## Additional file 1

| Regions | Features | Total |
| :---: | :---: | :---: |
| Subcortical regions (45) | Volume; normalized intensity: mean, <br> standard deviation, minimum, maximum and range | 270 |
|  | Area, volume, average thickness, <br> thickness standard deviation, |  |
| Cortical regions left and <br> right hemispheres (31x2) | White matter gray matter contrast: mean, <br> standard deviation, minimum <br> maximum and range | 806 |
| White matter left and Volume; normalized intensity: mean, | 384 |  |
| right hemispheres (32x2) | standard deviation, minimum, maximum and range |  |



| Subcortical regions |  |  |  |
| :---: | :---: | :---: | :---: |
| 1 | Left \& Right Lateral-Ventricle | 17 | 5th-Ventricle |
| 2 | $\begin{gathered} \text { Left \& Right } \\ \text { Inferior-Lateral-Ventricle } \end{gathered}$ | 18 | WM-hypointensities |
| 3 | Left \& Right Cerebellum-White-Matter | 19 | non-WM-hypointensities |
| 4 | $\begin{gathered} \text { Left \& Right } \\ \text { Cerebellum-Cortex } \end{gathered}$ | 20 | Optic-Chiasm |
| 5 | Left \& Right Thalamus-Proper | 21 | Corpus Callosum Posterior |
| 6 | Left \& Right Caudate | 22 | Corpus Callosum Mid Posterior |
| 7 | Left \& Right Putamen | 23 | Corpus Callosum Central |
| 8 | Left \& Right Pallidum | 24 | Corpus Callosum MidAnterior |
| 9 | Left \& Right Hippocampus | 25 | Corpus Callosum Anterior |
| 10 | Left \& Right Amygdala | 26 | 3rd-Ventricle |
| 11 | Left \& Right Accumbens-area | 27 | 4th-Ventricle |
| 12 | Left \& Right VentralDC | 28 | Brain-Stem |
| 13 | Left \& Right Vessel | 29 | CSF |
| 14 | Left \& Right choroid-plexus |  |  |
| 15 | Left \& Right WM-hypointensities |  |  |
| 16 | $\begin{gathered} \text { Left \& Right } \\ \text { non-WM-hypointensities } \end{gathered}$ |  |  |


| Cortical Regions |  |  |  |
| :---: | :---: | :---: | :---: |
| 1 | Caudalanteriorcingulate | 17 | Parsorbitalis |
| 2 | Caudalmiddlefrontal | 18 | Parstriangularis |
| 3 | Cuneus | 19 | Pericalcarine |
| 4 | Entorhinal | 20 | Postcentral |
| 5 | Fusform | 21 | Posteriorcingulate |
| 6 | Inferiorparietal | 22 | Precentral |
| 7 | Inferiortemporal | 23 | Precuneus |
| 8 | Isthmuscingulate | 24 | Rostralanteriorcingulate |
| 9 | Lateraloccipital | 25 | Rostralmiddlefrontal |
| 10 | Lateralorbitofrontal | 26 | Superiorfrontal |
| 11 | Lingual | 27 | Superiorparietal |
| 12 | Medialorbitofrontal | 28 | Superiortemporal |
| 13 | Middletemporal | 29 | Supramarginal |
| 14 | Parahippocampal | 30 | Transversetemporal |
| 15 | Paracentral | 31 | Insula |
| 16 | Parsopercularis | 32 | UnsegmentedWhiteMatter |

Supplementary Material Figure 1: Segmentation example from case 110033 of the CamCAN database. On the left a), the segmentation is shown without the white matter segmentation. Subcortical and cortical regions are divided. On the right b) the segmentation includes white matter segmentation.

| $\mathbf{1}$ | Brain Segmentation Volume |
| :---: | :---: |
| $\mathbf{2}$ | Left hemisphere cortical gray matter volume |
| $\mathbf{3}$ | Right hemisphere cortical gray matter volume |
| $\mathbf{4}$ | Subcortical gray matter volume |
| $\mathbf{5}$ | Total gray matter volume |
| $\mathbf{6}$ | Supratentorial volume |
| $\mathbf{7}$ | Mask Volume |
| $\mathbf{8}$ | Number of defect holes in lh surfaces prior to fixing |
| $\mathbf{9}$ | Number of defect holes in rh surfaces prior to fixing |
| $\mathbf{1 0}$ | Estimated Total Intracranial Volume |
| $\mathbf{1 1}$ | Left Hemisphere White Surface Total Area |
| $\mathbf{1 2}$ | Right Hemisphere White Surface Total Area |
| $\mathbf{1 3}$ | Left Hemisphere Cortex Mean Thickness |
| $\mathbf{1 4}$ | Right Hemisphere Cortex Mean Thickness |
| $\mathbf{1 5}$ | Total cortical gray matter volume |
| $\mathbf{1 6}$ | Volume of ventricles and choroid plexus |
| $\mathbf{1 7}$ | Left hemisphere cerebral white matter volume |
| $\mathbf{1 8}$ | Right hemisphere cerebral white matter volume |
| $\mathbf{1 9}$ | Total cerebral white matter volume |
| $\mathbf{y y y}$ |  |

Supplementary Material Table 2: Features extracted from the whole brain.

| Regressors | Hyperparameters |
| :---: | :--- |
| SVR | kernel='linear', degree=3, gamma='scale', coef0=0.0, <br> tol=0.001, C=1.0, epsilon=0.1, shrinking=True, cache_size=200 |
|  | n_estimators=100, criterion='squared_error', max_depth=None, <br> bootstrap=True, min_samples_split=2, min_samples_leaf=1, <br> min_weight_fraction_leaf=0.0, max_features=1.0, max_leaf_nodes=None, <br> min_impurity_decrease=0.0, oob_score=False, ccp_alpha=0.0 |
| MLP | epochs=500, lr=0.01, weigth_decay=0.01, validation_size=0.2, <br> criterion=L1, optimizer=Adam, early_stopping=20 epochs |

Supplementary Material Table 3: Hyperparameters of the regressors trained for the study.

| Database | Escaner | Acquisition protocol |
| :---: | :---: | :---: |
| The Open Access Series of Imaging Studies 1 (OASIS-1) | 1.5T Siemems Vision, Washington University, <br> Saint Louis, Misuri, United States | ```MPRAGE; RT = 9.7 ms, ET =4.0 ms, Flip Angle = 10 DT =200 ms, Orientation: Sagittal, thickness = 1.25 mm, n}\mp@subsup{}{}{0}\mathrm{ slices = 128, Resolution = 256 × 256 ( }1\times1\textrm{mm}``` |
| Information eXtraction from Images (IXI) initiative | 3T Philips Medical Systems Intera, Hammersmith Hospital, <br> London, England, United Kingdom <br> 1.5T Philips Medical Systems Gyroscan Intera, Guy's Hospital, <br> London, England, United Kingdom Institute of Psychiatry, <br> London, England, United Kingdom | $\mathrm{RT}=9.6 \mathrm{~ms}, \mathrm{ET}=4.6 \mathrm{~ms}$, Flip Angle $=8^{\circ}$ Number of Phase Encoding Steps $=208$, Echo Train Length $=208$, Reconstruction Diameter $=240.0$, AcquisitionMatrix $=208 \times 208$, <br> RT $=9.8 \mathrm{~ms}, \mathrm{ET}=4.6 \mathrm{~ms}$, Flip Angle $=8^{\circ}$, Number of Phase Encoding Steps $=192$, <br> Echo Train Length $=0$, Reconstruction Diameter $=240$, <br> Not available |
| NeuroCognitive Aging <br> Data Release (NeuroCog) | 3T GE Discovery, <br> Cornell Magnetic Resonance Imaging Facility, <br> New York, New York, United States 3T Siemens TimTrio, <br> York University Neuroimaging Center, Toronto, Ontario, Canada | MPRAGE; RT $=2530 \mathrm{~ms}, \mathrm{ET}=3.4 \mathrm{~ms}$, Flip Angle $=7^{\circ}$, voxel size $=1 \mathrm{~mm}$ isotropic, acquisition time $=5 \mathrm{~m} 25 \mathrm{~s}, 176$ slices <br> MPRAGE; RT $=1900 \mathrm{~ms}, \mathrm{ET}=2.52 \mathrm{~ms}$, Flip Ange $=9^{\circ}$, voxel size $=1 \mathrm{~mm}$ isotropic, acquisition time $=4 \mathrm{~m} 26 \mathrm{~s} ; 192$ slices |
| Cambridge Center of Aging and Neuroscience (Cam-CAN) | 3 T Siemens TimTrio, University of Cambridge, Cambridge, England, United Kingdom | MPRAGE; RT $=2250 \mathrm{~ms}$, ET $=2.99 \mathrm{~ms}$, IT $=900 \mathrm{~ms}$, Flip Angle $=9^{\circ}$, FOV $=256 \times 240 \times 192 \mathrm{~mm}$, resolution: 1 mm isotropic; GRAPPA $=2$; acquisition time $=4 \mathrm{mins} 32 \mathrm{~s}$ |
| Southwest University Adult Lifespan Dataset (SALD) | 3T MRI Siemens TimTrio, <br> The Brain Imaging Center of Southwest University, <br> Beibei, Chongqing, China | MPRAGE; RT $=1.90 \mathrm{~ms}, \mathrm{ET}=2.52 \mathrm{~ms}, \mathrm{TI}=900 \mathrm{~ms}$, Flip Angle $=90^{\circ}$, <br> resolution matrix $=256 \times 256$, slices $=176$, thickness $=1,0 \mathrm{~mm}$ y voxel size $=1 \times 1 \mathrm{~mm} 3$ |
| Dallas Lifespan Brain Study (DLBS) | 3T Philips Achieva, <br> Park aging mind Laboratory, <br> Dallas, Texas, United States | MPRAGE; RT $=8.1 \mathrm{~ms}, \mathrm{ET}=3.7 \mathrm{~ms}$, Flip Angle $=12^{\circ}$. Voxel size $1 \times 1 \times 1 \mathrm{~mm} 3$, slices $=160$, matriz dimension $204 \times 256 \times 160$ |
| Consortium for reliability and reproducibility (CoRR) | 35 different scaners from different institutions | Check parameters for each protocol at: https://www.nature.com/articles/sdata201449/tables/3 |

Supplementary Material Table 4: Acquisition parameters for each scanner employed in every database used to construct the Brain Age model.

|  |  | SVR |  | RF |  | MLP |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | MAE | r | MAE | r | MAE | r |
| Combined Feature Set | 20 features | $6.07 \pm 0.29$ | $0.82 \pm 0.02$ | $5.51 \pm 0.25$ | $0.84 \pm 0.02$ | $5.03 \pm 0.29$ | $0.86 \pm 0.02$ |
|  | 30 features | $5.94 \pm 0.24$ | $0.83 \pm 0.02$ | $5.54 \pm 0.26$ | $0.84 \pm 0.02$ | $4.92 \pm 0.25$ | $0.86 \pm 0.02$ |
|  | 40 features | $5.85 \pm 0.22$ | $0.83 \pm 0.02$ | $5.55 \pm 0.27$ | $0.84 \pm 0.02$ | $4.90 \pm 0.21$ | $0.87 \pm 0.01$ |
| Morphological Feature Set | 20 features | $6.68 \pm 0.43$ | $0.78 \pm 0.02$ | $6.53 \pm 0.54$ | $0.76 \pm 0.03$ | $5.74 \pm 0.47$ | $0.80 \pm 0.02$ |
|  | 30 features | $6.52 \pm 0.44$ | $0.79 \pm 0.02$ | $6.54 \pm 0.46$ | $0.77 \pm 0.03$ | $5.66 \pm 0.44$ | $0.81 \pm 0.02$ |
|  | 40 features | $6.37 \pm 0.39$ | $0.80 \pm 0.02$ | $6.46 \pm 0.42$ | $0.77 \pm 0.02$ | $5.57 \pm 0.27$ | $0.81 \pm 0.02$ |
| Intensity Feature Set | 20 features | $6.91 \pm 0.41$ | $0.75 \pm 0.02$ | $6.64 \pm 0.40$ | $0.75 \pm 0.02$ | $6.17 \pm 0.40$ | $0.77 \pm 0.02$ |
|  | 30 features | $6.87 \pm 0.46$ | $0.75 \pm 0.02$ | $6.67 \pm 0.43$ | $0.76 \pm 0.02$ | $6.13 \pm 0.44$ | $0.78 \pm 0.03$ |
|  | 40 features | $6.80 \pm 0.38$ | $0.76 \pm 0.02$ | $6.72 \pm 0.41$ | $0.75 \pm 0.02$ | $6.06 \pm 0.35$ | $0.78 \pm 0.02$ |

Supplementary Material Table 5: Validation results for the three regressors tested. Results are given as the average and the standard deviation of the values obtained from each fold of the 10 -fold cross-validation scheme before age bias correction. The values in bold show the combination with the best result.

|  |  | F | P-val | np2 |
| :---: | :---: | :---: | :---: | :---: |
| ANCOVA HC-CM-EM | Brain Age Gap | 2.969 | 0.053 | 0.240 |
|  | eTIV | 14.666 | $<0.001$ | 0.057 |
|  | Sex | 0.213 | 0.645 | $<0.001$ |
| ANCOVA HC-EM | Brain Age Gap | 1.734 | 0.019 | 0.001 |
|  | eTIV | 9.900 | 0.002 | 0.005 |
|  | Sex | $<0.001$ | 0.997 | $<0.001$ |
| ANCOVA HC-CM | Brain Age Gap | 6.796 | 0.010 | 0.043 |
|  | eTIV | 4.744 | 0.031 | 0.030 |
|  | Sex | 0.428 | 0.514 | 0.003 |
|  | Brain Age Gap | 1.110 | 0.294 | 0.007 |
| ANCOVA EM-CM | eTIV | 15.749 | $<0.001$ | 0.089 |
|  | Sex | 0.175 | 0.676 | 0.001 |

Supplementary Material Table 6: ANCOVA complete results for Brain Age Gap calculated for the combined regressor. Normality and equality of variances were tested before applying the ANCOVA. Sex and eTIV were included as covariates.

|  |  |  | F | P-val |
| :---: | :---: | :---: | :---: | :---: |
| ANCOVA HC-EM-CM | Brain Age Gap | 1.840 | 0.161 | 0.015 |
|  | eTIV | 20.37 | 0.078 | $<0.001$ |
|  | Sex | 2.423 | 0.010 | 0.121 |
| ANCOVA HC-EM | Brain Age Gap | 0.102 | 0.750 | 0.001 |
|  | eTIV | 11.49 | $<0.001$ | 0.064 |
|  | Sex | 3.878 | 0.051 | 0.022 |
| ANCOVA HC-CM | Brain Age Gap | 3.237 | 0.074 | 0.021 |
|  | eTIV | 9.191 | 0.003 | 0.057 |
|  | Sex | 0.659 | 0.418 | 0.004 |
|  | Brain Age Gap | 1.924 | 0.167 | 0.012 |
| ANCOVA EM-CM | eTIV | 21.01 | $<0.001$ | 0.115 |
|  | Sex | 1.214 | 0.272 | 0.008 |

Supplementary Material Table 7: ANCOVA complete results for Brain Age Gap calculated for the intensity regressor. Normality and equality of variances were tested before applying the ANCOVA. Sex and eTIV were included as covariates.

|  |  | F | P-val | np2 |
| :---: | :---: | :---: | :---: | :---: |
| ANCOVA HC-EM-CM | Brain Age Gap | 2.156 | 0.118 | 0.018 |
|  | eTIV | 0.999 | 0.319 | 0.004 |
|  | Sex | 3.952 | 0.048 | 0.016 |
| ANCOVA HC-EM | Brain Age Gap | 1.802 | 0.181 | 0.011 |
|  | eTIV | 0.074 | 0.786 | $<0.001$ |
|  | Sex | 2.794 | 0.096 | 0.016 |
|  | Brain Age Gap | 4.094 | 0.045 | 0.026 |
|  | eTIV | 0.707 | 0.402 | 0.005 |
| ANCOVA EM-CM | Sex | 1.844 | 0.176 | 0.012 |
|  | Brain Age Gap | 0.336 | 0.563 | 0.002 |
|  | eTIV | 3.280 | 0.072 | 0.020 |
|  | Sex | 2.515 | 0.115 | 0.015 |

Supplementary Material Table 8: ANCOVA results for Brain Age Gap calculated for the morphological regressor. Normality and equality of variances were tested before applying the ANCOVA. ETIV was included as a covariate.

|  |  | $\begin{gathered} \text { ANCOVA } \\ \text { HC-EM } \end{gathered}$ | $\begin{gathered} \text { ANCOVA } \\ \text { HC-CM } \end{gathered}$ | $\begin{gathered} \text { ANCOVA } \\ \text { EM-CM } \end{gathered}$ |
| :---: | :---: | :---: | :---: | :---: |
| Combined Feature Set | F-value | 2.387 | 5.581 | 0.440 |
|  | Effect size ( $\eta_{p}^{2}$ ) | 0.017 | 0.040 | 0.003 |
|  | p-value | 0.125 | 0.020 | 0.508 |
| Morphological Feature Set | F-value | 0.218 | 2.373 | 0.968 |
|  | Effect size ( $\eta_{p}^{2}$ ) | 0.002 | 0.018 | 0.007 |
|  | p-value | 0.641 | 0.126 | 0.327 |
| Intensity Feature Set | F-value | 1.618 | 5.555 | 0.666 |
|  | Effect size ( $\eta_{p}^{2}$ ) | 0.011 | 0.040 | 0.005 |
|  | p-value | 0.205 | 0.020 | 0.416 |

Supplementary Material Table 9: ANCOVA results for Brain Age Gap calculated for the female subgroup. Normality and equality of variances were tested before applying the ANCOVA. Sex and eTIV were included as covariates.

|  |  | ANCOVA | ANCOVA | ANCOVA |
| :---: | :---: | :---: | :---: | :---: |
|  |  | HC-EM | HC-CM | EM-CM |
| Combined Feature Set | F-value | 0.950 | 6.789 | 0.509 |
|  | Effect size $\left(\eta_{p}^{2}\right)$ | 0.035 | 0.047 | 0.028 |
|  | p-value | 0.339 | 0.388 | 0.485 |
| Morphological Feature Set | F-value | 0.638 | 0.746 | 1.239 |
|  | Effect size $\left(\eta_{p}^{2}\right)$ | 0.024 | 0.045 | 0.064 |
|  | p-value | 0.432 | 0.400 | 0.280 |
|  | F-value | 2.171 | 0.114 | 1.088 |
| Intensity Feature Set | Effect size $\left(\eta_{p}^{2}\right)$ | 0.077 | 0.007 | 0.057 |
|  | p-value | 0.153 | 0.740 | 0.311 |

Supplementary Material Table 10: ANCOVA results for Brain Age Gap calculated for the male subgroup. Normality and equality of variances were tested before applying the ANCOVA. Age and eTIV were included as covariates.


Supplementary Material Figure 2: Results of the Brain Age models on the external validation dataset (NKI-RS). The performance of the models is similar to that obtained on the healthy controls of the Application Dataset, thereby confirming the generalizability and reliability of the models.


Supplementary Material Figure 3: The outcomes derived from the integrated regression model for each gender are presented. While the findings do not indicate any statistically significant differences, they do suggest that females are the predominant factor contributing to the disparity between HC and CM. It is important to interpret these results cautiously, given the limited sample size of the male group.


Supplementary Material Figure 4: The sum of the absolute SHAP values of each feature for each member of the investigated groups, calculated for the regressor trained on the Combined Feature Set. The order of features varies between groups, but the 16 designated features are shared by the groups' most pertinent features.


Supplementary Material Figure 5: The sum of the absolute SHAP values of each feature for each member of the investigated groups, calculated for the regressor trained on the Morphological Feature Set. The order of features varies between groups, but the 17 designated features are shared by the groups' most pertinent features.


Supplementary Material Figure 6: The sum of the absolute SHAP values of each feature for each member of the investigated groups, calculated for the regressor trained on the Intensity Feature Set. The order of features varies between groups, but the 17 designated features are shared by the groups' most pertinent features.


Supplementary Material Figure 7: No correlations were found between Brain Age Gap calculated with the regressor trained on the Combined Feature Set and the clinical variables studied, a) Brain Age Gap change along with headache frequency, b) Brain Age Gap change along with migraine frequency, c) Brain Age Gap change along with migraine duration, and d) Brain Age Gap change along with chronic migraine duration.


Supplementary Material Figure 8: No statistically significant correlation was found between clinical variables and Brain Age Gap when calculated with the regressor trained on the Morphological Feature Set, a) Brain Age Gap change along with headache frequency, b) Brain Age Gap change along with migraine frequency, c) Brain Age Gap change along with migraine duration, and d) Brain Age Gap change along with chronic migraine duration.


Supplementary Material Figure 9: No statistically significant correlation was found between the clinical variables and the Brain Age Gap when calculated with the regressor trained on the Intensity Feature Set, a) Brain Age Gap change along with headache frequency, b) Brain Age Gap change along with migraine frequency, c) Brain Age Gap change along with migraine duration, and d) Brain Age Gap change along with chronic migraine duration.


Supplementary Material Figure 10: No statistically significant correlations were found between the selected key features during the model interpretation and the clinical variables of the CM and EM patients.

