

# Influence of Aging on the Neural Correlates of Autobiographical, Episodic, and Semantic Memory Retrieval

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## Abstract

■ We used fMRI to assess the neural correlates of autobiographical, semantic, and episodic memory retrieval in healthy young and older adults. Participants were tested with an event-related paradigm in which retrieval demand was the only factor varying between trials. A spatio-temporal partial least square analysis was conducted to identify the main patterns of activity characterizing the groups across conditions. We identified brain regions activated by all three memory conditions relative to a control condition. This pattern was expressed equally in both age groups and replicated previous findings obtained in a separate group of younger adults. We also identified regions whose activity differentiated among the different memory conditions. These patterns of differentiation were expressed less

strongly in the older adults than in the young adults, a finding that was further confirmed by a barycentric discriminant analysis. This analysis showed an age-related dedifferentiation in autobiographical and episodic memory tasks but not in the semantic memory task or the control condition. These findings suggest that the activation of a common memory retrieval network is maintained with age, whereas the specific aspects of brain activity that differ with memory content are more vulnerable and less selectively engaged in older adults. Our results provide a potential neural mechanism for the well-known age differences in episodic/autobiographical memory, and preserved semantic memory, observed when older adults are compared with younger adults. ■

## INTRODUCTION

Declarative memory involves the conscious retrieval of information and includes episodic, semantic, and autobiographical memory (EM, SM, and AM, respectively). SM comprises memory for factual information and general decontextualized knowledge, whereas EM supports the rich re-experiencing of a memory's original spatio-temporal context (Tulving, 1972, 1985). AM represents knowledge specific to an individual and comprises both decontextualized personal semantics, such as a friend's name, and highly contextualized EMs, such as a relative's wedding ceremony (Conway, 2001; Brewer, 1986). In general, AM has higher personal significance and emotional valence, is more structured by general world knowledge, and operates on a longer time frame than the conventional EM tested in the laboratory (Gilboa, 2004; Wheeler, Stuss, & Tulving, 1997).

Burianova and colleagues (Burianova, McIntosh, & Grady, 2010; Burianova & Grady, 2007) developed a functional brain imaging paradigm to compare AM, EM, and SM directly. They identified a network of common regions supporting the retrieval of all three memory types, as well

as sets of frontal and temporal brain areas specific to each memory condition. With the current study, we adopted this paradigm to explore how healthy aging affects the neural correlates of declarative memory. There is a large scientific literature documenting the effects of aging on memory, but no neuroimaging study so far has assessed these three forms of memory simultaneously within the same individuals.

Behavioral evidence indicates that SM is relatively preserved in healthy older adults (Spaniol, Madden, & Voss, 2006; Nilsson, 2003; Allen, Sliwinski, Bowie, & Madden, 2002; Nyberg, Backman, Erngrund, Olofsson, & Nilsson, 1996; Craik & Jennings, 1992; Mitchell, 1989) as they typically perform as well as young adults on tasks of memory for general knowledge, such as naming and lexical decision-making (Balota & Ferraro, 1996; Allen, Madden, Weber, & Groth, 1993; Mitchell, 1989), semantic priming (Laver & Burke, 1993) or multiplication verification (Allen, Smith, Jerge, & Vires-Collins, 1997). Given the relative preservation of SM in older adults, one would expect that the neural correlates of SM retrieval would also be relatively maintained. Indeed, several studies have found that brain activity during SM tasks, such as judging animacy or tests of memory for famous names, is similar in young and older adults, although the older adults may show more frontal activity (Nielson et al., 2006; Lustig et al., 2003; Logan, Sanders,

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dedifferentiation in the neural specificity of responses to the retrieval of different kinds of content might be observed. To quantify neural selectivity, we performed a multi-subject barycentric discriminant analysis (MUSUBADA; Abdi & Williams, 2010; Williams, Abdi, French, & Orange, 2010). MUSUBADA calculates how the largest patterns of whole-brain activity present in the data are expressed for each group within each condition. These brain activity patterns or dimensions are analogous to the patterns picked up by ST-PLS and, thus, MUSUBADA is a good complementary technique to ST-PLS. Additionally, MUSUBADA computes, for each group and condition mean, confidence ellipses, which provide an intuitive display of neural specificity per group, condition, and dimension rather than an overall measure of differentiation. In our case, we would expect dedifferentiation in older adults not to affect the brain activity pattern common to all memory types but instead to reduce the differences seen in brain patterns that distinguish among AM, EM, and SM in younger adults.

## METHODS

### Participants

Fifteen young (age range = 20–33, six men) and 15 older adults (age range = 63–77, six men; Mini-Mental State Examination range = 27–30, mean = 29.31) were recruited for this study. All participants were right-handed and native or fluent English speakers with either normal or corrected-to-normal vision. Exclusion criteria included poor health conditions (e.g., back problems), history of neurological or psychiatric disorders, head injury, and stroke. Informed consent was obtained in accordance with a protocol approved by Baycrest’s Research Ethics Board.

### Procedure

Immediately before scanning, participants received a practice session during which they were exposed to examples of the four conditions (control, AM, EM, and SM). The study consisted of six fMRI runs of 498 sec each. Each run consisted of 28 trials of 16 sec (seven trials per condition); trials from each condition were randomized within the run. For each trial, a stimulus was presented (4 sec), followed by an ISI (1 sec), a question (10 sec), and an inter-trial interval (1 sec). The stimuli and paradigm used here are described in greater detail in Burianova and Grady (2007). For the control trials, participants were presented with a scrambled meaningless picture, which was followed by a request to press one of three response pad keys corresponding to a letter (e.g., “Press a key that corresponds to the letter A”; 1 = A, 2 = G, 3 = *I don’t know*).

For AM, EM, and SM trials, a photograph was presented with a cue word directing attention to the gist of the image (e.g., “poverty,” “grandparents,” “airplane”). The picture was followed by one of three types of questions (EM, AM, or SM). Conditions were randomized, and participants

became aware of the condition at question onset. EM questions were about an element from the picture (e.g., “On the picture which you just saw, what was the color of the bicycle?”). SM questions were about general knowledge related to the theme of the picture (e.g., “In which city was John F. Kennedy assassinated?”). For both these conditions, three answer choices were presented, with either Button 1 or Button 2 corresponding to the correct answer and Button 3 corresponding to the answer “I don’t know.” During AM trials, participants were instructed to retrieve a personal event related thematically to the picture (e.g., “think of a time you were with older relatives”) and to rate the vividness of their memory for that event (e.g., 1 = *very vivid*, 2 = *somewhat vivid*, 3 = *not vivid at all*). Each photograph was presented three times over the course of the study (once for each of the three memory conditions), but never more than once per run. Accuracy was stressed over speed. The main purpose of the behavioral response was to discard incorrect trials and to insure that participants were engaged in the task. We found that, for our participants, RT was uncorrelated with accuracy, as measured by percent correct trials.

### MRI and fMRI Data Acquisition

Brain images were obtained with a Siemens 3 T Trio Scanner using a Matrix 12-channel head coil. The anatomical images were acquired with a T1-weighted 3-D MPRage oblique axial sequence (160 slices, 1 mm thick, field of view = 256 mm). Brain activity was measured using the BOLD response. Functional images were acquired with an EPI oblique axial sequence (repetition time [TR] = 2000 msec, echo time = 30 msec, field of view = 200 mm, flip = 70, 28 images, 5 mm thick).

Stimuli were projected onto a screen located behind the participant, made visible through a mirror mounted on top of the head coil. Plastic goggles with corrective lenses were used when needed. Responses were made with the right hand using the first three buttons of a four button Fiber-Optic Response Pad System (Current Designs, Inc., Philadelphia, PA). Heart rate and respiration data were collected to be regressed out of the functional images.

### fMRI Data Analysis

Images were reconstructed and preprocessed utilizing the analysis of functional neuroimages (Cox, 1996) and SPM5 software. The images were corrected for motion associated with heart rate and respiration, the timing of the interleaved functional sequence (slice timing), and within-run head motion (coregistration). Images were normalized to standard Montreal Neurological Institute (MNI) space using SPM5’s functional EPI template and smoothed with a 6-mm Gaussian filter.

Results were analyzed with ST-PLS, which was conducted on data from both young and older adults to assess differences across conditions and age groups. For the analysis,

we kept trials with correct responses for the control, SM and EM conditions, and AM trials for which participants answered “very vivid” or “somewhat vivid” (see Figure 1).

For each voxel, ST-PLS calculated the percent change in signal intensity value from a trial’s first TR (the onset of the question), at each of the subsequent seven TRs (16 sec). ST-PLS created a cross-block covariance matrix between changes in brain activity (for each voxel at each time point) and experimental manipulations (our task conditions: AM, SM, EM, and Ctl). A singular value decomposition was then conducted on this matrix.

The result of this analysis provided a set of latent variables (LVs), which identify how patterns of brain activity vary across the experimental conditions. Each LV accounts for a proportion of the covariance between conditions and brain activity, with the first LV accounting for the largest part. Two sets of weights called saliences are associated to each LV. The first set of saliences characterizes a contrast across the task conditions, and the second set of saliences expresses how each brain voxel’s pattern of signal change reflected the task contrast at each TR (McIntosh et al., 2004). In addition, ST-PLS calculated brain scores for each subject for each LV for each condition; brain scores are the product of each voxel’s salience by the normalized signal value for that voxel, summed across all brain voxels. These brain scores reflect how strongly a participant expresses the patterns of an LV per condition. Temporal brain scores were also calculated per participant for each task condition. These brain scores reflected how strongly the LV’s pattern of voxel salience was expressed over time and allowed us to identify the TRs with maximal condition and group contrasts in the LV.

The significance of each LV was determined using a permutation test (McIntosh, Bookstein, Haxby, & Grady, 1996) with 500 permutations, and the reliability of the voxel saliences was determined using bootstrap estimation of *SEs* using 100 bootstrap samples (McIntosh et al., 2004; Efron & Tibshirani, 1985). Voxels with a salience/*SE* ratio of magnitude of  $>4$  were considered to be reliable (Burianova & Grady, 2007; Sampson, Streissguth, Barr, &

Bookstein, 1989). Voxels with the highest salience/*SE* ratio within a 2-cm cube centered around them were considered local maxima for each active cluster. Maxima from clusters composed of more than 20 reliably activated voxels, with a minimal distance of 10 voxels between voxel peaks, are reported in the Results section in MNI coordinates. In addition, 95% confidence intervals for the mean brain scores (mean-centered and collapsed across all TRs in the analysis window) in each condition and group were calculated with the bootstrap procedure. When two confidence intervals for two conditions did not overlap, we considered that these two conditions differed reliably.

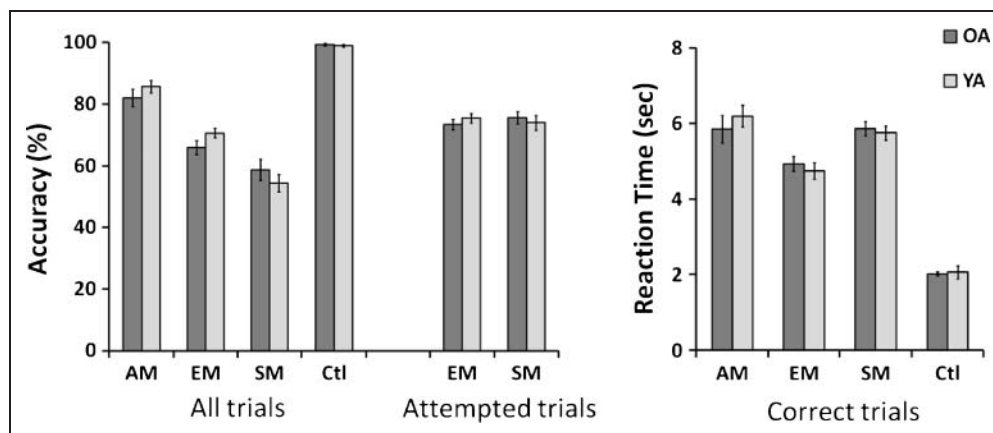
We also analyzed the group effects using MUSUBADA, which is a variation of discriminant analysis. We used MUSUBADA to determine if a pattern recognition technique could identify (i.e., “discriminate between”) the experimental conditions and if the discriminability between these conditions would interact with age. MUSUBADA computes the average (i.e., “barycenter”) scan per condition for all the participants and performs a PCA on this set of scans. It provides discriminant factor scores for the experimental conditions that can be used to display these conditions on a PCA-like map. We also projected the barycenters of the older and younger participants for each experimental condition on a map where the distance between two conditions reflected how much the brain patterns differed between them. Finally, we used a bootstrap procedure, with both scans and participants treated as random factors, to compute 95% confidence ellipses for each barycenter in the two groups, which we then plotted on the factor score map. Ellipses from different conditions that did not overlap on a least one map are significantly ( $p < .05$ ) different from each other (see Abdi, Dunlop, & Williams, 2009).

## RESULTS

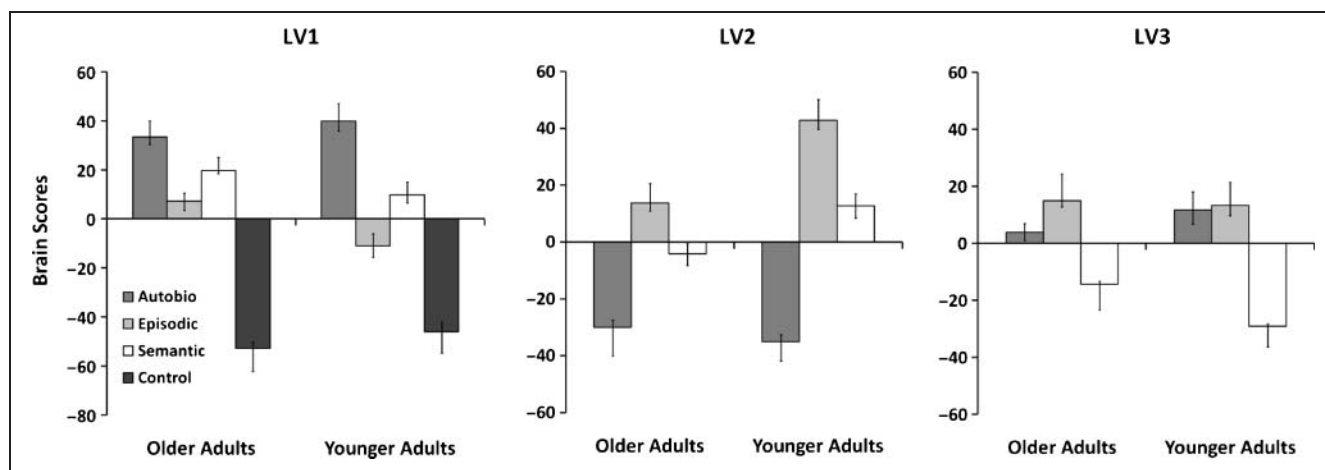
### Behavioral Results

Accuracy and RT for each task condition are plotted per age group in Figure 1. A series of  $2$  (Group)  $\times$   $4$  (Task

**Figure 1.** Left: Mean percent of correct trials per condition for each group, out of the total number of trials (all 42 trials, except for one younger participant who answered 35 trials per condition), and out of the number of trials for which the participant answered something other than “I don’t know” (attempted trials; SM and EM only). Right: Mean RT per condition for young and older adults (correct trials only). Error bars represent the *SEM* for each age group. Ctl = control condition, OA = older adults, YA = young adults.







**Figure 2.** Mean brain scores from the ST-PLS analyses (mean-centered and collapsed over all TRs in the analysis window) per task control for young and older adults. Data are shown for the analysis that included the control condition (LV1) and the analysis that excluded the control condition (LV2 and LV3). Error bars are the 95% bootstrapped confidence intervals.

condition) ANOVAs were conducted on the percentage of correct trials and on the mean RT for correct trials, respectively. The tests revealed no significant main effect of age group ( $F < 1$ ), and no significant Age group  $\times$  Condition interaction effect [accuracy:  $F(3, 84) = 1.914, p = .134$ ; RT:  $F < 1$ ] on either measure. However, both tests revealed a significant main effect of task condition [accuracy:  $F(3, 84) = 157.226, p < .001$ ; RT:  $F(3, 84) = 181.481, p < .001$ ]. Paired-sample  $t$  tests corrected for multiple comparisons with the Holm–Bonferroni method revealed that all conditions differed significantly from each other in their mean accuracy score ( $p < .001$ , adjusted). Mean accuracy for attempted trials (excluding “I don’t know” answers) did not differ significantly between the SM and the EM conditions ( $t < 1$ ). With the exception of AM and SM ( $t < 1$ ), mean RT for correct trials differed significantly between all the other conditions as well ( $p < .005$ , adjusted). The lack of group difference in RT ruled out motor response latency (i.e., button press) as a source of age differences in the BOLD response. Also, the lack of group difference in accuracy ruled out unbalanced statistical power as a confound, because both groups had equivalent numbers of trials entered in the analysis per condition.

### fMRI Results: ST-PLS

We obtained three significant LVs from our ST-PLS analysis. The first LV revealed regions whose activity differentiated the three memory conditions from the control condition. Because this LV accounted for over half of the covariance in the data, we performed an additional ST-PLS omitting the control condition for a better assessment of the differences among the memory conditions. This analysis provided two additional LVs. Figure 2 shows the mean brain scores for these three LVs, averaged per condition, for

each age group. Temporal brain scores indicated that maximal differentiation of the task conditions was achieved around TRs 4 and 5 or 10 sec following the onset of the question (see Supplementary Figure 1). We report the brain regions with reliable contributions to the observed brain patterns at these two TRs.

### Common Memory Regions

The first LV of the analysis that included the control condition (LV1) accounted for the largest amount of cross-block covariance in the data (55.1%,  $p < .002$ ) and identified brain regions whose level of activation differed between all memory conditions and the control condition. This pattern was expressed in both young and older adults to a similar degree. Figure 2 (left) shows the brain scores per condition for this LV in each group. In addition to showing a difference between the control and the memory conditions, the confidence intervals revealed a greater engagement of the common memory regions during AM relative to SM and EM and greater engagement during SM than EM in both age groups. During EM, the memory regions also were significantly less engaged in young adults than in older adults.

The pattern of peak voxels from this LV (see Table 1) closely resembles the common memory network proposed by Burianova and Grady (2007). This network includes the middle temporal cortices, the left inferior frontal gyrus, the angular gyrus, the caudate nuclei, the posterior cingulate, and the left medial-temporal lobe. All of these regions were activated above baseline in the three memory conditions in both age groups (Figure 3, top). Brain regions with more activity during the retrieval period of the control task than during the memory tasks mainly consisted of bilateral occipital areas. This difference was accounted for by a deactivation from trial onset during the memory conditions, rather than by an increase during

the control condition. We normalized activation to the onset of the question (immediately after the cue photograph was removed), a time point at which activity in occipital regions was elevated by the viewing of the cue photograph. Occipital activity declined when the cue was removed and the focus of the task switched to an internal retrieval process. This reduction of activity was larger during the memory trials than during the control trials, accounting for the apparently greater activity during the control condition that we observed.

### Regions Distinguishing among Memory Conditions

LV2 ( $p < .002$ ) accounted for 59.9% of the cross-block covariance of the matrix that did not include the control

condition. This LV identified brain regions whose activity differed maximally between the AM and the EM condition in both groups, with the SM condition contributing less to the pattern of activity (Figure 2, middle). Confidence intervals revealed significantly more positive EM and SM brain scores in young adults than in older adults. In general, this pattern that differentiated AM from EM and SM was expressed to a greater degree in the young adults.

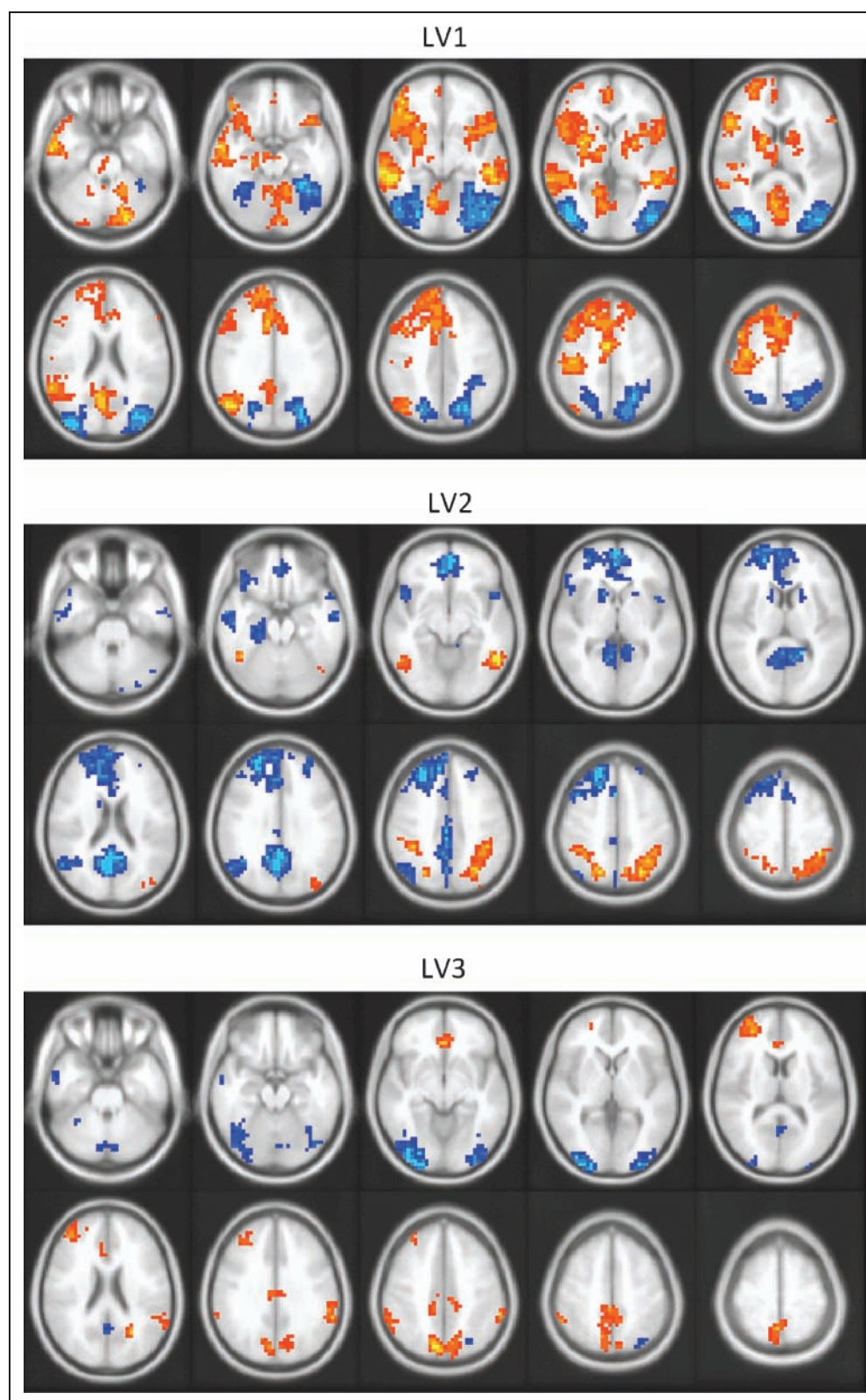
Peak voxels from regions contributing to this LV are listed in Table 2. Regions that showed greater activity during the EM than during the AM condition included the bilateral inferior frontal gyrus, middle, and superior occipital areas, as well as the right inferior temporal gyrus (Figure 3, middle). The right superior parietal lobule and the left fusiform also differentiated AM and EM because they

**Table 1.** Peak Voxels of Regions Expressing the Task Contrast of LV1

Region	Hemis	BA	MNI Coordinates			BS Ratio
			<i>x</i>	<i>y</i>	<i>z</i>	
<i>Memory &gt; Control</i>						
Middle temporal gyrus	L	21	-60	-8	-24	13.9
	R	21	50	-32	-8	10.8
Superior temporal gyrus	L	22	-48	-24	16	6.7
Inferior frontal gyrus	L	45	-48	20	12	11.7
	R	47	52	16	-4	8.8
SMA	L	6	-8	24	52	10.9
Superior medial frontal gyrus	L	6	-4	36	36	10.3
Middle frontal gyrus	L	8	-44	16	48	10.2
Precentral gyrus	L	4	-44	-20	56	8.6
Retrosplenial/posterior cingulate	L	23	-8	-56	16	11.6
Angular gyrus	L	39	-48	-68	32	11.0
	R	39	52	-64	28	6.3
Lingual gyrus	L	18	-12	-64	-8	8.1
Hippocampus	L	n/a	-20	-20	-20	7.6
Caudate	L	n/a	-16	4	8	8.7
	R	n/a	16	8	8	7.0
Thalamus	L	n/a	-8	-8	0	5.9
Cerebellum	R	n/a	32	-76	-44	9.9
<i>Control &gt; Memory</i>						
Inferior occipital gyrus	L	18	-48	-76	-4	-14.0
Middle occipital gyrus	L	19	-40	-88	12	-12.8
	R	19	44	-80	0	-12.6
Superior parietal lobule	R	7	20	-68	44	-10.9

Hemis = hemisphere, BA = Brodmann's area, *x* = right/left, *y* = anterior/posterior, *z* = superior/inferior, BS ratio = bootstrap ratio, R = right, L = left, n/a = not applicable.

**Figure 3.** Voxel saliences for LV1 (top), LV2 (middle), and LV3 (bottom). LV1 is from the ST-PLS that included the control condition, and LV2 and LV3 are from the analysis that only included the three memory conditions. Activity is presented for clusters of at least 20 voxels with a bootstrap ratio of magnitude of  $>4.0$ , from the fifth TR (10 sec) following the question onset. LV1: Clusters in warm colors showed reliably greater activity during the three memory tasks in both age groups, and clusters in cool colors showed reliably greater activity during the control task. LV2: For both age groups, clusters in warm colors showed reliably greater activity during the EM condition, whereas clusters in cool colors showed reliably greater activation during the AM condition. The SM condition contributed little to this pattern. LV3: For both age groups, clusters in warm colors showed reliably greater activity during the AM and EM conditions, whereas clusters in cool colors showed reliably greater activation during the SM condition.



showed greater deactivation during the AM than during the EM condition relative to the first TR in the trial.

A more extensive set of regions showed greater activity during the AM condition, relative to EM and SM. These regions (Figure 3, middle) included both ventral and dor-

sal portions of medial PFC, the bilateral hippocampus (with the maximum of the left region being somewhat posterior to the hippocampal region identified by LV1), the left angular gyrus, the temporal poles, and the left caudate nucleus. This pattern of activation is consistent with

the regions typically activated during AM retrieval (see Svoboda, McKinnon, & Levine, 2006; Maguire, 2001, for a review).

LV3 ( $p < .002$ ) accounted for 23.5% of the cross-block covariance in the matrix that did not include the control condition and identified brain regions whose activity distinguished SM from the other two conditions in both age groups (Figure 2, right). Confidence intervals revealed significantly more negative brain scores for SM in young adults than in older adults and more positive scores for AM, again indicating that this pattern was expressed more robustly in young adults. In addition, brain scores were significantly more positive for EM than AM in older adults, whereas there was no difference between these two conditions in young adults. Activity for EM did not differ between the groups on this LV.

Peak voxels from regions contributing to this LV are listed in Table 3. Regions showing greater activation during AM and EM than during the SM condition (Figure 3,

bottom) included the left ACC, the inferior parietal lobule, the left insula, and the middle frontal gyrus in both hemispheres. Activity in the left superior parietal lobule, the precuneus, and the right supramarginal gyrus also differentiated AM and EM from SM but showed greater deactivation, relative to the first TR in the trial, during the SM condition than during the EM and AM conditions. Regions with more activity for SM than AM or EM included the left middle temporal gyrus and the cerebellum. Activity in the inferior and middle occipital gyri also was greater during SM because of stronger deactivation during the AM condition.

To see whether the reduced expression of these brain activity patterns in older adults was related to task performance, we computed composite brain scores for each older participant for each of the three LVs. These composites were obtained by summing the absolute values of a subject's brain scores for all conditions. We then correlated these composite brain scores with task accuracy

**Table 2.** Peak Voxels of Regions Expressing the Task Contrast of LV2

Region	Hemis	BA	MNI Coordinates			BS Ratio
			<i>x</i>	<i>y</i>	<i>z</i>	
<i>EM &gt; AM and SM</i>						
Superior parietal lobule	R	7	36	-48	60	11.8
Inferior temporal gyrus	R	37	52	-52	-12	10.4
Fusiform	L	37	-44	-52	-20	7.2
Superior/middle occip gyrus	L	19	-28	-68	36	9.2
Inferior frontal gyrus	L	44	-52	12	24	6.5
	R	45	40	36	8	6.1
<i>AM &gt; EM and SM</i>						
Cuneus/precuneus	L	31	-8	-64	20	-20.8
Angular gyrus	L	39	-56	-64	24	-11.8
Middle orbital gyrus	L	10	-4	52	-8	-13.8
Superior frontal gyrus	L	8	-24	36	48	-13.4
Middle frontal gyrus	R	9	28	44	32	-8.2
Inferior frontal gyrus	L	47	-40	32	-20	-6.8
Middle temporal gyrus	L	21	-60	-8	-24	-9.8
Temporal pole	R	38	48	12	-8	-9.5
	L	38	-48	12	-12	-6.2
Hippocampus	L	n/a	-32	-24	-20	-8.9
	R	n/a	24	-20	-24	-8.2
Caudate	L	n/a	-16	16	-4	-7.9
Cerebellum	R	n/a	44	-64	-44	-10.4

Hemis = hemisphere, BA = Brodmann's area, *x* = right/left, *y* = anterior/posterior, *z* = superior/inferior, BS ratio = bootstrap ratio, R = right, L = left, n/a = not applicable.



**Table 3.** Peak Voxels of Regions Expressing the Task Contrast of LV3

Region	Hemis	BA	MNI Coordinates			BS Ratio
			<i>x</i>	<i>y</i>	<i>z</i>	
<i>EM and AM &gt; SM</i>						
Middle frontal gyrus	L	10	-32	52	12	11.3
	L	6	-32	8	64	5.7
	R	9	32	44	32	6.8
Anterior cingulate cortex	L	24	-8	32	12	9.8
		32	0	36	-8	7.2
Superior parietal lobule/precuneus	L	7	-12	-72	40	11.2
Supramarginal gyrus	R	40	60	-44	32	9.0
Inferior parietal lobule	L	40	-56	-48	48	7.9
Insula	L	n/a	-44	16	0	7.8
<i>SM &gt; EM and AM</i>						
Inferior occipital gyrus	L	18	-32	-96	-4	-11.5
	R	18	32	-96	-4	-8.8
Middle occipital gyrus	R	19	28	-72	40	-5.0
Retrosplenial cortex	R	23	4	-56	16	-8.7
Middle temporal gyrus	L	21	-60	0	-24	-7.4
Cerebellum	R	n/a	0	-60	-48	-6.6
	L	n/a	-12	-76	-28	-5.1

Hemis = hemisphere, BA = Brodmann's area, *x* = right/left, *y* = anterior/posterior, *z* = superior/inferior, BS ratio = bootstrap ratio, R = right, L = left, n/a = not applicable.

and RT in the different task conditions. None of the correlations between the composite score and task accuracy or RT reached significance ( $r = .021$  to  $.472$ ,  $p > .05$ , uncorrected).

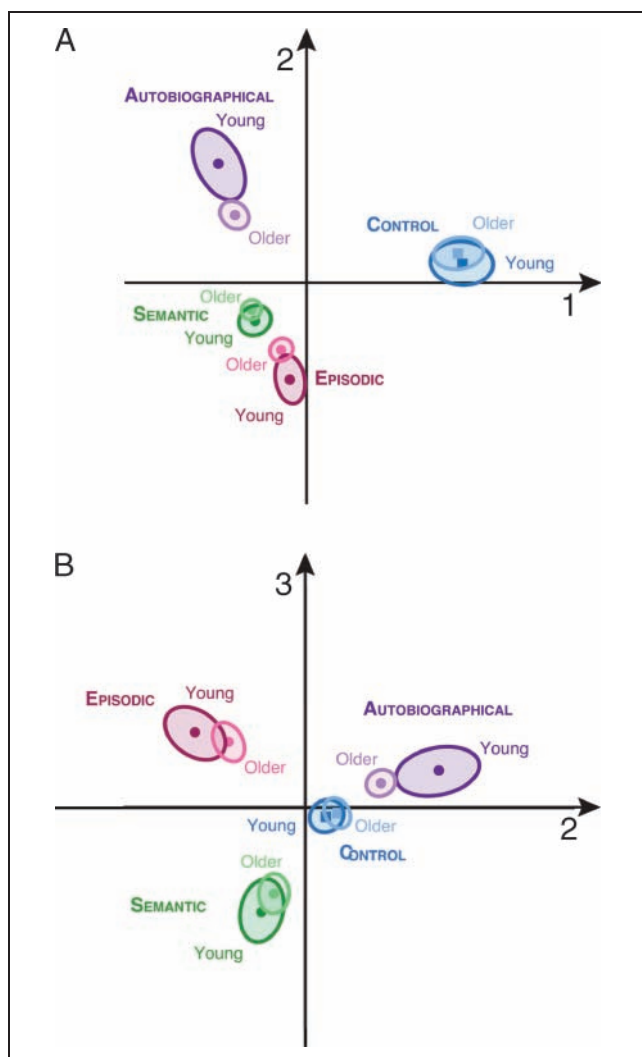
### fMRI Results: MUSUBADA

MUSUBADA identified three components which explained, respectively, 54%, 27%, and 19% of the variance between the experimental conditions. Figure 4 (A and B) displays the maps obtained with (respectively) Dimensions 1 vs. 2, and 2 vs. 3. Dimension 1 separates the control condition from all of the memory conditions, Dimension 2 distinguishes AM from SM and EM, and Dimension 3 maximally separates EM from SM. This overall pattern mirrors the results of the ST-PLS analysis. On both discriminant maps, the largest (and significant,  $p < .05$ ) differences among age groups were seen in AM, followed by EM. That is, for AM and EM, the older group projected closer to the center of the graph than the younger group, so that the brain patterns of the older participants were less differentiated than those of the young participants in these two conditions. Although there was a tendency for the older group to fall closer to the center of the graph than the younger

group for SM, the group differences did not reach significance in SM or in the control condition.

### DISCUSSION

We report the results of an experiment measuring brain activation during AM, EM, and SM retrieval in young and older adults using a paradigm previously used for young adults (Burianova & Grady, 2007). Both the earlier study and the current one identified the same set of core regions that were engaged during all memory conditions. These regions included the inferior frontal gyrus, the middle temporal gyrus, the left superior temporal gyrus, the left thalamus, the left hippocampus, the left angular gyrus, and the caudate nucleus. We also found that the common memory regions were activated reliably in older as well as younger adults, with minimal age differences; in fact the only age difference was slightly greater engagement of the common network for EM in older adults. This result suggests that the common memory network is relatively resilient to the effects of aging, in the same way that network function and connectivity is preserved with aging in the task-positive network (Grady et al., 2010), a set of



**Figure 4.** MUSUBADA mean discriminant factor scores and confidence ellipses for young and older groups. (A) A plot of Dimensions 1 and 2. (B) A plot of Dimensions 2 and 3. These dimensions explain 54%, 27%, and 19% of the between-condition variance; 95% confidence ellipses for each bacycenter (group mean per condition) were computed with a bootstrap procedure, with both scans (TRs) and participants treated as random factors. Nonoverlapping confidence ellipses indicate significant differences ( $p < .05$ ). Conditions closer to the origin have less differentiated patterns than conditions far from the origin.

fronto-parietal brain regions involved when externally driven tasks are carried out (Grady et al., 2010; Toro, Fox, & Paus, 2008; Fox et al., 2005).

Although the common memory network was engaged strongly by both age groups, there were some subtle differences. In the first LV, which identified the common network, we actually observed greater overall differentiation among the three memory conditions and the control condition in the older adults than in the young adults, particularly in the EM and SM conditions. This result is reassuring because it clearly rules out the possibility that any dedifferentiation among the memory conditions observed in the older group is because of unspecific age-related changes

in the BOLD response. However, if we consider only the three memory conditions, the first LV's pattern was expressed more similarly among these conditions in the older than in the young adults. In other words, older adults were recruiting regions from the common memory network to a more similar extent across all memory conditions, so that their neural signature was more similar. This is consistent with the main results from LVs 2 and 3 that patterns of selective activity that distinguished AM, EM, and SM were expressed less robustly in the older adults. Interestingly, the MUSUBADA analysis showed that this loss of neural differentiation was accounted for by age-related changes in the neural signature of AM and EM, but not SM nor the control condition.

Also, MUSUBADA revealed that EM and AM were significantly less distinguishable from the SM and control conditions in the older group than in young adults. This pattern, which reflects an age reduction in the episodic neural signature of EM and AM, is consistent with the aging literature which suggests that EM is disproportionately affected by aging, whereas SM is relatively preserved (Spaniol et al., 2006; Allen et al., 2002). When narrating personal episodes, older adults produce fewer episodic elements, but equal or greater amounts of semantic elements than young adults (Addis et al., 2008; Levine et al., 2002). During memory recognition tasks, older adults rely more heavily on familiarity with the studied item than on their capacity to recollect its initial encoding, a phenomenon illustrated with self-report (e.g., Bastin & Van der Linden, 2003; Mantyla, 1993; Parkin & Walter, 1992) and with process dissociation procedures (Cohn, Emrich, & Moscovitch, 2008; Java, 1996; Jennings & Jacoby, 1993; but see Davidson & Glisky, 2002). Also during recognition, older adults demonstrate an increased reliance on rhinal areas, which are associated with familiarity-based memory recognition, whereas young adults rely more on the hippocampus, which mediates recollection (Daselaar et al., 2006; Grady et al., 2005; Cabeza et al., 2004). Our results are in line with these earlier studies and support the idea of an age-related reduction in the episodic or richly experienced nature of both AM and EM.

Our ST-PLS results also indicated an age-related reduction in episodicity. LV2, which was expressed less robustly in the senior group, identified brain regions commonly activated during AM retrieval, such as the posterior medial cortices, left medial-temporal lobe, left inferior parietal lobe, medial PFC, and temporal poles (Svoboda et al., 2006; Maguire, 2001). The medial prefrontal and retrosplenial regions are linked to self-projection (St-Jacques, Conway, Lowder, & Cabeza, 2011; Vann, Aggleton, & Maguire, 2009; Buckner & Carroll, 2007; Svoboda et al., 2006), a phenomenon that facilitates vivid recollection. The medial-temporal lobe also plays a central role in the recollection of AM and EM (Moscovitch et al., 2005) and is thought to support the retrieval and integration of AM details (Addis et al., 2004; Gilboa, 2004). The reduced distinctiveness in the engagement of these regions during AM retrieval in our older group is consistent with evidence that AM

narratives lack episodic details in older adults. Also, some of the regions that are typically engaged during AM retrieval—such as the inferior parietal lobule, the medial PFC, and the posterior cingulate—belong to the default mode network (DMN; Buckner, Andrews-Hanna, & Schacter, 2008; Fox et al., 2005; Raichle et al., 2001), which is activated when attention is directed toward internally driven cognitive processes. Interestingly, recent work suggests that functional connectivity within the DMN is reduced in old age (Grady et al., 2010; Andrews-Hanna et al., 2007), so the decreased robustness of LV2's activity pattern in our older group may be linked to a general decrease in coherence or to an increased difficulty in recruitment within the DMN.

LV3, which maximally distinguished EM from SM in both age groups, was also less robustly expressed in our older adults. Among other findings, we observed greater activity in the inferior parietal lobule during EM than during SM, a region thought to play a supportive role in recollective processes (Cabeza, Ciaramelli, Olson, & Moscovitch, 2008). We also observed more activity in the precuneus, a region thought to support visual imagery during EM and AM (Burgess, Maguire, Spiers, & O'Keefe, 2001; Snyder, Grieve, Brotchie, & Andersen, 1998; Fletcher et al., 1995). It is possible that features such as temporal specificity, contextual details, and visual imagery, which distinguish episodic from context-independent SM, lose some salience during normal aging, and/or are retrieved less frequently.

Although our brain imaging results reflect an age-related reduction in the episodic neural signature of EM and AM, we note that we did not observe behavioral group differences on the AM or EM task (either for RT or accuracy). However, our behavioral measures were designed primarily to identify and exclude incorrect trials and were not sensitive to the qualitative changes in EM typically observed in aging. Also, although there was no group difference in the use of the 3-point AM vividness scale, a subjective scale cannot be considered an absolute measure of vividness. For example, St-Jacques, Rubin, and Cabeza (in press) also reported that they found no difference between young and older adults for the ratings of AMs retrieved in the scanner on an 8-point "reliving" scale; however, their postscanning interviews revealed a paucity of episodic details in the older adults' description of these AMs. In our case, the age-related changes we observed in the neural correlates of AM might indicate a difference in scale anchoring between our groups (i.e., young and older adults' criteria used to determine which AM is rated as "somewhat vivid" or "very vivid" may differ). Although our behavioral measures were not sensitive to age differences, the reduced engagement of regions known to be sensitive to detailed memory recollection and the pattern of dedifferentiation among the memory conditions we observed in our older adults suggest a loss of episodic distinctiveness.

This interpretation concurs with Li et al. (2001), who suggested that aging is accompanied by an increase in neural noise, which leads to a loss of distinctiveness in cortical representation because of increased overlapping activation

across EM traces. Interestingly, several recent studies have shown age-related losses in neural distinctiveness within (Goh, Suzuki, & Park, 2010) and across stimulus categories processed by the ventral visual pathway, such as faces, places, and objects (Carp, Park, Polk, & Park, 2011; Park, Carp, Hebrank, Park, & Polk, 2010; Voss et al., 2008; Park et al., 2004). Dennis and Cabeza (in press) also have shown that brain regions engaged distinctively during explicit and implicit learning in young adults are recruited nondiscriminatively during both conditions in older adults. Our study provides additional evidence for aging-related dedifferentiation across types of processing by showing dedifferentiation across declarative memory tasks that require retrieval of different types of information.

Importantly, however, interpreting age-related dedifferentiation is not straightforward. Dedifferentiation within processing pathways may reflect a loss of distinctive representation, whereas dedifferentiation observed across modalities and/or processes may reflect either neural inefficiency or compensation. The increased brain activity observed in older relative to younger adults in the absence of age-related changes in behavior or in the presence of a decrease in performance is thought to reflect neural inefficiency (Grady, 2008; Morcom et al., 2007). In the case of our results, the general decrease in brain activity in comparison with our young adults would argue against an explanation by inefficiency.

On the other hand, neural task-related changes present in older adults and absent in young adults that correlate with good task performance in seniors are considered compensatory (see Grady, 2008, for a review). With these criteria, some dedifferentiation can be considered compensatory (Hommet, Destrieux, Constans, & Berrut, 2008; Rajah & McIntosh, 2008; Li et al., 2001). Dennis and Cabeza (in press) proposed that normal aging causes a decrease in brain function which leads to a loss of competition between different systems or processes. This loss of competition results in a pooling of competing resources to compensate for the loss of function, and this causes neural dedifferentiation. In carrying out our tasks, it is possible that older adults—as an attempt to pool resources across systems—engaged a more similar set of brain regions across memory conditions than the young adults.

Finally, we should note that we found little evidence in our older adults for the kind of over-recruitment of brain activity that features prominently in the HAROLD, CRUNCH, and STAC models (Reuter-Lorenz & Park, 2010; Cabeza, 2002). These theories generally emphasize situations in which older adults recruit some brain area, such as the PFC, to a greater extent than younger adults, thereby using alternate circuitry to maintain adequate levels of cognitive function. Our results, as noted above, do not easily fit with the type of compensatory over-recruitment suggested by these theories and other reports in the literature. The only over-recruitment that we observed in our older group was more engagement of the common network for EM than was seen in the younger group. This could reflect

over-recruitment of the common network to compensate for under-recruitment of the networks specific to each condition, along the lines of CRUNCH and STAC, as there were no age differences in performance. On the other hand, the brain activity measures did not correlate with performance in our older group, which does not support an explanation in terms of compensation on an individual participant basis. This lack of correlation could be because of a number of factors, including, as noted above, a lack of sensitivity of our behavioral measures to age-related changes in memory. It is also possible that the overrecruitment of the common network during EM in the older adults is only partially compensatory, or is not compensatory for memory at all, but for some other, nonmemory process engaged during our tasks (de Chastelaine, Wang, Minton, Muftuler, & Rugg, in press). It also may be easier to find correlations between measures of brain activity and performance when performance is closely tied to experimentally driven task demands, unlike performance on our tasks, which was heavily influenced by personal knowledge and experience. Clearly further work is needed to determine if there are correlations between the degree of dedifferentiated brain activity during memory retrieval in older adults and the content or detailed nature of retrieved memories.

## Conclusion

In a group of healthy older adults, we found evidence for dedifferentiation in the neural signatures of EM and AM, but not for SM. Although our results indicate that regions identified as parts of a common memory retrieval network are activated normally in older adults, we found that selective brain activity associated with the memory conditions is diminished in old age. Dedifferentiation was expressed by a loss of specificity in the EM and AM conditions, consistent with a literature indicating that context-specific memory is most readily disrupted by aging, whereas SM is relatively preserved. The dedifferentiation we observed may reflect a pooling of resources across memory conditions that is associated with an aging-related decline in the ability to differentially represent episodes or their content, resulting in less richly detailed memories.

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