

## NIH Public Access

Author Manuscript

*Neuroimage*. Author manuscript; available in PMC 2014 January 15.

Published in final edited form as:

Neuroimage. 2013 January 15; 65: 176-193. doi:10.1016/j.neuroimage.2012.10.008.

# Variation in longitudinal trajectories of regional brain volumes of healthy men and women (ages 10 to 85 years) measured with atlas-based parcellation of MRI

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#### Abstract

Numerous cross-sectional MRI studies have characterized age-related differences in regional brain volumes that differ with structure and tissue type. The extent to which cross-sectional assumptions about change are accurate depictions of actual longitudinal measurement remains controversial. Even longitudinal studies can be limited by the age range of participants, sex distribution of the samples, and scan intervals. To address these issues, we calculated trajectories of regional brain volume changes from T1-weighted (SPGR) MRI data, quantified with our automated, unsupervised SRI24 atlas-based registration and parcellation method. Longitudinal MRIs were acquired at 3T in 17 boys and 12 girls, age 10 to 14 years, and 41 men and 41 women, age 20 to 85 years at first scan. Application of a regression-based correction factor permitted merging of data acquired at 3T field strength with data acquired at 1.5T from additional subjects, thereby expanding the sample to a total of 55 men and 67 women, ages 20 to 85 years at first scan. Adjustment for individual supratentorial intracranial volume removed regional volume differences between men and women due to sex-related differences in head size. Individual trajectories were computed from data collected on 2 to 6 MRIs at a single field strength over a ~1 to 8 year interval. Using the linear mixed-effects model, the pattern of trajectories over age indicated: rises in ventricular and Sylvian fissure volumes, with older individuals showing faster increases than younger ones; declines in selective cortical volumes with faster tissue shrinkage in older than younger individuals; little effect of aging on volume of the corpus callosum; more rapid expansion of CSF-filled spaces in men than women after age 60 years; and evidence for continued growth in central white matter through early adulthood with accelerated decline in senescence greater in men than women.

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No author of this manuscript has any conflicts of interest with this work, either financial or otherwise.

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#### Keywords

longitudinal; MRI; brain; field strength; atlas-based parcellation; image registration; SRI24 atlas

#### Introduction

Numerous cross-sectional MRI studies have characterized age-related differences in regional brain volumes that differ with structure and tissue type. In general, these brain imaging studies are consistent in reporting larger cerebrospinal fluid (CSF) filled volumes (ventricles and sulci), smaller brain tissue volumes, more prominent in cortical and allocortical gray matter than in centrum semiovale or corpus callosum white matter, and thinner cortices (e.g., Blatter et al., 1995; Courchesne et al., 2000; Good et al., 2001; Jernigan et al., 2001; Pfefferbaum et al., 1994; Raz et al., 2004a; Sowell et al., 2007; Sullivan et al., 2004; Walhovd et al., 2011); (reviewed by Raz and Kennedy, 2009; but see Burgmans et al., 2009). Age-related shrinkage of selective subcortical structures is controversial (e.g., Jack et al., 2000; Jernigan et al., 2001; Luft et al., 1999; Raz et al., 2003; Sullivan et al., 2005; Sullivan et al., 2004). One of the largest cross-sectional samples analyzed 1143 healthy men and women, age 18 to 94 years, from seven imaging centers and measured cortical thickness and regional volumes acquired on different 1.5T MRI systems and measured with a single method (FreeSurfer) (Fjell et al., 2009b). This analysis revealed small but significant sex differences in white matter, CSF, and the pallidum, suggesting more rapid age effects in older men than women; however, caution is required for data based on the pallidum measure because it was the least reliable of those used (Pfefferbaum et al., 2012). The extent to which cross-sectional assumptions about change reflect true longitudinal measurement, however, remains controversial (cf., Lindenberger et al., 2011; Rabbitt, 2011; Raz and Lindenberger, 2011; Salthouse, 2011). Statistical modeling has identified notable shortcomings in making longitudinal inferences about change from cross-sectional data, even in instances where cross-sectional measures correlate well with longitudinal change (e.g., Lindenberger et al., 2011).

Longitudinal studies are better suited to address conflicts emerging from cross-sectional investigation (cf., Lindenberger et al., 2011; Weiner et al., 2012). Such studies report ventricular enlargement or brain tissue volume decline detectable over one year (Adalsteinsson et al., 2000; Fjell et al., 2009a) to several years (e.g., Cook et al., 2004; Marcus et al., 2010; Pfefferbaum et al., 1998; Raji et al., 2009; Raz et al., 2005; Resnick et al., 2003; Rusinek et al., 2003; Scahill et al., 2003; Sullivan et al., 2010; Sullivan et al., 2004; Taki et al., 2011b; Tang et al., 2001), with the longest follow-up to date being 10 years (Driscoll et al., 2009). Brain regional volumes commonly identified as exhibiting the greatest aging effects are prefrontal cortex, medial temporal lobe structures, and lateral ventricles. As with cross-sectional studies, these longitudinal studies provide only inconsistent evidence for sex differences in rates of change. The series of analyses by Raz and colleagues on trajectories of local volume decline in striatum (Raz et al., 2003), entorhinal cortex, hippocampus (Raz et al., 2004b; Rodrigue and Raz, 2004), and cerebellum (Raz et al., 2005) culminated in an analysis comparing rates of change in these and other brain structures, examined three times on a 1.5T MRI system over a 30-month interval in 40 participants, age 49 to 85 years, and subjected to manual delineation of target brain structures (Raz et al., 2010). Adjusted for variation in intracranial volume, areas especially vulnerable to aging were the lateral prefrontal cortex, prefrontal white matter, hippocampus, putamen, and cerebellar hemispheres; the least affected were the primary visual cortex, corpus callosum, and ventral pons; the only sex difference reported was for the pons, where women showed greater shrinkage than men. Another study of 3 measurements over 4 years in 92 men and women, age 59 to 85 years, revealed widespread white matter volume decline

with local gray matter volume decline, which was most prominent in inferior and orbital frontal, inferior parietal, insular and cingulate cortices, and ventricular enlargement with little evidence for sex differences in rates of change (Resnick et al., 2003). A 6-year longitudinal study in 381 community-dwelling men and women, age 28 to 89 years, reported greater annual declines in gray matter-to-intracranial volume ratios in older men and women relative to younger women (Taki et al., 2011a).

Cross-sectional developmental studies focused on adolescence have revealed a curvilinear function of cortical gray matter with an increase from birth to about 10 years of age followed by a continuous decline through adulthood to old age (Blanton et al., 2001; Carne et al., 2006; Courchesne et al., 2000; Giedd et al., 1996; for reviews Giedd et al., 2010; Gogtay et al., 2004; e.g., Jernigan et al., 2001; Lange et al., 1997; Lu et al., 2007; Pfefferbaum et al., 1994; Raz and Rodrigue, 2006; Reiss et al., 1996; Sowell et al., 2007; Sowell et al., 2002; Stiles and Jernigan, 2010; Tisserand et al., 2002). Longitudinal studies are consistent with this depiction of regional brain volumetric change when regional brain volumes obtained over time are expressed as individual trajectories (Giedd et al., 1996; Raznahan et al., 2011b; Shaw et al., 2008). These analyses characterized heterochronicity in trajectories by brain region and sex (Brain Development Cooperative Group, 2012; Giedd et al., 1999; Lenroot et al., 2007; Raznahan et al., 2011a; Raznahan et al., 2011b; Shaw et al., 2008; Sowell et al., 2004). Brains of boys can be 10% larger than those of girls (Dekaban and Sadowsky, 1978; Goldstein et al., 2001), but growth starts and ends earlier in girls than boys, peaking at 10.5 years in girls compared with 14.5 years in boys and declining thereafter in both (Lenroot et al., 2007).

MRI studies report that the neocortex follows a curvilinear trajectory (Gogtay et al., 2004; Lenroot et al., 2007; Shaw et al., 2008), whereas allocortex and medial temporal structures follow a linear path (Gogtay et al., 2004). Growth is earlier in anterior than posterior cortical regions in both sexes (Shaw et al., 2008). Examination of regional cortical thickness over 2year intervals revealed continued gray matter thinning of cortical language areas associated with vocabulary scores and probably language development (Sowell et al., 2004). The largest longitudinal study of brain development examined 647 individuals, age 3 to 30 years over approximately 2-year intervals (Raznahan et al., 2011b). Developmental trajectories for regional cortical volumes and surface area analysis revealed curvilinear growth and sexual dimorphism varying by cortical, allocortical, and subcortical tissue structures and developmental stage (also see Raznahan et al., 2010; Raznahan et al., 2011a). Recently, we reported that longitudinal MRI assessment using robust, atlas-based parcellation methods was sufficiently sensitive to identify regional brain changes over a ~6-month interval in boys and girls in early adolescence. Supratentorial and CSF volumes increased, while cortical gray matter volumes declined in anterior (lateral and medial frontal, anterior cingulate, precuneus, and parietal) but not posterior (occipital, calcarine) cortical regions, whereas subcortical structures did not show consistent changes (Sullivan et al., 2011).

Despite power to detect change, longitudinal studies can be limited by the age range of participants recruited for examination. For example, some studies focus on healthy seniors (age 60 years and older), who had served as the comparison group for age-related dementing disorders, or use data taken from publicly available data sources, such as the Alzheimer's Disease Neuroimaging Initiative (ADNI) (e.g., Fjell et al., 2009a; Weiner et al., 2012). Restricting the age range of subjects to the elderly for the purpose of detecting and modeling the effects of aging, however, can potentially introduce a bias in modeling brain structural changes, especially in structures with developmental changes best described by higher-order rather than linear functions. Even longitudinal studies that use restricted age ranges comprise both the obvious longitudinal component, which provides a metric of rate and trajectory of change, and a cross-sectional component, which is related to the age at initial observation.

The cross-sectional component can affect the levels of dependent measures and may exert cohort effects (cf., Schaie and Hofer, 2001). These cross-sectional influences have been characterized as the "selection-maturation interaction" (Nesselroade, 1986), where "selection" refers to the age at study entry and "maturation" refers to the ages over which an individual was studied and the course of maturation over that period. According to Schaie and Hoffer (Schaie and Hofer, 2001), this interaction can be measured and even accounted for by examining multiple, parallel samples. Analysis of simple slopes of the longitudinal component describing change per individual does not fully address the cross-sectional component, which can potentially affect the initial level of trajectories. Thus, we assert that a statistical model incorporating both components should be employed to analyze data collected in the typical mixed longitudinal design.

Most studies of normal aging have been conducted at 1.5T field strength (e.g., Fjell et al., 2009b; Raz et al., 2010; Weiner et al., 2012). Studies at higher field strength, typically 3T and based on smaller samples, are now emerging (e.g., Sullivan et al., 2011). Recognizing the worth to longitudinal studies of merging data collected at different field strengths, a growing number of studies have attempted to combine data across MRI systems, typically 1.5T and 3T field strengths (Goodro et al., 2011; Han et al., 2006; Jovicich et al., 2009; Keihaninejad et al., 2010). To do so requires adjustment to minimize regional susceptibility to field effects that differentially influence tissue signal and border conspicuity (e.g., Bammer et al., 2007; Boss et al., 2007; Fushimi et al., 2007; Stankiewicz et al., 2011; Zhu et al., 2011). Recently, we showed that application of a regression-based linear correction function derived from 3T data and applied to 1.5T data on regional brain volumes determined from our SRI24 atlas-based registration and parcellation method (Rohlfing et al., 2010) significantly improved correspondence between volumes and enabled T1-weighted MRI data at both field strengths to be combined into a single analysis (Pfefferbaum et al., 2012).

The aims of the present study were to measure longitudinal changes in regional brain volumes in terms of trajectories over the full adult to senescent age range. Given the wide age range in combining longitudinal data collected over a 1 to 8 year interval in adults whose initial MRI age varied from 20 to 85 years, our analysis used a linear mixed-effects model, designed to handle mixed cross-sectional and longitudinal data. The adult data comprised MRI collected at 1.5T and at 3T field strengths; inclusion of these two independent adult samples provided some protection against the selection-maturation interaction (cf., Schaie and Hofer, 2001). A combined segmentation and atlas-based parcellation approach (Rohlfing et al., 2010) using a sequential registration approach preferable for longitudinal analysis (Sullivan et al., 2011) was used for MRI quantification, thereby enabling direct comparison of trajectory differences across different brain tissue types, structures, and regions. Inclusion of men and women also allowed testing of potential sex differences in these brain regional trajectories of volume growth and decline. To test whether and how the addition of adolescent developmental data modified the adult trajectories of regional volume changes, we conducted another set of trajectory analyses based on the adult MRI data plus adolescent MRI data collected on a 3T system from our previous study (Sullivan et al., 2011).

#### Methods

#### Subjects

The data reported herein were drawn from ongoing longitudinal studies of brain structure in alcoholism, HIV infection, and normal aging. The subjects in the current analysis were included because they had at least two MRIs at the same field strength and were deemed normal controls after thorough psychiatric and medical interview, as previously described

(e.g., Pfefferbaum et al., 2012; Pfefferbaum et al., 2007; Pfefferbaum et al., 2006; Rosenbloom et al., 2007; Sullivan et al., 2011). In short, clinical psychologists and research nurses administered the Structured Clinical Interview for DSM-IV (First et al., 1998) to confirm that prospective controls did not meet DSM-IV criteria for any Axis I disorder. Quantity of lifetime alcohol consumption and date of last drink were obtained by interview (Pfefferbaum et al., 1992; Skinner, 1982; Skinner and Sheu, 1982). All participants were screened by medical history questionnaire for chronic conditions that might affect brain structure, including uncontrolled hypertension and diabetes at study entry. Blood pressure recordings were also obtained from a subgroup of participants and did not identify any subject as having hypertension on the day of testing. In retrospective review, one participant was being treated with oral hypoglycemic medication for type II diabetes at study entry. All subjects had provided written informed consent or assent, depending on age, to participate in these studies, which were approved by the Institutional Review Boards of Stanford University and SRI International.

**Adult group**—Healthy adults with two or more 3T MRI data sets included 41 men, age 22 to 80 years at initial MRI, and 41 women, age 20 to 85 years at initial MRI. An additional 14 men and 26 women, all serving as control adults in ongoing studies, had undergone two to four MRIs at 1.5T field strength; their average age at first MRI was  $49.3\pm14.1$  years (range=20 to 72 years) for a total adult sample of 122 (55 men and 67 women). The mean  $\pm$ SD age and range at each MRI at each field strength is presented in Table 1.

Men and women were of similar education and socioeconomic status. Most were righthanded, had above average estimated intelligence, and were relatively low consumers of alcohol (Table 1). Most participants, and nearly all age 40 or older (35/36 men and 36/43 women), completed the Dementia Rating Scale (DRS) (Mattis, 2004) at one or more MRI sessions and achieved scores ranging between 132 and 144 (dementia cut-off 124). The 8 subjects without a DRS were the following: 41 and 57 year-old women, both scientists in our laboratory; a 68 year old woman who achieved a score of 30 out of 30 on the Mini-Mental State Examination (MMSE) (Folstein et al., 1975); a 79 year old woman who achieved a 29 on the MMSE; a 66 year old man, laboratory personnel; and 3 women who performed in the normal range on a variety of other cognitive tests.

Adolescent group—Data for all but one adolescent boy were presented in Sullivan et al. (Sullivan et al., 2011) and were included here to extend the age range and MRI per subject of available longitudinal 3T MRI data. The current data set with two MRIs included 17 boys and 12 girls, age 10 to 14 years; 12 boys and 6 girls had three MRIs, data not previously published (Table 1). As previously described (Sullivan et al., 2011), at their initial and follow-up visits, parents and their children were interviewed by a research psychologist or other trained researcher using a structured interview (Kiddie Schedule for Affective Disorders, K-SADS) to assess current and lifetime history of psychiatric disorders (Kaufman et al., 1997). Using the probe questions of K-SADS-PL, the interviewer questioned each participant about age at first regular use of alcohol or drug and recency and frequency of use for each substance. No participant endorsed regular use of alcohol or any substance at baseline or follow-up. One parent of each child was also interviewed at each session and confirmed, without knowledge of the child's report, a negative history of regular alcohol and drug use. No further information on alcohol or drug misuse was obtained because there were no endorsements of gate (i.e., probe) questions. Other exclusionary criteria were history of loss of consciousness > 30 minutes or central nervous system diseases. Parents provided information to determine socioeconomic status (Hollingshead, 1975). Intelligence quotient (IQ) of each adolescent was measured with the Peabody Picture Vocabulary Test (Dunn and Dunn, 1997).

#### **MRI** acquisition

**1.5T acquisition**—This set of MRI data was collected on a GE 1.5T Signa Twin wholebody system with a quadrature head coil (General Electric Healthcare, Waukesha, WI). Two coronal structural sequences were used for the analysis: a SPoiled Gradient Recalled (SPGR) echo sequence (TR=25 ms, TE=5 ms, flip angle=30, matrix=256×192, thick=2 mm, skip=0 mm, 94 slices) and a dual-echo fast spin echo (FSE) sequence (TR=7500 ms, TE1/2=13.5/108.3 ms, matrix = 256×192, thick=4 mm, skip=0 mm, 47 slices).

**3T acquisition**—This set of MR data was collected on a GE 3T Signa whole-body system with an 8-channel phased-array head coil. Data were derived from T1-weighted Inversion-Recovery Prepared SPGR images (TR=7 ms, TE=2.2 ms, TI=300 ms, matrix =  $256 \times 256$ , thick=1.25 mm, skip=0 mm, 124 slices) and dual-echo FSE images (TR=8583 ms, TE1/2=13.5/108.3 ms, matrix =  $256 \times 192$ , thick=2.5 mm, skip=0 mm, 62 slices).

#### SRI24 atlas-based parcellation

For both 1.5T and 3T data, all acquired structural images were first corrected for intensity inhomogeneity by applying a second-order polynomial multiplicative bias field computed via entropy minimization (Likar et al., 2001). The late-echo FSE image was corrected using the bias field computed from the corresponding early-echo image to maintain the ratio of early- and late-echo values at each pixel, which keeps quantities derived from this ratio (e.g., T2) invariant. For each subject and each session, the bias-corrected early-echo FSE image was then registered to the bias-corrected SPGR image using intensity-based nonrigid image registration (Rohlfing and Maurer, 2003) (http://nitrc.org/projects/cmtk). The SPGR, early-echo FSE, and late-echo FSE images were each skull stripped using FSL's Brain Extraction Tool, BET (Smith, 2002). The early-echo and late-echo brain masks were reformatted into SPGR image space and combined with the SPGR-derived brain mask via label voting (Rohlfing and Maurer, 2005) to form the final SPGR brain mask.

The SRI24 atlas (Rohlfing et al., 2010) (http://nitrc.org/projects/sri24) was used as the template for parcellating all subject brain images into regional volumes for region-of-interest-based analysis. The SRI24 atlas was created from multi-spectral images of 24 subjects, all aligned via template-free groupwise nonrigid image registration. Structural parcellation maps were either transferred from other atlases (e.g., Colin27) via nonrigid registration and manually corrected, or outlined directly in the atlas, which is possible due to the clear definition of anatomical structures in the SRI24 template image as a result of the nonrigid atlas construction procedure. For a complete description of the atlas construction and its validation, the interested reader is referred to the published description of the atlas (Rohlfing et al., 2010).

For each subject, the baseline skull-stripped SPGR images were registered to the SPGR channel of the SRI24 atlas (Rohlfing et al., 2010) via nonrigid image registration (Rohlfing and Maurer, 2003). Cortical and subcortical parcellation maps for all subjects at baseline MRI were obtained by reformatting label maps defined in SRI24 space directly into SPGR image spaces using the subject-to-atlas coordinate transformations. Each follow-up MRI was nonrigidly registered to the baseline MRI for the same subject, and label maps were reformatted via concatenation of the follow-up-to-baseline transformation with the baseline-to-atlas transformation, thus producing longitudinally-consistent parcellations (Sullivan et al., 2011).

All bias-corrected and skull-stripped SPGR images were segmented into three tissue compartments (gray matter, white matter, CSF) using FSL's FAST tool (Zhang et al., 2001). As tissue priors to both initialize and guide the classification, we used the tissue probability

maps provided with the SRI24 atlas, reformatted into subject SPGR space via the same transformations described above for the atlas-based parcellation.

**SRI24 regression-based correction function (RCF)**—To compensate for across field-strength measurement discrepancies, we applied our previously derived linear regression-based correction function (RCF) for each region (Pfefferbaum et al., 2012). For each of the 23 regional volumes, the linear fit of 3T on 1.5T volume was computed and the slope and intercept were used to transform 1.5T volumes.

 $Volume3T_{RCF} = (Volume3T - intercept)/slope$ 

#### **Regions of interest**

The SRI24 analysis used 23 regions of interest (Figure 1), including cortical, allocortical, and subcortical gray matter regions, white matter structures, and CSF-filled spaces, as described in our prior work (Pfefferbaum et al., 2011; Pfefferbaum et al., 2006). For each subject and MRI session, gray matter volume was computed for each cortical and allocortical region, and tissue volume (gray plus white matter) was computed for each subcortical region. Also measured were CSF-filled volumes of the lateral ventricles, third ventricle, and Sylvian fissures as well as supratentorial volume.

#### **Statistical analysis**

The first, and larger, set of analyses was based on the adult data only; the second set of analyses combined the adolescent and adult data to test the influence of adolescent brain development on regional brain volume trajectories and trajectory modeling.

Trajectories of individual subjects were calculated using a linear mixed-effects (lme) model implemented in the statistical package, R [http://www.r-project.org/], and based on the approach described by Laird and Ware (Laird and Ware, 1982). The lme model also allowed for testing of nested random effects; for the current analysis, the effects of age and MRI field strength were tested first and the n the effects of age and sex were tested. To describe the effects of age, linear and higher-order functions (age+age<sup>2</sup> [quadratic], and age+age<sup>2</sup>+age<sup>3</sup> [cubic]) were entered to identify the best overall fit of the trajectories of each regional brain volume. In all analyses if the  $age^3$  term was significant (p<.05), the cubic model was accepted. If the age<sup>3</sup> term was not significant, the age<sup>2</sup> term was similarly tested and the quadratic model accepted if significant. If the age<sup>2</sup> term was not significant, the linear model was accepted. To examine longitudinal trajectories of volume change independent of age at data acquisition, we computed the trajectory slopes of each subject for each brain region with the subject's age at acquisition entered into the model as the deviation from the mean age of the multiple MRIs available for each individual subject, which we refer to as "agecentered" (Rogosa et al., 1982). Further, a general linear model (glm) tested crosssectional differences in regional volumes between men and women as a function of age using only the data from the initial observation, as would be the case in a simple single observation cross-sectional study. Finally, for the adult-only analysis, we used the lme model to test for age-by-individual trajectory-by-sex interactions for each regional volume. Only the last set of lme analyses that we present combined the adolescent and adult MRI data.

#### Results

#### Combining 1.5T vs. 3T MRI data

As noted above, to combine the data across field strengths, each regional volume at 1.5T was transformed using the regression-based correction factor (RCF) (Pfefferbaum et al., 2012). Following application of this procedure, a simple linear regression of each regional volume on supratentorial volume (SVOL) provided headsize-residualized values for each subject. Next, an lme analysis was conducted using age and field strength as predictors for each SVOL-corrected regional volume on the combined 1.5T and 3T data to test for age-by-field strength interactions. Of the 23 regional volumes, only one measure had a field strength-by-age interaction (t(195)=1.9848, p=.0380), which did not survive correction for multiple comparisons (family-wise Bonferroni correction for 23 regions with  $\alpha = .05$  required p .002). Thus, all subsequent analyses on the adult group used the combined 1.5T and 3T data, comprising 122 subjects.

#### Supratentorial volume (SVOL) sex differences

For all 23 regions, men had larger age-residualized volumes than women (t(120)=2.370 to 8.247, p=.0194 to <.00001). Given the known difference between men and women in intracranial volumes, an analysis examined sex differences in regional volumes (across all observations at all times) before and after SVOL correction after controlling for age using a glm. First, we tested the homogeneity-of-slopes assumption; no region met correction for multiple comparisons with either Bonferroni correction or the false discovery rate (FDR) approach. After SVOL correction, sex differences (men > women) remained for three regions, precentral cortex (p=.022), putamen (p=.0118), and pallidum (p=.0373), which did not survive correction for multiple comparisons, and were small (approximately  $\pm 0.2$  SD). Thus, all subsequent analyses were conducted with SVOL-corrected data.

#### Effect of age on rate of regional volume change

Lme analyses used age as the predictor for each SVOL-corrected regional volume across all subjects. Of the 23 regions, 4 were best fit with a linear model, 10 with a quadratic model, and 9 with a cubic model (Table 2, Figure 2 black regression lines). The fit of each of the three CSF measures indicated accelerated increases in volume with increasing age (quadratic or cubic fit). All but two tissue measures (caudate and corpus callosum) decreased in volume with age (linear, quadratic, or cubic fit).

#### Mean volume and individual longitudinal trajectories of change with aging

Our study design combined longitudinal data collected over a ~1 to 8 year interval in adults whose initial MRI age varied from 20 to 85 years. Thus, the results in Table 2 could be due to cross-sectional differences across individuals, individual trajectories, or a combination of both factors. To examine individual longitudinal trajectories of volume change independent of age at data acquisition, we computed the trajectory slopes of each subject for each brain region with age centered on the mean age of the multiple MRIs available for each individual trajectories independent of age. To correct for multiple comparisons, we used FDR, with  $\alpha$ =. 05. Volumes of the three CSF regions increased across subjects with mean age, and volumes of all tissue regions except the caudate, amygdala, and corpus callosum decreased with mean age. Age-by-volume trajectory interactions were identified in 17 regional changes, consistent with the quadratic or cubic fit noted in the above analysis conducted without centering age (Table 3).

#### Effect of age and sex on rate of regional volume change

Next, lme analyses with age as the predictor of each regional volume were conducted separately for men and women (Figure 2 regression lines, blue for men and red for women). In general, as with the combined data, ventricular and sulcal volumes increased and tissue volumes decreased with aging for each sex (Table 2). As is evident from the figures, regions suggesting age-by-sex interactions were the lateral ventricles, Sylvian fissure, hippocampus, and corpus callosum.

### Sex differences in mean volume and individual longitudinal trajectories of change with aging

To test whether sex and age interacted, as suggested in Figure 2, an lme analysis used 3 factors (mean age by centered age-by-centered age by sex) as predictors of regional volume:

[result=lme(volume~agemean\*agecentered+agecentered\*sex, random=~1|subject)]

Results of interest were the effects of sex (regardless of age) and the interaction of centered age by sex (Table 4). None of the sex effects on regional tissue volume met FDR-corrected significance thresholds, a result consistent with the adequacy of the SVOL correction. By contrast, for the three CSF measures, the volumes of the men had steeper trajectories than those of the women, especially after age 60 years. The volumes of the putamen and pallidum also survived FDR correction, but the sex-by-volume trajectory interactions could be explained by the fact that the fits for the men and women crossed each other (Figure 2d). What appeared to be sex-by-trajectory interactions for the hippocampus and corpus callosum in Figure 2 were not supported by individual-trajectory line analysis.

#### Sex differences in trajectories of regional brain systems

We conducted a series of ANOVAs to test for sex differences in age-independent individual trajectories of each of five, anatomically-related categories of regional brain volume. Descriptive statistics (Figure 3 and Table 5), ANOVA results, and followup Scheffé test results appear in Table 5.

For <u>CSF measures</u>, a 2 group (men, women)-by-3 CSF region ANOVA yielded significant effects of sex and region but not an interaction. In both groups the lateral ventricles expanded faster than the Sylvian fissures, which in turn expanded faster than the third ventricle.

The <u>neocortical tissue regions</u> did not show a sex effect or sex-by-region interaction but did show a region effect. For men and women, the lateral and medial frontal cortices lost volume faster than the calcarine cortex.

The <u>allocortical tissue regions</u> showed a modest sex effect, large regional effect, but no interaction. For the men and the women, volume decline was faster in the anterior than posterior cingulate cortex; for the women, the volume decline of the precuneus was also faster than that of the posterior cingulate cortex.

The <u>subcortical tissue structures</u> had neither a sex effect nor sex-by-region interaction, although the region effect was significant. Followup Scheffé tests, however, indicated only that volume decline of the hippocampus was greater than that of the thalamus in men.

For the <u>white matter tissue measures</u>, a sex-by-region effect was described by a volume decline in centrum semiovale and a volume increase in the corpus callosum in the men. The women did not exhibit detectable volume shrinkage in these white matter structures.

#### Sex differences in individual trajectory slopes over age

We next tested the adult sample for three-way interactions in those regions that had shown a significant age effect. A model for determining whether there were sex differences in how individual trajectory slopes change over age entailed entering for each observation for each individual as predictors of the volume of a region 1) an individual's average age across observations ("agemean"), 2) an individual trajectory term (the deviation from the individual's age mean at each observation, "agecentered"), and 3) sex. Significant agemean-by-agecentered-by-sex interactions for volumes of the lateral ventricles and Sylvian fissures (older men increasing more rapidly than older women) and for centrum semiovale volume, which exhibited some minimal growth in the 20 to 40 year age range and more rapid decline in the later years for the men. Additionally, more rapid decline was seen in men relative to women in the later years in the anterior cingulate, parietal, and precentral cortices and the thalamus (p = .0156 to .00019, FDR-corrected).

#### Cross-sectional vs. longitudinal measurement of age-related brain volumes

To emphasize the value of the lme trajectory model using longitudinal data, a similar analysis used only initial observations in a cross-sectional glm analysis of age-related differences in regional volumes. The glm analyses yielded a similar pattern of age differences as observed with the lme conducted on longitudinal data for CSF volumes, which were better fit with a polynomial than linear model. Principal differences between cross-sectional and longitudinal results affected the cortical measures, which were better fit by a quadratic or cubic function with longitudinal data but by a linear function with cross-sectional data (Table 6).

A glm analysis of the cross-sectional data with the linear, quadratic, or cubic age function and sex as predictors of each regional volume was conducted to test for age-by-sex interactions. Whereas the lme individual longitudinal trajectory analysis identified 5 regions exhibiting sex differences meeting FDR correction, none of the cross-sectional (glm) comparisons identified any significant age-by-sex interactions (Table 6).

#### Longitudinal measurement of brain volumes in adolescents and adults

Having described regional brain volume trajectories across the adult age span, we introduced our previously reported volume measures obtained in young adolescents, age 10 to 13 at study entry, who had undergone the same MRI protocol on the same 3T system (Sullivan et al., 2011) used in the 3T adult sample. Inclusion of the adolescent data allowed combined modeling of brain changes that might reflect both developmental and senescent changes. Accordingly, lme analysis of the combined adolescent and adult group yielded similar fits with evidence of growth in the centrum semiovale and rapid volume regression in several cortical regions (e.g., frontal, parietal, temporal, and precuneus) from adolescence to early adulthood (Figure 4 and Table 7).

#### Discussion

Longitudinal tracking of volume change in brain structures with advancing age revealed several different patterns of trajectories related to region, tissue type, rate of change, and sex. The corpus callosum was the only structure not showing a consistent volume change with age. CSF volume trajectories all showed accelerated increases with age that were best fit by quadratic models for the third ventricle and Sylvian fissures and by a cubic model for the lateral ventricles. Declines in tissue volume of the precentral and postcentral cortices and putamen were best described by linear models; thus, although these structures lost volume with aging, there was no evidence of accelerated decline in older relative to younger individuals. In contrast to these linearly declining volumes, trajectories of the temporal,

calcarine, and occipital cortices and four subcortical structures (thalamus, caudate, pallidum, and amygdala) were best modeled by quadratic fits, indicative of accelerated changes in older age, notable after age 60 years, and present in men and women.

Regional volume changes best described by cubic functions were the lateral and medial frontal, parietal, anterior and posterior cingulate cortices, insula, and precuneus. The double inflection suggested two points of accelerated change, the first near age 30 years and the second after age 60 years. This pattern is consistent with a large postmortem study, reporting greater gray matter than white matter shrinkage from age 20 to 50 years, followed by greater white matter shrinkage in very old age (Miller et al., 1980). The older-age trajectory inflections were salient for the lateral ventricles and hippocampus. Trajectories of the hippocampus showed accelerating volume decline after age 60 years (Fjell, et al., 2010). That analysis modeled the effect of the starting age on the shape of the aging trajectory. By shifting the starting point to an older age at initial analysis point, the trajectory of volume decline became steeper. Our two hippocampal aging trajectories were similar whether the starting age was 10 or 20 years and, therefore, likely provide a minimally biased representation of local volume acceleration.

Comparison of the slopes of individuals' trajectories revealed a pattern of regions especially vulnerable to aging and showing faster rates of change relative to other regions showing slower declines. The CSF volumes showed a step-wise effect in their sensitivity to aging: lateral ventricles > Sylvian fissures > third ventricle. The pattern in the cortex revealed more rapid declines with aging in the lateral and medial frontal volumes than temporal, calcarine, or occipital volumes, a pattern consistent with other cross-sectional and longitudinal reports. The allocortex showed a similar anteroposterior pattern as the neocortex, where volume decline was steeper in the anterior than posterior cingulate cortices. The most salient aging difference in subcortical structures occurred in the men, whose hippocampal aging slope was steeper than their thalamic slope. Only the white matter structural comparison, however, vielded a region-by-sex interaction, indicating that decline in volume of the centrum semiovale was faster in men than women and faster than that in the corpus callosum, which actually showed no significant decline with age in either sex. We note a potential limitation of our centrum semiovale measure. Specifically, we did not measure white matter hyperintensities (WMHIs) because we focused on SPGR results, which are not particularly sensitive to detection of WMHIs. Thus, WMHIs, indicative of compromised tissue (e.g., DeCarli et al., 2005; Raz et al., 2012; Schmidt et al., 1993), may have been included in the white matter skeleton of the centrum semiovale.

As noted by Fjell et al. (Fjell et al., 2010), description of aging effects across a large age range can be substantially influenced by the age at observation and requires appropriate statistical testing of a model that includes both secular (i.e., cohort) and individual trajectories. Our use of the model to test for interactions involving age at observation, individual trajectories, and sex demonstrated more rapid increase in lateral ventricles and Sylvian fissures and more rapid decline in the centrum semiovale in older men than women.

Although cross-sectional analysis largely comported with the longitudinal analysis in description of presumed age-related volume increases in CSF and decreases in tissue, longitudinal analysis detected regional sex differences in volume declines not detected with the cross-sectional analysis. In particular, for the three CSF measures, the volumes of the men had steeper (longitudinal) trajectories than those of the women, especially after age 60 years, patterns not detected cross-sectionally.

Our last set of analyses included longitudinal MRI data collected in young adolescents, thereby extending the age range down to 10 years. Inclusion of these data in longitudinal trajectory modeling yielded the same fits as observed in the adult-only analyses in most brain regions but refined them by providing evidence of development as well as senescent change in other regions. Specifically, seven regional trajectories were better fit with a higher-order function when the adolescent data were added to the adult data, including four posterior cortical volumes (postcentral, temporal, calcarine, and occipital cortices), two subcortical volumes (thalamus and putamen), and the corpus callosum. Considering the patterns of all 23 regions, the trajectories identified continued volume growth in the centrum semiovale concurrent with rapid volume regression in several cortical regions, notably the frontal, parietal, temporal, and precuneus, from adolescence to early adulthood. The volume growth in white matter volumes has been shown to occur with normal expansion of brain size and to be a significant determinant of ultimate intracranial volume (cf., Pfefferbaum et al., 1994), possibly reflecting increasing complexity in connectivity with functional (e.g., Vogel et al., 2010) and structural (e.g., Brain Development Cooperative Group, 2012; Giedd et al., 2010; Sowell et al., 2007) development. The white matter expansion during development, including continued myelination (Yakovlev and Lecours, 1967), occurs contemporaneously with regressive processes in the cortex, which is presumed to be undergoing pruning of neurons (Chugani et al., 1987; Feinberg, 1983; Huttenlocher, 1990; Huttenlocher et al., 1982; Johnston et al., 2009) lacking connectivity, speculatively because of lack of environmental or interoceptive need or stimulation (cf., Iglesias et al., 2005). Ideally, the gap between age 15 and 20 years should be filled for a complete model. Nonetheless, the developmental trajectories observed suggest a pattern of continuity of growth of white matter through early adulthood along with decline of cortical volume, especially in frontal regions to age 30 years, followed by a shallow slope until later adulthood, described by a second dip in cortical volume shrinkage around age 60 years (cf., Brain Development Cooperative Group, 2012; Giedd et al., 2010; Sowell et al., 2007). Perhaps these two points mark the end of developmental and start of senescent changes in brain, a depiction consistent with the pattern observed in postmortem analyses of age-related differences in brain weights and gray matter-to-white matter ratios (Dekaban and Sadowsky, 1978; Miller et al., 1980). As speculated by Raz and colleagues (Raz et al., 2005), senescent decline in brain tissue volume results from a confluence of degenerative processes, including shrinkage of neurons, arborization, processes, and intralaminar myelin, collectively considered age-related neurodegeneration and, like neurodevelopment, exhibits heterochronicity of regional brain structural loss.

Application of the regression-based correction function (RCF) to combine data across field strengths (Pfefferbaum et al., 2012) enabled inclusion of data from our 1.5T cohort and our 3T cohort. Using that approach, we showed that brain regions having the greatest correspondence between RCF-corrected data were cortical, allocortical, and subcortical structures and CSF-filled spaces. The globus pallidus showed the lowest correspondence, probably because of its high iron content and field-dependent effect on signal intensity (cf., Bartzokis et al., 2007; Haacke et al., 2005; Hallgren and Sourander, 1958; Pfefferbaum et al., 2010) and may have influenced the striatal trajectories measured in our current analysis.

Using the SRI24 atlas-based parcellation approach for quantification and our regressionbased correction approach to combine data at 1.5T and 3T field strengths, only two regions had substandard ICCs of volumes across field strengths: globus pallidus (ICC corrected=. 599) and the postcentral cortex (ICC corrected=.764). As previously noted (Table 1, Pfefferbaum et al., 2012), all other corrected ICCs were greater than .847 [.81 is considered "substantial" (Landis and Koch, 1977)]. Longitudinal studies with cross-sectional study entry ages spanning many decades, as conducted herein, have the benefit of tracking the trajectory of development and senescence of a given brain region for each individual separately as well as describing the trajectory of the group. Because the start points of the trajectories differ widely by age, such studies also carry a significant cross-sectional factor and the liability of cohort effects related to age at study entry, that is, the selection-maturation interaction (Nesselroade, 1986). A large-scale, retrospective postmortem study by Miller and Corsellis (Miller and Corsellis, 1977) noted significant secular effects over ~100 years in 20 to 50 year old men and women, born from the late 1800s onwards and autopsied from the early 1900s onward. Over the century, brain weights were greater in men and women, suggestive of cohort effects from environmental factors, for example, nutrition, stress, and infection. Inclusion of multiple samples with unmatched study entry ages has a potential advantage of mitigating possible cohort effects (Schaie and Hofer, 2001). To the extent that 1.5T data were typically acquired earlier in a study than 3T data because of the later introduction of the higher field strength systems to human clinical research, merging of field strength data can contribute to reduction of cohort effects.

In summary, we present a longitudinal study of regional brain volume development and regression, spanning young adolescence to older adulthood, that describes heterochronicity in trajectories by brain region and sex with statistical consideration of cross-sectional effects of age at observation.

#### Acknowledgments

This work was supported by NIH grants AA017347, AA005965, AA012388, AA010723, AA017168, AG017919, EB008381. All in-house image analysis software is available from http://nitrc.org/projects/cmtk/. The SRI24 atlas is available from http://nitrc.org/projects/sri24/. The authors wish to thank David R. Rogosa, Ph.D. for invaluable instruction on interpretation of longitudinal, lme analysis and understanding of R output, and Alex McMillan, Ph.D. for helpful instruction in programming and plotting in R.

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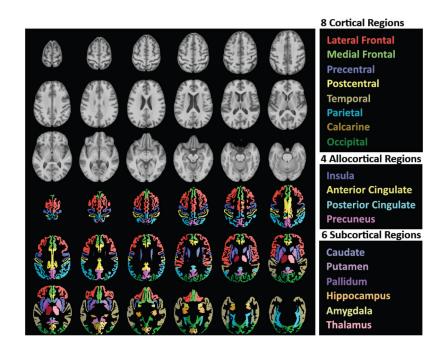
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#### Figure 1.

Top three rows of gray-tone figures: Axial slices from superior to inferior (top left to bottom right) of T1-weighted SRI24 atlas template image. Bottom three rows of color figures: The same axial slices with selected, color-coded parcellated structures delineated in the SRI24 atlas.

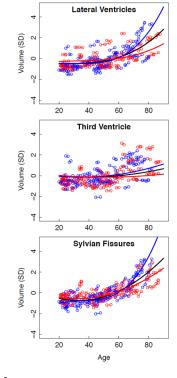
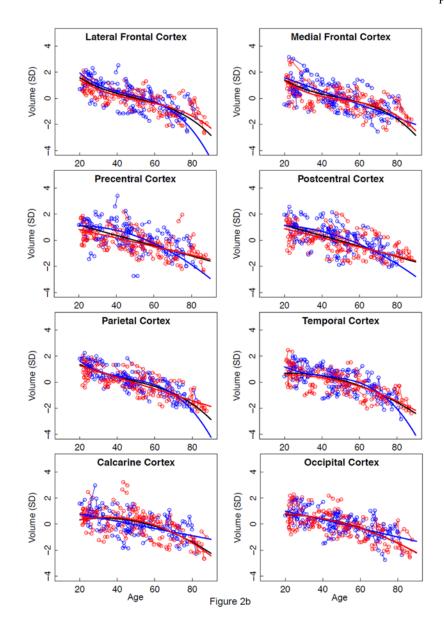


Fig. 2a



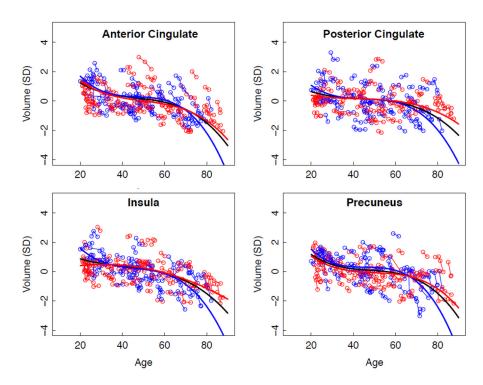


Fig. 2c

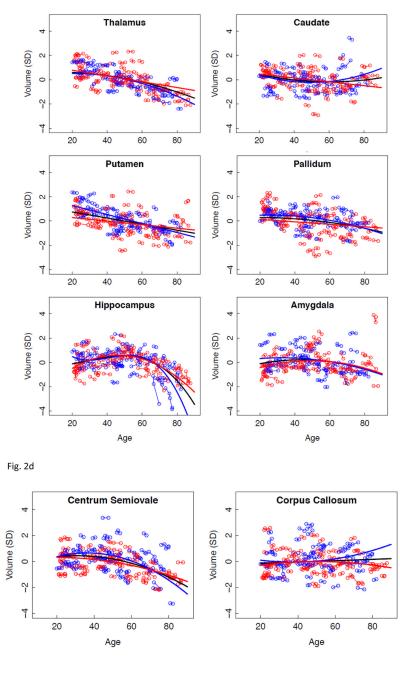
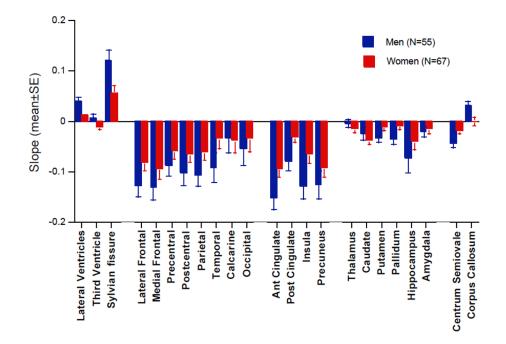


Fig. 2e

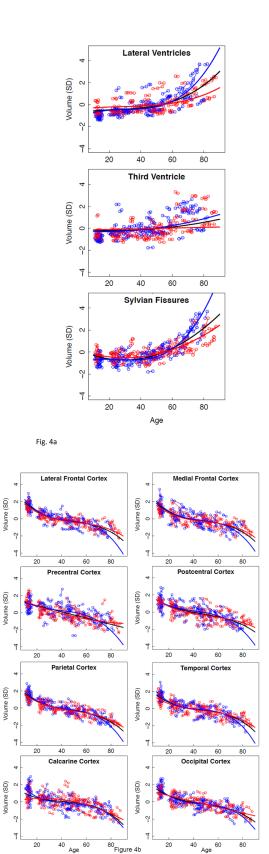
#### Figure 2.

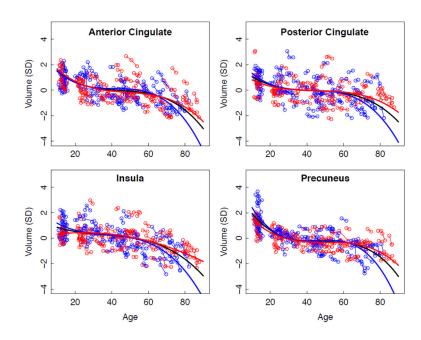
**a–e.** Volumes, expressed as standardized residuals (Z-score) or standard deviations (SD), after correction for supratentorial volume (SVOL) of regional brain structures of individual men (blue) and women (red) and best-fit functions over age for each sex. The black fit is the combined group, irrespective of sex.



#### Figure 3.

Mean  $\pm$  standard error (SE) of age-centered trajectory slopes of each of the 23 brain measures for the adults. Men had significantly greater slopes of the three CSF-filled structures. See Table 5 for statistical results.







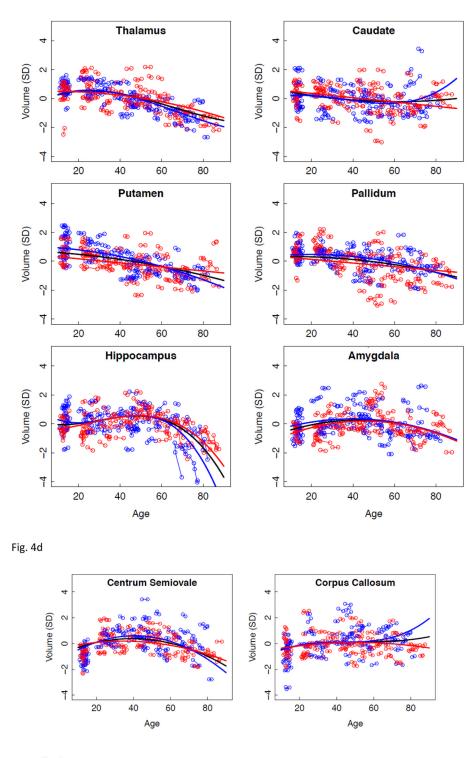


Fig. 4e

#### Figure 4.

**a–e.** Volumes, expressed as standardized residuals (Z-score) or standard deviations (SD), after correction for supratentorial volume (SVOL) of regional brain structures of the adult plus adolescent samples, with boys and men (blue) and girls and women (red) and best-fit functions over age for each sex. The black fit is the combined group, irrespective of sex.

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Table 1

Demographic information for men and women at initial MRI (mean±SD and N)  $% \left( M_{\mathrm{SD}}^{\mathrm{A}}\right) =0$ 

|                            |            | 3     | 3.0T  | 1     | 1.5T  | 1.5T  | 1.5T + 3.0T |
|----------------------------|------------|-------|-------|-------|-------|-------|-------------|
|                            |            | Men   | Women | Men   | Women | Men   | Women       |
| Age at 1st MRI             | mean =     | 47.9  | 45.2  | 43.6  | 52.4  | 46.8  | 48.0        |
|                            | SD=        | 16.0  | 21.3  | 16.9  | 11.5  | 13.1  | 18.4        |
|                            | range=     | 22-80 | 20-85 | 20–71 | 29–72 | 20-80 | 20-85       |
|                            | <b>N</b> = | 41    | 41    | 14    | 26    | 55    | 67          |
| Age at 2nd MRI             | mean=      | 49.6  | 47.0  | 45.1  | 54    | 48.5  | 49.7        |
|                            | SD=        | 16.0  | 21.5  | 17.1  | 11.7  | 16.2  | 18.6        |
|                            | range=     | 24-82 | 21-87 | 20–73 | 29–74 | 20-82 | 21-87       |
|                            | <b>N</b> = | 41    | 41    | 14    | 26    | 55    | 67          |
| Age at 3rd MRI             | mean =     | 53.6  | 46.8  | 41.8  | 55.8  | 50.7  | 49.3        |
|                            | SD=        | 15.7  | 25.5  | 19.0  | 15.3  | 17.0  | 23.2        |
|                            | range=     | 26-78 | 21–86 | 22–74 | 33–74 | 22–78 | 21-86       |
|                            | <b>N</b> = | 18    | 16    | 9     | 9     | 24    | 22          |
| Age at 4th MRI             | mean=      | 56.2  | 43.5  | 45.6  | 54.2  | 55.3  | 46.2        |
|                            | SD=        | 18.3  | 26.5  | I     | 18.3  | 17.7  | 24.4        |
|                            | range=     | 26–79 | 23-83 | 45    | 54-72 | 26-79 | 23-83       |
|                            | <b>N</b> = | 10    | 6     | 1     | 5     | 11    | 12          |
| Age at 5th MRI             | mean=      | 67.2  | 50.8  | I     | I     | 67.2  | 50.8        |
|                            | SD=        | 13.1  | 30.5  |       |       | 13.1  | 30.5        |
|                            | range=     | 47–79 | 29–72 |       |       | 47–79 | 29–72       |
|                            | <b>N</b> = | 9     | 2     |       |       | 9     | 2           |
| Education (years)          | mean=      | 16.1  | 16.4  | 14.8  | 16.5  | 15.8  | 16.5        |
|                            | SD=        | 2.3   | 2.2   | 2.5   | 2.5   | 2.4   | 2.3         |
|                            | <b>N</b> = | 41    | 41    | 14    | 26    | 55    | 67          |
| Socioeconomic Status (SES) | mean=      | 25.3  | 25    | 34.7  | 22.2  | 27.6  | 24.0        |
|                            | SD=        | 11.1  | 9.7   | 14.4  | 10.4  | 12.5  | 9.6         |
|                            | <b>N</b> = | 41    | 41    | 13    | 23    | 54    | 64          |
| Handedness                 | mean=      | 20.7  | 21.5  | 23.6  | 19.2  | 21.6  | 20.5        |
|                            | SD=        | 6.9   | 9.3   | 13.3  | 10.6  | 9.1   | 9.8         |
|                            |            |       |       |       |       |       |             |

|  |              | 3         | 3.0T          |            | 1.5T      | 1.5T       | 1.5T + 3.0T |
|--|--------------|-----------|---------------|------------|-----------|------------|-------------|
|  |              | Men       | Women         | Men        | Women     | Men        | Women       |
|  | N =          | 35        | 33            | 14         | 24        | 49         | 57          |
| Body Mass Index (BMI)  | mean=        | 26.0      | 24            | 26.8       | 23.8      | 26.2       | 23.9        |
|  | SD=          | 3.7       | 7.5           | 4.8        | 5.1       | 3.9        | 6.7         |
|  | =<br>Z       | 40        | 41            | 11         | 22        | 51         | 63          |
| Estimated IQ   | mean=        | 114.5     | 117           | 108.3      | 113.3     | 112.4      | 115.0       |
|  | SD=          | 9.5       | 6.8           | 4.6        | 7.1       | 8.6        | 7.1         |
|  | <b>N</b> =   | 26        | 23            | 13         | 26        | 39         | 49          |
| Dementia Rating Scale (DRS) Total  | mean =       | 139.8     | 141.0         | 139.8      | 141.8     | 139.8      | 141.4       |
|  | SD=          | 2.6       | 2.1           | 1.6        | 1.9       | 2.3        | 2           |
|  | = <b>Z</b>   | 32        | 24            | 13         | 21        | 45         | 45          |
| Lifetime alcohol consumption (kg)  | mean=        | 54.9      | 15.3          | 111.3      | 141.8     | 6.79       | 14.8        |
|  | SD=          | 92.0      | 14.9          | 146.4      | 1.9       | 107.5      | 15.7        |
|  | =<br>Z       | 30        | 23            | 6          | 21        | 39         | 30          |
| Smoker   | yes/no       | 14/27     | 11/29         | 9/5        | 2/24      | 19/36      | 14/53       |
| SD=standard deviation; N=immber of subjects  | lbjects      |           |               |            |           |            |             |
| SES: Low scores reflect higher SES   |              |           |               |            |           |            |             |
| Handedness: right handedness=14-32; left handedness=50-70 (Crovitz and Zener, 1962)                        | eft handedne | ss=50-70  | ) (Crovitz ar | ıd Zener,  | 1962)     |            |             |
| Estimated IQ: mean of NART-IQ and ANART-IQ where available Peabody Picture Vocabulary Test for adolescents | NART-IQ w    | here avai | ilable Peabo  | dy Picture | vocabular | y Test for | adolescents |
|  |              |           |               |            |           |            |             |

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Table 2

Best fit tests of SVOL-corrected volume trajectories over age for all adults and for men and women separately

|                                   | Men      | <b>Men + Women (N = 122)</b> | N = 122)       |         | Men (N=55) | =55)           | м        | Women (N=67) | V=67)          |
|-----------------------------------|----------|------------------------------|----------------|---------|------------|----------------|----------|--------------|----------------|
| Region                            | t        | p FDR                        | best curve fit | t       | d          | best curve fit | t        | d            | best curve fit |
| Lateral Ventricles                | 2.7431   | .0067 *                      | cubic          | 4.5855  | .0000      | cubic          | 3.8816   | .0002        | cubic          |
| Third Ventricle                   | 3.6671   | .0003 *                      | quadratic      | 3.0743  | .0028      | quadratic      | 2.0040   | .0477        | quadratic      |
| Sylvian Fissures                  | 8.5119   | * 0000.                      | quadratic      | 3.5217  | .000       | cubic          | 5.5151   | 0000.        | quadratic      |
| Lateral Frontal Cortex            | -2.9798  | .0032 *                      | cubic          | -2.9786 | .0037      | cubic          | -2.6285  | 6600.        | cubic          |
| Medial Frontal Cortex             | -3.1146  | .0021 *                      | cubic          | -7.8071 | 0000.      | linear         | -3.2953  | .0014        | cubic          |
| Precentral Cortex                 | -9.7764  | * 0000.                      | linear         | -2.4915 | .0145      | quadratic      | -7.0530  | 0000.        | linear         |
| <b>Postcentral Cortex</b>         | -10.2411 | * 0000.                      | linear         | -2.0633 | .0418      | quadratic      | -7.2801  | 0000.        | linear         |
| Parietal Cortex                   | -2.6816  | * 0800                       | cubic          | -2.9171 | .0044      | cubic          | -11.3402 | 0000.        | linear         |
| Temporal Cortex                   | -4.0235  | .0001 *                      | quadratic      | -2.1303 | .0358      | cubic          | -2.7343  | .0074        | quadratic      |
| Calearine Cortex                  | -4. 1049 | .0001 *                      | quadratic      | -4.6237 | 0000.      | linear         | -3.9319  | .0002        | quadratic      |
| Occipital Cortex                  | -3.0871  | .0023 *                      | quadratic      | -6.8023 | 0000.      | linear         | -2.1498  | .0340        | quadratic      |
| Anterior Cingulate Cortex         | -3. 5027 | * 9000 <sup>.</sup>          | cubic          | -3,5546 | 9000.      | cubic          | -3.4712  | .0008        | cubic          |
| <b>Posterior Cingulate Cortex</b> | -3. 3641 | * 6000.                      | cubic          | -3.7995 | .0003      | cubic          | -2.1729  | .0322        | cubic          |
| Insula                            | -2.2715  | .0242 *                      | cubic          | -3.4538 | .0008      | cubic          | -2.9966  | .0034        | quadratic      |
| Precuneus                         | -4.1290  | .0001 *                      | cubic          | -3.7769 | .0003      | cubic          | -3.5054  | .000         | cubic          |
| Thalamus                          | -3.9032  | .0001 *                      | quadratic      | -3.8136 | .0002      | quadratic      | -6.6825  | 0000.        | linear         |
| Caudate                           | 3.3824   | $\neq_*$ 6000.               | quadratic      | 3.6849  | .0004      | quadratic      | -4.0224  | .000         | linear         |
| Putamen                           | -8.3422  | * 0000.                      | linear         | -9.0948 | 0000.      | linear         | -3.6402  | .0004        | linear         |
| Pallidum                          | -2.1328  | .0342 *                      | quadratic      | -2.3375 | .0215      | quadratic      | -2.1071  | .0376        | linear         |
| Hippocampus                       | -2.7292  | * 6900.                      | cubic          | -3.8513 | .0002      | cubic          | -7.6729  | 0000.        | quadratic      |
| Amygdala                          | -4.5450  | * 0000                       | quadratic      | -2.1767 | .0320      | quadratic      | -4.0451  | .000         | quadratic      |
| <b>Centrum Semiovale</b>          | -7.5763  | * 0000.                      | quadratic      | -6.9309 | 0000       | quadratic      | -4.0268  | .0001        | quadratic      |
| Corpus Callosum                   | -1.3681  | .1728 *                      | linear         | 2.7776  | .0066      | quadratic      | -2.7536  | .0070        | quadratic      |

\* FDR= false discovery rate, p=.05  $*_{1}^{*}$  lower-order term in unexpected direction

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Table 3

ANOVA results for age-centered volumes of longitudinal trajectories

|                            | Volui | Volume at Mean Ages Effect | ges Ellect | Age-by-Vol | Age-by-Volume Trajectory Interaction | ry Interaction |
|----------------------------|-------|----------------------------|------------|------------|--------------------------------------|----------------|
| Region                     | df    | t                          | p FDR      | df         | t                                    | p FDR          |
| Lateral Ventricles         | 120   | 8.95848                    | * 00000.   | 197        | 9.91037                              | * 00000.       |
| Third Ventricle            | 120   | 6.79041                    | * 00000.   | 197        | 2.87763                              | .00445 *       |
| Sylvian Fissures           | 120   | 11.05846                   | * 00000.   | 197        | 9.04335                              | * 00000.       |
| Lateral Frontal Cortex     | 120   | -11.84789                  | * 00000.   | 197        | -2.31901                             | .02142         |
| Medial Frontal Cortex      | 120   | -8.66803                   | * 00000.   | 197        | -2.5453                              | .01168         |
| Precentral Cortex          | 120   | -7.01242                   | * 00000.   | 197        | -1.74149                             | .08316         |
| Postcentral Cortex         | 120   | -7.49142                   | * 00000.   | 197        | -2.13276                             | .03418         |
| Parietal Cortex            | 120   | -13.55924                  | * 00000.   | 197        | -3.57912                             | .00043 *       |
| Temporal Cortex            | 120   | -11.04099                  | * 00000.   | 197        | -4.52385                             | .00001 *       |
| Calcarine Cortex           | 120   | -7.31196                   | * 00000.   | 197        | -4.41283                             | .00002 *       |
| Occipital Cortex           | 120   | -10.95272                  | * 00000.   | 197        | -3.55935                             | .00047 *       |
| Anterior Cingulate Cortex  | 120   | -5.38524                   | * 00000.   | 197        | -3.87876                             | .00014 *       |
| Posterior Cingulate Cortex | 120   | -2.83808                   | .00533 *   | 197        | -4.15135                             | .00005 *       |
| Insula                     | 120   | -6.54018                   | * 00000.   | 197        | -4.68928                             | .00001 *       |
| Precuneus                  | 120   | -5.29627                   | * 00000.   | 197        | -3.8016                              | .00019 *       |
| Thalamus                   | 120   | -10.29237                  | * 00000.   | 197        | -3.34852                             | * 76000.       |
| Caudate                    | 120   | -0.69196                   | .49030     | 197        | 2.88059                              | .00441 *       |
| Putamen                    | 120   | -7.27889                   | * 00000.   | 197        | -2.29159                             | .02299         |
| Pallidum                   | 120   | -5.07171                   | * 00000.   | 197        | -3.02313                             | .00283 *       |
| Hippocampus                | 120   | -3.39159                   | .00094 *   | 197        | -7.72059                             | * 00000.       |
| Amygdala                   | 120   | -0.82663                   | .41009     | 197        | -4.41392                             | .00002 *       |
| Centrum Semiovale          | 120   | -4.44389                   | .00002 *   | 197        | -6.99384                             | * 00000.       |
| Corpus Callosum            | 120   | -1.02166                   | .30900     | 197        | 0.99337                              | .32175         |

Neuroimage. Author manuscript; available in PMC 2014 January 15.

FDR= false discovery rate, p=.05

df=degrees of freedom

Table 4

Mean volume and individual longitudinal trajectories of change with aging

|                                   |     | Volume by Sex | <b>Jex</b> | Sex-by-Volu | Sex-by-Volume Trajectory Interaction | Interaction |
|-----------------------------------|-----|---------------|------------|-------------|--------------------------------------|-------------|
| Region                            | df  | t             | d          | df          | t                                    | p FDR       |
| Lateral Ventricles                | 119 | .18681        | .85213     | 196         | 4.87353                              | * 00000.    |
| Third Ventricle                   | 119 | 1.04153       | .29974     | 196         | 2.71853                              | .00715 *    |
| Sylvian Fissures                  | 119 | 45161         | .65237     | 196         | 2.77317                              | * 60900.    |
| Lateral Frontal Cortex            | 119 | 1.17353       | .24293     | 196         | -1.72042                             | .08693      |
| Medial Frontal Cortex             | 119 | 1.15046       | .25226     | 196         | 53250                                | .59498      |
| <b>Precentral Cortex</b>          | 119 | 2.13919       | .03446     | 196         | -2.27100                             | .02423      |
| Postcentral Cortex                | 119 | 1.88726       | .06156     | 196         | 91249                                | .36263      |
| Parietal Cortex                   | 119 | 1.04615       | .29761     | 196         | 88131                                | .37923      |
| Temporal Cortex                   | 119 | 1.72495       | .08713     | 196         | 85534                                | .39341      |
| Calcarine Cortex                  | 119 | 29213         | 69077.     | 196         | .21652                               | .82881      |
| Occipital Cortex                  | 119 | .51869        | .60494     | 196         | 19775                                | .84345      |
| Anterior Cingulate Cortex         | 119 | .89011        | .37520     | 196         | -1.34662                             | .17966      |
| <b>Posterior Cingulate Cortex</b> | 119 | 14245         | .88697     | 196         | -2.31795                             | .02148      |
| Insula                            | 119 | 11253         | .91060     | 196         | -2.15853                             | .03210      |
| Precuneus                         | 119 | 1.10390       | .27186     | 196         | 56495                                | .57275      |
| Thalamus                          | 119 | -1.18492      | .23841     | 196         | 28430                                | .77648      |
| Caudate                           | 119 | 62883         | .53066     | 196         | 2.33919                              | .02033      |
| Putamen                           | 119 | 2.27087       | .02495     | 196         | -2.93261                             | .00376 *    |
| Pallidum                          | 119 | 2.12342       | .03579     | 196         | -3.20705                             | .00157 *    |
| Hippocampus                       | 119 | .35188        | .72555     | 196         | 96833                                | .33407      |
| Amygdala                          | 119 | 1.34833       | .18011     | 196         | 81389                                | .41669      |
| <b>Centrum Semiovale</b>          | 119 | 1.96098       | .05222     | 196         | -1.53888                             | .12545      |
| <b>Corpus Callosum</b>            | 119 | 1.27063       | .20634     | 196         | 2.13521                              | .03399      |

Neuroimage. Author manuscript; available in PMC 2014 January 15.

\* FDR= false discovery rate, p=.05

Table 5

Age-centered trajectories (slopes) of the 23 ROIs for men and women: Mean, SD, SE, ANOVAs, t-test p-values for sex differences and ANOVAs across ROIs within sex

|                                   | Me    | Men (N = 55) | 6     | Won   | Women (N = 67) | ()    | AVUVA                                       | t-tests: M v F | Within-Sex A    | WILLING SEA ALVOVA ACTOSS NOLS (SCHELE) |
|-----------------------------------|-------|--------------|-------|-------|----------------|-------|---|----------------|-----------------|---|
| ROI                               | Mean  | SD           | SE    | Mean  | SD             | SE    | Sex x ROI                                   | p-value        | Men             | Women                                   |
| <b>CSF-filled Regions</b>         |       |              |       |       |                |       |   |                |                 |   |
| Lateral Ventricles                | .0397 | .0658        | .0089 | .0133 | 0319           | .0039 | Sex $p = .0012$                             | .0046          | LatVent>Sylvian | LatVent>Sylvian                         |
| Third Ventricle                   | .0071 | .0080        | .0080 | 0114  | .0056          | .0056 | <b>KOI p = .0001</b><br>Sex x ROI p = .068  | .0553          | Sylvia n>3Vent  | Sylvian>3Vent                           |
| Sylvian fissure                   | .1201 | .1606        | .0217 | .0560 | .1136          | .0139 |   | .0113          |                 |   |
| Neocortex                         |       |              |       |       |                |       |   |                |                 |   |
| Lateral Frontal                   | 1255  | .1720        | .0232 | -0799 | .1364          | .0167 | Sex $p = .2002$                             | .1046          | Lat Frnt > Calc | Trend: Lat Frnt>Tmp,Calc,Occ            |
| Medial Frontal                    | 1305  | .1843        | .0248 | 0933  | .01681         | .0205 | <b>KOI p = .0001</b><br>Sex x ROI p = .5623 | .2469          | Med Frnt > Calc | Trend: Med Frnt >Tmp,Calc,Occ           |
| Precentral                        | 0864  | .1603        | .0216 | 0575  | .1318          | .0161 |   | .2758          |                 |   |
| Postcentral                       | 1025  | .1763        | .0238 | 0647  | .1281          | .0156 |   | .1731          |                 |   |
| Parietal                          | 1067  | .1624        | .0219 | 0599  | .1316          | .0161 |   | .0810          |                 |   |
| Temporal                          | 0905  | .2138        | .0288 | 0326  | 1749           | .0214 |   | .1023          |                 |   |
| Calcarine                         | 0326  | .2136        | .0288 | 0363  | .2087          | .0255 |   | .9217          |                 |   |
| Occipital                         | 0532  | .2537        | .0342 | 0324  | .2284          | .0279 |   | .6357          |                 |   |
| Allocortex                        |       |              |       |       |                |       |   |                |                 |   |
| Anterior Cingulate Cortex         | 1503  | .1835        | .0247 | 0928  | .1321          | .0161 | Sex $p = .0416$                             | .0469          | Ant>Post Cing   | Ant>Post Cing                           |
| <b>Posterior Cingulate Cortex</b> | 0796  | .1383        | .0187 | 0304  | .0864          | .0106 | <b>KOI p = .0001</b><br>Sex x ROI p = .5907 | .0180          |                 | Precun>Post Cing                        |
| Insula                            | 1288  | .1841        | .0248 | 0639  | .1626          | .0199 |   | .0410          |                 |   |
| Precuneus                         | 1254  | .2075        | .0280 | 0914  | .1571          | .0192 |   | .3065          |                 |   |
| Subcortical Structures            |       |              |       |       |                |       |   |                |                 |   |
| Thalamus                          | 0047  | .0634        | .0086 | 0151  | .0598          | .0073 | Sex p = .2461                               | .3545          | Hipp>Thal       | n.s.                                    |
| Caudate                           | 0247  | .0863        | .0116 | 0380  | .0606          | .0074 | <b>KOI p = .0032</b><br>Sex x ROI p = .183  | .3191          |                 |   |
| Putamen                           | 0332  | .0571        | .0077 | 0105  | .0620          | .0076 |   | 0.386          |                 |   |
| Pallidum                          | 0359  | .0787        | .0106 | 0081  | .0714          | .0087 |   | .0428          |                 |   |
| Hippocampus                       | 0718  | .2144        | .0289 | 0385  | .1351          | .0165 |   | .2989          |                 |   |
| Amygdala                          | 0211  | .0786        | .0106 | 0140  | .0903          | .0110 |   | .6485          |                 |   |
| White Matter                      |       |              |       |       |                |       |   |                |                 |   |

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|                          | Men   | n (N = 55) |       | Wom  | Women (N = 67) | (L)   | ANOVA   | t-tests: M v F | Within-Sex A               | Within-Sex ANOVA across ROIs (Scheffe) |
|--------------------------|-------|------------|-------|------|----------------|-------|---|----------------|----------------------------|--|
| ROI                      | Mean  | SD         | SE    | Mean | SD             | SE    | SD SE Mean SD SE Sex x ROI                                | p-value Men    | Men                        | Women                                  |
| <b>Centrum Semiovale</b> | 0425  | .0660      | 6800. | 0185 | .0536          | .0066 | $\operatorname{Sex} \mathbf{p} = .6263$                   | .0283          | .0283 Centrum >Corpus n.s. | n.s.                                   |
| <b>Corpus Callosum</b>   | .0309 | .0657      | 6800. | 0002 | .0670          | .0082 | .0657 .0089 $0002$ .0670 .0082 <b>Sex R ROI p = .0001</b> | .0113          |                            |  |

 $\#^{\mathbf{d}}$ .30849

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best fit

p FDR

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Volume over age and sex

Volume over age

.49002 .03575 .22454

-.69252 2.12449

cubic

 $.03782 \ ^{*7}$ 

1.02289

quadratic

.00141 \*

3.26864 -2.10049

Region

.71916

-.36044 -.30637 -1.04299-.36241 -1.34508.61709

\* 00000. \* 00000. \* 00000.

-7.91181

-1.22095

linear linear

-11.27923

quadratic

.00002 \* \* 00000.

4.50634

.75986 29908

linear linear linear linear linear linear linear

-6.83645 -7.02428-13.14970

.71770 .18118

\* 00000. \* 00000. .53836 .13686

> 1.49778 -.96447 -1.19576-1.67202-1.19628-.52865 .74405

\* 00000.

-10.55671-4.85214

\* 00000. .00941 \* \* 00000. \* 00000. \* 00000.

\* 00000.

-6.45304

-10.39591

.23419

linear linear linear linear

-2.63919 -5.89171

.33678

.09717 .23399 59804

| Lateral Ventricles<br>Third Ventricle<br>Sylvian Fissures<br>Lateral Frontal Cortex<br>Medial Frontal Cortex<br>Precentral Cortex<br>Postcentral Cortex<br>Parietal Cortex<br>Temporal Cortex<br>Calcarine Cortex<br>Occipital Cortex<br>Anterior Cingulate Cortex<br>Posterior Cingulate Cortex | Insula<br>Precuneus<br>Thalamus<br>Caudate<br>Putamen<br>Pallidum<br>Hippocampus |
|--|--|
|--|--|

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\$watermark-text

\$watermark-text

.25630 .08235 .64529

-1.14090

cubic

.01073  $^{*7}$ .00084 \*

2.59266 -3.42660

quadratic

-4.41357

-1.75237-.46150

quadratic

**Centrum Semiovale** 

Amygdala

**Corpus Callosum** 

linear

.24937

-1.15751

FDR= false discovery rate, p=.05

53208 .08567 .48817

.62671

quadratic

.01519  $^{*7}$ 

2.46346 -5.02306

linear

.07610

-1.78937

-10.07233

-4.93880

1.73323 .69544

linear

\* 00000. .00002 \*

.45834

#None met FDR p = .05

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#### Table 7

SVOL-corrected trajectories of regional volumes over age

|                            | Adolescen | ts + Adults | (N = 151) |
|----------------------------|-----------|-------------|-----------|
| Region                     | t         | p FDR       | best fit  |
| Lateral Ventricles         | 4.16071   | .00004 *    | cubic     |
| Third Ventricle            | 3.20046   | .00155 *    | quadratic |
| Sylvian Fissures           | 10.84126  | .00000 *    | quadratic |
| Lateral Frontal Cortex     | -6.19092  | .00000 *    | cubic     |
| Medial Frontal Cortex      | -5.23801  | .00000 *    | cubic     |
| Precentral Cortex          | -13.46334 | .00000 *    | linear    |
| Postcentral Cortex         | -2.70526  | .00731 *    | cubic     |
| Parietal Cortex            | -5.55705  | .00000 *    | cubic     |
| Temporal Cortex            | -5.18987  | .00000 *    | cubic     |
| Calcarine Cortex           | -3.41084  | .00076 *    | cubic     |
| Occipital Cortex           | -3.65920  | .00031 *    | cubic     |
| Anterior Cingulate Cortex  | -4.75743  | .00000 *    | cubic     |
| Posterior Cingulate Cortex | -4.99639  | .00000 *    | cubic     |
| Insula                     | -2.74021  | .00660 *    | cubic     |
| Precuneus                  | -7.92646  | .00000 *    | cubic     |
| Thalamus                   | 3.18856   | .00162 *    | cubic     |
| Caudate                    | 2.81216   | .00533 *    | quadratic |
| Putamen                    | -2.19611  | .02903 *    | quadratic |
| Pallidum                   | -2.37314  | .01841 *    | quadratic |
| Hippocampus                | -4.28229  | .00003 *    | cubic     |
| Amygdala                   | -6.38594  | .00000 *    | quadratic |
| Centrum Semiovale          | -11.13289 | .00000 *    | quadratic |
| Corpus Callosum            | 2.14031   | .03333 *    | cubic     |

\* FDR= false discovery rate, p=.05