

Fig. 1. Estimating lesion burden. Panel A shows a participant with an estimated lesion number of 11 and volume of 29.16 mL. Panel B shows an age- and sex-matched control participant with a lesion number of 6 and volume of 0.72 mL. The left image in each panel shows T1-weighted images only, and the right image shows T1-weighted images with lesion maps overlaid in yellow. Images were obtained using the LST toolbox for SPM (Schmidt et al., 2012).

LST toolbox for SPM (Schmidt et al., 2012): www.statistical-modelling.de/lst.html (Fig. 1). This algorithm segments T2 hyperintense lesions using T1 and FLAIR images (see *Supplementary Material* for details of MRI data acquisition). FLAIR images were collected as part of in-depth neurocognitive testing of a subsample of Cam-CAN participants. Therefore, lesion burden was estimated for 272 participants only (Shafto et al., 2014). LST is a reliable, open-source, toolbox that demonstrates good agreement with manual tracing methods and very good specificity (García-Lorenzo et al., 2013; Schmidt et al., 2012). The algorithm also meets general standards for automated lesion detection such as the use of both multimodal and spatial information (García-Lorenzo et al., 2013). The algorithm requires user specification of a threshold for transformed intensities κ . As recommended by Schmidt et al. (2012), the threshold intensity parameter $\kappa = 0.7$ was chosen by visually inspecting lesion maps for different κ in 4 participants before modeling the data. We ran supplementary analyses with other thresholds κ to assess whether this choice impacted our results. We note that although the direction of effects and effect sizes for lesion volume were consistent across different κ , the effect sizes for lesion number were lower for $\kappa = 0.1$ and $\kappa = 0.3$ (*Supplementary Table 1*).

2.4. White matter microstructure

To assess the relationship between cardiovascular health and white matter microstructure, we modeled mean FA, MD, and MK for 10 tracts of the Johns Hopkins University (JHU) white matter tractography atlas averaged over the hemispheres (Fig. 2). See *Supplementary Methods* for details of MRI data acquisition and preprocessing.

2.5. Protective factors: exercise and BMI

We modeled exercise and BMI as potential protective factors for cardiovascular and white matter health in an exploratory analysis. We assessed exercise using the European Physical Activity Questionnaire (Wareham et al., 2002). Four measures of physical activity energy expenditure in kJ/d/kg were calculated from self-reported physical activities at home, during leisure, at work, and during the commute. Both paid employment and regular volunteering in the last 12 months were classified as work. BMI was calculated as weight (kg)/height (m)². Height and weight were measured using portable scales (Seca 875).

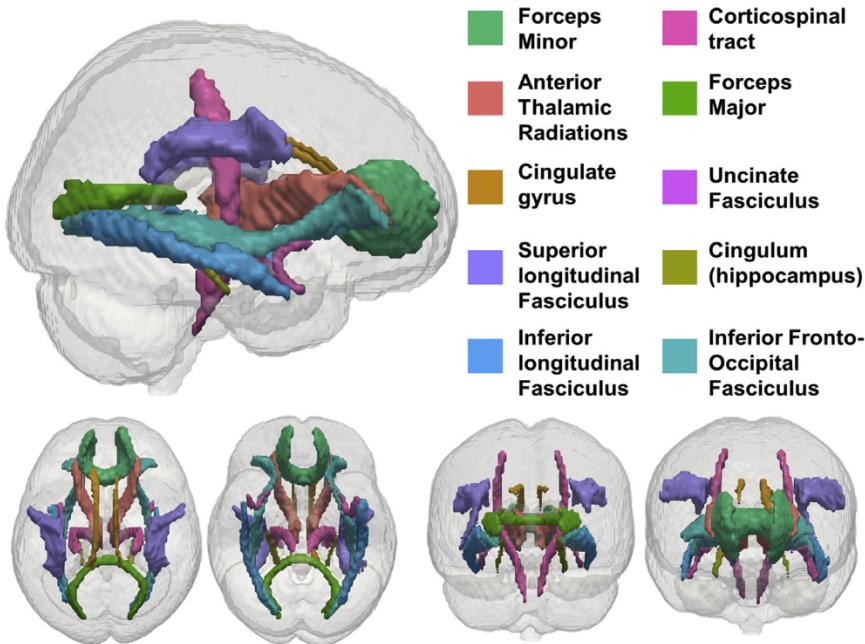


Fig. 2. JHU white matter tracts modeled in our analysis. Adapted from Kievit et al. (2016).

2.6. Structural equation modeling

We modeled the relationship between cardiovascular health and white matter using Confirmatory Factor Analysis and SEM in R's (R core team, 2015) lavaan package (Rosseel, 2012). All models were fitted using maximum likelihood estimation with robust (Huber-White) standard errors and a scaled test statistic. The residual variance of all observed variables was freely estimated. All available data were used. Missing data were estimated using the full information maximum likelihood method for all models. This method yields unbiased estimates when data are missing at random or missing completely at random, and as such is preferable to alternative techniques such as complete-case analyses or imputation methods (Enders and Bandolos, 2001). Model fit was inspected using the χ^2 test, the Root Mean Square Error of Approximation (RMSEA) and its confidence interval, the Comparative Fit Index (CFI), and the Standardized Root Mean Square Residual (SRMR). We report the scaled test statistics. Good fit was defined as approximately RMSEA < 0.05, CFI > 0.97, and SRMR < 0.05, acceptable fit as approximately RMSEA = 0.05–0.08, CFI = 0.95–0.97, and SRMR = 0.05–0.10 (Schermelleh-Engel et al., 2003). Nested models were compared using a χ^2 test. Effect sizes were evaluated by inspecting R^2 for cardiovascular health and age overall and standardized parameter estimates for the individual effects of blood pressure and heart rate. Absolute estimates above 0.10 were defined as small effects, 0.20 as typical and 0.30 as large (Gignac and Szodorai, 2016).

3. Results

3.1. Measurement models

To establish the relationship between cardiovascular and white matter health, we first used Confirmatory Factor Analysis to specify a measurement model for our cardiovascular health measures (Fig. 3). Estimating latent variables has 2 benefits: first, it reduces measurement error in estimates of cardiovascular health (Little et al., 1999), and second, it allows for examining whether cardiovascular health is best represented as a single factor, which is theoretically plausible, or multiple, partially independent factors (here systolic blood pressure, diastolic blood pressure, and heart rate). We first fit a single-factor model, which represents cardiovascular health as a single latent dimension. This model did not fit well $\chi^2(27) = 984.28$, $p < 0.001$; RMSEA = 0.247 [0.240–0.255]; CFI = 0.474; SRMR = 0.218. We found that a three-factor model with heart rate and diastolic and systolic blood pressure as separate factors showed adequate fit (Fig. 3; Supplementary Table 2) and fit

better than the single-factor model (Supplementary Table 3; $\Delta\chi^2(3) = 181.71$, $p < 0.001$). We therefore used the three-factor measurement model in all subsequent analyses. The first measurement for both diastolic and systolic blood pressure showed a lower factor loading than the latter 2 measurements. This is consistent with the notion that the first measurement was less reliable, potentially due to movement or adaptation to the testing setting, and highlights the value of latent variables for reducing measurement error.

We also assessed fit of a single-factor measurement model of white matter microstructure, by estimating a single latent variable from white matter microstructure in 10 white matter tracts. We found that this single-factor model did not fit well for FA ($\chi^2(35) = 418.66$, $p < 0.001$; RMSEA = 0.130 [0.120–0.140]; CFI = 0.879; SRMR = 0.062), MD ($\chi^2(35) = 1825.69$, $p < 0.001$; RMSEA = 0.281 [0.271–0.292]; CFI = 0.766; SRMR = 0.090), or MK ($\chi^2(35) = 283.51$, $p < 0.001$; RMSEA = 0.105 [0.097–0.112]; CFI = 0.840; SRMR = 0.054). This indicates that white matter microstructure cannot be adequately captured by a single factor in our cohort. We therefore modeled each of the 10 white matter tracts as a separate indicator.

We were not able to assess model fit of a single-factor model of white matter lesion burden. There were only 2 indicators of lesion burden (total lesion volume and number), making a single-factor model just identified. Just-identified models do not yield meaningful fit statistics. We therefore modeled each of the lesion burden measures as separate indicators in all subsequent analyses.

3.2. White matter lesion burden

We examined the relationship between cardiovascular health and white matter lesion burden using structural equation models in which diastolic blood pressure, systolic blood pressure, and heart rate were modeled as predictors for total lesion volume and number. To account for potential confounding with age, this variable was additionally included as a covariate. The full model showed good fit (Fig. 4). All regression paths, apart from the relationship between systolic blood pressure and lesion number, were significant (Fig. 4), indicating that each cardiovascular measure made partially independent contributions to white matter lesion burden. Lower diastolic blood pressure, higher systolic blood pressure, and heart rate each predicted greater total lesion volume and a higher number of lesions above and beyond age (Fig. 4, Supplementary Table 1).

Next, we examined whether diastolic blood pressure, systolic blood pressure, and heart rate each showed a specific link to white

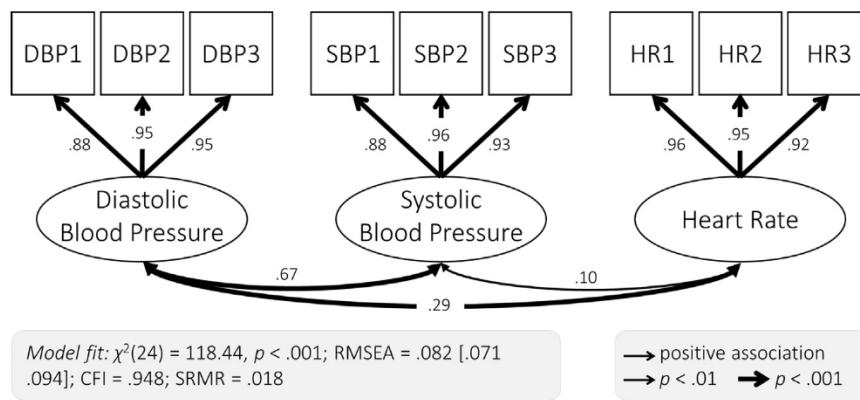


Fig. 3. Three-factor measurement model of cardiovascular health. Each of the 3 cardiovascular health factors was extracted from 3 measurements (diastolic blood pressure: DBP1, DBP2, DBP3; systolic blood pressure: SBP1, SBP2, SBP3; and heart rate: HR1, HR2, HR3). Standardized parameter estimates are shown.

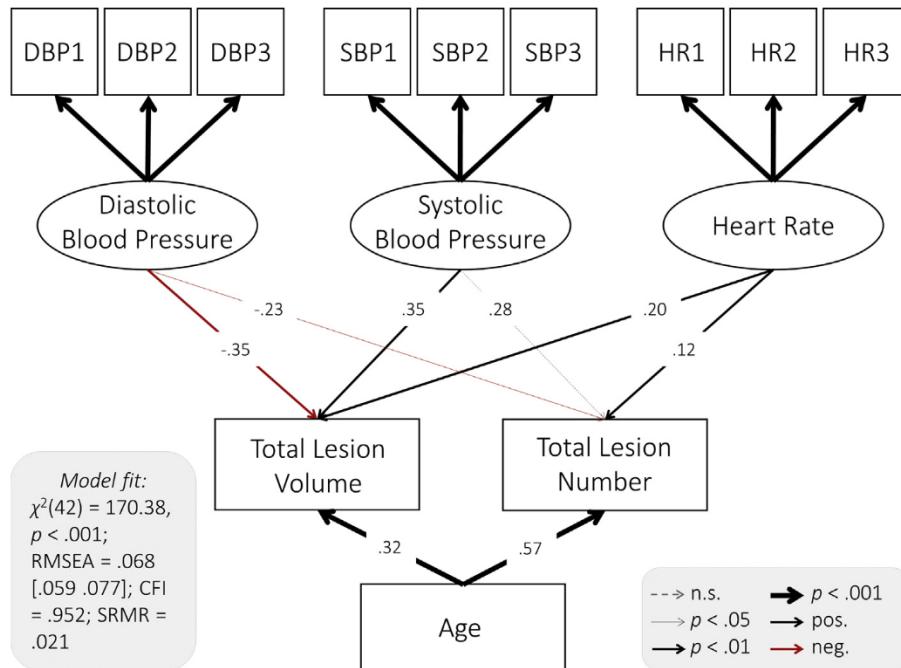


Fig. 4. Path model of the relationship between cardiovascular health white matter lesion burden. Diastolic blood pressure, systolic blood pressure, and heart rate were modeled as latent variables (Fig. 3). Age and total lesion volume and number were modeled as manifest variables. Standardized parameter estimates are shown. Residual covariances between cardiovascular factors, lesion burden measures, and age were allowed but are not shown for simplicity.

matter health, by comparing the freely estimated model shown in Fig. 4 with a model in which the parameter estimates for paths between cardiovascular health and each of the lesion burden measures are constrained to be equal (e.g., paths between lesion number and systolic blood pressure, diastolic blood pressure, and heart rate). We found that the constrained model fit worse than the freely estimated model ($\Delta\chi^2(4) = 31.49, p < 0.001$). This indicates that diastolic blood pressure, systolic blood pressure, and heart rate differed in their relationship to white matter lesion burden, with diastolic and systolic blood pressure showing greater effects than heart rate (for standardized parameter estimates, see Fig. 4).

We took the same approach to test whether lesion volume and lesion number showed different sensitivity to cardiovascular health. We found that a model in which parameter estimates for paths from each cardiovascular health measure to total lesion volume and number (e.g., paths between diastolic blood pressure and lesion volume and number) were constrained to be equal did not differ significantly in fit from a model in which these parameters were freely estimated ($\Delta\chi^2(3) = 2.40, p = 0.494$). This indicates that lesion volume and number showed a similar sensitivity to cardiovascular health. The total effect size of cardiovascular health and age on white matter lesion burden was considerable, with an $R^2 = 0.51$ for lesion number and $R^2 = 0.30$ for volume.

To better understand the negative association between diastolic blood pressure and lesion burden, we reran the model and included diastolic blood pressure as the only exogenous variable. We found that the association between diastolic blood pressure and total lesion volume and number became nonsignificant in this model (Supplementary Table 4). This indicates that the effects of diastolic blood pressure are conditional on other cardiovascular factors and age. This finding is compatible with the notion that pulse pressure, the difference between systolic and diastolic pressure, is a sensitive indicator of cardiovascular health (Kim et al., 2011; Strandberg and Pitkala, 2003). Exploratory models including pulse pressure and either systolic or diastolic blood pressure showed that higher pulse pressure was related to higher

lesion burden overall (standardized coefficients ranging from 0.20 to 0.39, Supplementary Tables 5 and 6). Both systolic and diastolic blood pressure remained significant predictors of lesion burden over and above pulse pressure for lesion volume but not number (Supplementary Tables 5 and 6). This indicates that although pulse pressure is a sensitive indicator, absolute diastolic and systolic blood pressure can provide additional information about white matter health.

3.3. White matter microstructure

Next, we examined the link between cardiovascular health and nonclinical metrics of white matter microstructure. Specifically, we tested the relationship between cardiovascular health and FA, MD, and MK in 3 separate models. For each of these models, diastolic blood pressure, systolic blood pressure, and heart rate were modeled as simultaneous exogenous variables. Age was included as a covariate. We found largely converging results across FA, MD, and MK. For all models, blood pressure and heart rate made partially independent contributions to white matter microstructure. Consistently, lower diastolic blood pressure, higher systolic blood pressure, and higher heart rate were each associated with lower FA, higher MD, and lower MK (Fig. 5, Table 2, Supplementary Figs 1 and 2). Of our 3 measures of white matter microstructure, MD was generally most sensitive to cardiovascular health (Supplementary Table 7). Cardiovascular health and age explained up to 56% of the variance in MD (Supplementary Table 7), with absolute standardized parameter estimates indicating small to large effect sizes of cardiovascular health above and beyond age (Table 2). Effect sizes were generally larger for blood pressure than heart rate (Table 2). Although DWI metrics are only indirect measures of white matter microstructure (Jones et al., 2013), the associations reported here are compatible with an interpretation of adverse associations between cardiovascular ill health and white matter microstructure (Falangola et al., 2008; Jones et al., 2013; Madden et al., 2012).

0.001), indicating that more energy spent while commuting was associated with better cardiovascular health overall. Exercise at work showed no clear relationship to cardiovascular health but was the most significant predictor of MD. There was a weak, negative correlation between exercise and MD in 7 tracts with standardized coefficients ranging from -0.04 to -0.12 (Supplementary Table 14). This indicates that more exercise at work was associated with lower MD in these tracts, likely reflecting better white matter health.

3.4.2. Body mass index

The model including BMI showed mediocre fit overall ($\chi^2(99) = 516.44$, $p < 0.001$; RMSEA = 0.080 [0.073 0.086]; CFI = 0.938; SRMR = 0.201). Higher BMI was associated with higher diastolic blood pressure (standardized coefficient = 0.29, $p < 0.001$), systolic blood pressure (standardized coefficient = 0.23, $p < 0.001$), and heart rate (standardized coefficient = 0.16, $p < 0.001$), thus predicting reduced cardiovascular health overall. Higher BMI was weakly correlated with lower MD in 3 tracts (Supplementary Table 15). This apparent negative effect of BMI was likely due to suppression. In a model where BMI alone was regressed onto MD, all but one nonsignificant association became positive. Here, lower BMI was significantly associated with lower MD and therefore increased white matter microstructure, in 4 tracts (forceps minor, superior longitudinal fasciculus, inferior fronto-occipital fasciculus, and anterior thalamic radiation), with standardized coefficients ranging from 0.09 to 0.18 (Supplementary Table 16).

3.5. Testing for potential confounds

Using multigroup models, we carried out a series of supplementary analyses of white matter lesion burden and microstructure to examine whether our results could be explained by possible differences between sexes, participants taking or not taking anti-hypertensive medication and with and without known cardiovascular risk factors (diabetes, hypercholesterolemia, etc., see Table 1 for full list). Results were invariant across groups for all of these factors (see Supplementary Analyses for details). Finally, we investigated whether social and lifestyle factors confounded our results by rerunning our model and including covariates for social class, education levels, smoking, and alcohol consumption. The inclusion of these variables did not meaningfully change the directionality or significance level of the effects (see Supplementary Analyses for details).

4. Discussion

Here, we show a link between common clinical measures of cardiovascular health and imaging indices of white matter health, in terms of both macrostructure and microstructure observed using multimodal MRI in a population-based sample of healthy aging adults. Lower diastolic blood pressure, higher systolic blood pressure, and higher heart rate were each strongly and independently associated with poorer white matter health on all indices—over and above the effects of age. The link between cardiovascular and white matter health was robust across genders, in people taking and not taking antihypertensive medication, with and without known cardiovascular risk factors (diabetes, elevated cholesterol levels, etc.), and when controlling for social class, education levels, alcohol consumption, and smoking.

4.1. Systolic hypertension and diastolic hypotension

We found that systolic hypertension predicted poorer white matter macrostructure and microstructure on all indices, in line with previous studies showing bivariate links between high systolic

blood pressure and lower FA, higher MD, and greater white matter lesion volume and number (Maillard et al., 2012; van Dijk et al., 2004; Verhaaren et al., 2013). Systolic blood pressure is known to increase more steeply with age than diastolic blood pressure and has been argued to be a better predictor of cardiovascular and neurological outcomes (Strandberg and Pitkala, 2003). However, we found that lower diastolic blood pressure had a similarly detrimental effect as higher systolic blood pressure. This negative correlation was not evident in a single-indicator model including diastolic blood pressure alone, showing that low diastolic blood pressure is likely to be particularly detrimental at moderate to high levels of systolic blood pressure. This conditional effect may capture the difference between systolic and diastolic blood pressure, a measure known as pulse pressure (Kim et al., 2011; Strandberg and Pitkala, 2003). Pulse pressure is often argued to be a particularly good measure of cardiovascular health in older populations because systolic and diastolic blood pressure widen with age (Supplementary Fig. 3), increasing pulse pressure and contributing to the high prevalence of isolated systolic hypertension in older adults (Huang et al., 2004; Strandberg and Pitkala, 2003). Exploratory models showed that pulse pressure was indeed a sensitive indicator of white matter microstructure and macrostructure and showed greater effect sizes than either systolic or diastolic blood pressure on their own. However, both systolic and diastolic blood pressure remained significant predictors of white matter health after controlling for pulse pressure, indicating that they each capture information about cardiovascular health over and above pulse pressure. Pathophysiologically, isolated systolic hypertension in combination with diastolic hypotension may reflect reduced vessel compliance and increased arterial stiffness, one of the hallmarks of vascular aging (Vlachopoulos et al., 2010).

These findings also highlight the importance of assessing and modeling systolic and diastolic blood pressure, rather than just hypertensive status. The use of multivariate models reveals the existence of conditional effects, which can remain undetected when using univariate techniques. This pattern of results is also relevant to clinical practice. Current UK treatment guidelines include only upper limits for blood pressure (NICE, 2016), but our findings indicate that lower limits for diastolic blood pressure, or pulse pressure, may provide crucial complementary information about cardiovascular health and its consequences.

4.2. Elevated heart rate

Elevated heart rate was associated with poorer white matter health, independent of age and blood pressure. Previous research showed that high heart rate predicts cardiovascular problems independent of blood pressure, physical activity, and comorbidities (Cooney et al., 2010; Fox et al., 2007; Woodward et al., 2012). Nighttime heart rate has also been implicated in white matter lesions and stroke (Yamaguchi et al., 2015). Here, we demonstrate that higher heart rate during the day is associated with poorer white matter microstructure and macrostructure, although effect sizes were somewhat smaller for heart rate than they were for blood pressure. The etiology and impact of elevated heart rate remain poorly understood but may be related to sympathetic nervous system hyperactivity and endothelial dysfunction, which, in turn, may put stress of vascular architecture (Palatini, 2011).

4.3. Body mass and exercise

Body mass and exercise were related to white matter health, both directly and indirectly via cardiovascular health. Higher BMI was associated with poorer cardiovascular health and higher MD, indicating reduced white matter integrity, although effect sizes

- detection of FLAIR-hyperintense white-matter lesions in Multiple Sclerosis. *NeuroImage* 59, 3774–3783.
- Serra, L., Cercignani, M., Basile, B., Spano, B., Perri, R., Fadda, L., Marra, C., Giubilei, F., Caltagirone, C., Bozzali, M., 2012. White matter damage along the uncinate fasciculus contributes to cognitive decline in AD and DLB. *Curr. Alzheimer Res.* 9, 326–333.
- Shafto, M.A., Tyler, L.K., Dixon, M., Taylor, J.R., Rowe, J.B., Cusack, R., Calder, A.J., Marslen-Wilson, W.D., Duncan, J., Dagleish, T., Henson, R.N., Brayne, C., Matthews, F.E., 2014. The Cambridge Centre for Ageing and Neuroscience (Cam-CAN) study protocol: a cross-sectional, lifespan, multidisciplinary examination of healthy cognitive ageing. *BMC Neurol.* 14, 204.
- Shimoji, K., Uka, T., Tamura, Y., Yoshida, M., Kamagata, K., Hori, M., Motoi, Y., Watada, H., Kawamori, R., Aoki, S., 2014. Diffusional kurtosis imaging analysis in patients with hypertension. *Jpn. J. Radiol.* 32, 98–104.
- Strandberg, T.E., Pitkala, K., 2003. What is the most important component of blood pressure: systolic, diastolic or pulse pressure? *Curr. Opin. Nephrol. Hypertens.* 12, 293–297.
- Strömmér, J.M., Davis, S.W., Henson, R.N., Tyler, L.K., Cam-CAN, Campbell, K.L., 2018. Physical Activity Mitigates Age-related Differences in Frontal White Matter. *J Gerontol. gly220*.
- Taylor, J.R., Williams, N., Cusack, R., Auer, T., Shafto, M.A., Dixon, M., Tyler, L.K., Cam-CAN, Henson, R.N., 2017. The Cambridge Centre for Ageing and Neuroscience (Cam-CAN) data repository: structural and functional MRI, MEG, and cognitive data from a cross-sectional adult lifespan sample. *NeuroImage* 144, 262–269.
- Torres, E.R., Strack, E.F., Fernandez, C.E., Tumey, T.A., Hitchcock, M.E., 2015. Physical activity and white matter hyperintensities: a systematic review of quantitative studies. *Prev. Med. Rep.* 2, 319–325.
- van Dijk, E.J., Breteler, M.M.B., Schmidt, R., Berger, K., Nilsson, L.-G., Oudkerk, M., Pajak, A., Sans, S., Ridder, M. de, Dufouil, C., Fuhrer, R., Giampaoli, S., Launer, L.J., Hofman, A., 2004. The association between blood pressure, hypertension, and cerebral white matter lesions. *Hypertension* 44, 625–630.
- Vasan, R.S., Beiser, A., Seshadri, S., Larson, M.G., Kannel, W.B., D'Agostino, R.B., Levy, D., 2002. Residual lifetime risk for developing hypertension in middle-aged women and men: the Framingham Heart Study. *JAMA* 287, 1003–1010.
- Verhaaren, B.F.J., Vernooy, M.W., de Boer, R., Hofman, A., Niessen, W.J., van der Lugt, A., Ikram, M.A., 2013. High blood pressure and cerebral white matter lesion progression in the general population. *Hypertension* 61, 1354–1359.
- Vlachopoulos, C., Aznaouridis, K., Stefanadis, C., 2010. Prediction of cardiovascular events and all-cause mortality with arterial stiffness: a systematic review and meta-analysis. *J. Am. Coll. Cardiol.* 55, 1318–1327.
- vonder Heide, R.J., Skipper, L.M., Klobusicky, E., Olson, I.R., 2013. Dissecting the uncinate fasciculus: disorders, controversies and a hypothesis. *Brain* 136, 1692–1707.
- Wareham, N.J., Jakes, R.W., Rennie, K.L., Mitchell, J., Hennings, S., Day, N.E., 2002. Validity and repeatability of the EPIC-Norfolk physical activity questionnaire. *Int. J. Epidemiol.* 31, 168–174.
- Woodward, M., Webster, R., Murakami, Y., Barzi, F., Lam, T.-H., Fang, X., Suh, I., Batty, G.D., Huxley, R., Rodgers, A., 2012. The association between resting heart rate, cardiovascular disease and mortality: evidence from 112,680 men and women in 12 cohorts. *Eur. J. Prev. Cardiol.* 21, 719–726.
- Xu, J., Li, Y., Lin, H., Sinha, R., Potenza, M.N., 2013. Body mass index correlates negatively with white matter integrity in the fornix and corpus callosum: a diffusion tensor imaging study. *Hum. Brain Mapp.* 34, 1044–1052.
- Yamaguchi, Y., Wada, M., Sato, H., Nagasawa, H., Koyama, S., Takahashi, Y., Kawanami, T., Kato, T., 2015. Impact of nocturnal heart rate variability on cerebral small-vessel disease progression: a longitudinal study in community-dwelling elderly Japanese. *Hypertens. Res.* 38, 564–569.
- Zuo, S., Pan, P., Li, Q., Chen, Y., Feng, H., 2017. White matter injury and recovery after hypertensive intracerebral hemorrhage. *Biomed. Res. Int.* 2017, 6138424.