

# The Association between Poor Sleep and Accelerated Brain Ageing in Older Adults

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## INTRODUCTION

The ageing brain undergoes widespread gray (GM) and white matter (WM) degeneration leading to cognitive decline. Numerous studies indicate large heterogeneity in the age-related brain changes [1-3]. Growing body of evidence links this striking heterogeneity to modifiable lifestyle factors such as sleep, diet and physical activity [4]. As we get older overall sleep quality deteriorates. Up to half of elderly population experiences various sleep problems and sleep disruptions, including difficulties in maintaining or initiating sleep, and fragmentation of sleep [5,6]. Short sleep duration and poor sleep quality in healthy older adults have been previously associated with grey matter atrophy and microstructural white matter changes, putting them at increased risk of dementia. Here, we used measures derived from structural and diffusion magnetic resonance imaging (MRI) to examine interlinked GM and WM changes in healthy ageing. We subsequently investigated the associations of age-related brain changes with sleep quality and sleep disturbance, hypothesising that poor sleep accelerates brain ageing. Accelerated brain ageing, i.e. the deviation from normative ageing can be computed as the difference ( $\delta$ ) between chronological estimated from date of birth and "brain age" estimated from neuroimaging datasets [7]. Here, we used a novel technique [8] to estimate  $\delta$  and study its associations with sleep quality and sleep disturbance.

## METHODS

### DATA & PRE-PROCESSING

Elderly participants ( $n=50$ ; mean  $\pm$  SD age  $73.5 \pm 4.7$ ) were scanned on a 3T Philips Achieva MRI system. T1-w MPRAGE (spatial resolution  $1 \times 1 \times 1 \text{ mm}$ ) and multi-shell diffusion MRI (single-shot EPI,  $2 \times 2 \times 2 \text{ mm}$ ,  $b=1000$  &  $2000 \text{ s/mm}^2$ , 55 directions per shell) scans were acquired. Subjective sleep quality was assessed with the Pittsburgh Sleep Quality Index (PSQI; [9]) and sleep fragmentation was measured as actigraphy derived wakefulness after sleep onset (WASO; [10]). Data pre-processing and distortion correction were performed using the UK Biobank pipeline [11]. 110 subject-specific T1 image-derived phenotypes (IDPs), reflecting GM volumetric features and 66 diffusion derived, tract-specific microstructural IDPs [12] were extracted.

### VOXEL-WISE AGE-RELATED BRAIN CHANGES

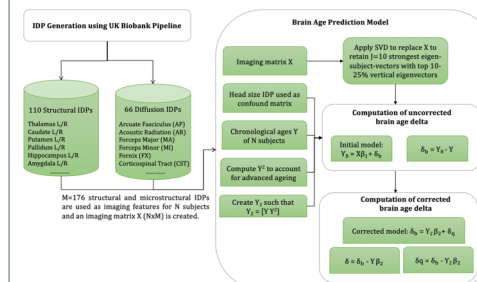
Tract-based spatial statistics (TBSS) analysis [13] was employed to explore changes in FA (fractional anisotropy) and MD (mean diffusivity) associated with age. Linked independent component analysis (FSL FLICA; [14]) was used to investigate modes of simultaneous covariation of GM structure and WM microstructure. FLICA decomposition into 10 independent components (ICs) was run on the skeletonised FA/MD and GM density maps following FSL voxel-based morphometry pipeline [1].

## CONCLUSIONS

- Healthy (neurotypical) ageing is associated with interlinked GM and WM changes accelerated by poor sleep, indexed by low subjective sleep quality and increased sleep fragmentation.
- Based on recent research showing that deviation from normative brain ageing is one of the hallmarks of dementia [15], we conclude that sleep disruptions in healthy older adults should be considered as modifiable risk factor for dementia.

## METHODS (cont.)

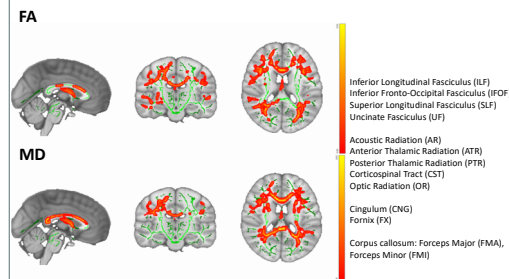
### BRAIN AGE PREDICTION



**Overview of the employed here "brain age" prediction model.** We used a recently published approach [8] to predict "brain age" from the set of  $M=176$  structural and microstructural IDPs in an unbiased manner. A matrix  $X$  ( $N \times M$ ) was created to represent the IDPs. Singular value decomposition was applied to reduce the feature dimensionality of  $X$ . We retained the  $J=10$  strongest eigen-subject-vectors with the top 10-25% vertical eigenvectors. Using the matrix  $X$  as predictors, we estimated  $\delta$  and  $\delta_q$ , accounting for linear and quadratic age effects respectively.

## RESULTS

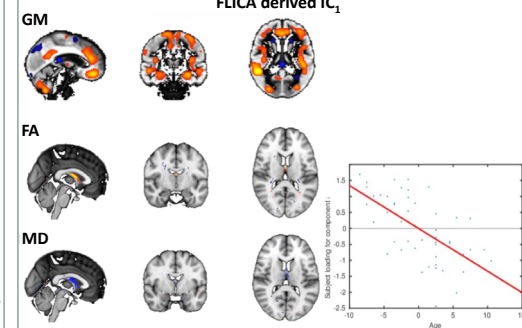
### AGE-RELATED MICROSTRUCTURAL BRAIN CHANGES



**TBSS analyses showed significant widespread changes in the WM microstructure.** Age was a significant predictor of reduction in FA and increase in MD ( $p < 0.05$  FDR) within the association (ILF, IFOF, SLF, UF), projection (AR, ATR, PTR, CST, OR), limbic (CNG, FX) and commissural (FMA and FMI) fibre bundles in healthy older adults.

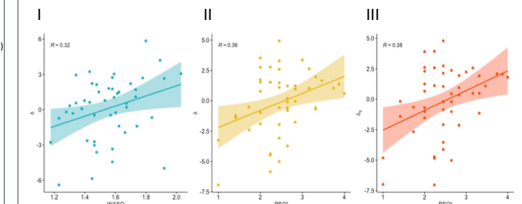
## RESULTS (cont.)

### INTERLINKED GM AND WM CHANGES IN HEALTHY AGEING



**FLICA indicated two modes of covariation in GM and WM in healthy older adults (IC<sub>1</sub> and IC<sub>2</sub>).** The independent component IC<sub>1</sub> showed a significant linear decrease of the global GM and WM microstructure with increasing age. Age explained 40% of the variance within IC<sub>1</sub> ( $R^2=0.40$ ,  $p < 0.001$  FDR). The linear relationship between the IC<sub>1</sub> loading and age was driven by FA (44%), GM volumetric information (30%) and MD (25%). The IC<sub>2</sub> showed a linear ( $R^2=0.15$ ) and U-shape ( $R^2=0.23$ ) relationship with PSQI, which did not survive FDR correction. The relationship between IC<sub>2</sub> and loading and PSQI was driven by FA (37%) followed by GM (33%) and MD (27%).

### RELATIONSHIPS BETWEEN BRAIN AGE DELTA AND SLEEP



**Poor sleep as a predictor of accelerated brain ageing computed as  $\delta$  and  $\delta_q$  ( $|\delta|=2.0$ ;  $|\delta_q|=2.1$  years) in healthy older adults.** The corrected linear estimate of delta ( $\delta$ ) was significantly correlated with WASO (I;  $R=0.32$ ,  $p=0.05$  FDR) and PSQI (II;  $R=0.36$ ,  $p=0.044$  FDR) using the T1 IDPs. There was also a significant relationship between the corrected quadratic estimate of delta ( $\delta_q$ ) and PSQI using the multimodal (T1+WM) IDPs (III,  $R=0.38$ ,  $p=0.037$  FDR).

## REFERENCES

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