



THE UNIVERSITY *of* EDINBURGH

Edinburgh Research Explorer

## Age-related changes in the neural networks supporting semantic cognition

**Citation for published version:**

Hoffman, P & Morcom, A 2018, 'Age-related changes in the neural networks supporting semantic cognition: A meta-analysis of 47 functional neuroimaging studies', *Neuroscience & Biobehavioral Reviews*, vol. 84, pp. 134-150. <https://doi.org/10.1016/j.neubiorev.2017.11.010>

**Digital Object Identifier (DOI):**

[10.1016/j.neubiorev.2017.11.010](https://doi.org/10.1016/j.neubiorev.2017.11.010)

**Link:**

[Link to publication record in Edinburgh Research Explorer](#)

**Document Version:**

Publisher's PDF, also known as Version of record

**Published In:**

Neuroscience & Biobehavioral Reviews

**General rights**

Copyright for the publications made accessible via the Edinburgh Research Explorer is retained by the author(s) and / or other copyright owners and it is a condition of accessing these publications that users recognise and abide by the legal requirements associated with these rights.

**Take down policy**

The University of Edinburgh has made every reasonable effort to ensure that Edinburgh Research Explorer content complies with UK legislation. If you believe that the public display of this file breaches copyright please contact [openaccess@ed.ac.uk](mailto:openaccess@ed.ac.uk) providing details, and we will remove access to the work immediately and investigate your claim.





Contents lists available at ScienceDirect

## Neuroscience and Biobehavioral Reviews

journal homepage: [www.elsevier.com/locate/neubiorev](http://www.elsevier.com/locate/neubiorev)

# Age-related changes in the neural networks supporting semantic cognition: A meta-analysis of 47 functional neuroimaging studies

Paul Hoffman\*, Alexa M. Morcom

Centre for Cognitive Ageing and Cognitive Epidemiology (CCACE) &amp; Department of Psychology, University of Edinburgh, UK



## ARTICLE INFO

## Keywords:

Semantic memory  
fMRI  
Multiple demand network  
Default mode network

## ABSTRACT

Semantic cognition is central to understanding of language and the world and, unlike many cognitive domains, is thought to show little age-related decline. We investigated age-related differences in the neural basis of this critical cognitive domain by performing an activation likelihood estimation (ALE) meta-analysis of functional neuroimaging studies comparing young and older people. On average, young people outperformed their older counterparts during semantic tasks. Overall, both age groups activated similar left-lateralised regions. However, older adults displayed less activation than young people in some elements of the typical left-hemisphere semantic network, including inferior prefrontal, posterior temporal and inferior parietal cortex. They also showed greater activation in right frontal and parietal regions, particularly those held to be involved in domain-general controlled processing, and principally when they performed more poorly than the young. Thus, semantic processing in later life is associated with a shift from semantic-specific to domain-general neural resources, consistent with the theory of neural dedifferentiation, and a performance-related reduction in prefrontal lateralisation, which may reflect a response to increased task demands.

## 1. Introduction

Semantic knowledge, of the meanings of words and properties of objects, shapes our understanding of the world and guides our behaviour. Most of our interactions with the environment, linguistic and non-linguistic, require us to harness this knowledge in some way. This use of semantic knowledge is often termed semantic cognition (Rogers and McClelland, 2004). Unsurprisingly, given its central role in higher cognitive function, semantic cognition activates a complex set of brain regions which overlap with other neural systems such as the multiple demand network (Duncan, 2010) and the default mode network (Buckner et al., 2008). In this meta-analysis, we investigated age-related differences in the functional neuroanatomy of semantic cognition. While formal meta-analysis techniques have been used to investigate functional brain activation in a number of domains (Li et al., 2015; Maillet and Rajah, 2014; Spreng et al., 2010), this is the first to focus on semantic cognition specifically. This is important because most aspects of semantic processing are thought to remain stable into older age, in stark contrast to the declines in function observed in many other cognitive domains (Nilsson, 2003; Nyberg et al., 1996; Park et al., 2002; Rönnlund et al., 2005; Salthouse, 2004; Verhaeghen, 2003). Important insights into the nature of successful cognitive ageing can be gained through better understanding of the changes in neural activity that

underlie this maintenance of function. In what follows, we first provide an overview of the neural correlates of semantic cognition, as revealed by studies of young people. We then consider the predictions made by current theories of neurocognitive ageing for age-related differences in the networks engaged by semantic cognition in younger and older adults, before testing these predictions in a formal meta-analysis of 47 neuroimaging studies.

## 1.1. The neural basis of semantic cognition

Semantic cognition activates a distributed neural network in young adults, including frontal, temporal and parietal regions (Binder et al., 2009; Noonan et al., 2013). Key regions are illustrated in blue in Fig. 1 (alongside other networks to be described later). It is important to note at the outset that the semantic network is somewhat left-lateralised, although, as we discuss later, the degree of lateralisation can vary dependent on stimulus, brain region and task difficulty. The ventral anterior temporal lobe (vATL) is thought to be involved in the storage of multi-modal semantic representations (Lambon Ralph et al., 2017). This is based on the strong association between damage to this region and the clinical syndrome of semantic dementia, which involves a profound and selective loss of semantic knowledge (Patterson et al., 2007). fMRI studies often overlook vATL, in part because of well-known

\* Corresponding author at: Centre for Cognitive Ageing and Cognitive Epidemiology, Department of Psychology, University of Edinburgh, 7 George Square, Edinburgh, EH8 9JZ, UK.  
E-mail address: [p.hoffman@ed.ac.uk](mailto:p.hoffman@ed.ac.uk) (P. Hoffman).

<https://doi.org/10.1016/j.neubiorev.2017.11.010>

Received 21 July 2017; Received in revised form 10 November 2017; Accepted 17 November 2017

Available online 26 November 2017

0149-7634/© 2017 The Authors. Published by Elsevier Ltd. This is an open access article under the CC BY license (<http://creativecommons.org/licenses/by/4.0/>).

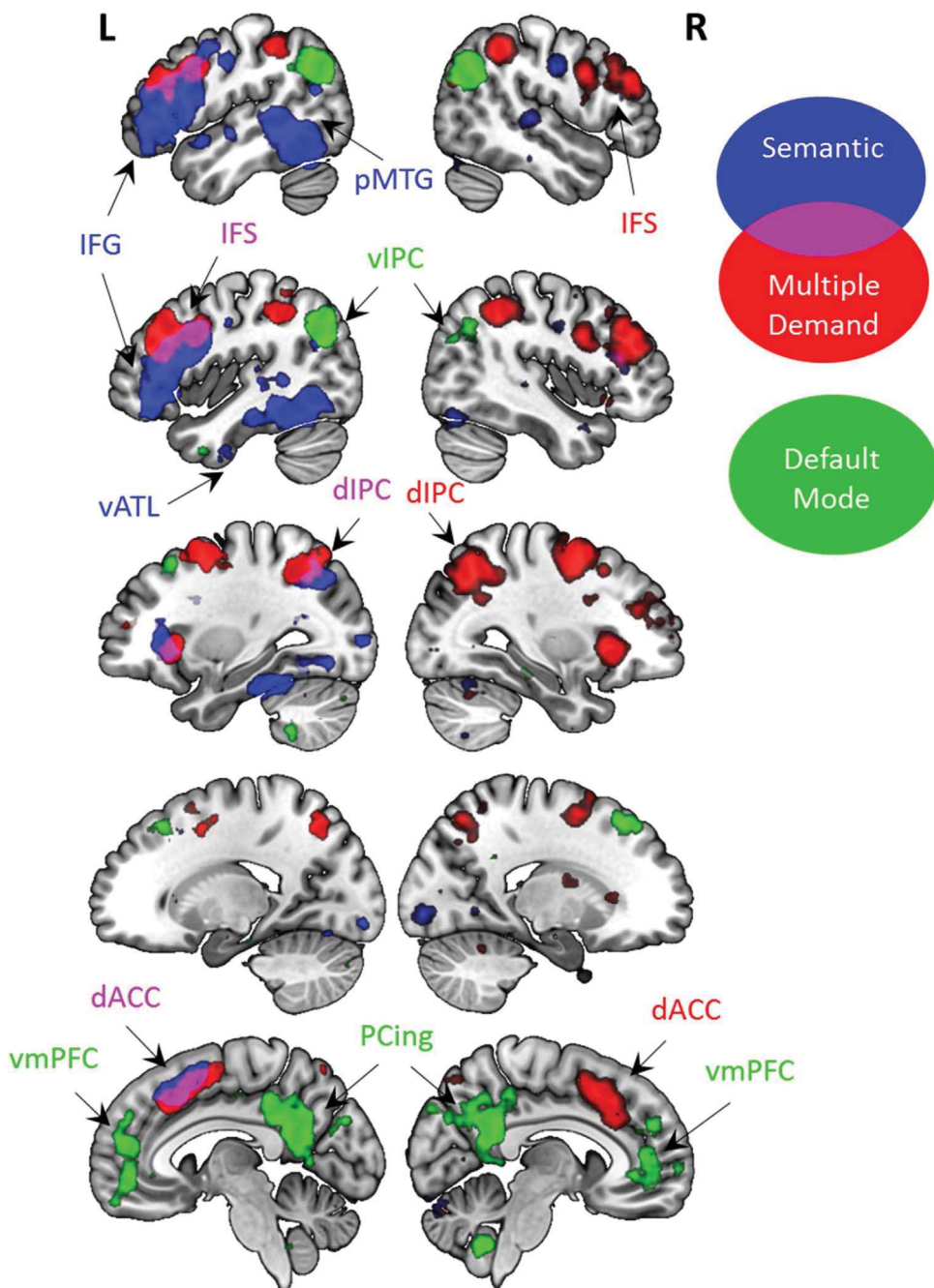


Fig. 1. Regions typically associated with semantic processing and with the multiple demand and default mode networks. Figure show areas of activation associated with particular topics in the Neurosynth database of over 10,000 neuroimaging studies (Yarkoni et al., 2011). Topics were extracted using automated analysis of terms used in the target articles (Poldrack et al., 2012). The semantic topic included the keywords [semantic; words; meaning; picture; conceptual; association; knowledge]. The multiple demand topic included [task; performance; control; executive; difficulty; demands; goal]. The default mode topic included [network; resting; default; intrinsic; spontaneous]. The database does not discriminate between young and older participants; however, since the vast majority of neuroimaging participants are young; these networks predominately reflect activation patterns in young adults. IFG = inferior frontal gyrus; pMTG = posterior middle temporal gyrus; IFS = inferior frontal sulcus; vIPC = ventral inferior parietal cortex; vATL = ventral anterior temporal lobe; dIPC = dorsal inferior parietal cortex; dACC = dorsal anterior cingulate cortex; PCing = posterior cingulate cortex; vmPFC = ventromedial prefrontal cortex.

technical difficulties in acquiring signal from the ventral temporal cortices, due to the proximity of air-filled sinuses (Devlin et al., 2000). However, recent studies using methods that combat these issues have reliably identified activity in the left vATL during semantic processing (e.g., Halai et al., 2015; Hoffman et al., 2015; Humphreys et al., 2015). vATL activation is greater in the left hemisphere during written word semantic processing and speech production, but displays a more bilateral distribution during other forms of semantic processing (Rice et al., 2015a).

Other regions are involved in the executive regulation of semantic knowledge, ensuring that task and context-appropriate information is activated (Jefferies, 2013). This is critical because we store a wide range of knowledge about any concept and different aspects of this information are important in different situations. For example, the relevant semantic features of *pianos* change depending on whether one is asked to play a piano or to move one across the room (Saffran, 2000).

This element of semantic processing, often termed semantic control, has chiefly been associated with activity in the left inferior frontal gyrus (IFG) (Badre and Wagner, 2002; Hoffman et al., 2010; Thompson-Schill et al., 1997). More recently, it has become clear that left posterior middle temporal gyrus (pMTG) is also activated by manipulations of semantic control (Noonan et al., 2013; Whitney et al., 2011). The two regions also display strong structural and functional interconnectivity (Turken and Dronkers, 2011). Current theories hold that both IFG and pMTG serve to regulate performance in semantic tasks by exerting top-down control over the activation of semantic representations in the vATL (Lambon Ralph et al., 2017).

Semantic tasks also activate some areas within the “multiple demand” network (MDN) (Duncan, 2010; Fedorenko et al., 2013). This network comprises a set of brain regions that respond to increasing task demands across many cognitive domains and are thought to be involved in the planning and regulation of goal-directed cognition and behaviour

(see red regions in Fig. 1). MDN regions activated during semantic processing include left dorsal inferior parietal cortex (dIPC; in the region of the intraparietal sulcus), left inferior frontal sulcus (IFS; superior to IFG) and the dorsal anterior cingulate (dACC; often including the pre-supplementary motor area) (Noonan et al., 2013). Importantly, however, MDN activity during semantic tasks is usually restricted to left-hemisphere structures, in contrast to other domains such as visuospatial processing, which preferentially activate right-hemisphere elements of this network (Shulman et al., 2010). Thus, although semantic tasks recruit elements of the domain-general MDN as well as semantic-specific brain regions, there is a bias in both cases towards left-hemisphere activation.

Finally, semantic processing has been linked with the default mode network (DMN), a set of brain regions that display greater activity during rest periods when participants are not engaged in an overt task (Buckner et al., 2008; Raichle et al., 2001). Core areas of the DMN include the ventral inferior parietal cortex (vIPC) bilaterally, the ventromedial prefrontal cortex (vmPFC) and the posterior cingulate (pCing) (see green regions in Fig. 1). Some descriptions of the DMN include the ATL, which has also been strongly implicated in semantic representation (Buckner et al., 2008; Humphreys et al., 2015). Some researchers have proposed that DMN activation during rest is a consequence of implicit semantic processing, as participants at rest engage in daydreaming and other semantically-rich forms of self-directed thought in the absence of any external stimulus (Binder et al., 1999). However, other studies have shown that, with the exception of the ATL, DMN regions are not activated by explicit semantic tasks, suggesting that these regions are unlikely to make a major contribution to semantic cognition (Hoffman et al., 2015; Humphreys et al., 2015).

### 1.2. Age-related changes in functional brain networks

In addition to well-known changes in brain structure (Raz et al., 2005), functional imaging studies have suggested that ageing may affect how brain networks are configured and how they respond to cognitive challenges. Although relatively few neuroimaging studies of cognitive ageing have been concerned with semantic cognition specifically, two main general principles of functional reorganisation have been proposed (Grady, 2012; Morcom and Johnson, 2015). Each outlines specific regional patterns of age-related differences which are frequently interpreted in terms of compensatory shifts which help to support performance. According to alternative views, increases in activation or activation of additional regions in ageing may reflect reduced specificity of neuronal responses rather than compensation. This may be due to noisy neuronal representations (Li et al., 2001) or impaired ability to regulate activity across networks (Grady et al., 1994; Logan et al., 2002). It is difficult to adjudicate between these mechanisms using functional imaging measures of activation (Lövdén et al., 2010; Morcom and Johnson, 2015). In this meta-analysis, we were interested in the proposed principles of reorganisation and the predictions they make for age-related differences in the networks supporting semantic function. It is important to note also that vascular changes associated with ageing can result in a reduction in vascular reactivity which impacts the BOLD signal (Huettel et al., 2001; Kannurpatti et al., 2010; Tsvetanov et al., 2015). However, these effects tend to be subtle, at least for higher-order cognitive tasks (Kannurpatti et al., 2010). Moreover the current study, like previous meta-analyses, reveals age-related increases as well as decreases in activation (Li et al., 2015; Spreng et al., 2010).

One long-standing observation is that older adults often show more activation in visual processing tasks than young adults in prefrontal cortices and may also show less activation in occipitotemporal cortices (Davis et al., 2008; Grady et al., 1994; Maillet and Rajah, 2014; Spreng et al., 2010) although increased activation has also been observed in posterior cortical regions in older adults, (e.g., Grady et al., 1994). This pattern, termed PASA (posterior-to-anterior shift in aging; Dennis and

Cabeza, 2008) is proposed to reflect an upregulation in the executive control processes supported by the prefrontal cortices, to compensate for less efficient visual processing. Since most studies of semantic processing involve presentation of visual stimuli (either words or pictures), a straight-forward prediction of the PASA theory is that older adults will exhibit increased prefrontal activation, and reduced visual cortex activation, during semantic tasks. As the left IFG is strongly implicated in executive regulation of semantic knowledge, this is a possible site for such an upregulation. Alternatively, or in addition, the increased demands may cause older adults to recruit MDN regions, which respond to increased demands in semantic processing as well as in other cognitive domains.

In parallel, researchers have frequently noted age-related reductions in the laterality of prefrontal activation, with tasks that elicit lateralised activity in young people displaying a more bilateral pattern in older adults. This phenomenon, termed HAROLD (hemispheric asymmetry reduction in older adults; Cabeza, 2002), has, like PASA, been proposed to reflect a compensatory response (Grady, 2012). Indeed, in a meta-analysis of 80 neuroimaging studies using a range of cognitive tasks, increased recruitment of right prefrontal regions in older adults was only observed where older people performed more poorly than their young counterparts (Spreng et al., 2010). This is compatible with the view that the increased recruitment helps to maintain performance under difficult conditions (but also with the possibility that increasing task demand triggers or enhances nonspecific responses; Logan et al., 2002). When performance was equivalent there was no evidence of HAROLD: instead, older adults engaged left dorsolateral PFC more and left IFG less than the young, consistent with greater use of MDN resources (Spreng et al., 2010).

In semantic tasks, IFG activation is relatively left-lateralised in young adults, with the right IFG only called upon to contribute under the most demanding conditions (Krieger-Redwood et al., 2015; Noonan et al., 2013). If semantic tasks become more difficult in older people, one might expect them to engage this region more frequently, resulting in a HAROLD pattern. This hypothesis is consistent with a further proposal that the recruitment of brain regions is governed by a load-dependent function that shifts in older age, the CRUNCH theory (compensation-related utilization of neural circuits hypothesis; Reuter-Lorenz and Cappell, 2008). CRUNCH states that older people tend to increase their recruitment of neural resources at a lower level of task demand than young people, in order to maintain performance at a similar level (see also Park and Reuter-Lorenz, 2009). It also states that additional recruitment of brain regions is subject to a ceiling effect as task demand increases, and after this point young people display greater activation. Left IFG is one region where this may be a likely outcome. This region displays robust activation in young adults for almost all semantic tasks and thus may have little spare capacity for additional recruitment in later life. Of course, these predictions assume that older people find semantic tasks more demanding than young people. While this assumption is uncontroversial for many areas of cognition, it is less certain in the semantic tasks, on which young and old often perform at similar levels (Nilsson, 2003; Nyberg et al., 1996; Park et al., 2002; Rönnlund et al., 2005; Salthouse, 2004; Verhaeghen, 2003).

Finally, older adults also frequently display increased activation of the DMN (Grady et al., 2010; Persson et al., 2007). In most cases, however, this is unlikely to reflect an adaptive compensatory strategy, since activity decreases rather than increases in DMN regions are associated with successful completion of most tasks (Buckner et al., 2008; Persson et al., 2007). Age-related differences in this network may therefore indicate a failure in older adults to deactivate neural systems that are unrelated to the task at hand. The failure to inhibit DMN activity during demanding tasks may be an example of the broader phenomenon of dedifferentiation of neural activity in later life (Grady, 2012).

To investigate age-related differences in the neural basis of semantic

cognition, we performed an activation likelihood estimation (ALE) meta-analysis of 47 functional neuroimaging studies that contrasted young and older adults on tasks involving semantic processing. Theories of neurocognitive ageing posit that age-related changes in activation are either a cause of or response to diminished task performance in older people. To assess whether performance declined with age in the studies we analysed, we computed behavioural effect sizes for the difference between young and older participants wherever possible. This allowed us to divide studies into those in which young and older participants were well-matched in performance and those in which young people outperformed older people, allowing us to investigate whether these two situations led to different outcomes.

## 2. Analysis method

### 2.1. Study selection

We searched for peer-reviewed studies published between January 1990 and August 2016, in which young and older adults were compared on tasks that required semantic processing. An initial search was conducted on 25th August 2016 using the Scopus database for articles containing the following terms in their title or abstract: (fMRI OR PET OR neuroimaging) AND (age OR ageing OR older) AND (semantic\* OR speech OR language OR comprehension OR fluency OR naming OR sentence\*). This yielded 1176 studies, which were screened for inclusion in the meta-analysis. Further candidate studies were identified by searching the reference lists of studies that passed the screening process, and those of previous meta-analyses of functional neuroimaging studies of cognitive ageing (Li et al., 2015; Maillet and Rajah, 2014; Spreng et al., 2010).

Inclusion criteria were as follows:

1. Experimental paradigm contrasted two conditions, one of which had a greater involvement of semantic processing. A broad definition of semantic knowledge was used, which included the meanings of words and sentences as well as knowledge relating to meaningful objects or faces. Tasks included explicit semantic decisions (e.g., animacy or concreteness judgements), tasks that implicitly engage semantic processing (e.g., lexical decision or passive listening to speech) and semantically-driven word retrieval tasks (e.g., category fluency and naming). Stimuli were most often written words, although some studies presented spoken words, pictures or familiar odours. There were also a number of studies whose main focus was episodic memory but which used semantic judgements as an incidental memory encoding task (e.g., Madden et al., 1999). These studies were included if they reported activations elicited by the semantic encoding phase independent of later retrieval activity. We excluded any studies using only the subsequent memory paradigm (e.g., Morcom et al., 2003).
2. Study included a healthy young adult (mean age < 45) and older adult (mean age > 60) group and reported whole-brain activation peaks either from each group independently or from contrasts of the two groups. In addition, a small number of studies were included that reported positive and negative effects of ageing using a parametric design, with participants spanning from young to older age.

A total of 47 studies met the inclusion criteria (see Table 1). A number of otherwise eligible studies could not be included, either because they presented activation maps visually but did not report peak activation co-ordinates (e.g., Logan et al., 2002), because they only reported deactivations relative to rest (e.g., Persson et al., 2007) or because analyses discriminating between young and older adults were only performed in regions of interest (e.g., Shafto et al., 2010).

To classify studies based on performance differences, we calculated an effect size (Cohen's *d*) for the difference between young and older participants, using a similar approach to Li et al. (2015). Effect sizes

were computed based on the means and standard deviations of the two groups or from test statistics comparing the groups. Effect sizes were computed from number of correct responses/errors but not from reaction times, since older people exhibit general reductions in processing speed that may not reflect changes in semantic processing per se. The only exception to this rule was for two studies that required participants to make subjective judgements about concepts (pleasantness judgements; Daselaar et al., 2003; Grossman et al., 2002). Since it is not possible to score such judgements for accuracy, we used reaction time data for these studies. In both cases, responses were faster for the older group, so the effect could not be attributed to age-related slowing.

### 2.2. ALE analyses

A series of Activation Likelihood Estimation (ALE) analyses were carried out using GingerALE 2.3.6 (Eickhoff et al., 2012; Eickhoff et al., 2009). This software takes activation peaks from neuroimaging contrasts of interest, across a range of independent studies, models the spatial distribution of these peaks and computes whole-brain activation likelihood maps. These maps can then be subjected to voxel-wise statistical tests to identify regions that are reliably activated across studies.

We used the ALE method to investigate regions activated by semantic processing in young and older adults and to explore age-related differences in these networks. We considered four types of activation foci, which we labelled Y, O, Y > O and O > Y (see Table 2 for numbers of peaks in each study type). Y and O refer to peaks obtained in independent analyses of each age group while Y > O and O > Y refers to peaks obtained in within-study contrasts of the two age groups. We analysed these four types separately because they give complementary information about the underlying neural networks. The Y and O peaks provide essential information about the spatial distribution of activation in each age group, allowing us to determine the degree to which the age groups activate similar networks during semantic processing. The within-study contrasts (Y > O and O > Y) provide information about differences in the degree to which each group activates specific regions.

We conducted the following analyses:

1. Activation in young and older adults. These analyses considered Y and O peaks separately and identified areas consistently activated by each age group. A conjunction analysis was also performed to identify regions commonly activated by both groups.
2. Contrasts of young and older adults. These analyses used the Y > O and O > Y peaks to identify areas in which older adults reliably exhibited more or less activation than young adults. We also performed a laterality analysis for these ALE maps (following Rice et al., 2015b; Turkeltaub and Coslett, 2010). A mirror image of each ALE map was generated and subtraction analyses were performed to identify regions in which ALE values in one hemisphere were significantly higher than in the homologous region in the opposite hemisphere. This allowed us to formally test the lateralisation of activation differences.
3. Division of studies by behavioural effects. Finally, we formed two subsets of studies based on the effect sizes of the behavioural differences between the two age groups. We arranged all the studies in order of effect size and performed a median split. In the half with the smaller effect sizes, performance did not differ between young and older participants (Performance-Equivalent studies), while in the half with the larger effect sizes there was a performance difference favouring the young (Performance-Reduced studies). We performed separate ALE analyses of Y > O and O > Y peaks for these subsets of studies, to investigate the effect of behavioural performance on neural activity differences.

In GingerALE, each activation peak is modelled as a probability distribution centred on the peak co-ordinates, generated by Gaussian

**Table 1**  
Details of studies included in the meta-analysis.

Study #	First author	Year	Semantic task	Baseline task	Effect size (Cohen's d)	Imaging modality	Number of peaks				Young group		Older group		
							O	Y	O > Y	Y > O	N	mean age	N	mean age	
1	Anderson	2000	Visualise relationship between two words	Cued episodic recall of words	NA	PET			11	13	12	24.4	12	68.5	
2	Baciu	2016	Category fluency & Picture naming & Picture semantic association	Rest & Shape naming & Shape matching	1.67 & -0.32 & 0.50	fMRI			41	2	16	42.6	14	72.2	
3	Backman	1997	Spoken word stem completion	Passive viewing of word stems	NA	PET	2	2			7	24.3	7	63.4	
4	Bergerbest	2009	Concreteness decisions on novel words	Concreteness decisions on old (primed) words	NA	fMRI	7	3	11	2	16	23.4	15	78.7	
5	Berlinger	2010	Picture naming + animacy decision & sentence plausibility judgements	Scrambled picture decision & old/new recognition judgements	0.20	fMRI			10	19	24	26.5	24	62.0	
6	Cabeza	1997	Find meaningful relationship between two words	Episodic memory for word pairs	NA	PET			10	11	12	26.0	12	70.0	
7	Daselaar	2003a	Pleasantness decisions on written words	Motor response to arrow cues	-0.35	fMRI	3	4		1	20	32.7	21	66.2	
8	Daselaar	2003b	Animacy decision on written words	Case judgement to written words	0.38	fMRI	17	18		6	26	32.4	39	66.3	
9	Daselaar	2005	Word stem completion for novel words	Word stem completion to old (primed) words	-0.76	fMRI	3	5		3	25	32.5	38	66.4	
10	Davis	2014	Plausibility judgements on auditory sentences	Listening to auditory noise	0.22	fMRI				2	50	Parametric			
11	Destrieux	2012	Category fluency	Rest	1.02	fMRI				7	1	22	25.2	21	80.2
12	Diaz	2014	Property verification on pictures	Perceptual and phonological judgements on pictures	0.65	fMRI				30	4	16	23.5	16	68.2
13	Donix	2010	Familiarity judgements on familiar faces	Familiarity judgements on unfamiliar faces	NA	fMRI	9	7	1		12	30.4	12	62.1	
14	Eckert	2008	Repetition of words presented in noise	Words not recognised	0.54	fMRI				4		15	Parametric		
15	Geva	2012	Rhyme judgements on pictures and words	Perceptual judgements on symbols and scrambled pictures	0.09	fMRI				2		12	24.6	19	64.1
16	Gold	2009	Lexical decisions on written words	Rest	< 0 <sup>†</sup>	fMRI				3	4	15	22.9	14	74.7
17	Grady	1999	Animacy decision on written words and pictures	Episodic encoding or perceptual decisions on written words and pictures	NA	PET					8	12	23.0	12	66.2
18	Grossman	2002	Comprehension judgements on written sentences	Perceptual task on pseudofont sentences	0.56	fMRI	25	19	15	8	13	22.6	11	63.5	
19	Hwang	2007	Passive listening to spoken text	Rest	NA	fMRI	7	7			12	26.0	12	70.0	
20	Iidaka	2001	Find meaningful relationship between two pictures	Form association between two abstract shapes	NA	fMRI	10	11		2	7	25.7	7	66.2	
21	Johnson	2001	Relatedness judgements on spoken word pairs	Similarity decision on spoken nonwords	0.18	fMRI	3	8		2	9	31.9	9	72.7	
22	Kalenzaga	2015	Imagine scene based on written word cue	Rest	NA	fMRI				5	19	29.2	16	68.3	
23	Kareken	2003	Odour identification (matching smell to object)	Odour smelling	0.82	PET				3	6	27.8	6	71.0	
24	Kounios	2003	Pleasantness decisions on written words	Judgements on nonwords	NA	fMRI	8	3	2	2	16	23.4	16	73.9	
25	Kuchinsky	2012	Auditory word recognition	Listening to noise	0.43	fMRI				6		36	Parametric		
26	Leshikar	2010	View two objects and generate a sentence containing both	View abstract patterns	NA	fMRI				53	2	19	20.9	18	65.7
27	Madden	1996	Lexical decisions on written words	Motor response on all words and nonwords	NA	PET	3	5		4	10	22.5	10	68.2	
28	Madden	1999	Animacy decision on written words	Case judgement to written words	NA	PET	5		2		12	23.2	12	71.0	
29	Madden	2002	Lexical decisions on written words	Perceptual task on consonant strings	NA	PET	5	7	1	1	12	23.6	12	65.0	
30	Madden	2010	Size & animacy decisions on written words	Rest	0.49	fMRI				17	2	20	22.4	20	69.6
31	Maguire	2003	Truth judgements to auditory facts	Syllable judgments to jumbled word strings	0.43	fMRI	9	18			12	32.4	12	74.8	
32	Marsolais	2014	Category fluency	Reciting months of the year	0.43	fMRI	39	69			14	24.0	14	63.5	
33	Martins	2014	Word sorting by semantic category	Word sorting by rhyme or initial phoneme	NA	fMRI	4	40	15	30	28	26.0	14	63.0	
34	McGeown	2009	Semantic association task on written words	Perceptual task on nonwords	1.16	fMRI	4	11	3	17	10	23.1	9	75.1	
35	Meinzer	2009	Category fluency	Repeating the word "pause"	3.14	fMRI	14	9	5		16	26.1	16	69.3	
36	Meinzer	2012a	Category fluency	Repeating the word "rest"	0.88	fMRI	12	14	10		14	24.6	14	69.2	
37	Meinzer	2012b	Category fluency	Repeating the word "rest"	1.14	fMRI	17	37			16	24.0	16	68.9	
38	Murty	2008	Indoor/outdoor decisions on photographs	Rest	0.46	fMRI				12	9	30	25.6	30	61.2
39	Neilson	2006	Familiarity judgements on names of famous people	Familiarity judgements on names of non-famous people	0.42	fMRI	23	5	15		15	23.6	15	70.4	
40	Peelle	2013	Semantic feature matching on written words	Rest	-0.19	fMRI				15		18	24.4	21	65.0
41	Roxbury	2016	Lexical decisions on spoken words	Lexical decisions on spoken nonwords	0.58	fMRI				4		17	27.4	17	71.0
42	Shafto	2012	Lexical decisions on spoken words	Pitch decisions on auditory stimuli	NA	fMRI	6	20			14	23.9	16	75.8	
43	Stebbins	2002	Concreteness decisions on written words	Case judgement to written words	0.10	fMRI	5	14			15	25.3	15	76.5	

(continued on next page)

Table 1 (continued)

Study #	First author	Year	Semantic task	Baseline task	Effect size (Cohen's d)	Imaging modality	Number of peaks				Young group		Older group	
							O	Y	O > Y	Y > O	N	mean age	N	mean age
44	Suzuki	2001	O odour identification task	Motor response with no odour	NA	fMRI	2	15		6	30.0	6	73.0	
45	Tyler	2010	Monitoring auditory word strings for particular words	Monitoring auditory noise	NA	fMRI	37	20		14	23.9	44	67.4	
46	Wierenga	2008	Picture naming	Viewing abstract shapes	0.59	fMRI	7	3	16	20	25.1	20	74.9	
47	Wong	2009	Matching spoken words to pictures	Rest	1.94	fMRI			7	12	21.8	12	67.5	
						TOTAL	286	374	338	163	723	26.0	766	69.1

Positive effect sizes indicate a performance advantage favouring young participants and negative sizes favouring older participants.

NA = data not available.

† Indicates that there were insufficient data to compute an exact effect size but that the mean performance of older participants exceeded that of the young.

Table 2

Number of studies and number of peaks available for each analysis.

		Peak Type			
		Y	O	Y > O	O > Y
Number of studies contributing peaks	TOTAL	26	27	25	31
	Performance-Equivalent			8	9
	Performance-Reduced			8	14
Number of peaks	TOTAL	374	286	163	338
	Performance-Equivalent			23	71
	Performance-Reduced			50	156

smoothing. This accounts for uncertainty in the true focus of activation due to between-subject variability. The full-width half maximum (FWHM) of the smoothing kernel is determined by the number of subjects generating the peak, and is based on estimates of between-subject variability in activity elicited in motor cortex by finger-tapping (Eickhoff et al., 2009). For the present analyses, we added 10 mm to the smoothing kernel to account for the greater between-subject variability associated with higher cognitive functions (including semantic processing; see Tahmasebi et al., 2011). We used Turkeltaub et al.'s (2012) non-additive version of the ALE algorithm, which limits the influence of a single study reporting multiple peaks very close to one another. Peaks reported in Talairach space were converted to MNI space using the tal2icbm\_spm transform (Lancaster et al., 2007). Analyses were thresholded using a permutation-based method for cluster-level inference (Eickhoff et al., 2012). A family-wise error cluster-corrected threshold of  $p < 0.05$  was adopted (with a cluster-forming threshold of  $p < 0.01$ ). For some analyses, the minimum cluster size indicated using this method was rather large (over 20,000 mm<sup>3</sup>). To determine whether smaller clusters were present below the cluster-corrected threshold, we re-ran analyses with an uncorrected threshold of  $p < 0.01$  and an arbitrary extent threshold of 1000 mm<sup>3</sup>. Because these results were not corrected for multiple comparisons, we draw no strong inferences from them; however, they are provided as Supplementary Materials and we note where they are consistent with prior hypotheses about age-related effects.

The laterality analysis of Y > O and O > Y maps involved a subtraction of ALE maps. Cluster-level inference is not currently available for subtraction analyses so instead initial individual analyses of each dataset were performed at  $p < 0.01$ , i.e., the same voxel threshold as in the main analyses and then adopted an uncorrected threshold of  $p < 0.05$  (with a minimum cluster size of 500 mm<sup>3</sup>) for the final subtraction map. All thresholds were computed using 5000 random permutations of the dataset.

### 3. Results

Forty-seven studies were included in the meta-analysis, comprising a total of 723 young and 766 older participants (see Table 1). The mean age of young participants was 26.0 years (SD = 4.1) and the mean age of older participants was 69.1 (SD = 4.7). Table 2 shows the number of studies contributing Y, O, Y > O and O > Y peaks to the analyses reported below.

#### 3.1. Activation in young and older adults

Fig. 2 shows ALE maps generated from separate analyses of young and older participants (using all Y and O peaks), as well as their overlap. Peak areas of convergence are reported for the separate analyses in Table 3 and for their conjunction in Table 4. Very similar

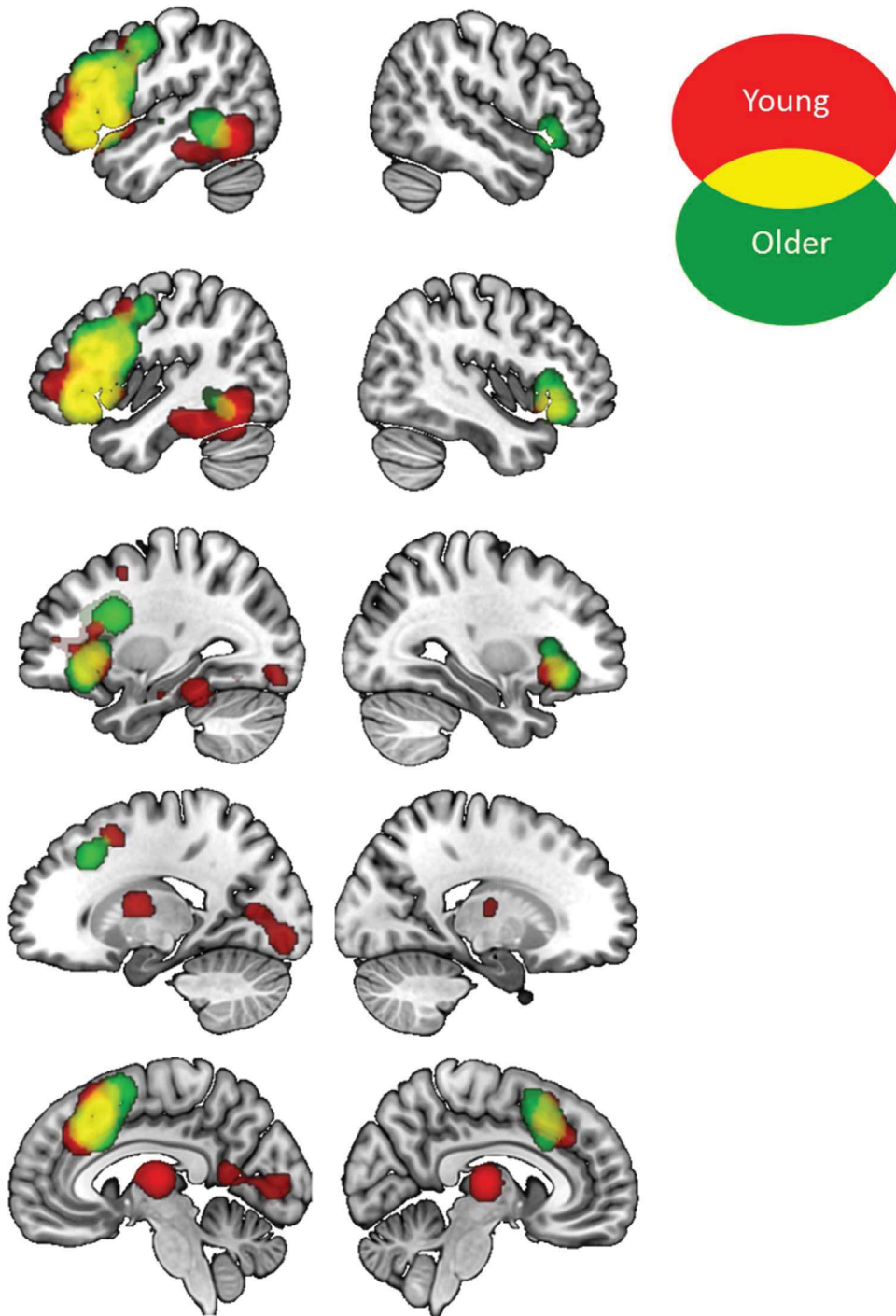


Fig. 2. Activation likelihood maps for separate analyses of young and older people. Results are presented at a threshold of  $p < 0.05$ , corrected for multiple comparisons at the cluster level.

regions were identified in the two populations. The overlap included several regions implicated in semantic processing, such as left IFG, left pMTG and dACC, as well as overlapping clusters in right IFG. The uncorrected analysis also revealed overlapping activation in dIPC (see Supplementary Fig. 1), though this was not present at the cluster-corrected threshold.

This analysis performed three important functions. First it acted as a sanity check, indicating that the studies included in the meta-analysis did indeed identify activation in regions usually associated with semantic cognition (cf. Fig. 1). Second, it highlighted areas that our analyses may *not* be sensitive to. We did not obtain significant ALE values in the vATL, which probably reflects well-known technical difficulties in acquiring signal from this region with fMRI, due to the

proximity of air-filled sinuses (Devlin et al., 2000). This means that the studies in the meta-analysis are unlikely to be sensitive to potential age differences in the activation of this important semantic region. Finally, these analyses indicated that young and older individuals recruit broadly similar neural networks during semantic processing. This means that any age differences are relatively subtle in nature and should be interpreted in the context of a high degree of overall similarity.

### 3.2. Contrasts of young and older adults

ALE maps derived from direct comparisons of young and older adults (all  $Y > O$  and  $O > Y$  peaks) are shown in Fig. 3 (see Table 5



**Table 3**  
ALE clusters for activation by young and older adults across all studies.

Cluster	Anatomical region	Volume (mm <sup>3</sup> )	BA	x	y	z	ALE value
<i>Young</i>							
1	L lateral prefrontal	55680					
	L IFG (pars triangularis)		47/45	-50	26	-2	0.0079
	L IFG (pars opercularis)		44/45	-50	22	18	0.0070
2	L IFS/middle frontal gyrus	20832	6	-44	4	44	0.0029
	L medial frontal & cingulate						
	SFG/dACC		8	-4	20	48	0.0060
	SFG/dACC		32	-4	22	44	0.0060
3	SFG/dACC	19512	24	-4	28	36	0.0055
	L SFG		8	-24	6	50	0.0029
	L posterior temporal & occipitotemporal						
	L inferior temporal gyrus		37	-46	-60	-10	0.0045
4	L fusiform gyrus	13392	37	-40	-40	-22	0.0036
	L parahippocampal/hippocampus		20	-32	-16	-22	0.0025
	Thalamus & L caudate						
	Thalamus		-	-2	-16	8	0.0050
5	Thalamus	10328	-	-12	-6	12	0.0037
	L caudate		-	-12	-2	12	0.0037
	L occipital lobe						
	L lingual gyrus		17	-12	-78	4	0.0032
	L lingual gyrus		18	-26	-86	-12	0.0031
	L occipital pole		18	-16	-90	-6	0.0029
6	L precuneus	6664	17	-10	-58	8	0.0028
	L precuneus		17	-6	-58	12	0.0028
	R IFG						
	R anterior IFG (pars orbitalis)		47	38	24	-8	0.0047
<i>Older</i>							
1	L lateral prefrontal & temporal	72584					
	L frontal operculum		44	-42	12	26	0.0066
	L IFG (pars orbitalis)		47	-42	30	-6	0.0064
	L IFG (pars triangularis)		45	-50	20	-2	0.0063
	L IFS/middle frontal gyrus		44/45	-46	22	24	0.0062
	L pMTG		21	-54	-44	-4	0.0039
	L precentral gyrus		6	-50	-6	44	0.0033
	L mid superior temporal sulcus		22	-60	-16	-4	0.0032
2	Medial frontal & cingulate	23400					
	dACC/SFG		32	-4	22	40	0.0062
3	R IFG	12032					
	R IFG (pars orbitalis)		47	38	21	-10	0.0044

IFG = inferior frontal gyrus; IFS = inferior frontal sulcus; SFG = superior frontal gyrus; pMTG = posterior middle temporal gyrus; dACC = dorsal anterior cingulate cortex. ALE = activation likelihood estimation. BA = Brodmann area.

for details). Reduced activation in older participants was observed in a range of left-hemisphere regions linked with semantic processing, including a broad swathe of IFG extending into IFS, posterior temporal cortex including pMTG and ventral occipitotemporal regions, and a dIPC region extending into the intraparietal sulcus. Older adults also showed less activity in left hippocampus and in the occipital pole bilaterally. In contrast, enhanced activation for older individuals was

most prominent in the right hemisphere, including the right IFG and a large area of right superior frontal and parietal cortex. Much of this right-hemisphere cluster overlapped with areas of the MDN (cf. Fig. 1). The uncorrected maps also revealed smaller clusters of O > Y activity in left anterior IFS and in various regions of the DMN: pCing, vmPFC and bilateral vIPC (see Supplementary Fig. 2).

Laterality analyses were performed to identify regions in which ALE

**Table 4**  
ALE clusters for conjunction of young and older adults.

Cluster	Anatomical region	Volume (mm <sup>3</sup> )	BA	x	y	z	ALE value
1	L lateral prefrontal	44960					
	L IFG (pars orbitalis)		47	-42	30	-6	0.0064
	L IFG (pars triangularis)		45	-50	20	-2	0.0063
	L IFS/middle frontal gyrus		44/45	-46	22	24	0.0062
	L precentral gyrus		6	-42	6	40	0.0027
	L precentral gyrus		6	-46	0	44	0.0026
2	L medial frontal & cingulate	15664					
	SFG/dACC		32	-4	22	44	0.0060
3	dACC	5920	24	-4	26	36	0.0054
	R IFG						
4	R IFG (pars orbitalis)	2456	47	38	26	-10	0.0044
	L pMTG						
5	L pMTG	2456	37	-52	-52	-6	0.0030

IFG = inferior frontal gyrus; IFS = inferior frontal sulcus; SFG = superior frontal gyrus; pMTG = posterior middle temporal gyrus; dACC = dorsal anterior cingulate cortex. ALE = activation likelihood estimation. BA = Brodmann area.

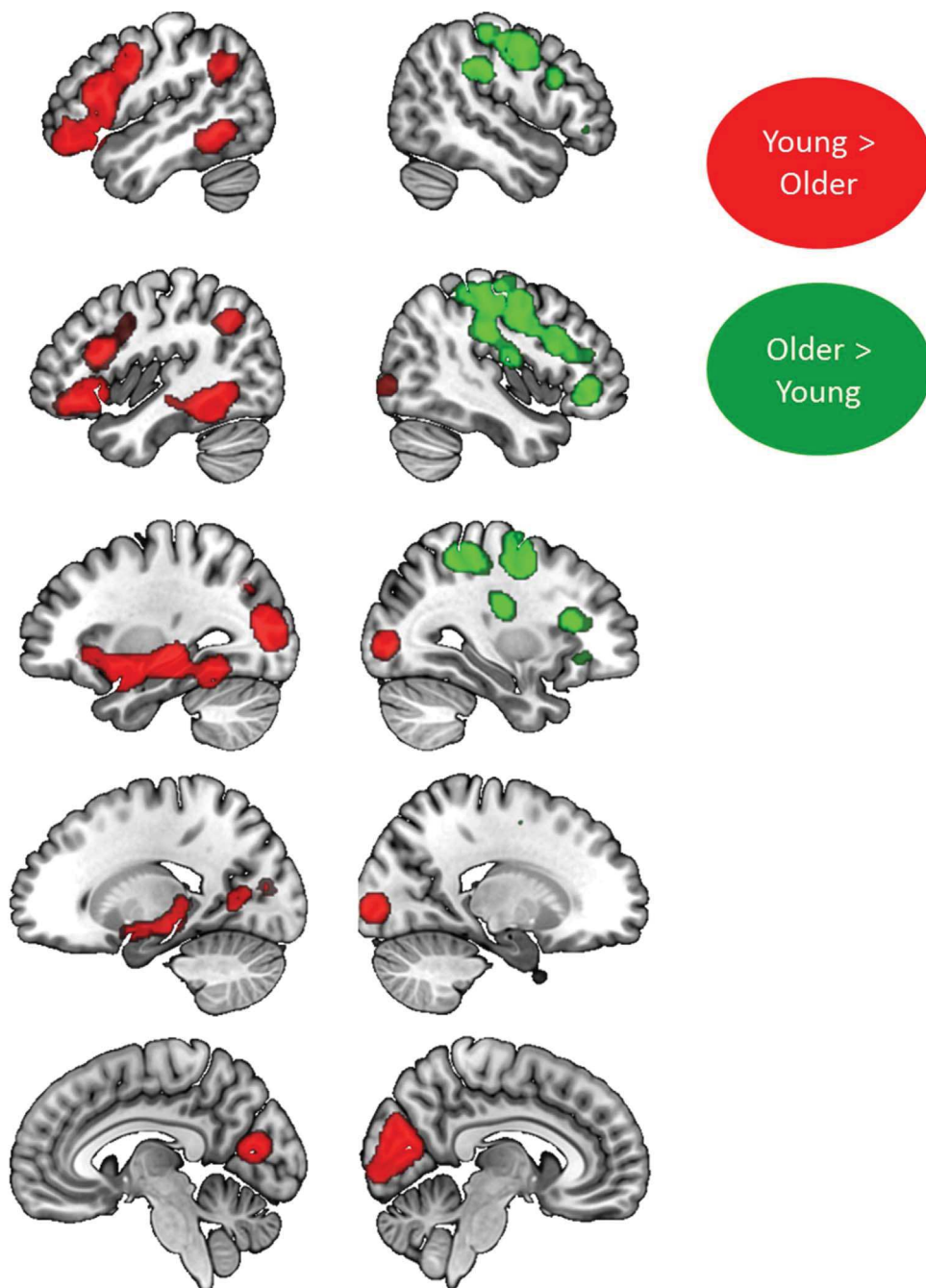


Fig. 3. Activation likelihood maps for contrasts of young and older people. Results are presented at a threshold of  $p < 0.05$ , corrected for multiple comparisons at the cluster level.

values in one hemisphere were significantly higher than in the homologous region in the opposite hemisphere (see Fig. 4). For the  $Y > O$  peaks, ALE values were significantly higher in the left hemisphere in areas of the precentral gyrus and parietal cortex, which overlapped with those identified in the main  $Y > O$  analysis. No regions exhibited higher activation likelihood in the right hemisphere, indicating that there was a clear leftward bias in  $Y > O$  peaks. The opposite was true for  $O > Y$  activations, with significantly higher ALE values in right IFG and right superior frontal and parietal cortex, relative to the analogous regions in the left hemisphere. The regions were also identified in the main  $O > Y$  analysis. Although this was an exploratory analysis (using an uncorrected threshold), its formal test of group by region interactions supports the above observation that older adults are more likely to show reduced activation in left-hemisphere regions and increased activation in the right hemisphere relative to the young.

### 3.3. Division of studies by behavioural effects

Here, we investigated whether the observed differences between age groups are related to behavioural performance differences between young and older participants, as predicted by theories of neurocognitive aging. We were able to compute an effect size for the performance difference between young and older adults in 29 of the 47 studies. The remaining studies either failed to report the relevant performance data or used covert or passive tasks with no behavioural measures. Older participants performed better than the young in 6 studies, while young participants outperformed the older participants in the rest (though in many cases the effect size was small and not statistically significant). We note that these results suggest that there is often age-related decline in semantic processing, contrary to the dominant view in the cognitive ageing literature. We consider reasons for this in the Discussion.

We arranged the studies in order of effect size and used a median

**Table 5**  
ALE clusters for Y > O and O > Y activation across all studies.

Cluster	Anatomical region	Volume (mm <sup>3</sup> )	BA	x	y	z	ALE value
<b>Y &gt; O</b>							
1	L lateral prefrontal, medial temporal & posterior temporal	47720					
	L hippocampus		20	-28	-26	-10	0.0030
	L fusiform gyrus		37	-38	-50	-14	0.0030
	L anterior insula/parahippocampal		13	-28	2	-14	0.0027
	L IFG (pars opercularis)		44	-48	20	20	0.0026
	L IFG (pars orbitalis)		47	-44	24	-8	0.0025
	L pMTG		37	-46	-56	-6	0.0024
	L precentral gyrus		6	-50	2	36	0.0024
	L precentral/postcentral gyrus		43	-56	-8	28	0.0017
2	L & R occipital lobes	20832					
	Calcarine cortex		18	2	-76	16	0.0028
	R occipital pole		18	14	-92	0	0.0026
	R inferior lateral occipital		19	34	-86	0	0.0026
	L intracalcarine cortex		17	-18	-64	6	0.0018
3	L lateral occipital	7128					
	L lateral occipital		18	-30	-84	12	0.0031
4	L dIPC	4784					
	L dorsal angular gyrus		39	-48	-58	34	0.0020
	L angular gyrus		22	-54	-54	24	0.0020
<b>O &gt; Y</b>							
1	R superior frontal, parietal & superior temporal	44504					
	R postcentral gyrus/dIPC		3	34	-36	54	0.0041
	R SFG		6	30	-4	52	0.0040
	R precentral gyrus		6	48	-4	42	0.0039
	R IFG (pars orbitalis)		47	40	36	-6	0.0033
	R IFS		45	36	26	18	0.0033
	R central operculum		-	36	-14	22	0.0031
	R IFS		44	44	18	26	0.0031
	R superior temporal gyrus		22	64	-18	10	0.0030
	R supramarginal gyrus		40	48	-30	30	0.0030
	R supramarginal gyrus		40	60	-20	24	0.0026

IFG = inferior frontal gyrus; IFS = inferior frontal sulcus; SFG = superior frontal gyrus; pMTG = posterior middle temporal gyrus; dIPC = dorsal inferior parietal cortex. ALE = activation likelihood estimation. BA = Brodmann area.

split to form them into two groups. The first, Performance-Equivalent group included the 6 studies with effect sizes favouring older individuals and other studies with smaller effects in favour of the young. The mean effect size in this set of studies was 0.06 (Cohen's *d*), indicating that on average there was a negligible behavioural difference between the two age groups. The second, Performance-Reduced group included studies with larger effects favouring young people. The mean effect size in this set of studies was 1.01. This is a large effect in Cohen's terminology and indicates that young people, on average, performed one standard deviation better than older people. The mean effect size differed significantly between the two sets of studies ( $t(30) = 4.74$ ,  $p < 0.001$ ). The mean ages of participants in the two sets of studies were very similar (young: 28.5 vs. 27.0 years;  $t(30) = 0.7$ ,  $p = 0.50$ ; older: 69.1 vs. 70.2 years;  $t(30) = 0.6$ ,  $p = 0.55$ ).

ALE maps for Y > O and O > Y peaks for these two subsets of studies are shown in Fig. 5 (see Table 6 for co-ordinates). We regard these analyses as exploratory because there were a relatively small number of studies in each set. Therefore, we focus mainly on two sets of regions: those showing significant age effects in both Performance-Equivalent and Performance-Reduced studies, and those showing age effects in only one subset which overlapped with the results of the overall analysis. We first consider areas of reduced activation in older people. An important area of convergence across studies was in left IFG, which was under-activated by older people in both sets of studies, specifically in the ventral and anterior portions. Left medial temporal lobe/hippocampus also showed significantly reduced activation irrespective of performance differences. In other areas, effects appeared to depend on whether there were performance differences between the two groups. In some regions associated with semantic processing, namely left pMTG and dIPC, reduced activation in older people only emerged in the Performance-Reduced studies. Thus, it appears that older people routinely activate left IFG to a lesser degree than young

people, but that diminished activation in other key parts of the semantic network may only be seen when older people are performing at a lower level. In occipital cortices, the largest overlap of Y > O peaks with the main analysis was found for Performance-Equivalent studies.

The O > Y contrasts showed minimal overlap across study type. For Performance-Reduced studies, there were large areas of activation in right frontal and parietal cortex, including right IFG, which corresponded closely to areas identified in the overall O > Y analysis. Other significant clusters were found in MDN regions: left anterior IFS (superior to the IFG region identified in Y > O analyses) and dACC (not found in the overall analysis). Thus, it appears that the tendency for older adults to increase activation in the right hemisphere and in the MDN tends to occur when they perform more poorly than young people. For Performance-Equivalent studies, older adults displayed significantly more activation in left vIPC and lateral occipital areas and in right medial temporal cortex. Two regions showed opposite direction age-related differences in the two subsets of studies: a region of left ventral occipitotemporal cortex showed reduced activation in older adults in Performance-Equivalent studies, and increased activation in the Performance-Reduced studies.

#### 4. Discussion

We used ALE meta-analysis of 47 functional neuroimaging studies to investigate age-related changes in the neural networks supporting semantic cognition. Separate analyses of young and older participants revealed that both age groups activated similar, left-lateralised networks, which included lateral prefrontal, medial frontal and posterior temporal regions. Against this backdrop of broad similarity, however, there were a number of areas in which recruitment varied as a function of age. Older people demonstrated less activation in left-hemisphere regions associated with control and regulation of semantic processing

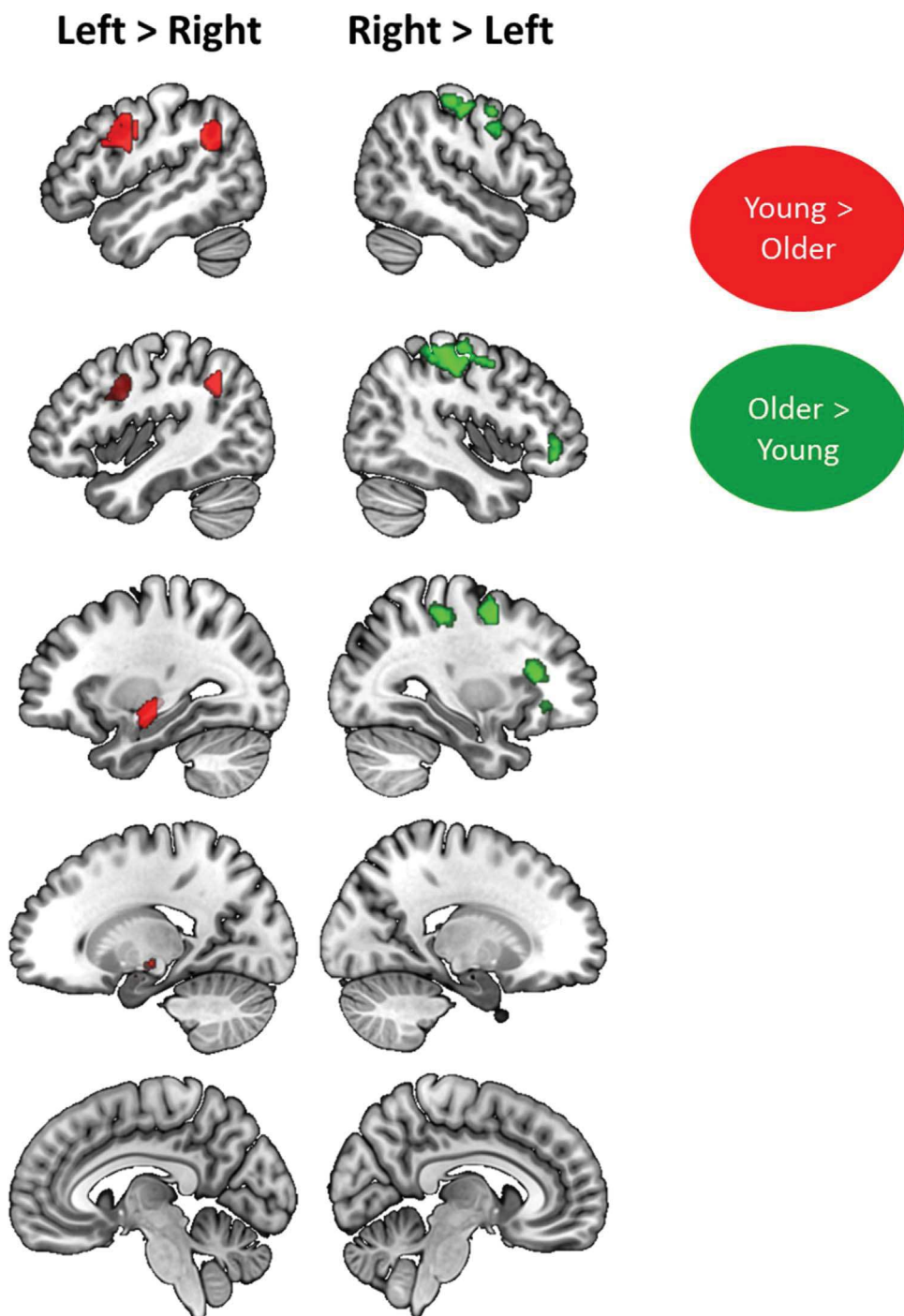


Fig. 4. Laterality analysis of contrasts of young and older adults. Figure shows regions where ALE values were significantly higher in the left hemisphere compared with the homologous region in the right, and vice versa.

(IFG, pMTG, dIPC). In pMTG and dIPC, age-related differences were only robust for studies in which older people performed more poorly than their younger counterparts, while in left IFG, older and younger adults differed regardless of relative performance levels. Older people also showed decreased activation of occipital cortex, which appeared to be driven mainly by studies in which the groups performed at an equivalent level. In other areas, older people demonstrated more activation than the young. These encompassed right frontal and superior parietal lobes, including right IFG and areas of the MDN. This increased activation appeared to be driven mainly by studies where older people performed at a lower level than young people. Taken together, these findings indicate a shift from the left-lateralised semantic network in later life, with less activation in left-hemisphere regions linked specifically with semantic processing and greater activity in the right

hemisphere and in elements of the MDN. The most prominent changes seemed to occur when older adults were unable to maintain task performance at the same level as young people. Here, we consider the extent to which these findings are compatible with existing theories of neurocognitive ageing and where they provide new evidence for age-related differences that may be specific to semantic cognition.

In the Introduction we outlined two leading theories of neurocognitive ageing which propose that there are large-scale age-related shifts in patterns of brain activity. The PASA theory (Davis et al., 2008; Dennis and Cabeza, 2008; Grady et al., 1994) holds that older adults are less efficient at processing visual stimuli and therefore exhibit reduced activation in posterior occipital and temporal regions. To compensate for this decline, older individuals are proposed to upregulate activation in prefrontal regions associated with executive control. We found

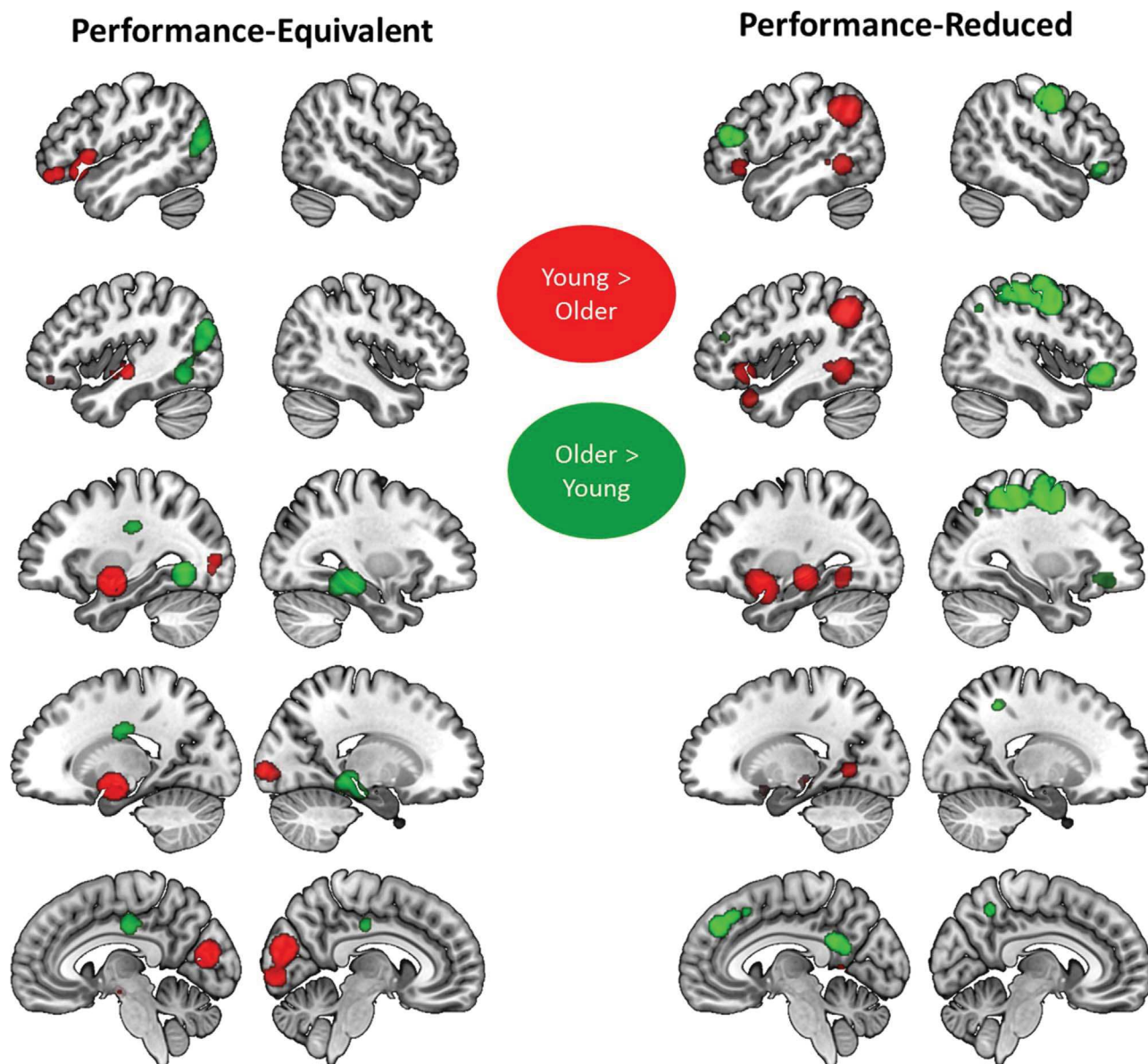


Fig. 5. Activation likelihood maps for contrasts of young and older people, split by behavioural performance effects. Results are presented at a threshold of  $p < 0.05$ , corrected for multiple comparisons at the cluster level.

support for the first prediction of this theory: across all studies, there were age-related activation reductions in primary visual cortex and in left ventral occipitotemporal regions associated with visual word and object recognition. However, the data were not unambiguous, as there were also smaller age-related activation *increases* in other occipital and fusiform regions. The evidence for increases in recruitment of prefrontal regions was more mixed. Contrary to PASA, left IFG – a major site for regulation of semantic processing – was reliably *less* active in older people, though they did show more activation in a large swathe of right PFC. This suggests that, where semantic processing is concerned, different areas of PFC are affected by ageing in different ways, consistent with findings from studies of episodic and working memory (Rajah and D’esposito, 2005). Our results are inconsistent with a general picture of a posterior-to-anterior shift, at least in the studies of semantic cognition surveyed.

HAROLD takes the view that cognitive ageing is associated with reductions in the asymmetry of activation patterns, particularly in the prefrontal cortices (Cabeza, 2002; Grady, 2012). Consistent with previous meta-analyses (Binder et al., 2009; Noonan et al., 2013), we found that young participants recruited a somewhat left-lateralised

network during semantic tasks. A reduction in lateralisation in the semantic domain would therefore entail less left-hemisphere and more right-hemisphere activity in later life. This is what we observed, broadly speaking. Older adults reliably demonstrated less left-hemisphere and more right-hemisphere activation. These large clusters included left and right IFG. The direct analysis of age-related differences in lateralisation confirmed the presence of localised effects in IFG, and also implicated other frontal and parietal sites.

One view of HAROLD is that more bilateral recruitment of neural resources is a compensatory effect that helps to maintain performance in older age (Cabeza, 2002). In young people, greater right IFG activation is observed for highly demanding semantic tasks that require more executive control (Krieger-Redwood et al., 2015; Noonan et al., 2013). Upregulation of the activation of this area in older people may therefore reflect increased reliance on this demand-related mechanism. We found that older adults’ additional activation in right IFG (and elsewhere in the right hemisphere) was most robust in studies where they performed more poorly than young. One interpretation is that these studies employed tasks that older participants found more difficult and which therefore elicited greater recruitment of right IFG to

**Table 6**  
ALE clusters for Y > O and O > Y activation in Performance-Equivalent and Performance-Reduced studies.

Cluster	Anatomical region	Volume (mm <sup>3</sup> )	BA	x	y	z	ALE value
<i>Performance-Equivalent: Y &gt; O</i>							
1	L & R occipital cortex	13720					
	Cuneus		18	4	-82	20	0.0016
	R calcarine cortex		18	14	-94	-2	0.0012
2	L medial temporal	11496					
	L hippocampus		20	-26	-8	-12	0.0017
	L superior temporal gyrus		22	-42	-18	-6	0.0010
3	L IFG	3688					
	L IFG (pars opercularis)		44	-52	14	0	0.0011
	L IFG (pars triangularis)		45	-52	20	-10	0.0011
4	L IFG	1184					
	L IFG (pars orbitalis)		47	-50	36	-12	0.0010
	L IFG (pars orbitalis)		47	-48	42	-14	0.0010
5	L lateral occipital	1168					
	L lateral occipital		18	-26	-84	-2	0.0009
	L lateral occipital		18	-30	-86	4	0.0009
<i>Performance-Equivalent: O &gt; Y</i>							
1	L ventral temporal, lateral occipital and inferior parietal	9504					
	L posterior fusiform		37	-34	-62	-6	0.0021
	L lateral occipital		39	-42	-80	24	0.0017
	L lateral occipital		19	-46	-76	16	0.0017
2	R medial temporal	7648					
	R parahippocampal gyrus		37	24	-36	-10	0.0019
	R parahippocampal/hippocampus		20	28	-30	-12	0.0018
3	Middle cingulate	5664					
	L mid-cingulate		23	-6	-20	40	0.0015
	L frontal white matter		-	-24	-16	30	0.0014
	Mid-cingulate		23	4	-18	38	0.0013
<i>Performance-Reduced: Y &gt; O</i>							
1	L IFG, insula & temporal pole	11008					
	L anterior insula		13	-28	6	-16	0.0018
	L temporal pole		38	-40	18	-28	0.0011
2	L dIPC	8544					
	L dorsal angular gyrus		39	-46	-60	36	0.0017
3	L posterior temporal & occipital	7168					
	L posterior fusiform		37	-38	-54	-8	0.0015
	L pMTG		37	-44	-56	-6	0.0014
	L lingual gyrus		18	-18	-60	0	0.0011
4	L medial temporal	4280					
	L hippocampus		20	-28	-26	-10	0.0018
<i>Performance-Reduced: O &gt; Y</i>							
1	R superior frontal & parietal	28112					
	R postcentral gyrus/dIPC		3	34	-36	54	0.0032
	R precentral gyrus		6	48	-6	46	0.0030
	R precentral gyrus		6	36	-10	62	0.0028
	R SFG		6	30	-4	52	0.0027
	R dorsal angular gyrus		39	38	-62	42	0.0020
	R precuneus		7	8	-52	50	0.0018
2	R IFG	4800					
	R IFG (pars orbitalis)		47	40	34	-10	0.0023
3	L medial frontal & cingulate	3648					
	L dACC/SFG		32	-8	42	36	0.0024
	L dACC/SFG		32	-10	20	48	0.0018

**Table 6 (continued)**

Cluster	Anatomical region	Volume (mm <sup>3</sup> )	BA	x	y	z	ALE value
4	L posterior cingulate	3016					
	L posterior cingulate		23	-8	-52	24	0.0022
	L precuneus		18	-12	-62	18	0.0019
5	L anterior IFS	2872					
	L IFS/IFG		45	-50	32	16	0.0021

IFG = inferior frontal gyrus; IFS = inferior frontal sulcus; SFG = superior frontal gyrus; pMTG = posterior middle temporal gyrus; dIPC = dorsal inferior parietal cortex; dACC = dorsal anterior cingulate cortex. ALE = activation likelihood estimation. BA = Brodmann area.

support performance to some degree (although not to the level of the young participants). Of course, another possibility is that right IFG upregulation does not support performance in older people, and may be a cause of rather than a response to performance declines. This debate is unlikely to be fully resolved by the correlational methodology of neuroimaging studies alone, particularly by cross-sectional studies, which also struggle to establish interpretable associations between age effects and performance (see Morcom and Johnson, 2015). TMS studies, however, permit assessment of the effects of temporary disruption of function, and one such study comparing young and older adults provided some support for the view that dorsolateral prefrontal regions contributing to performance are more bilateral in older age, at least during episodic memory retrieval (Rossi et al., 2004). No TMS studies to date have investigated such effects on semantic cognition specifically. It is worth noting that increased right prefrontal recruitment is frequently observed in aphasic patients following stroke and is associated with better recovery of language function, at least in some cases (Saur et al., 2006; Winhuisen et al., 2005).

One possible prediction of a compensatory account was an upregulation of left IFG in older people, as well as in right IFG. Young people show reliable increases in left IFG activation for more demanding semantic tasks (Badre et al., 2005; Krieger-Redwood et al., 2015; Noonan et al., 2013). However, we found that older individuals activated left IFG less than the young. A potential explanation for this discrepancy is offered by the CRUNCH theory outlined in the Introduction (Reuter-Lorenz and Cappell, 2008). On this view, older people can successfully maintain their performance up to a point by increasing activation of task-related brain areas above that of their younger peers. Under more demanding conditions, however, this effect reaches a plateau beyond which activation in older people tails off, and young people show greater activation. Since left IFG is a core element of the semantic network in young people, and demonstrates robust activation across all semantic tasks, it may have little spare capacity for additional recruitment in older age. In order to address this hypothesis in detail, direct manipulation of task demand in people of different ages will be needed (Reuter-Lorenz and Cappell, 2008; Schneider-Garces et al., 2010).

Finally, many of the results of the present meta-analysis are consistent with the idea that activation shifts in later life away from neurally specialised regions and towards more task-general areas. In the current study, older adults displayed reduced activity in several core areas of the left-hemisphere semantic network, including left IFG, pMTG and dIPC. These areas have been linked particularly with executive regulation of semantic knowledge (Jefferies, 2013). This finding may indicate reduced efficiency of such processes in older age, in line with executive control declines in working memory and episodic memory tasks (McCabe et al., 2010). At the same time as observing decreases in semantic regions, we observed reliable age-related increases in activation in areas of the domain-general MDN, including right IFS and middle frontal gyrus, right dIPC and dACC. This may indicate that older people draw more heavily on flexible domain-general processing resources to compensate for under-activation of the core

semantic network, i.e., the additional recruitment of MDN regions reflects neurocognitive flexibility, as articulated by Lövdén et al. (2010). As noted in the Introduction, our data cannot determine whether this additional recruitment actually benefits performance, or is secondary to a reduction in the specificity of neural responses (Grady, 2012; Grady et al., 1994; Li et al., 2001; Logan et al., 2002). However, like the CRUNCH hypothesis, the neurocognitive flexibility theory of additional recruitment makes other testable predictions. Additional engagement of the MDN in older adults should be found across task domains (e.g., semantic cognition and episodic memory), and should depend on task demand, so that engagement of domain-general regions and networks in older people at low demand should resemble those in young people at high demand.

We found no strong evidence for age-related differences in DMN activity (although the direction of findings at the more lenient uncorrected threshold was for several small areas of reduced activity in older people). The role of DMN regions in semantic cognition is currently unclear, with some researchers arguing that some regions classified as within the DMN (vIPC and pCing, in particular) make important contributions to semantic processing (Binder and Desai, 2011). Others claim that there is a strong distinction between the DMN and the semantic network (Humphreys et al., 2015). However, evidence from one previous fMRI study suggests that DMN activation is negatively associated with semantic performance. Persson et al. (2007) compared young and older participants performing verb generation, a difficult semantic task. They found that DMN regions (particularly pCing) were deactivated by the semantic task and that the degree of deactivation increased with increasing task demand. Older adults exhibited less deactivation than young people in the most demanding conditions and, importantly, individuals with greater deactivation in right posterior cingulate displayed better task performance. This study suggests that increased DMN activation in older people reflects a failure of older adults to deactivate this network, which may in turn have negative effects on semantic performance. This is an important possibility for future studies to consider, in light of increasing evidence for interaction between DMN and semantic regions (Vatanev et al., 2017).

#### 4.1. Convergence with previous meta-analyses

The results of the present meta-analysis are broadly consistent with previous meta-analyses that have investigated more general effects of healthy ageing on functional brain activity (Li et al., 2015; Spreng et al., 2010). These meta-analyses included many of the studies we investigated but also included numerous studies of episodic and working memory, perception and executive function that fell outside our more targeted approach. Similar findings of age-related reductions in activation of visual cortices were reported by both Spreng et al. (2010) and Li et al. (2015) and may be a consequence of impaired or less differentiated visual processing in later life. Our data also revealed greater activation with age in other visual regions, which may be consistent with a dedifferentiation view, i.e. that visual cortical function is less specific rather than simply impaired (Carp et al., 2011; Park et al., 2004). Reduced activity in the left hippocampus was also reported in both previous meta-analyses as well as the present study, and may reflect reductions in the frequency with which this region is engaged in incidental encoding of novel experiences into episodic memory (Daselaar et al., 2003). Likewise, both previous meta-analyses found that older adults demonstrated reduced activity in areas of left IFG, consistent with our findings. In contrast, a meta-analysis of subsequent memory effects in episodic memory studies found no differences between young and older people in left IFG or hippocampus (Maillet and Rajah, 2014). This result does not conflict with our findings; older adults may be less likely to engage this region during semantic tasks, but when they do engage it, the activation is associated with successful episodic memory encoding just like in the young, leading to a preserved subsequent memory effect (Maillet and Rajah, 2014; Morcom et al.,

2003).

A difference between our results and those of the two earlier more inclusive meta-analyses (Li et al., 2015; Spreng et al., 2010) is that they found additional recruitment by older people of more posterior left PFC regions, which we did not. In addition, neither previous study found evidence for reduced activation of left pMTG or dIPC. It is likely that our analysis had greater power to detect such effects as a consequence of focusing specifically on semantic tasks that provide strong activation in these regions. Increases in right PFC regions were also found in previous meta-analyses, particularly when older people performed more poorly than young. More generally, both previous meta-analyses reported increased activation in older participants in MDN regions, which accords with our findings. In summary, many of the age-related differences we found were consistent with those reported for other cognitive domains, though we also found some additional age-related differences. Direct comparisons in future studies will be able to establish whether these differences are specific to semantic cognition.

#### 4.2. Implications for future studies

Meta-analyses can be useful not only in synthesising the current state of knowledge in a domain but also in plotting where the limits of our current understanding lie. This meta-analysis has identified two lacunae in our understanding of age-related changes in semantic cognition. First, we note that the literature is heavily biased towards verbal semantic processing. Forty of the analysed studies either used lexical stimuli or required verbal responses, while only 13 presented non-verbal stimuli (usually pictures but in two studies, smells). This is important because non-verbal semantic processing, in addition to being an essential part of everyday life, engages a different distribution of brain regions to verbal semantic cognition. While verbal semantic processing is strongly left-lateralised (particularly for written words), non-verbal stimuli elicit more bilateral patterns of activation (Krieger-Redwood et al., 2015; Rice et al., 2015a,b; Visser et al., 2010). As a consequence, the general shift in activation away from left-hemisphere regions and towards contralateral activation may be less prominent for non-verbal processing. The degree to which the present findings apply to non-verbal processing therefore remains an open question, as does the status of non-verbal semantic cognition in ageing more generally. However, one simple prediction of the neurocognitive flexibility theory of additional recruitment, consistent with our data for predominantly verbal studies, is that older people will show greater activation of MDN regions than young people in non-verbal semantic tasks.

Second, the studies included in this meta-analysis did not consistently report activation even in young people in the vATLs, which are now known to be a key region in the representation of semantic knowledge (Binder and Desai, 2011; Humphreys et al., 2015; Patterson et al., 2007). The failure to detect engagement of this area most likely reflects a combination of methodological factors that reduce the likelihood of activity in this area being sampled properly (Visser et al., 2010). These include poor signal in the vATL in fMRI studies, due to the proximity of air-filled sinuses (Devlin et al., 2000),<sup>1</sup> its extreme ventral position in the brain which can lead to it being excluded from image acquisition (Visser et al., 2010) and the use of resting baselines that do not adequately control for task-unrelated semantic processing (Humphreys et al., 2015). When these issues are addressed, semantic cognition does reliably activate this area (e.g., Hoffman et al., 2015; Humphreys et al., 2015; Spitsyna et al., 2006). However, since vATL was not reliably activated in the studies included in the meta-analysis, we are unable to draw any conclusions about possible age effects in this

<sup>1</sup> This factor does not apply to PET studies, which report vATL activation more frequently than fMRI studies (Visser et al., 2010). We considered running separate analyses on the PET studies included in the present meta-analysis but there were too few of these to give reliable results.

region. This is an important target for future work, because vATL and left IFG are thought to play complementary roles in semantic task performance (Lambon Ralph et al., 2017).

Finally, we found that in the studies included in the current meta-analysis, older people often performed semantic tasks more poorly than the young. This result may seem at odds with the established view that ageing has little effect on semantic performance, especially when compared with other cognitive domains (Nilsson, 2003; Nyberg et al., 1996; Park et al., 2002; Rönnlund et al., 2005; Salthouse, 2004; Verhaeghen, 2003). We propose that this apparent discrepancy may stem from the tests used to probe semantic ability in behavioural vs. neuroimaging studies, which emphasise different aspects of semantic processing. Behavioural ageing studies typically assess semantic ability with vocabulary size measures. These provide an index of how much semantic knowledge each individual possesses, and it is clear that this quantity increases with age (e.g., Verhaeghen, 2003). However, vocabulary tests place minimal demands on controlled processing of knowledge. Neuroimaging studies, in contrast, are more likely to use tasks that require complex executive regulation of knowledge retrieval (e.g., verbal fluency tasks) and are more likely to impose time pressure on responses. Under these circumstances, one's ability to regulate semantic processing efficiently may be a stronger determinant of performance than how much one knows. This executive aspect of semantic processing may be robust in young people, consistent with their greater activation of brain regions associated with semantic control. Evidence from a recent behavioural study supports this proposal. Young and older adults were compared on vocabulary-style measures of semantic ability and on tests designed specifically to probe semantic control (Hoffman, 2017). Older adults outperformed the young on the vocabulary measures but were impaired on specific aspects of semantic control. It is therefore likely that the neural differences observed in the present meta-analysis are accompanied by change in the patterns of strengths and weaknesses among the different elements of semantic cognition.

## Acknowledgements

PH was funded by The University of Edinburgh Centre for Cognitive Ageing and Cognitive Epidemiology, part of the cross council Lifelong Health and Wellbeing Initiative (MR/K026992/1). Funding from the Biotechnology and Biological Sciences Research Council (BBSRC) and Medical Research Council (MRC) is gratefully acknowledged. AM is a member of CCACE.

## Appendix A. Supplementary data

Supplementary data associated with this article can be found, in the online version, at <https://doi.org/10.1016/j.neubiorev.2017.11.010>.

## References

- Badre, D., Wagner, A.D., 2002. Semantic retrieval, mnemonic control, and prefrontal cortex. *Behav. Cogn. Neurosci. Rev.* 1, 206–218.
- Badre, D., Poldrack, R.A., Pare-Blagoev, E.J., Insler, R.Z., Wagner, A.D., 2005. Dissociable controlled retrieval and generalized selection mechanisms in ventrolateral prefrontal cortex. *Neuron* 47, 907–918.
- Binder, J.R., Desai, R.H., 2011. The neurobiology of semantic memory. *Trends Cogn. Sci.* 15, 527–536.
- Binder, J.R., Frost, J.A., Hammeke, T.A., Bellgowan, P.S.F., Rao, S.M., Cox, R.W., 1999. Conceptual processing during the conscious resting state: a functional MRI study. *J. Cogn. Neurosci.* 11, 80–93.
- Binder, J.R., Desai, R.H., Graves, W.W., Conant, L.L., 2009. Where is the semantic system? A critical review and meta-analysis of 120 functional neuroimaging studies. *Cereb. Cortex* 19, 2767–2796.
- Buckner, R.L., Andrews-Hanna, J.R., Schacter, D.L., 2008. The brain's default network: anatomy, function and relevance to disease. *Ann. N. Y. Acad. Sci.* 1124, 1–38.
- Cabeza, R., 2002. Hemispheric asymmetry reduction in older adults: the HAROLD model. *Psychol. Aging* 17, 85.
- Carp, J., Park, J., Polk, T.A., Park, D.C., 2011. Age differences in neural distinctiveness revealed by multi-voxel pattern analysis. *Neuroimage* 56, 736–743.
- Daselaar, S., Veltman, D., Rombouts, S., Raaijmakers, J., Jonker, C., 2003. Neuroanatomical correlates of episodic encoding and retrieval in young and elderly subjects. *Brain* 126, 43–56.
- Davis, S.W., Dennis, N.A., Daselaar, S.M., Fleck, M.S., Cabeza, R., 2008. Que PASA? The posterior–anterior shift in aging. *Cereb. Cortex* 18, 1201–1209.
- Dennis, N.A., Cabeza, R., 2008. Neuroimaging of healthy cognitive aging. In: Craik, F.I.M., Salthouse, T.A. (Eds.), *The Handbook of Aging and Cognition*, Third ed. Lawrence Erlbaum, London, pp. 1–55.
- Devlin, J.T., Russell, R.P., Davis, M.H., Price, C.J., Wilson, J., Moss, H.E., Matthews, P.M., Tyler, L.K., 2000. Susceptibility-induced loss of signal: comparing PET and fMRI on a semantic task. *Neuroimage* 11, 589–600.
- Duncan, J., 2010. The multiple-demand (MD) system of the primate brain: mental programs for intelligent behaviour. *Trends Cogn. Sci.* 14, 172–179.
- Eickhoff, S.B., Laird, A.R., Grefkes, C., Wang, L.E., Zilles, K., Fox, P.T., 2009. Coordinate-based activation likelihood estimation meta-analysis of neuroimaging data: a random-effects approach based on empirical estimates of spatial uncertainty. *Hum. Brain Mapp.* 30, 2907–2926.
- Eickhoff, S.B., Bzdok, D., Laird, A.R., Kurth, F., Fox, P.T., 2012. Activation likelihood estimation meta-analysis revisited. *Neuroimage* 59, 2349–2361.
- Fedorenko, E., Duncan, J., Kanwisher, N., 2013. Broad domain generality in focal regions of frontal and parietal cortex. *Proc. Natl. Acad. Sci.* 110, 16616–16621.
- Grady, C.L., Maisog, J.M., Horwitz, B., Ungerleider, L.G., Mentis, M.J., Salerno, J.A., Pietrini, P., Wagner, E., Haxby, J.V., 1994. Age-related changes in cortical blood flow activation during visual processing of faces and location. *J. Neurosci.* 14, 1450–1462.
- Grady, C.L., Protzner, A.B., Kovacevic, N., Strother, S.C., Afshin-Pour, B., Wojtowicz, M., Anderson, J.A., Churchill, N., McIntosh, A.R., 2010. A multivariate analysis of age-related differences in default mode and task-positive networks across multiple cognitive domains. *Cereb. Cortex* 20, 1432–1447.
- Grady, C., 2012. The cognitive neuroscience of ageing. *Nat. Rev. Neurosci.* 13, 491–505.
- Grossman, M., Cooke, A., DeVita, C., Alsop, D., Detre, J., Chen, W., Gee, J., 2002. Age-related changes in working memory during sentence comprehension: an fMRI study. *Neuroimage* 15, 307–317.
- Halai, A.D., Parkes, L.M., Welbourne, S.R., 2015. Dual-echo fMRI can detect activations in inferior temporal lobe during intelligible speech comprehension. *Neuroimage* 122, 214–221.
- Hoffman, P., Jefferies, E., Lambon Ralph, M.A., 2010. Ventrolateral prefrontal cortex plays an executive regulation role in comprehension of abstract words: convergent neuropsychological and repetitive TMS evidence. *J. Neurosci.* 30, 15450–15456.
- Hoffman, P., Binney, R.J., Lambon Ralph, M.A., 2015. Differing contributions of inferior prefrontal and anterior temporal cortex to concrete and abstract conceptual knowledge. *Cortex* 63, 250–265.
- Hoffman, P., 2017. An individual differences approach to semantic cognition: divergent effects of age on representation, retrieval and selection. *bioRxiv* 182170.
- Huettel, S.A., Singerman, J.D., McCarthy, G., 2001. The effects of aging upon the hemodynamic response measured by functional MRI. *Neuroimage* 13, 161–175.
- Humphreys, G.F., Hoffman, P., Visser, M., Binney, R.J., Lambon Ralph, M.A., 2015. Establishing task- and modality-dependent dissociations between the semantic and default mode networks. *Proc. Natl. Acad. Sci. U. S. A.* 112, 7857–7862.
- Jefferies, E., 2013. The neural basis of semantic cognition: converging evidence from neuropsychology, neuroimaging and TMS. *Cortex* 49, 611–625.
- Kannurpatti, S.S., Motes, M.A., Rypma, B., Biswal, B.B., 2010. Neural and vascular variability and the fMRI-BOLD response in normal aging. *Magn. Reson. Imaging* 28, 466–476.
- Krieger-Redwood, K., Teige, C., Davey, J., Hymers, M., Jefferies, E., 2015. Conceptual control across modalities: graded specialisation for pictures and words in inferior frontal and posterior temporal cortex. *Neuropsychologia* 76, 92–107.
- Lambon Ralph, M.A., Jefferies, E., Patterson, K., Rogers, T.T., 2017. The neural and computational bases of semantic cognition. *Nat. Rev. Neurosci.* 18, 42–55.
- Lancaster, J.L., Tordesillas-Gutiérrez, D., Martínez, M., Salinas, F., Evans, A., Zilles, K., Mazziotta, J.C., Fox, P.T., 2007. Bias between MNI and Talairach coordinates analyzed using the ICBM-152 brain template. *Hum. Brain Mapp.* 28, 1194–1205.
- Li, S.-C., Lindenberger, U., Sikström, S., 2001. Aging cognition: from neuromodulation to representation. *Trends Cogn. Sci.* 5, 479–486.
- Li, H.-J., Hou, X.-H., Liu, H.-H., Yue, C.-L., Lu, G.-M., Zuo, X.-N., 2015. Putting age-related task activation into large-scale brain networks: a meta-analysis of 114 fMRI studies on healthy aging. *Neurosci. Biobehav. Rev.* 57, 156–174.
- Logan, J.M., Sanders, A.L., Snyder, A.Z., Morris, J.C., Buckner, R.L., 2002. Under-recruitment and nonselective recruitment: dissociable neural mechanisms associated with aging. *Neuron* 33, 827–840.
- Lövden, M., Bäckman, L., Lindenberger, U., Schaefer, S., Schmiedek, F., 2010. A theoretical framework for the study of adult cognitive plasticity. *Psychol. Bull.* 136 (4), 659–676.
- Madden, D.J., Turkington, T.G., Provenzale, J.M., Denny, L.L., Hawk, T.C., Gottlob, L.R., Coleman, R.E., 1999. Adult age differences in the functional neuroanatomy of verbal recognition memory. *Hum. Brain Mapp.* 7, 115–135.
- Maillet, D., Rajah, M.N., 2014. Age-related differences in brain activity in the subsequent memory paradigm: a meta-analysis. *Neurosci. Biobehav. Rev.* 45, 246–257.
- McCabe, D.P., HL, Balota, D.A., Hambrick, D.Z., 2010. The relationship between working memory capacity and executive functioning: evidence for a common executive attention construct. *Neuropsychology* 24, 222.
- Morcom, A.M., Johnson, W., 2015. Neural reorganization and compensation in aging. *J. Cognit. Neurosci.*
- Morcom, A.M., Good, C.D., Frackowiak, R.S., Rugg, M.D., 2003. Age effects on the neural correlates of successful memory encoding. *Brain* 126, 213–229.
- Nilsson, L.G., 2003. Memory function in normal aging. *Acta Neurol. Scand.* 107, 7–13.
- Noonan, K.A., Jefferies, E., Visser, M., Lambon Ralph, M.A., 2013. Going beyond inferior



- prefrontal involvement in semantic control: evidence for the additional contribution of dorsal angular gyrus and posterior middle temporal cortex. *J. Cogn. Neurosci.* 25, 1824–1850.
- Nyberg, L., Bäckman, L., Erngrund, K., Olofsson, U., Nilsson, L.-G., 1996. Age differences in episodic memory, semantic memory, and priming: relationships to demographic intellectual, and biological factors. *J. Gerontol. Ser. B: Psychol. Sci. Social Sci.* 51, 234–240.
- Park, D.C., Reuter-Lorenz, P., 2009. The adaptive brain: aging and neurocognitive scaffolding. *Annu. Rev. Psychol.* 60, 173–196.
- Park, D.C., Lautenschlager, G., Hedden, T., Davidson, N.S., Smith, A.D., Smith, P.K., 2002. Models of visuospatial and verbal memory across the adult life span. *Psychol. Aging* 17, 299–320.
- Park, D.C., Polk, T.A., Park, R., Minear, M., Savage, A., Smith, M.R., 2004. Aging reduces neural specialization in ventral visual cortex. *Proc. Natl. Acad. Sci. U. S. A.* 101, 13091–13095.
- Patterson, K., Nestor, P.J., Rogers, T.T., 2007. Where do you know what you know? The representation of semantic knowledge in the human brain. *Nat. Rev. Neurosci.* 8, 976–987.
- Persson, J., Lustig, C., Nelson, J.K., Reuter-Lorenz, P.A., 2007. Age differences in deactivation: a link to cognitive control? *J. Cogn. Neurosci.* 19, 1021–1032.
- Poldrack, R.A., Mumford, J.A., Schonberg, T., Kalar, D., Barman, B., Yarkoni, T., 2012. Discovering relations between mind, brain, and mental disorders using topic mapping. *PLoS Comput. Biol.* 8, e1002707.
- Rönnlund, M., Nyberg, L., Bäckman, L., Nilsson, L.-G., 2005. Stability, growth, and decline in adult life span development of declarative memory: cross-sectional and longitudinal data from a population-based study. *Psychol. Aging* 20, 3.
- Raichle, M.E., MacLeod, A.M., Snyder, A.Z., Powers, W.J., Gusnard, D.A., Shulman, G.L., 2001. A default mode of brain function. *Proc. Natl. Acad. Sci.* 98, 676–682.
- Rajah, M.N., D'Esposito, M., 2005. Region-specific changes in prefrontal function with age: a review of PET and fMRI studies on working and episodic memory. *Brain* 128, 1964–1983.
- Raz, N., Lindenberger, U., Rodrigue, K.M., Kennedy, K.M., Head, D., Williamson, A., Dahle, C., Gerstorf, D., Acker, J.D., 2005. Regional brain changes in aging healthy adults: general trends, individual differences and modifiers. *Cereb. Cortex* 15, 1676–1689.
- Reuter-Lorenz, P.A., Cappell, K.A., 2008. Neurocognitive aging and the compensation hypothesis. *Curr. Directions Psychol. Sci.* 17, 177–182.
- Rice, G.E., Hoffman, P., Lambon Ralph, M.A., 2015a. Graded specialization within and between the anterior temporal lobes. *Ann. N. Y. Acad. Sci.* 1359, 84–97.
- Rice, G.E., Lambon Ralph, M.A., Hoffman, P., 2015b. The roles of left versus right anterior temporal lobes in conceptual knowledge: an ALE meta-analysis of 97 functional neuroimaging studies. *Cereb. Cortex* 25, 4374–4391.
- Rogers, T.T., McClelland, J.L., 2004. *Semantic Cognition: A Parallel Distributed Processing Approach*. MIT Press, Cambridge, MA.
- Rossi, S., Miniussi, C., Pasqualetti, P., Babiloni, C., Rossini, P.M., Cappa, S.F., 2004. Age-related functional changes of prefrontal cortex in long-term memory: a repetitive transcranial magnetic stimulation study. *J. Neurosci.* 24, 7939–7944.
- Saffran, E.M., 2000. The organization of semantic memory: in support of a distributed model. *Brain Lang.* 71, 204–212.
- Salthouse, T.A., 2004. Localizing age-related individual differences in a hierarchical structure. *Intelligence* 32, 541–561.
- Saur, D., Lange, R., Baumgaertner, A., Schraknepper, V., Willmes, K., Rijntjes, M., Weiller, C., 2006. Dynamics of language reorganization after stroke. *Brain* 129, 1371–1384.
- Schneider-Garces, N.J., Gordon, B.A., Brumback-Peltz, C.R., Shin, E., Lee, Y., Sutton, B.P., Maclin, E.L., Gratton, G., Fabiani, M., 2010. Span, CRUNCH, and beyond: working memory capacity and the aging brain. *J. Cogn. Neurosci.* 22, 655–669.
- Shafiq, M.A., Stamatakis, E.A., Tam, P.P., Tyler, L.K., 2010. Word retrieval failures in old age: the relationship between structure and function. *J. Cogn. Neurosci.* 22, 1530–1540.
- Shulman, G.L., Pope, D.L., Astafiev, S.V., McAvoy, M.P., Snyder, A.Z., Corbetta, M., 2010. Right hemisphere dominance during spatial selective attention and target detection occurs outside the dorsal frontoparietal network. *J. Neurosci.* 30, 3640–3651.
- Spitsyna, G., Warren, J.E., Scott, S.K., Turkheimer, F.E., Wise, R.J.S., 2006. Converging language streams in the human temporal lobe. *J. Neurosci.* 26, 7328–7336.
- Spreng, R.N., Wojtowicz, M., Grady, C.L., 2010. Reliable differences in brain activity between young and old adults: a quantitative meta-analysis across multiple cognitive domains. *Neurosci. Biobehav. Rev.* 34, 1178–1194.
- Tahmasebi, A.M., Davis, M.H., Wild, C.J., Rodd, J.M., Hakyemez, H., Abolmaesumi, P., Johnsrude, I.S., 2011. Is the link between anatomical structure and function equally strong at all cognitive levels of processing? *Cereb. Cortex* bhr205.
- Thompson-Schill, S.L., D'Esposito, M., Aguirre, G.K., Farah, M.J., 1997. Role of left inferior prefrontal cortex in retrieval of semantic knowledge: a reevaluation. *Proc. Natl. Acad. Sci. U. S. A.* 94, 14792–14797.
- Tsvetanov, K.A., Henson, R.N., Tyler, L.K., Davis, S.W., Shafiq, M.A., Taylor, J.R., Williams, N., Rowe, J.B., 2015. The effect of ageing on fMRI: correction for the confounding effects of vascular reactivity evaluated by joint fMRI and MEG in 335 adults. *Hum. Brain Mapp.* 36, 2248–2269.
- Turkeltaub, P.E., Coslett, H.B., 2010. Localization of sublexical speech perception components. *Brain Lang.* 114, 1–15.
- Turkeltaub, P.E., Eickhoff, S.B., Laird, A.R., Fox, M., Wiener, M., Fox, P., 2012. Minimizing within-experiment and within-group effects in activation likelihood estimation meta-analyses. *Hum. Brain Mapp.* 33, 1–13.
- Turken, A.U., Dronkers, N.F., 2011. The neural architecture of the language comprehension network: converging evidence from lesion and connectivity analyses. *Front. Syst. Neurosci.* 5. <http://dx.doi.org/10.3389/fnsys.2011.00001>.
- Vatavsever, D., Bzdok, D., Wang, H.-T., Mollo, G., Sormaz, M., Murphy, C., Karapanagiotidis, T., Smallwood, J., Jefferies, E., 2017. Varieties of semantic cognition revealed through simultaneous decomposition of intrinsic brain connectivity and behaviour. *Neuroimage* 158, 1–11.
- Verhaeghen, P., 2003. Aging and vocabulary score: a meta-analysis. *Psychol. Aging* 18, 332–339.
- Visser, M., Jefferies, E., Lambon Ralph, M.A., 2010. Semantic processing in the anterior temporal lobes: a meta-analysis of the functional neuroimaging literature. *J. Cogn. Neurosci.* 22, 1083–1094.
- Whitney, C., Kirk, M., O'Sullivan, J., Lambon Ralph, M.A., Jefferies, E., 2011. The neural organization of semantic control: TMS evidence for a distributed network in left inferior frontal and posterior middle temporal gyrus. *Cereb. Cortex* 21, 1066–1075.
- Winhuisen, L., Thiel, A., Schumacher, B., Kessler, J., Rudolf, J., Haupt, W.F., Heiss, W.D., 2005. Role of the contralateral inferior frontal gyrus in recovery of language function in poststroke aphasia. *Stroke J. Cereb. Circ.* 36, 1759–1763.
- Yarkoni, T., Poldrack, R.A., Nichols, T.E., Van Essen, D.C., Wager, T.D., 2011. Large-scale automated synthesis of human functional neuroimaging data. *Nat. Methods* 8, 665–670.

### List of studies included in meta-analysis

- Anderson, N.D., Iidaka, T., Cabeza, R., Kapur, S., McIntosh, A.R., Craik, F.I., 2000. The effects of divided attention on encoding and retrieval-related brain activity: A PET study of younger and older adults. *Journal of cognitive neuroscience* 12, 775–792.
- Baciu, M., Boudiaf, N., Cousin, E., Perrone-Bertolotti, M., Pichat, C., Fournet, N., Chainay, H., Lamalle, L., Krainik, A., 2016. Functional MRI evidence for the decline of word retrieval and generation during normal aging. *Age (Dordr)* 38, 3.
- Bäckman, L., Almkvist, O., Andersson, J., Nordberg, A., Winblad, B., Reineck, R., Långström, B., 1997. Brain activation in young and older adults during implicit and explicit retrieval. *Journal of Cognitive Neuroscience* 9, 378–391.
- Bergerbest, D., Gabrieli, J.D., Whitfield-Gabrieli, S., Kim, H., Stebbins, G.T., Bennett, D.A., Fleischman, D.A., 2009. Age-associated reduction of asymmetry in prefrontal function and preservation of conceptual repetition priming. *Neuroimage* 45, 237–246.
- Berlinger, M., Danelli, L., Bottini, G., Sberna, M., Paulesu, E., 2013. Reassessing the HAROLD model: is the hemispheric asymmetry reduction in older adults a special case of compensatory-related utilisation of neural circuits? *Exp Brain Res* 224, 393–410.
- Cabeza, R., Grady, C.L., Nyberg, L., McIntosh, A.R., Tulving, E., Kapur, S., Jennings, J.M., Houle, S., Craik, F.I., 1997. Age-related differences in neural activity during memory encoding and retrieval: a positron emission tomography study. *The Journal of Neuroscience* 17, 391–400.
- Daselaar, S., Veltman, D., Rombouts, S., Raaijmakers, J., Jonker, C., 2003a. Neuroanatomical correlates of episodic encoding and retrieval in young and elderly subjects. *Brain* 126, 43–56.
- Daselaar, S.M., Veltman, D.J., Rombouts, S.A., Raaijmakers, J.G., Jonker, C., 2005. ageing affects both perceptual and lexical/semantic components of word stem priming: An event-related fMRI study. *Neurobiol Learn Mem* 83, 251–262.
- Daselaar, S.M., Veltman, D.J., Rombouts, S.A.R.B., Raaijmakers, J.G.W., Jonker, C., 2003b. Deep processing activates the medial temporal lobe in young but not in old adults. *Neurobiology of ageing* 24, 1005–1011.
- Davis, S.W., Zhuang, J., Wright, P., Tyler, L.K., 2014. Age-related sensitivity to task-related modulation of language-processing networks. *Neuropsychologia* 63, 107–115.
- Destrieux, C., Hommet, C., Domengie, F., Boissy, J.M., De Marco, G., Joannette, Y., Andersson, F., Cottier, J.P., 2012. Influence of age on the dynamics of fMRI activations during a semantic fluency task. *J. Neurosci* 39, 158–166.
- Diaz, M.T., Johnson, M.A., Burke, D.M., Madden, D.J., 2014. Age-related differences in the neural bases of phonological and semantic processes. *J Cogn Neurosci* 26, 2798–2811.
- Donix, M., Petrowski, K., Jurjanz, L., Huebner, T., Herold, U., Baeumlner, D., Amanatidis, E.C., Poettrich, K., Smolka, M.N., Holthoff, V.A., 2010. Age and the neural network of personal familiarity. *PLoS One* 5, e15790.
- Eckert, M.A., Walczak, A., Ahlstrom, J., Denslow, S., Horwitz, A., Dubno, J.R., 2008. Age-related effects on word recognition: reliance on cognitive control systems with structural declines in speech-responsive cortex. *Journal of the Association for Research in Otolaryngology* 9, 252–259.
- Geva, S., Jones, P.S., Crinion, J.T., Price, C.J., Baron, J.-C., Warburton, E.A., 2012. The effect of ageing on the neural correlates of phonological word retrieval. *Journal of cognitive neuroscience* 24, 2135–2146.
- Gold, B.T., Andersen, A.H., Jicha, G.A., Smith, C.D., 2009. ageing influences the neural correlates of lexical decision but not automatic semantic priming. *Cereb Cortex* 19, 2671–2679.
- Grady, C.L., McIntosh, A.R., Rajah, M.N., Beig, S., Craik, F.I., 1999. The effects of age on the neural correlates of episodic encoding. *Cerebral Cortex* 9, 805–814.
- Grossman, M., Cooke, A., DeVita, C., Alsop, D., Detre, J., Chen, W., Gee, J., 2002. Age-related changes in working memory during sentence comprehension: an fMRI study. *Neuroimage* 15, 302–317.
- Hwang, J.H., Li, C.W., Wu, C.W., Chen, J.H., Liu, T.C., 2007. ageing effects on the activation of the auditory cortex during binaural speech listening in white noise: an fMRI study. *Audiol Neurootol* 12, 285–294.
- Iidaka, T., Sadato, N., Yamada, H., Murata, T., Omori, M., Yonekura, Y., 2001. An fMRI study of the functional neuroanatomy of picture encoding in younger and older adults. *Cognitive Brain Research* 11, 1–11.
- Johnson, S.C., Saykin, A.J., Flashman, L.A., McAllister, T.W., O'Jile, J.R., Sparling, M.B., Guerin, S.J., Moritz, C.H., Mamourian, A.C., 2001. Similarities and Differences in Semantic and Phonological Processing with Age Patterns of Functional MRI

- Attention, Aging, Neuropsychology, and Cognition (Neuropsychology, Development and Cognition: Section B) 8, 307–320.
22. Kalenzaga, S., Sperduti, M., Anssens, A., Martinelli, P., Devauchelle, A.D., Gallarda, T., Delhommeau, M., Lion, S., Amado, I., Krebs, M.O., Oppenheim, C., Piolino, P., 2014. Episodic memory and self-reference via semantic autobiographical memory: insights from an fMRI study in younger and older adults. *Front Behav Neurosci* 8, 449.
  23. Kareken, D.A., Mosnik, D.M., Doty, R.L., Dzemidzic, M., Hutchins, G.D., 2003. Functional anatomy of human odor sensation, discrimination, and identification in health and aging. *Neuropsychology* 17, 482–495.
  24. Kounios, J., Koenig, P., Glosser, G., DeVita, C., Dennis, K., Moore, P., Grossman, M., 2003. Category-specific medial temporal lobe activation and the consolidation of semantic memory: evidence from fMRI. *Cognitive Brain Research* 17, 484–494.
  25. Kuchinsky, S.E., Vaden, K.L., Jr., Keren, N.I., Harris, K.C., Ahlstrom, J.B., Dubno, J.R., Eckert, M.A., 2012. Word intelligibility and age predict visual cortex activity during word listening. *Cereb Cortex* 22, 1360–1371.
  26. Leshikar, E.D., Gutchess, A.H., Hebrank, A.C., Sutton, B.P., Park, D.C., 2010. The impact of increased relational encoding demands on frontal and hippocampal function in older adults. *Cortex* 46, 507–521.
  27. Madden, D.J., Costello, M.C., Dennis, N.A., Davis, S.W., Shepler, A.M., Spaniol, J., Bucur, B., Cabeza, R., 2010. Adult age differences in functional connectivity during executive control. *Neuroimage* 52, 643–657.
  28. Madden, D.J., Langley, L.K., Denny, L.L., Turkington, T.G., Provenzale, J.M., Hawk, T.C., Coleman, R.E., 2002. Adult Age Differences in Visual Word Identification: Functional Neuroanatomy by Positron Emission Tomography. *Brain and Cognition* 49, 297–321.
  29. Madden, D.J., Turkington, T.G., Coleman, R.E., Provenzale, J.M., DeGrado, T.R., Hoffman, J.M., 1996. Adult age differences in regional cerebral blood flow during visual word identification: Evidence from H 2 15 O PET. *Neuroimage* 3, 127–142.
  30. Madden, D.J., Turkington, T.G., Provenzale, J.M., Denny, L.L., Hawk, T.C., Gottlob, L.R., Coleman, R.E., 1999. Adult age differences in the functional neuroanatomy of verbal recognition memory. *Human brain mapping* 7, 115–135.
  31. Maguire, E.A., Frith, C.D., 2003. ageing affects the engagement of the hippocampus during autobiographical memory retrieval. *Brain* 126, 1511–1523.
  32. Marsolais, Y., Perlberg, V., Benali, H., Joannette, Y., 2014. Age-related changes in functional network connectivity associated with high levels of verbal fluency performance. *Cortex* 58, 123–138.
  33. Martins, R., Simard, F., Monchi, O., 2014. Differences between patterns of brain activity associated with semantics and those linked with phonological processing diminish with age. *PLoS One* 9, e99710.
  34. McGeown, W.J., Shanks, M.F., Forbes-McKay, K.E., Venneri, A., 2009. Patterns of brain activity during a semantic task differentiate normal ageing from early Alzheimer's disease. *Psychiatry Res* 173, 218–227.
  35. Meinzer, M., Flaisch, T., Wilsner, L., Eulitz, C., Rockstroh, B., Conway, T., Gonzalez-Rothi, L., Crosson, B., 2009. Neural signatures of semantic and phonemic fluency in young and old adults. *Journal of Cognitive Neuroscience* 21, 2007–2018.
  36. Meinzer, M., Flaisch, T., Seeds, L., Harnish, S., Antonenko, D., Witte, V., Lindenberg, R., Crosson, B., 2012a. Same modulation but different starting points: performance modulates age differences in inferior frontal cortex activity during word-retrieval. *PLoS One* 7, e33631.
  37. Meinzer, M., Seeds, L., Flaisch, T., Harnish, S., Cohen, M.L., McGregor, K., Conway, T., Benjamin, M., Crosson, B., 2012b. Impact of changed positive and negative task-related brain activity on word-retrieval in aging. *Neurobiol ageing* 33, 656–669.
  38. Murty, V.P., Sambataro, F., Das, S., Tan, H.-Y., Callicott, J.H., Goldberg, T.E., Meyer-Lindenberg, A., Weinberger, D.R., Mattay, V.S., 2009. Age-related alterations in simple declarative memory and the effect of negative stimulus valence. *Journal of cognitive neuroscience* 21, 1920–1933.
  39. Nielson, K.A., Douville, K.L., Seidenberg, M., Woodard, J.L., Miller, S.K., Franczak, M., Antuono, P., Rao, S.M., 2006. Age-related functional recruitment for famous name recognition: an event-related fMRI study. *Neurobiol ageing* 27, 1494–1504.
  40. Peelle, J.E., Chandrasekaran, K., Powers, J., Smith, E.E., Grossman, M., 2013. Age-related vulnerability in the neural systems supporting semantic processing. *Front ageing Neurosci* 5, 46.
  41. Roxbury, T., McMahon, K., Coulthard, A., Copland, D.A., 2015. An fMRI Study of Concreteness Effects during Spoken Word Recognition in Aging. *Preservation or Attenuation? Front ageing Neurosci* 7, 240.
  42. Shafto, M., Randall, B., Stamatakis, E.A., Wright, P., Tyler, L.K., 2012. Age-related neural reorganization during spoken word recognition: the interaction of form and meaning. *Journal of cognitive neuroscience* 24, 1434–1446.
  43. Stebbins, G.T., Carrillo, M.C., Dorfman, J., Dirksen, C., Desmond, J.E., Turner, D.A., Bennett, D.A., Wilson, R.S., Glover, G., Gabrieli, J.D., 2002. ageing effects on memory encoding in the frontal lobes. *Psychology and ageing* 17, 44.
  44. Suzuki, Y., Critchley, H.D., Suckling, J., Fukuda, R., Williams, S.C., Andrew, C., Howard, R., Ouldred, E., Bryant, C., Swift, C.G., 2001. Functional Magnetic Resonance Imaging of Odor Identification The Effect of Aging. *The Journals of Gerontology Series A: Biological Sciences and Medical Sciences* 56, M756-M760.
  45. Tyler, L.K., Shafto, M.A., Randall, B., Wright, P., Marslen-Wilson, W.D., Stamatakis, E.A., 2010. Preserving syntactic processing across the adult life span: the modulation of the frontotemporal language system in the context of age-related atrophy. *Cereb Cortex* 20, 352–364.
  46. Wierenga, C.E., Benjamin, M., Gopinath, K., Perlstein, W.M., Leonard, C.M., Rothi, L.J., Conway, T., Cato, M.A., Briggs, R., Crosson, B., 2008. Age-related changes in word retrieval: role of bilateral frontal and subcortical networks. *Neurobiol ageing* 29, 436–451.
  47. Wong, P.C., Jin, J.X., Gunasekera, G.M., Abel, R., Lee, E.R., Dhar, S., 2009. ageing and cortical mechanisms of speech perception in noise. *Neuropsychologia* 47, 693–703.