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# Do brain image databanks support understanding of normal ageing brain structure?

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European Radiology



## Do brain image databanks support understanding of normal ageing brain structure? A systematic review

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## Abstract

Objective To document accessible magnetic resonance (MR) brain images, metadata, and statistical results from normal older subjects that may be used to improve diagnoses of dementia. Methods We systematically reviewed published brain image databanks (print literature and internet) concerned with normal ageing brain structure. *Results* From nine eligible databanks, there appeared to be 937 normal subjects aged  $\geq$ 60 years. However, many subjects were in more than one databank and not all were representative of normal ageing clinical characteristics. Therefore, there were approximately 336 subjects aged  $\geq 60$  years with metadata representative of normal ageing but only 98 subjects were openly accessible. No databank had the range of MR image sequences, e.g. T2\*, fluid attenuated inversion recovery (FLAIR), required to effectively characterise the features of brain ageing. No databank supported random subject retrieval therefore manual selection bias and errors may occur in studies that use these subjects as controls. Finally, no databank stored results from statistical analyses of its brain image and metadata that may be validated with analyses of further data. Conclusion Brain image databanks require open access, more subjects, metadata, MR image sequences, searchability, and statistical results to improve understanding of normal ageing brain structure and diagnoses of dementia.

**Keywords**: Magnetic Resonance Imaging; Normality; Databanks; Review; Brain Pathology.

## **Key points:**

- We reviewed databanks with structural MR brain images of "normal" older people
- In total from these 9 databanks, ~98 normal subjects ≥60 years were openly accessible
- None had all the required sequences, random subject retrieval, or statistical results
- More access, subjects, sequences, metadata, searchability, and results are needed
- These may improve understanding of normal brain ageing and diagnoses of dementia

## Introduction

Normal ageing and dementia are associated with brain tissue loss (atrophy) measured by magnetic resonance (MR) imaging [1-7]. The progressive economic and human

burden of dementia, and the likely limited effect of future treatments beyond the early clinical stages, necessitates earlier and more accurate diagnoses of pathological atrophy [8-10]. Better understanding of the effects of normal ageing on brain tissue, in visual or computational assessment tools, may afford earlier and more accurate diagnoses of dementia and other age-related neurological disorders [1]. The variation of brain tissue loss in normal subjects increases with advancing age [1; 4-5]. Thus one-off studies including relatively small numbers of subjects may not be reliable [11-13]. Indeed, these studies are in disagreement as to whether atrophy (of grey matter) is constant across adulthood [3], increased in old age [2] or slowed in old age [6]. Reports of correlations of normal brain volumes and cognitive measures are also inconsistent [14].

With large volumes of data, brain image databanks may facilitate a better understanding of the variation in structure of the normal ageing brain [11-13; 15-19] e.g. results from statistical analyses (such as correlation coefficients of brain volumes and age) can be stored and validated with analyses of further data. Image data should include a range of MR sequences, such as T1, T2, T2\*, and fluid attenuated inversion recovery (FLAIR), to effectively describe the features of normal brain ageing [20]. These databanks should support random or stratified random (i.e. random within a specified constraint such as age) image (subject) retrieval so as to remove manual selection bias in studies of ageing that use these subjects as controls.

Studies of ageing should also address the issue of what is "normal" [21]. Many older people without neurological disorder have clinical characteristics that may affect brain structure, such as hypertension, diabetes, arthritis, and medication use that may not be regarded as "normal" in younger populations [1; 21-27]. Therefore, these clinical characteristics should be considered as part of "effects of normal ageing" and subjects with them, if otherwise cognitively normal, should probably not be excluded from normal ageing brain image studies and databanks. Instead, it should be possible to say in which way subjects are normal and hence their inclusion and categorisation in normal ageing brain image studies and databanks should be supported by thorough cognitive and medical test results (metadata) [21]. This is particularly true if these subjects are to be used as controls in studies of dementia and related disorders where cognitive state greatly influences diagnoses [28-29].

It is apparent that brain image databanks have the potential to support studies of agerelated neurological disorders and better understanding of normal ageing brain

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structure [19]. A systematic review may determine if they have yet realised this potential and if not, what still needs to be done.

### Materials and methods

We used the Preferred Reporting Items for Systematic Reviews and Meta-Analyses (PRISMA) statement [30-31], a checklist for preparing clear and transparent accounts of systematic reviews [32], to prepare this report. Between October 2010 and October 2011 we searched the literature using PubMed (http://www.ncbi.nlm.nih.gov/ pubmed/) and the internet using Google (http://www.google.co.uk/) and Google Scholar (http://scholar.google.co.uk/) with the terms: "Magnetic Resonance Imaging" or "MRI" or "MR" and "brain" and "databank" or "database" or "data set" and "human". The internet search ended after two consecutive result pages provided no reference to brain image databanks. We supplemented the search by consulting the Biomedical Informatics Research Network (BIRN; http://www.birncommunity.org/ resources/data/), repositories of neuroimaging resources (http://neuinfo.org/; http://www.nitrc.org/) and reference lists in previous commentaries of brain image databanks [16-19]. We first read the abstracts and/or titles produced from the search to select publications potentially describing a human brain image databank. We included databanks described in these selected publications for review if they: (1) provided publicly accessible and downloadable brain images; (2) included people aged 60 years and over; (3) described some or all of their subjects as "normal"; (4) stored structural brain images of individual subjects, but not if they stored only brain atlases or templates, i.e. averaged or combined brain images from multiple subjects, without the underlying individual subjects' images. While the latter three criteria are self-explanatory, public accessibility allows the sharing of data and results derived from these data thereby may lead to better understanding of normal brain ageing [12; 19].

We sought from all available information about each databank its: (1) purpose; (2) number of subjects; (3) number of "normal" subjects aged  $\geq 60$  years; (4) criteria for normality; (5) MR image sequences; (6) subject retrieval parameters; and (7) results from statistical analyses (e.g. correlation coefficients, mean brain volumes by gender) on the data contained. We estimated missing values where possible, the bases for estimates are noted in the results tables. Finally, we interfaced with databanks and/or

consulted databank manuals and publications to determine how data were accessed and searched. We compiled tables summarising these results and composed individual descriptions of each databank.

#### Results

The literature search produced 591 publications and we found a further 31 items through internet and supplementary searches. Seven records were duplicates therefore the search produced 615 individual records. We screened these to identify 144 that potentially described a databank of human brain images. Based on criteria given in the methods section, we excluded 135 of these (fig 1). Particular records that did not meet inclusion criteria and the main reasons for exclusion, included:

- the Cardiovascular Health Study (CHS) database: as data were not accessible to investigators not associated with the CHS study [33]
- the AddNeuroMed Study database: as data were not yet publicly accessible [34-35]
- the BrainSCAPE database: as it was offline at the time of this study [36]
- the Whole Brain Atlas [37] and Neuroanatomical database of normal Japanese brains [38-39]: as images were not downloadable

the Allen Human Brain Atlas [40], NIH MRI Study of Normal Brain
 Development database [41-42], BrainWeb: Simulated MRI Volumes for Normal
 Brain Database [43-44], IMAGEN project [45], Morphometry BIRN database
 [46], and Surface Management System Database (SumsDB) [47-48]: as they did
 not include subjects aged 60 years and over

• the International Stroke Database [49], the Neuropsychiatric Imaging Research Laboratory (NIRL) Database [50], 1000 Functional Connectomes Project/ International Neuroimaging Data-sharing Initiative (INDI) database [51], Function BIRN Data Repository [52], and Brain Image Database (BRAID) [53-54]: as they did not describe any of their subjects as "normal"

• the BrainMap database [55-56], BRAINnet Database [57], Brede Database [58], and Internet Brain Volume Database (IBVD) [59]: as they did not contain structural brain images

• and the Montreal Neurological Institute (MNI) 152 atlas [60]: as it did not contain the underlying individual subjects' images.

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Summary of MR brain image databanks concerned with defining "normal" ageing brain structure

This left nine MR brain image databanks that met the criteria as follows (table 1). All nine of these databanks reported to include "normal" subjects aged 60 years and over. However, only five databanks, ADNI, fMRIDC, OASIS cross-sectional, OASIS longitudinal, and XNAT Central, included subjects representative of the normal ageing population according to cognitive and medical test results. Further, we could not find information on the total number of normal subjects aged  $\geq 60$  years and the criteria for normality for all subjects in the XNAT Central databank. Furthermore, many subjects were in more than one databank (fMRIDC, OASIS longitudinal, OASIS cross-sectional and XNAT Central databanks) [23-24]. Therefore in total, according to information we could find, there were approximately 336 different individual, representative normal subjects aged  $\geq 60$  years (from the ADNI, fMRIDC, and OASIS Cross-sectional databanks; table 2). The mean age of these 336 subjects was 75.78, standard deviation (SD) 6.49 years. Many of these subjects were not accessible without application; only 98 different individual, representative normal older subjects were openly accessible. The mean age of these openly accessible subjects was 75.92, SD 8.99 years.

Regardless of whether representative metadata were available or not and discounting subject overlap, the apparent total number of normal subjects aged  $\geq 60$  years (in the eight databanks where we could determine the number of subjects) was 937 with a mean of 118, SD 73 (range 15-222) subjects per databank. From the seven databanks where we could find or estimate age (table 2), the mean age of subjects aged  $\geq 60$  years was 72.31, SD 6.36 years.

All nine databanks had T1-weighted MR brain images, five (ADNI, AIBL, Designed Database of MR Brain Images of Healthy Volunteers, ICBM, and IXI) had T2-weighted images, four (ADNI, AIBL, ICBM, and IXI) had proton density (PD) images, one (AIBL) had fluid attenuated inversion recovery (FLAIR) images, and none had T2\*, or susceptibility-weighted (SWI) images.

Most databanks supported subject retrieval by demographics and scanning acquisition parameters. Three databanks (OASIS cross-sectional, OASIS longitudinal, and XNAT Central) supported subject retrieval by parameters derived from image analyses (such as brain volume and atrophy rating) and cognitive and medical test results. We found

no databank that supported random or stratified random (random within a specified constraint such as age) subject retrieval. Finally, no databank stored results from statistical analyses (e.g. correlation coefficients or mean brain volumes by gender) of the data it contained.

Purpose, subjects, criteria for normality, and subject retrieval parameters of each databank

#### ADNI databank

 The ADNI was setup to determine which combination of neuroimaging, cerebral spinal fluid (CSF), and blood biomarkers provides the earliest and most accurate diagnosis and expected course of Alzheimer's disease (AD). Housed at the Laboratory of Neuroimaging (LONI) Image Data Archive (IDA), the ADNI databank contained serial MR brain images, separated by 6-12 months over 2-3 years, from approximately 229 normal, 398 mild cognitive impairment (MCI), and 192 AD subjects aged 55-90 years (approximately 222 normal subjects were aged ≥60 years; table 2). Normal subjects may have had some medical problems common in ageing. The criteria for normality also included results from a battery of cognitive tests including the American National Adult Reading Test (ANART), Clinical Dementia Rating (CDR), and Mini Mental State Examination (MMSE), which were in the databank. Image analysis results were in the databank but we did not find statistical results. The LONI IDA supported subject retrieval by a range of clinico-demographic and scan acquisition parameters but not directly by cognitive test or image analysis results.

#### AIBL databank

The AIBL study was designed to understand the pathology and early clinical manifestation of AD, improve the diagnosis of AD, and identify diet and lifestyle factors that are significant in the development of AD. Also housed at the LONI IDA, the AIBL databank contained serial MR brain images acquired from 177 normal, 57 MCI, and 53 AD subjects aged 60-100 years. Although medical and cognitive test results were part of the criteria for normality, the normal subjects were not representative of the normal ageing population because they were preferentially selected based on their APOE genetic status [61].

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#### Designed Database of MR Brain Images of Healthy Volunteers

The Designed Database of MR Brain Images of Healthy Volunteers was created to assess the effects of healthy ageing on brain structure and provide references for the assessment of disease. It contained MR brain images from 100 normal subjects aged 18-72 years (15 subjects were aged  $\geq 60$  years; table 2). These subjects had "no history of diabetes, hypertension, head trauma, psychiatric disease, or other symptoms or history likely to affect the brain" therefore may not be representative of normal ageing. We did not find cognitive test results to be in the criteria for normality. Subject demographics age, gender, race, and handedness were in the database and these could be used to retrieve subjects from the database.

#### The fMRIDC

The fMRIDC was created to allow the functional magnetic resonance imaging (fMRI) research community to validate methods and hypotheses and perform meta-analyses of a large number of peer reviewed studies. It stored structural MR brain images as well as fMRI data from these studies. We did not have access to the overall composition of the databank, e.g. we could not determine the total number of subjects, but found 66 normal subjects aged ≥60 years. These subjects had no history of stroke, heart attack, or psychiatric disorder but had medical characteristics common in ageing, e.g. hypertension, arthritis. Fifty of these subjects were also in the OASIS and XNAT Central databanks. Subjects could be retrieved by study title, author, keywords, abstract, or "special collections" (selected novel datasets) but not directly by subject demographic, imaging or cognitive parameters.

#### IXI dataset

The IXI dataset was acquired to develop computer aided diagnostics of MR brain images. It contained MR brain images from 593 normal, healthy subjects aged 19-86 years (197 subjects were aged  $\geq 60$  years; table 2). We did not find the criteria for normality and medical and cognitive test results were not in the dataset. Subject demographics such as age, gender, weight, ethnicity, and qualification were in the dataset and these could be used to retrieve subjects from the dataset.

## ICBM databank

The ICBM study will develop a probabilistic atlas and reference system for the normal human brain throughout the lifespan [16]. The ICBM databank, also housed at the LONI IDA, had 851 normal subjects aged 18-90 years (approximately 76 subjects were aged  $\geq$ 60 years; table 2). The criteria for normality included results from several medical and cognitive tests such as the MMSE. As the criteria for normality were the same regardless of age, the older subjects may not have been representative of the normal ageing population, e.g. subjects with any prescription medications (with some exceptions such as antibiotics or non-steroidal anti-inflammatories) or hypertension were excluded regardless of age.

## OASIS: Cross-sectional MRI Data in Young, Middle Aged, Nondemented, and Demented Older Adults

The OASIS cross-sectional databank was created to provide the data needed, for example, for widespread study of ageing and dementia and to develop new MR brain image analysis techniques. It contained MR brain images from 316 normal and 100 demented subjects aged 18-96 years (98 normal subjects were aged ≥60 years; table 2), including older subjects with hypertension and treated diabetes. The criteria for normality also included MMSE score and CDR. The databank supported subject retrieval by a range of clinico-demographics, including cognitive test results (CDR and MMSE), scanning acquisition parameters and parameters derived from analyses of brain images: atlas scaling factor, estimated total intracranial volume, whole brain volume in estimated total intracranial volume.

## OASIS: Longitudinal MRI Data in Nondemented and Demented Older Adults

The OASIS longitudinal databank was created for reasons similar to the OASIS crosssectional databank. It contained serial MR brain images, acquired over two or more sessions and separated by at least 1 year, from 86 normal (14 of which later converted to dementia) and 64 demented subjects aged 60-96 years. Many of the older subjects in the OASIS cross-sectional databank were also in this longitudinal databank but were assigned new subject identifiers. The criteria for normality and subject retrieval parameters were the same as in the OASIS cross-sectional databank.

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### The Extensible Neuroimaging Archive Toolkit (XNAT) Central

The XNAT Central databank was designed to allow secure and quality controlled data (medical image and metadata) sharing among local colleagues, external collaborators, and the broader neuroscience community. It contained over 3000 subjects from approximately 200 medical imaging studies, including the OASIS data. Additional to the OASIS subjects we found 9 subjects (with brain images) aged  $\geq$ 60 years however these subjects were not normal (they appeared to have brain tumours). We did not have access to the remaining subjects or criteria for normality. Subjects could be retrieved by the parameters in the OASIS cross-sectional databank among others, including medical test results and regional brain volumes.

#### Discussion

We systematically reviewed published MR brain image databanks with structural brain images of "normal" older people (aged  $\geq 60$  years). Amongst nine databanks that met the inclusion criteria, concerned with defining "normal" ageing brain structure, there appeared to be 937 normal subjects aged 60 years and over. However, after adjusting for the many subjects that were in more than one databank and those that did not have metadata (cognitive and medical test results) representative of the normal ageing population there were 336 normal subjects aged 60 years and over, only 98 of which were openly accessible. The high variation in structure of the normal ageing brain [1; 4-5] and inconsistency of causal inferences [2-3; 6; 14] indicates that this number of subjects (most of which were not openly accessible) is too few to effectively characterise this variation.

The criteria for normality in many of these databanks may not have represented the clinical characteristics of normal ageing. For example, the Designed Database of MR Brain Images of Healthy Volunteers and ICBM criteria for normality were the same across the lifespan [21; 62] thus may not have been representative of the normal ageing population's clinical characteristics such as the increasing proportion with prescription medications and hypertension. When a population has a mean of approximately 3 prescriptions and approximately 50% have medically diagnosed hypertension [1; 21-25], it would be reasonable to conclude that subjects with these characteristics are at least equally "normal" to subjects without and both should be included in normal ageing brain image databanks. This is particularly true when

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 considering that these subjects may be used as controls for study groups, e.g. dementia patients, that have similar clinical characteristics [23]. Therefore, criteria for normality should represent common characteristics in populations of interest. MR brain image databanks with representative normal older subjects have led to many publications: over 200 publications from the ADNI databank and the OASIS cross-sectional databank has been cited by over 100 publications [63-64]. However, these databanks provided a limited range of image sequences [65]; the openly accessible images from representative normal older subjects were only T1-weighted [24]. To support better understanding of normal ageing brain structure, databanks should include, for example, T2\* and FLAIR images as well as the commonly used T1 and T2 images [20; 24; 65].

Almost all databanks supported image (subject) retrieval by demographic and scanning acquisition parameters but few (OASIS and XNAT Central) supported subject retrieval directly by medical and cognitive test results and parameters derived from image analyses. Therefore, it may be difficult to match or differentiate databank subjects (to study groups) on all desired parameters, e.g. age, intelligence, MMSE, head size, blood pressure, when using them as controls. Moreover, no databank supported random subject retrieval therefore manual selection bias and errors may occur in studies that use these subjects as controls.

Further to storing subjects, databanks that store results from statistical analyses of normal brain images and metadata may facilitate better understanding of normal ageing brain structure [1; 11-13; 19] e.g. results from statistical analyses (such as correlation coefficients) can be stored, tested, and validated with analyses of further data. However, we found no databank that had these results. Although not yet included, the ICBM databank plans to include probabilistic atlases of the variation of normal brain structure throughout the whole adult lifespan [16]. These atlases will be generated from a considerable sample (N=7000). However, according to a recent progress report of this work [21], the number of older subjects (aged  $\geq$ 60 years) to be included in these atlases will be limited (estimated 581, from subject proportions in the progress report, if the 7000 subject target is reached). The Internet Brain Volume Database (IBVD) [59], excluded from our review as it did not contain structural brain images, contained brain volumes from different studies with different parameters and criteria for normality hence may not effectively describe normal ageing brain structure variation. Therefore, there is a current lack of easily accessible statistical results and

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atlases (from representative normal ageing subjects) that may facilitate better understanding of normal ageing brain structure and the required earlier and more accurate diagnoses of dementia and related disorders [1; 9]. To have such a great effect, e.g. so as to be used in large clinical trials, these results and atlases should be openly accessible in a brain image databank [19].

The strengths of this study include use of established systematic review criteria, exhaustive search of printed and online materials, and structured evaluation of databanks according to prespecified criteria. The study limitations include difficulty in searching for databanks and our search process, although we used multiple overlapping techniques, may not have found every databank with structural brain images from "normal" older subjects. In particular, we were not able to comment on databanks not publicly available. Further, we used available publications, user guides, and fact sheets and interfaced with databanks when possible. However, we may not have found all relevant information so may, inadvertently, not have justly described the databanks we did find, for which we apologise. Notwithstanding these limitations, we have considered all of the leading published brain image databanks [19], and others not previously reviewed, that are concerned with the variation in structure of the "normal" ageing brain.

According to our review, brain image databanks with normal older subjects have the potential to facilitate better understanding of normal ageing brain structure. This understanding is ever more important as cases of age-related neurological disorders grow with the average life expectancy that is now on average in the 9<sup>th</sup> decade for western countries. However, the total number of openly accessible subjects representative of the normal ageing population's clinical characteristics (approximately 98 different individual subjects aged  $\geq 60$  years) in existing brain image databanks is too limited at present to inform the true variation in normal ageing brain structure. Databanks should include subjects thoroughly tested to show no cognitive or other debilitating disorder but with clinical characteristics that are common in ageing, e.g. prescription medications, diabetes, hypertension and arthritis [1; 21-27]. As long as these characteristics are carefully documented and searchable, this will allow others to draw controls appropriate for their study group and/or representative of the wider population. To avoid bias and errors in brain imaging studies that use these subjects as controls, databanks should support random and stratified random subject retrieval. Multiple image sequences, including the T2, T2\*,

FLAIR, as well as T1-weighted sequences that are routinely used in diagnosis, are required to define the structure of the normal and abnormal ageing brain. Finally, statistical analyses results and atlases defining normal ageing brain structure variation should be included in databanks to provide a reference for others to test. With further data and analyses these results and atlases will be validated or evolve to facilitate better understanding of normal ageing brain structure. In turn, this understanding may lead to earlier and more accurate diagnoses of disorders such as dementia and facilitate clinical trials of new treatments.

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Uploaded in a separate file at the end for blinded peer review.

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Table 1. MR brain image databanks concerned with defining "normal" ageing brain structure.

Name [references]

- 1. The Alzheimer's Disease Neuroimaging Initiative (ADNI) databank [65-70]
- 2. Australian Imaging Biomarkers & Lifestyle Flagship Study of Ageing (AIBL) databank [22; 61; 69-70]
- 3. Designed Database of MR Brain Images of Healthy Volunteers [62; 71]
- 4. The fMRI Data Center [fMRIDC; 72; 73]

- 5. Information eXtraction from Images (IXI) dataset [74-76]
- 6. International Consortium for Brain Mapping (ICBM) databank [16; 21; 69-70]
- 7. Open Access Structural Imaging Series (OASIS): Cross-sectional MRI Data in Young, Middle Aged, Nondemented, and Demented Older Adults [24; 77]
- OASIS: Longitudinal MRI Data in Nondemented and Demented Older Adults [23; 77]
- 9. The Extensible Neuroimaging Archive Toolkit (XNAT) Central [78-79]

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-	No. of	"normal"	' subjects		Age range; mean,	Representative cognitive	
Name	60-69	70-79	$\geq 80$ years	(Total)	SD in years <sup>a</sup>	and medical test results <sup>b</sup>	Accessibility
ADNI databank	40	131	51	(222) <sup>c</sup>	60-90; 75.8, 5.0	Yes	By application
AIBL databank	85	69	23	$(177)^{d}$	60-100; 70.0, 7.0	No	By application
Designed Databank of MR Brain Images of Healthy Volunteers	14	1	0	(15)	60-72; 64.9, 3.1	No	Open
The fMRIDC	•	$\mathbf{O}$		$(66)^{\rm e}$	60-93; 75.6, 6.7 <sup>f</sup>	Yes	By application
IXI dataset	129	58	10	(197)	60-86; 68.1, 6.0	No	Open
ICBM databank	47	19	10	(76) <sup>g</sup>	60-90; ., .	No	By application
OASIS Cross-sectional databank	25	35	38	(98) <sup>e</sup>	60-94; 75.9, 9.0	Yes	Open
OASIS Longitudinal databank	23	35	28	(86) <sup>e</sup>	60-93; 75.8, 8.2	Yes	Open
XNAT Central	•			(.) <sup>e</sup>	60-94 <sup>h</sup> ; ., .	Yes	Open/ by application <sup>i</sup>

Note: .=missing value; <sup>a</sup>This column shows the age range; mean, and standard deviation (SD) of "normal" subjects aged ≥60 years; <sup>b</sup>This shows whether or not we found cognitive and medical test results, representative of the normal ageing population, in the databank/ criteria for normality; <sup>c</sup>Estimated from total enrolment by age group multiplied by proportion of normal subjects in the databank (0.28; http://www.adni-info.org/Pdfs/ADNI\_Enroll\_Demographics.pdf); <sup>d</sup>Estimated from age frequency distribution graph [22]; <sup>e</sup>Many of these subjects were part of the fMRIDC, OASIS Cross-sectional, OASIS Longitudinal and XNAT Central databanks [23-24]; <sup>f</sup>Estimated from ages and sample sizes in original studies [27; 80]; <sup>g</sup>Estimated from exclusion by age group graph [21]; <sup>h</sup>This is the age range according to information that we could find; <sup>i</sup>Accessibility was data dependent.

Fig. 1 PRISMA flow diagram of systematic review phases





