were recruited through a physical fitness study (Chapman et al., 2013) that had strict inclusion and exclusion criteria. Those potential participants who had physical or cognitive issues and were not able to endure the study were excluded. Thus, the older adult subjects in our study were in general healthier than their peers in the overall population, which may have contributed to their behavioral performance being comparable to that exhibited by the cohort of young participants. However, this fact makes the ERP differences in the face of preserved performance even more striking, since many individual differences can create variability in the ERPs of general older adult populations (Meyer & Federmeier, 2010; Wlotko et al., 2010). Second, more studies will be needed to investigate the time-frequency or phase coherence information on the cortical oscillations associated with the object memory retrieval process associated with the SORT. Finally, in the current design subjects only use their right hand to respond to the stimuli, leaving the uncertainty as to whether unilateral responses contributed in an important way to the left fronto-temporal ERP component. A study design incorporating bilateral hand responses could plausibly help to address this issue.

In conclusion, our findings suggest that older adults employ additional neural resources during semantic processing that requires more extensive and exhaustive search within the semantic network. When the search ends with object memory retrieval, older adults recruit similar neural mechanisms as younger adults. Our results support the contention that the stability of this semantic memory function in older age relies not only on successfully retrieving an object memory but also on successfully terminating search before false-positive object memory retrieval occurs: this process has been found to be impaired in patient populations (Assaf, Rivkin, et al., 2006; Kraut, Cherry, et al., 2006). The semantic ERP markers observed in the current study may have potential applications in characterizing early semantic deterioration and distinguishing neurophysiological changes due to disease from those due to aging alone (Chiang et al., 2012).

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Appendix A. Supplementary data

Supplementary data associated with this article can be found, in the online version, at <http://dx.doi.org/10.1016/j.biopsych.2014.05.010>.

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