

1 ***Association of cardiovascular risk factors with MRI indices of cerebrovascular***
2 ***structure and function and white matter hyperintensities in young adults***

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38 **Key Points**

39 **Questions:** Are modifiable cardiovascular risk factors in young adults
40 associated with cerebral blood vessel structure and function, and neuroimaging
41 white matter hyperintensities?

42 **Results:** In this cross-sectional study of 125 young adults without clinical
43 evidence of cerebrovascular disease, a higher number of optimal
44 cardiovascular health metrics was correlated with higher cerebral vessel
45 density, higher cerebral blood flow, and lower white matter hyperintensity
46 lesions.

47 **Meaning:** These preliminary findings suggest a relationship between
48 modifiable cardiovascular risk factors and MRI biomarkers of cerebrovascular
49 structure and function and white matter hyperintensities in young adults.
50 Further research is needed to verify these findings and determine clinical
51 importance.

52

53 **Abstract**

54 **Importance:** Risk of stroke and brain atrophy in later life relate to levels of
55 cardiovascular risk in early adulthood. However, it is unknown whether
56 cerebrovascular changes are present in young adults.

57 **Objective:** To examine relationships between modifiable cardiovascular risk
58 factors and cerebrovascular structure, function and white matter integrity in
59 young adults.

60 **Design, Setting, and Participants:** A cross-sectional observational study of
61 125 young adults (aged 18 to 40 years) without clinical evidence of
62 cerebrovascular disease with data collection completed between August 2014
63 and May 2016 at the University of Oxford, United Kingdom. Final data
64 collection was completed on the 31st of May 2016.

65 **Exposures:** The number of modifiable cardiovascular risk factors at
66 recommended levels, based on the following criteria: BMI <25 kg/m²; highest
67 tertile cardiovascular fitness and/or physical activity; alcohol <8 drinks/week;
68 non-smoker for >6 months; blood pressure on awake ambulatory monitoring
69 <130/80 mmHg; a non-hypertensive diastolic response to exercise (peak
70 diastolic blood pressure <90 mmHg), total cholesterol <200mg/dL; and fasting
71 glucose <100mg/dL. Participants were categorized from 0 to 8, with higher
72 numbers indicating healthier risk categories.

73 **Main Outcomes and Measures:** Cerebral vessel density (vessels/cm³), caliber
74 (µm) and tortuosity, brain white matter hyperintensity lesion count (number),
75 and in a subgroup (n=52) brain blood arrival time (seconds) and cerebral blood
76 flow (ml/100g/min) assessed by brain magnetic resonance imaging.

77 **Results** A total of 125 participants, mean age 25±5 years, 49% female, with a mean
78 score of 6.0 (SD 1.4) modifiable cardiovascular risk factors at recommended levels,
79 completed the cardiovascular risk assessment and brain MRI protocol.

80 Cardiovascular risk factors were correlated with cerebrovascular morphology and
81 white matter hyperintensity count in multivariable models. For each additional
82 modifiable risk factor categorized as healthy, vessel density was greater by 0.3
83 vessels/cm³ (95%CI 0.1 to 0.5, p=0.003), vessel caliber was greater by 8µm (95%CI
84 3 to 13, p=0.01) and white matter hyperintensity lesions was lower by 1.6 lesions
85 (95%CI 0.5 to 2.8, p=0.006). Among the 52 participants with available data, cerebral
86 blood flow varied with vessel density and was 2.5ml/100g/min higher for each
87 healthier category of a modifiable risk factor (95%CI 0.16 to 4.89, p=0.03).

88 **Conclusions and Relevance** In this preliminary study, involving young adults
89 without clinical evidence of cerebrovascular disease, modifiable cardiovascular
90 risk factors were associated with MR indices of cerebral vessel structure and
91 function, and white matter hyperintensities. Further research is needed to verify
92 these findings and determine clinical importance.

93 **Key words:** brain health, cardiovascular risk factors, young adults,

94

95

96 **Introduction**

97 A life-course approach to understand risk of cardiovascular disease is well
98 established¹ and it is accepted that changes in cardiac and vascular structure that
99 underlie this risk emerge very early in life^{2, 3}. Whether modifiable cardiovascular risk
100 factors, and novel early life exposures such as preterm birth, influence the early
101 cerebrovasculature is less well studied.

102

103 Cardiovascular risk closely relates to cerebrovascular injury and cognitive decline in
104 older adults⁴. MRI markers of cerebral injury in mid-life, including white matter
105 hyperintensity lesions, are associated with future stroke, dementia and all-cause
106 mortality⁵. Progression of white matter hyperintensity lesions is faster in association
107 with metabolic dysfunction and hypertension⁶. Experimental studies have
108 demonstrated that cardiovascular risk factors result in remodelling of the brain
109 vasculature, including vessel rarefaction, lower vessel caliber and cerebral blood
110 flow⁷. Elevated blood pressure, dyslipidemia and low fitness in early adulthood are
111 known to predict brain health in older adult life⁸⁻¹⁰. Whether cerebrovascular
112 morphological changes are already evident in young adults, and correlate with white
113 matter hyperintensity lesions and risk factors at this age, is unclear.

114

115 Advances in brain MRI allow automated segmentation and analysis of vessel
116 morphology, white matter hyperintensity lesions^{11, 12} and blood flow¹³; thus making it
117 possible to estimate brain vascular and structural status for an individual^{11, 12}.

118 Therefore, the objective of the current study was to use multi-modality brain imaging
119 to test the hypothesis that cardiovascular risk profiles are correlated with variation in
120 vessel morphology and white matter hyperintensity lesions in young adults.

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124 **Methods**

125 **Study design and participants**

126 This was a cross-sectional observational study completed between August 2014 and
127 May 2016. The South Central Research Ethics Committee for the National Health
128 Service Health Research Authority (NHS HRA) approved the study (14/SC/0275). All
129 participants gave written informed consent. Measurements were completed at the
130 Oxford Cardiovascular Clinical Research Facility and Oxford Centre of Clinical
131 Magnetic Resonance Research, John Radcliffe Hospital, University of Oxford, United
132 Kingdom. Image analysis was performed using pipelines developed at the Hotchkiss
133 Brain Institute, University of Calgary and Wellcome Centre for Integrative
134 Neuroimaging, University of Oxford¹²⁻¹⁶. Final data collection was completed on the
135 31st of May 2016.

136

137 Participants aged 18 to 40 years were recruited through purposive active and
138 passive recruitment¹⁷ including local advertising, invitation from local birth cohort
139 studies and invitation from the Oxford University Hospital Hypertension Service.
140 Strategies were designed to recruit adults with a heterogeneity in risk factors known
141 to be present in young adult populations including traditional risk factors such as
142 hypertension and more novel factors such as gestational age. Participants were
143 excluded if they had previous cardiovascular or cerebrovascular events, renal
144 dysfunction or metabolic disease including diagnosis of familial hyperlipidaemia.
145 Participants with secondary causes of hypertension such as renal vascular disease,
146 vascular anomalies or adrenal dysfunction were excluded following assessment in
147 Oxford University Hospital Hypertension Service.

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152 **Procedures**

153 **Cardiovascular Risk Assessment**

154 Participants attended a research clinic in the morning after a 12-hour fast to complete
155 a detailed cardiovascular risk assessment (Supplementary Data eMethods 1).

156 Measurements included: body size, fasting blood samples for total cholesterol, high-
157 density lipoprotein, low-density lipoprotein, triglycerides, highly sensitive c-reactive
158 protein, glucose, and insulin levels, clinic and 24-hour blood pressure, as well as
159 peak oxygen uptake and exercise blood pressure (from cardiopulmonary exercise
160 testing). In addition, participants completed a detailed lifestyle questionnaire and had
161 seven complete days of objectively measured physical activity. Post-hoc, participants
162 were assessed for a cardiovascular score based on 8 modifiable risk factors, with 1
163 point awarded for each healthier category of a modifiable risk factor according to the
164 following criteria: BMI <25 kg/m²; highest tertile cardiovascular fitness and/or physical
165 activity; alcohol <8 drinks/week; non-smoker for >6 months; blood pressure on
166 awake ambulatory monitoring <130/80 mmHg; a non-hypertensive diastolic response
167 to exercise (peak diastolic blood pressure <90 mmHg), total cholesterol <200mg/dL;
168 and fasting glucose <100mg/dL. The score was adapted from established
169 cardiovascular health scores to include alcohol consumption and dynamic exercise
170 blood pressure response, as known independent risk factors for brain health¹⁹⁻²¹. The
171 thresholds for healthy criteria were set to be consistent with recommended public
172 health guidelines and existing literature^{4, 9, 18-20}.

173

174 **Brain Imaging and Analysis**

175 Individuals underwent a multimodality MRI scan (3.0T Trio Tim, Siemens, Munich,
176 Germany). The MRI protocol included T1-weighted structural, T2-weighted Fluid-
177 Attenuated Inversion Recovery (FLAIR), Diffusion Tensor Imaging (DTI) and Time-of-
178 Flight (TOF) MR Arteriogram (MRA) (Supplementary Data eMethods 2). MR imaging

179 was completed fasted and prior to exercise testing. Complete acquisition and
180 analysis methods are presented in the on-line supplement.
181
182 T1-weighted images were processed using FMRIB Software Library (FSL) tools²¹.
183 Brain vessel segmentation was completed on TOF MRA using previously described
184 automated segmentation tools (supplement eFigure 1)^{12, 16}. Binary segmentations
185 were used to determine vessel density, caliber and tortuosity.
186
187 White matter hyperintensity (WMH) lesions and associated volumes were segmented
188 using the Brain Intensity AbNormality Classification Algorithm (BIANCA); a fully-
189 automated, supervised method for WMH detection^{11, 22}. BIANCA classifies image
190 voxels based on their intensity and spatial features, where the intensity features were
191 extracted from T2-weighted FLAIR, T1-weighted and DTI fractional anisotropy (FA)
192 images, FA images were generated using DTI tools, FSL topup, FSL eddy and
193 DTIFit^{21, 23}. WMH masks were manually segmented from 10 images to use as the
194 training set for BIANCA, these were independently verified by a neurologist (TS) and
195 radiologist (DM) blinded to participant risk profile. Lesion count was selected as the
196 most sensitive outcome of white matter change in young adults in whom a single
197 lesion, independent of volume, could be considered abnormal²⁴. Minimum lesion size
198 used in analysis was 1 mm³.
199
200 A subgroup of 52 participants also had multi-delay vessel-encoded
201 pseudocontinuous Arterial Spin Labelling (ASL), identical to a previously published
202 protocol¹³. Cerebral blood flow and blood arrival time were estimated from ASL
203 images using a previously described analysis pipeline^{13, 15}. Gray matter masks were
204 used to calculate the average cerebral blood flow after linear registration of the ASL
205 MRI to the T1-weighted MRI dataset.
206

207

208 **Statistical Analysis**

209 Recruitment was continued to 125 participants for an estimated power of 90%
210 at $P=0.05$ to identify a 0.70-SD difference in vessel density, vessel caliber and white
211 matter lesion count between lowest and highest cardiovascular risk tertile groups.
212 Arterial spin labelling (ASL) MRI imaging was added during the course of the study to
213 provide a subgroup of 52 participants, recruited sequentially for an estimated 80%
214 power to detect a 10% difference in cerebral blood flow²⁵.

215

216 Existing literature on risk predictors of brain health was used to define an a priori set
217 of potential correlates of MRI brain health in young adults^{4, 9, 18-20}. These were
218 grouped as: 1) non-modifiable, including age, sex, gestational age, and 2) modifiable,
219 including systolic blood pressure, body mass index (BMI), peak exercise capacity
220 (oxygen uptake ml/min/kg), peak exercise diastolic blood pressure, weekly vigorous
221 activity level, alcohol consumption, smoking history, lipid profile, glucose and insulin
222 resistance, and current hypertension medication.

223

224 In a priori analysis, bivariable and multivariable analysis was completed to
225 investigate correlation between the defined cardiovascular risk markers and brain
226 imaging findings. In this multivariable analysis to reduce multiple testing and potential
227 interaction between the variables, the model was restricted to a subset of variables
228 (resting systolic blood pressure, BMI, vigorous physical activity level, alcohol
229 consumption and smoking). This model was adjusted for non-modifiable factors
230 including age, sex and gestational age.

231

232 In post-hoc analysis, the individuals' combined cardiovascular score from across 8
233 risk factors, was used as a metric of overall modifiable cardiovascular health. The
234 relationships between the individuals' modifiable cardiovascular score and brain

235 imaging findings were studied using linear regression adjusted for age and sex.

236 Comparison between brain imaging findings was made between groups of

237 participants in the lowest and highest tertiles for the cardiovascular score.

238

239 In addition, bivariable analysis was completed to investigate correlation between

240 vessel morphology and white matter hyperintensity lesion count and in a subgroup

241 (n=52), blood arrival time and cerebral blood flow. These relationships were further

242 investigated with fixed entry linear regression models adjusted for modifiable and

243 non-modifiable factors used in the models above.

244

245 Statistical analysis was undertaken using Statistical Product and Service Solutions

246 (SPSS) Version 22 (Armonk, New York, U.S). Normality of variables was assessed

247 by visual assessment of curves. If normally distributed, results are presented as

248 mean \pm standard deviation for continuous variables, otherwise median and

249 interquartile range. For categorical variables, number and percentage are presented.

250 Comparison between groups for continuous variables was performed with a 2-sided,

251 independent-sample Student's *t* test. All multivariable analysis was completed using

252 forced entry linear regression with residual analysis completed to assess model

253 assumptions. All multivariable analyses were adjusted for age and sex. All tests

254 were 2-sided, P-values <0.05 were considered statistically significant with no

255 adjustment for multiple comparison. Due to multiplicity of testing all results were

256 considered exploratory. Results are presented as point estimates and 95%

257 confidence intervals stated in units appropriate to the risk factor and brain imaging

258 findings being reported. Graphpad Prism 7 software was used for statistical figures

259 and mean with 95% confidence intervals presented.

260

261

262

263

264 **Results**

265 A total of 125 participants completed the brain MRI protocol and cardiovascular risk
266 assessment study measures. The mean age of participants was 24.7 ± 5.0 years, 61
267 participants were female (49%), the mean gestational age was 36.6 ± 4.3 weeks,
268 educational attainment was high with 86 completing University level education
269 (68.8%), 29 participants had prior history of hypertension of which 21 were on anti-
270 hypertension medications (16.8%) (Table 1). The distributions of MRI brain outcomes
271 between lowest and highest quintile of the respective measures are presented in the
272 supplement (eTable 1). The 52 participants with available cerebral blood flow data
273 shared a comparable demographic profile as the overall study group (mean age 24.6
274 ± 5.0 years, 42% female (n=22), gestational age 37.2 ± 3.6 weeks, and 10 participants
275 were on anti-hypertension medications (19.2%).

276

277 **Modifiable risk factors and association with brain vessel structure and white**
278 **matter hyperintensity lesions**

279 Association between risk factors (SBP, BMI, smoking pack years, Ex DBP,
280 cholesterol/HDL ratio, hypertension treatment) and brain vessel morphology are
281 presented in Table 2. Vessel tortuosity only varied with gestational age in both
282 bivariable and adjusted models (0.005 unit tortuosity change/gestational week,
283 95%CI 0.001 to 0.009, $p=0.007$) (Table 2 and Supplementary Data, eTable 2). In the
284 multivariable models, systolic blood pressure (-0.2 vessels/cm³ per 10mmHg, 95%CI
285 -0.4 to -0.004 , $p=0.04$), smoking (2 vessels/cm³ per 10 pack years, 95%CI 0.6 to 3.0,
286 $p=0.04$) and body mass index (-0.1 vessels/cm³ per 1kg/m², 95%CI -0.15 to -0.01 ,
287 $p=0.02$) were significantly correlated with vessel density, while vessel caliber was
288 correlated with systolic blood pressure ($-6\mu\text{m}$ per 10mmHg, 95%CI -10.0 to -0.5 ,
289 $p=0.03$) and smoking ($40\mu\text{m}$ per 10 pack years, 95%CI 2.0 to 80.0, $p=0.04$). In
290 bivariable models, number of white matter hyperintensity lesions correlated with

291 smoking (8 lesions per 10 pack years, 95%CI 1.5 to 14.4, p=0.02), exercise diastolic
292 blood pressure (1 lesions per 10mmHg, 95%CI 0.1 to 2.4, p=0.04), and alcohol
293 consumption (4 lesion per 10 weekly alcoholic drinks, 95%CI 0.3 to 8.0, p=0.03),
294 (Supplementary Data, eTable 3).

295

296 Healthier categories on the modifiable cardiovascular score correlated with vessel
297 morphology (Table 4.) Each additional healthier category of risk factor was
298 associated with a 0.3 vessels/cm³ higher vessel density (95%CI 0.1 to 0.5, p=0.003)
299 and 8µm greater vessel caliber (95%CI 3.0 to 13.0, p=0.01). Similarly, white matter
300 hyperintensity lesion count correlated with the cardiovascular score with 1.6 fewer
301 white matter hyperintensity lesions per additional healthier category of risk factor
302 (95%CI to -3.0 to -0.5, p=0.006). In addition, the cardiovascular score correlated with
303 total volume of white matter hyperintensity adjusted for brain size with 51 mm³ lower
304 white matter hyperintensity lesion volume per additional healthier category of risk
305 factor (95%CI to -87 to -15 mm³ p=0.006). Differences in vessel morphology and
306 white matter hyperintensity lesions between tertiles of the study group, divided based
307 on the cardiovascular score, are presented in Figure 1.

308

309 **Vessel Morphology and brain MRI biomarkers of cerebral blood flow, arrival** 310 **time and white matter lesion count**

311 To explore whether cerebral blood flow also varied with cardiovascular risk factors, a
312 subgroup (n=52) analysis was performed in those with cerebral blood flow measures
313 (mean cerebral blood flow 60 ml/100g/min (SD 11.5) and mean blood arrival time
314 1.01 seconds (SD 0.08). Slower blood arrival time (0.1 seconds per 1kg/m², 95%CI
315 0.001 to 0.05, p=0.001) and lower cerebral blood flow (-1.1 ml/100g/min per 1kg/m²,
316 95%CI -2.0 to -0.1, p=0.03) were correlated with higher BMI (Supplementary Data,
317 eTable 3). Cerebral blood flow was also lower in correlation with anti-hypertensive
318 medication 11 ml/100g/min (95%CI -18 to -3, p=0.007). Cerebral blood flow was

319 2.5ml/100g/min higher for each additional healthier category of the cardiovascular
320 score (95%CI 0.16 to 4.89, p=0.03). There was no significant correlation between
321 blood arrival time and the cardiovascular scores (Table 4).

322

323 In multivariable analysis, controlling for modifiable risk factors (SBP, BMI, VPA,
324 smoking, alcohol intake) blood arrival time and cerebral blood flow varied with
325 cerebral vessel density, with each additional vessel per cm³ correlating with a 0.015
326 seconds faster blood arrival time (95%CI -0.03 to -0.002, p=0.02) and 3 ml/100g/min
327 increase in cerebral blood flow (95%CI 0.7 to 5.4, p=0.01). Vessel density was
328 inversely correlated with white matter hyperintensity lesion count with 1.5 fewer
329 lesions per unit increase in vessel density per cm³ (95%CI to -2.7 to -0.4, p=0.01).
330 (Table 3).

331

332 **Discussion**

333 In this cross-sectional study, optimal status of modifiable cardiovascular risk factors
334 in young adults were associated with differences in brain vessel structure and
335 function as well as a lower number of white matter hyperintensity lesions. Higher
336 vessel density correlated with both higher cerebral blood flow and lower white matter
337 lesion counts.

338

339 To date, studies tracking changes in brain vascular measures have largely focused
340 on the transition from middle age to older adulthood. Cerebral blood flow is estimated
341 to decline over the life course²⁶ with risk of dementia in older adults being 2 to 3 fold
342 higher in those whose cerebral blood flow is below 55 ml/100g/min²⁷. Vascular
343 dementia has also been associated with lower vascular density in brains of adults
344 who have an early diagnoses of disease²⁸. In the current study, young adults in the
345 lowest tertile for the modifiable cardiovascular score had approximately 1 vessel/cm³
346 lower vessel density and a mean value for cerebral blood flow of 55 ml/100g/min,

347 which is in the bottom 40% of the current study population. Therefore, the distribution
348 of MRI findings observed in the current study raises the potential that some
349 individuals may be starting to diverge on to different risk trajectories for brain
350 vascular health in early adulthood. Furthermore, levels of cerebral blood flow
351 associated with an increased risk of dementia are evident in some young adults. No
352 participants had clinically significant white matter hyperintensity lesion volumes but
353 lesion count was up to 4 lesions lower in the highest tertile of optimal status of
354 modifiable risk factors.

355

356 Adverse modifiable cardiovascular risk factors are major determinants of white
357 matter hyperintensity progression²⁹, with small lesions increasing in size or clustering
358 into confluent lesions³⁰. Accumulation of lesions from an early age might explain why,
359 by mid-life, white matter hyperintensity lesion volume is an established predictor of
360 future stroke and dementia risk⁵. The longitudinal relationships between vessel
361 morphology, cerebral perfusion and white matter lesion burden are uncertain.
362 However, the patterns observed in the current study may suggest that resilience of
363 the white matter, and potential to withstand risk exposures, may be influenced by the
364 vascular morphology of an individual.

365

366 Modifiable risk factors such as blood pressure, BMI, smoking and lipid profile are
367 known to drive systemic vascular disease in young adults in part through biological
368 vascular disorders including endothelial dysfunction and oxidative stress³¹⁻³³. The
369 current study suggests the cerebrovasculature may be similarly affected. Novel early
370 life factors, such as preterm birth, are linked with early vascular disease³⁴ and the
371 third trimester and early neonatal period are hypothesized to be times of significant
372 vascular remodelling. In this study, gestational age was associated with vessel
373 tortuosity, consistent with previous reports in infants³⁵, but not other cerebrovascular
374 measures. Further work is needed to understand whether this was because

375 participants were largely born late preterm or because cardiovascular risk profile
376 overwhelms this early exposure.²⁸.

377

378 The observed association between brain vascular measures and modifiable risk
379 factors raises the potential for targeted intervention to prevent progression to
380 disease. Reducing multiple risk factors can change risk trajectories and reduce
381 vascular disease burden³⁶, with sustained lifestyle intervention and active blood
382 pressure lowering associated with lower burden of white matter hyperintensity
383 lesions and improved cerebral perfusion^{37, 38}. These interventions typically achieve
384 25% improvements in cardiovascular fitness and 10 mmHg reductions in blood
385 pressure^{37, 38}, comparable to differences between high and low tertile groups for the
386 cardiovascular scores in this study.

387

388 However, lifestyle-based primary cardiovascular prevention in young adults requires
389 complex intervention design. Recent systematic review of interventions in young
390 hypertensives demonstrated that the optimal way to intervene is poorly understood
391 with lack of sustained effect³⁹. The alternative to lifestyle interventions would be
392 pharmacological treatment. However, in this study group higher blood pressure was
393 associated with reduced vessel density and anti-hypertensive use was associated
394 with lower cerebral blood flow. Therefore, further work to identify optimal
395 interventions in young adults to maintain autoregulation of cerebral blood flow, while
396 reducing risk, may be required.

397

398 **Limitations**

399 This study has several limitations. First, a small sample recruited at a single site
400 increases risk of bias and type 1 error while the study may be underpowered to
401 identify subtle correlations with some risk factors. Second, purposive mixed passive
402 and active recruitment strategies mean the sample is not population-based and could

403 be considered similar to a convenience sample. Therefore, it is not possible to
404 generalise expected prevalence of cerebrovascular changes to the wider population.
405 Third, the study is cross-sectional and causality or even temporality of the observed
406 relationships cannot be inferred. Fourth, the cardiovascular risk assessment would
407 be strengthened by detailed dietary questionnaires which were not included in this
408 study. Fifth, cerebral blood flow was only available in a subgroup so ability to
409 understand interactive effects of modifiable risk factors, vascular remodelling and
410 perfusion on white matter integrity is limited. Sixth, longitudinal follow up will be
411 required to determine the clinical significance of the observed findings. As such, this
412 study should be considered preliminary and exploratory but does support a need for
413 future work. The complexity of the imaging protocol and associated financial costs
414 may limit its widespread use but large multi-centre studies with more focused
415 protocols, and extended follow up, may have the potential to track vascular
416 remodelling and assessment of impact on white matter and later disease.

417

418 **Conclusion**

419 In this preliminary study involving young adults without clinical evidence of
420 cerebrovascular disease, modifiable cardiovascular risk factors were associated with
421 MRI indices of cerebral vessel structure and function, and white matter
422 hyperintensities. Further research is needed to verify these findings and determine
423 clinical importance.

424

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431 **Authorship**

432 All authors meet criteria for authorship: WW, AJL, HB, CF, HD, PL contributed to the
433 design of the study, secured funding and refined the overall study protocol and lead
434 the project delivery, NF, LG, TO, MJ, CM contributed to the development of the Brain
435 MRI protocol and related pipelines, AJL, WW, OH, JF, SN contributed to image
436 acquisition and quality control, WW, NF, LG, TO, MJ, CM, JB, HB, TS, DM, RP
437 contributed to brain MRI image processing and analysis, AD advised on
438 accelerometer protocol for objective physical activity measurement and completed
439 analysis of raw data, WW, AJL, HB, OH, completed cardiovascular risk assessment
440 and analysis of measures, WW, CF, AJL, PL and EF contributed to the statistical
441 analysis, WW wrote the manuscript with support from LG, OH, AJL, CF, NF, HD, PL.
442 All authors contributed to revision of the manuscript. PL completed the final edit of
443 the manuscript.

444

445 **Disclosures**

446 Dr. Okell reports grants from The Royal Academy of Engineering, during the conduct
447 of the study; In addition, Dr. Okell has a patent (US Patent 9,757,047) with royalties
448 paid from Siemens Healthcare. All other authors declare no competing interests.

449

450 **Role of the funding source**

451 The funders of the study had no role in design and conduct of the study; collection,
452 management, analysis, and interpretation of the data; preparation, review, or
453 approval of the manuscript; and decision to submit the manuscript for publication.

454

455 **Access to data**

456 Dr. Williamson and Professor Leeson had full access to all of the data in the study
457 and take full responsibility for the integrity of the data and the accuracy of the data
458 analysis.

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588 Table 1. Age, demographics and cardiovascular risk profile of study group.

	Study Group (n=125)
Demographics	
Age, mean (SD), years	24.7 (5.0)
Female, n, (%)	61 (49%)
Gestational Age, mean (SD), weeks	36.6 (4.3)
Smoking, n, (%)	19 (15.2)
Smokers' median pack years (Q1-Q3)	2.7 (6.7)
Alcohol, n, (%)	97 (77.6)
Alcohol consumers' median drinks per week (Q1-Q3)	4.0 (4.0)
Hypertension Diagnosis, n, (%)	29 (23.0)
Taking Hypertension Medication, n (%)	21 (16.8)
FHx Stroke or CHD, n, (%)	10 (8)
Education Level	
Completed University, n, (%)	86 (68.8)
Anthropometrics	
Height, mean (SD), m	1.73 (0.1)
Weight, mean (SD), kg	70.9 (13.8)
BMI, mean (SD), kg/m ²	23.6 (3.7)
Blood pressure, mean (SD), mmHg	
Resting Systolic	122.0 (11.6)
Resting Diastolic	71.3 (9.55)
Ambulatory Awake Systolic	129.6 (11.8)
Ambulatory Awake Diastolic	76.9 (8.0)
Peak Exercise Systolic	174.8 (25.4)
Peak Exercise Diastolic	87.1 (12.4)
Fitness	
Peak VO ₂ , mean (SD), ml/kg/min	37.9 (9.6)
Peak Respiratory Exchange Ratio, mean (SD)	1.2 (0.06)
VPA, median (Q1-Q3), hours per week	0.74 (1.25)
MVPA, median (Q1-Q3), hours per week	14.73 (6.09)
Biochemistry	
Total Cholesterol, mean (SD), mg/dL	170.15 (29.0)
LDL, mean (SD), mg/dL	97.45 (25.9)
HDL, mean (SD), mg/dL	55.68 (11.2)
TChol:HDL ratio, mean (SD)	3.18 (0.85)
Triglyceride, median (IQR), mg/dL	74.4 (54.0)
Blood Glucose, mean (SD), mg/dL	88.2 (7)
HOMA-IR, mean (SD)	0.77 (0.46)
HsCRP, median (Q1-Q3), mg/L	0.57 (1.16)
Brain MRI Vessel, Perfusion and White Matter Parameters	
Brain vessel density, mean (SD), vessels/cm ³	8.3 (1.41)
Brain vessel calibre, mean (SD), µm	531 (36)
Brain vessel tortuosity, mean (SD)	1.49 (0.088)
Brain white matter hyperintensity lesion count, mean (SD)	20.9 (7.9)
Brain Blood Arrival Time (SD), seconds	1.01 (0.08)
Cerebral Blood Flow (SD), ml/100g/min	60 (11.5)

589 Abbreviations: FHx, Family History, BMI, body mass index; SBP, systolic blood
590 pressure; DBP, diastolic blood pressure; Peak VO₂, Peak Oxygen Uptake; VPA,
591 Vigorous Physical Activity; MVPA, Moderate to Vigorous Physical Activity; LDL, low
592 density lipoprotein; HDL, high density lipoprotein; T Chol: total cholesterol; HsCRP,
593 highly sensitive C reactive protein; HOMA-IR, homeostatic model assessment of

594 insulin resistance. Brain blood arrival time and cerebral blood flow data was available
595 in 52 participants.
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Table 2. Association between non-modifiable and modifiable risk factors and brain vessel morphology (vessel density, caliber and tortuosity).

	Bivariable Point Estimate (95 %CI)	P value	Adjusted Point Estimate (95 %CI)	P value
Brain Vessel Density (vessels/cm³)		Model Statistics R²=0.20 p =.009		
Gestational Age, weeks	-0.001 (-0.06 to 0.06)	.98	-0.02 (-0.08 to 0.03)	.42
Resting SBP, mmHg	-0.03 (-0.05 to -0.004)	.02	-0.02 (-0.04 to -0.0004)	.046
BMI, kg/m ²	-0.10 (-0.16 to -0.02)	.01	-0.08 (-0.15 to -0.01)	.02
VPA, hours per week	0.10 (-0.17 to 0.39)	.42	-0.04 (-0.28 to 0.20)	.75
Alcoholic drinks per week	-0.10 (-0.025 to -0.008)	.31	-0.01 (-0.04 to 0.02)	.41
Smoking pack years	0.20 (0.06 to 0.30)	.004	0.17(0.06 to 0.28)	.004
Peak VO ₂ , ml/kg/min	0.01 (-0.02 to 0.04)	.5	.	.
Peak Ex DBP, mmHg	-0.02 (-0.04 to -0.003)	.047	.	.
Cholesterol/HDL Ratio	-0.40 (-0.69 to -0.06)	.02	.	.
HOMA IR	-0.56 (-1.17 to 0.04)	.07	.	.
Hypertension Rx	0.75 (-0.01 to 1.5)	.05	.	.
Brain Vessel Caliber (µm)		Model Statistics R²=0.24 p=.001		
Gestational Age, weeks	-0.1 (-2.0 to 1.0)	.88	-1.0 (-3.0 to 0.5)	.16
Resting SBP, mmHg	-0.4 (-1.0 to 2.0)	.15	-0.6 (-1.0 to -0.05)	.03
BMI, kg/m ²	-1.0 (-3.0 to 1.0)	.33	-1.0 (-3.0 to 1.0)	.42
VPA, hours per week	1.0 (-6.0 to 8.0)	.73	-2.0 (-9.0 to 4.0)	.49
Alcoholic drinks per week	-0.1 (-1.0 to 1.0)	.70	-1.0 (-2.0 to 0.1)	.09
Smoking pack years	3.0 (-0.2 to 6.0)	.06	4.0 (0.2 to 8.0)	.04
Peak VO ₂ , ml/kg/min	0.4 (-0.2 to 1.0)	.19	.	.
Peak Ex DBP, mmHg	-1.0 (-1.4 to -0.4)	<.001	.	.
Cholesterol/HDL Ratio	-3.0 (-10.0 to 5.0)	.52	.	.
HOMA IR	-14.0 (-30 to 1.0)	.08	.	.
Hypertension Rx	10 (-9.0 to 31.0)	.27	.	.
Brain Vessel Tortuosity		Model Statistics R²=0.1 p=.26		
Gestational Age, weeks	0.005 (0.001 to 0.009)	.007	0.006 (0.001 to 0.01)	.01

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Also modelled was the association between these risk factors and tortuosity, and only gestational age was related, full analysis presented in supplement (eTable 1). Model adjusted for non-modifiable factors of age, sex, gestational age and modifiable risk factors of systolic blood pressure, body mass index, vigorous physical activity, weekly alcohol consumption and smoking status. Abbreviations and units: SBP, systolic blood pressure (mmHg); BMI, body mass index (kg/m²); VPA, Vigorous Physical Activity (hours per week); Alcohol (drinks per week); Smoking (pack years); Peak VO₂, Peak Oxygen Uptake (ml/kg/min); Ex DBP, Peak exercise diastolic blood pressure (mmHg), Cholesterol/HDL ratio, ratio total cholesterol/high density lipoprotein; HOMA-IR, homeostatic model assessment of insulin resistance,

610 Hypertension Rx participant taking prescription medications for hypertension
611 (yes/no). Exposure variables were available for all participants. The point estimate
612 refers to the magnitude of change in the vessel morphology variable per unit change
613 in the non-modifiable and modifiable variables.

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615 **Table 3. Association of vessel morphology (density, caliber, tortuosity)**
616 **with measures of brain blood arrival time, cerebral blood flow and white**
617 **matter hyper-intensity lesions**

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	Bivariable Point Estimate (95 %CI)	P Value	Adjusted Point Estimate (95 %CI)	P Value
Blood Arrival Time (seconds) (n=52)				
Brain Vessel Density, vessels/cm ³	-0.03 (-0.04 to -0.01)	.002	-0.015 (-0.03 to -0.002)	.02
Brain Vessel Caliber, µm	0.08 (-0.61 to 0.78)	.81	0.22 (-0.28 to 0.71)	.38
Brain Vessel Tortuosity	0.13 (-0.15 to 0.4)	0.36	-0.014 (-0.23 to 0.21)	.90
Cerebral Blood Flow (ml/100g/min) (n=52)				
Brain Vessel Density, vessels/cm ³	4.0 (1.8 to 6.2)	.001	3.1 (0.7 to 5.4)	.01
Brain Vessel Caliber, µm	48.6 (-50.3 to 147.6)	.34	-8.0 (-126.1 to 110.1)	.89
Brain Vessel Tortuosity	3.8 (-36.4 to 44.1)	.85	12.9 (-35.4 to 61.1)	.60
White Matter Hyperintensity Lesion Count (lesions) (n=125)				
Brain Vessel Density, vessels/cm ³	-1.1 (-2.2 to 0.06)	.06	-1.5 (-2.7 to -0.4)	.01
Brain Vessel Caliber, µm	13.5 (-31.3 to 58.4)	.55	12.1 (-34.5 to 57.8)	.61
Brain Vessel Tortuosity	-17.5(-35.3 to 0.24)	.05	-11.0 (-29.0 to 7.0)	.23

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620 Model adjusted for non-modifiable factors of age, sex, gestational age and
621 modifiable risk factors of systolic blood pressure, body mass index, vigorous
622 physical activity, weekly alcohol consumption and smoking status. Also
623 modelled were the association with vessel caliber and tortuosity, only vessel
624 density was related. The point estimate refers to the magnitude of change in blood
625 arrival time, cerebral blood flow or number of white matter hyperintensity lesions per
626 unit change in respective vessel morphological variable.

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Table 4. Modifiable cardiovascular score and association with brain vessel morphology, cerebral blood flow and white matter hyperintensity lesion count

Modifiable Cardiovascular Score	Brain Vessel Density, vessels/cm ³ point estimate (95%CI)	Brain Vessel Caliber, μm point estimate (95%CI)	Brain Vessel Tortuosity point estimate (95%CI)	Brain Blood Arrival Time, seconds (n=52) point estimate (95%CI)	Cerebral Blood Flow, ml/min/100g (n=52) point estimate (95%CI)	Brain white matter hyperintensity lesion count, number point estimate (95%CI)
1 (n=2)	9.2 (6.4 to 11.9)	505 (437 to 573)	1.52 (1.44 to 1.50)	.	.	36.2 (24.3 to 48.0)
2 (n=0)
3 (n=4)	6.9 (5.0 to 8.8)	518 (470 to 565)	1.49 (1.46 to 1.52)	1.26 (1.16 to 1.36)	66.6 (50.4 to 82.0)	24.0 (16 to 32)
4 (n=14)	7.4 (6.6 to 8.2)	512 (493 to 532)	1.47 (1.45 to 1.53)	1.22 (1.16 to 1.27)	54.2 (45.5 to 63.0)	25.0 (21.0 to 29.2)
5 (n=27)	8.0 (7.4 to 8.5)	524 (510 to 540)	1.51 (1.47 to 1.55)	1.21 (1.16 to 1.26)	54.6 (47.0 to 62.0)	22 (19.0 to 25.3)
6 (n=36)	8.5 (8.0 to 9.0)	533 (521 to 545)	1.49 (1.46 to 1.52)	1.19 (1.15 to 1.23)	60.2 (54.0 to 67.0)	21.0 (19.0 to 24.0)
7 (n=33)	8.5 (8.0 to 9.0)	542 (530 to 555)	1.48 (1.45 to 1.52)	1.18 (1.14 to 1.22)	64.0 (57.8 to 70.0)	19.0 (16.2 to 21.8)
8 (n=9)	9.1 (8.2 to 10.0)	540 (518 to 563)	1.54 (1.46 to 1.62)	1.18 (1.11 to 1.24)	68.0 (57.6 to 78.1)	20.0 (15.4 to 26.6)
Change in point estimate per additional score (n=125)	0.31 (0.112 to 0.514)	8.0 (3.0 to 13.0)	0.005 (-0.008 to 0.18)	-0.014 (-0.03 to 0.001)	2.5 (0.16 to 4.89)	-1.6 (-3.0 to -0.5)

636 Participants were assessed for a cardiovascular score, for each healthier category of
637 a modifiable risk factor according to the following criteria: BMI <25 kg/m²; highest tertile
638 cardiovascular fitness and/or physical activity; alcohol <8 drinks/week; non-smoker for
639 >6 months; blood pressure on awake ambulatory monitoring <130/80 mmHg; a non-
640 hypertensive diastolic response to exercise (peak diastolic blood pressure <90
641 mmHg), total cholesterol <200mg/dL; and fasting glucose <100mg/dL. Adjusted for
642 age and sex. The point estimate refers to the magnitude of change in the dependent
643 variable per unit change in the modifiable cardiovascular score.

Figure 1. Comparison of white matter lesion count and vessel morphology between groups of participants based on their modifiable cardiovascular score.

The cardiovascular score provided a cumulative score for each of the following factors: high cardiovascular fitness (top tertile of peak oxygen uptake ($\geq 110\%$ predicted peak oxygen uptake) or participating in ≥ 75 minutes vigorous physical activity per week); not smoking in last 6 months; alcohol < 8 drinks/week; ambulatory awake blood pressure $< 130/80$ mmHg; body mass index < 25 kg/m²; fasting total cholesterol < 200 mg/d; fasting blood glucose < 100 mg/dL; and diastolic blood pressure at peak exercise ≤ 90 mmHg. Figure 1 presents a post-hoc comparisons between groups of participants who score 0 to 5 positive factors (n=47), 6 factors (n=36) and 7 to 8 positive factors (n=42). The groupings were defined to approximate tertiles of the combined cardiovascular score. Panel A presents the white matter lesions counts for individual participants and associated group mean and 95% CI, Panels B and C present the mean group values and 95% CI. Participants with 7 to 8 healthier categories of risk factor have a mean vessel density 11% higher than participants with 0 to 5 healthier categories of risk factor (Panel B, 8.6 vessels/cm³ (SD 1.39) vs 7.8 vessels/cm³ (SD 1.21) p=0.007), a mean vessel caliber 3% higher (Panel C, 538 μ m (SD 21) vs 522 μ m (SD 45) p=0.02) and on average 20% lower white matter hyperintensity lesion counts (Panel A, 19.6 lesions (SD 7.8) vs 23.5 lesions (SD 8.6) p=0.03). Panels present group means and 95%CI and reported group differences are adjusted for age and sex.

Association of cardiovascular risk factors with MRI indices of cerebrovascular structure and function and white matter hyperintensities in young adults

Online Data Supplement

eMethod 1. Detailed description of cardiovascular risk assessment.

eMethod 2. Detailed description of brain magnetic resonance imaging acquisition and analysis.

eTable 1. Quintile distribution of Brain MRI measures and mean difference between top and bottom quintile.

eTable 2. Association between non-modifiable and modifiable risk factors and brain vessel tortuosity.

eTable 3. Association between modifiable risk factors, brain blood arrival time, cerebral blood flow and white matter hyperintensity lesion count.

eFigure 1. Rows A1 and A2 provide a case comparison of the MRI imaging modalities and analysis tools used to assess brain vessel morphology, white matter lesion count, and cerebral blood flow.

eMethod1. Detailed description of cardiovascular risk assessment.

Participants attended a research clinic in the morning after a 12-hour fast. Body size was measured at a combined digital height and weight station (Seca 798, Seca, Hamburg, Germany). Participants completed a detailed questionnaire on medical history, socioeconomic status, and self-reported behaviours such as nutritional intake, smoking and alcohol consumption. Fasting blood samples were drawn, centrifuged, separated within 30 minutes, and stored at -80°C for later analysis. Total cholesterol, high-density lipoprotein, triglycerides, glucose, and insulin levels were measured at the John Radcliffe Biochemistry Laboratory. Low-density lipoprotein was calculated by Friedewald formula and insulin resistance by homeostatic model assessment^{1, 2}. Blood pressure was reported as mean of three measures recorded supine after five-minute rest using a size appropriate cuff and an automatic blood pressure monitor (A & D Instruments Ltd., Japan). Cardiopulmonary exercise test was completed on a stationary cycle ergometer (Ergoline GmbH, Germany) using an incremental exercise protocol. Participants began with a one-minute rest period followed by two-minute warm-up at 20 Watts. They were instructed to maintain a rate of 60 revolutions per minute (RPM) throughout the test. To limit total exercise duration to approximately 8-12 minutes the initial workload started at 35 to 75 Watts dependent on self-reported fitness. Workload then incremented 15 Watts per minute. Heart rate was recorded using continuous ECG monitoring, and manual blood pressure was recorded every third minute and at peak exercise. Participants were encouraged to exercise until exhaustion prevented

them from maintaining at least 50 RPM or established safety termination criteria were met^{3, 4}. Participants reported perceived exertion scores throughout and respiratory exchange ratio was used as secondary criteria to validate peak exercise was reached. Predicted peak oxygen uptake was used to calculate the percentage achieved of predicted peak $\dot{V}O_2$ ⁵. Breath by breath data was averaged over 15 seconds and peak exercise parameters reported as the highest averaged values over sequential 30-second periods⁶. At the end of the study, participants were asked to wear a 24 hour ambulatory blood pressure monitor to record awake average blood pressure readings with recordings every 30 minutes. A wrist worn triaxial accelerometer was worn for nine days to provide seven complete days of objectively measured physical activity⁷.

eMethods 2. Detailed description of brain magnetic resonance image acquisition and analysis.

Individuals underwent multimodality brain MRI scanning on a Siemens 3.0T scanner (Siemens, Munich, Germany). MRI imaging was completed prior to the exercise and cardiovascular risk assessment described above. All study measures were completed within 48 hours. MRI protocol included T1-weighted structural imaging (TR/TE = 2040/4.7 ms, flip angle 8°, FOV 200 mm, voxel size 1.0 mm isotropic), T2-weighted FLAIR (TR/TE = 9000/90 ms, flip angle 150°, FOV 220 mm voxel size 1.1 x 0.9 x 3.0 mm), Diffusion Tensor Imaging (DTI) (TR/TE = 8900/95 ms, 2.0 mm isotropic resolution, multiband echo-planar imaging (EPI), 64 slices, 64 diffusion weighted directions, FOV 192 mm, b-value 1500s/mm², five non-diffusion weighted images, b-value

0s/mm² with one b0 volume acquired in the reverse phase encoded direction), Time-of-Flight (TOF) MRA (TR/TE = 23/8 ms, flip angle 10°, FOV 300 mm voxel size 1.6 x 1.2 x 5.0 mm) and in a subgroup of 52 patients multi-delay vessel-encoded pseudocontinuous Arterial Spin Labelling (ASL), identical to a previously published protocol⁸. Brain vessel segmentation was completed on TOF MRA imaging using previously described automated segmentation tools (Figure 1)^{9, 10}. The binary segmentations were used to determine overall vessel density, average caliber and tortuosity. All vessel segmentation results were visually checked to ensure proper quality. Vessel tortuosity was defined by the deviation from the shortest path between two points. This analysis was implemented by identifying the vessel endpoints and bifurcations, calculating the shortest path and the length of the actual centerline between each two connected points. The final tortuosity was then calculated by the ratio and it was averaged over all vessel segments. Cerebral perfusion and arrival time were estimated from ASL images using a previously described analysis pipeline^{8, 11}. White matter hyperintensity (WMH) lesions were automatically segmented on FLAIR images with BIANCA (Brain Intensity AbNormality Classification Algorithm) a fully-automated, supervised method for WMH detection^{12, 13}. BIANCA classifies the image's voxels based on their intensity and spatial features, where the intensity features were extracted from T2-weighted FLAIR, T1-weighted and DTI fractional anisotropy (FA) images, FA images generated using established DTI tools, FSL topup, FSL eddy and DTIFit¹⁴⁻¹⁷. WMH masks were manually segmented from 10 images to use as the training set for BIANCA, these were independently verified by a neurologist (TS) and radiologist (DM). BIANCA probability output maps were

all visually checked for quality. Lesion count was selected as the most sensitive outcome of white matter change in this young adult population in which the presence of a single lesion, independent of volume, could be considered abnormal. The minimum lesion size used in analysis was 1 mm³. T1-weighted structural images were processed using FSL¹⁶ to generate gray matter masks which were used to calculate the average cerebral blood flow after linear registration of the ASL MRI to the T1-weighted MRI dataset.

eTable 1 Quintile distribution of Brain MRI measures and mean difference between top and bottom quintile.

Brain Measure	Quintile 1 Mean (SD)	Quintile 5 Mean (SD)	Mean Difference between 1 st and 5 th quintile of respective measure Mean ((95%CI)	Relative percentage difference between 1 st and 5 th quintile of respective measure
Brain Vessel Density, vessels/cm ³ (n=125)	6.6 (0.62)	10.5 (0.95)	3.8 (3.3 to 4.4)	37% lower vessel density
Brain Vessel Caliber, μ m (n=125)	504 (56)	587 (47)	82 (61 to 103)	14% lower vessel caliber
Brain Vessel Tortuosity (n=125)	1.40 (0.02)	1.64 (0.05)	0.241 (0.22 to 0.27)	15% lower tortuosity
Brain white matter hyperintensity lesion count, number (n=125)	34.5 (4.5)	11 (2)	23 (21 to 25)	3 fold higher in first quintile
Brain Blood Arrival Time, seconds (n=52)	1.31 (0.03)	1.08 (0.02)	0.22 (0.2 to 0.25)	20% slower arrival time in the first quintile
Cerebral Blood Flow, ml/min/100g (n=52)	46 (4.7)	78 (8)	32 (25 to 38)	41% lower cerebral blood flow in the first quintile

eTable 2 Association between non-modifiable and modifiable risk factors and brain vessel tortuosity.

	Point Estimate (95 %CI)	P value	Adjusted effects Point Estimate (95 %CI)	P value
Brain Vessel Tortuosity			Model Statistic R ² =0.10 p=.26	
Gestational Age, weeks	0.005 (0.001 to 0.009)	.007	0.006 (0.001 to 0.01)	.01
Resting SBP, mmHg	-0.00003(-0.001 to 0.001)	.97	0.0003 (-0.001 to 0.002)	.74
BMI, kg/m ²	-0.001 (-0.004 to 0.005)	.75	-0.0003 (-0.006 to 0.005)	.90
VPA, hours per week	-0.002 (-0.015 to 0.02)	.81	-0.002 (-0.021 to 0.016)	.81
Alcohol, drinks per week	-0.001 (-0.002 to 0.003)	.61	-0.001 (-0.003 to 0.002)	.60
Smoking, pack years	-0.005 (-0.13 to 0.002)	.15	-0.008 (-0.017 to 0.001)	.09
Peak VO ₂ , ml/kg/min	0.001 (-0.001 to 0.003)	.16	.	.
Peak Ex DBP, mmHg	-0.001 (-0.001 to 0.002)	.36	.	.
Cholesterol/HDL Ratio	0.009 (-0.01 to 0.03)	.37	.	.
HOMA IR	0.008 (-0.031 to 0.046)	.68	.	.
Hypertension Rx	-0.004 (-0.05 to 0.04)	.87	.	.

Model adjusted for non-modifiable factors of age, sex, gestational age and modifiable risk factors of systolic blood pressure, body mass index, vigorous physical activity, weekly alcohol consumption and smoking status. Abbreviations and units: SBP, systolic blood pressure (mmHg); BMI, body mass index (kg/m²); VPA, Vigorous Physical Activity (hours per week); Alcohol; Smoking (pack years); Peak VO₂, Peak Oxygen Uptake (ml/kg/min); Ex DBP, Peak exercise diastolic blood pressure (mmHg), Cholesterol/HDL ratio, ratio total cholesterol/high density lipoprotein; HOMA-IR, homeostatic model assessment of insulin resistance, Hypertension Rx participant taking prescription medications for hypertension (yes/no). The point estimate refers to the magnitude of change in vessel tortuosity per unit change in the non-modifiable and modifiable variables.

eTable 3 Association between modifiable risk factors, brain blood arrival time, cerebral blood flow and white matter hyperintensity lesion count.

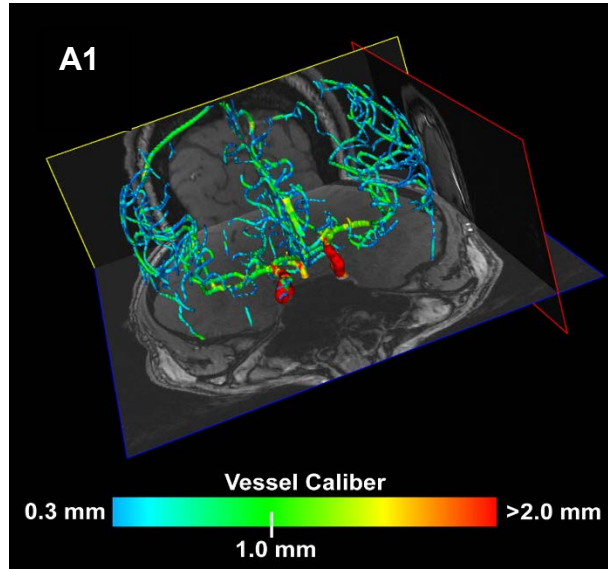
Blood Arrival Time	Point Estimate (95 %CI)	P value
Gestational Age, weeks	0.003 (-0.003 to 0.01)	.27
SBP, mmHg	0.001(-0.01 to 0.03)	.14
BMI, kg/m ²	0.011 (0.001 to 0.05)	.001
VPA, hours per week	0.001(-0.023 to 0.026)	.91
Alcohol, drinks per week	-0.00015 (-0.0015 to 0.0015)	.88
Smoking, pack years	-0.001 (-0.011 to 0.009)	.84
Peak Vo ₂ , ml/kg/min	0.002 (-0.001 to 0.004)	.17
Peak Ex DBP, mmHg	-0.001 (-0.003 to 0.001)	.48
Cholesterol/HDL Ratio	0.02 (-0.005 to 0.045)	.11
HOMA IR	0.012 (-0.062 to 0.085)	.75
Hypertension Rx (yes/no)	-0.02 (-0.08 to 0.04)	.46
Cerebral Blood Flow		
Gestational Age, weeks	-0.441 (-1.3 to 0.45)	.32
SBP, mmHg	-0.213 (-0.484 to 0.082)	.16
BMI, kg/m ²	-1.06 (-2.01 to -0.1)	.03
VPA, hours per week	1.52 (-2.02 to 5.06)	.86
Alcohol, drinks per week	0.01 (-0.23 to 0.25)	.93
Smoking, pack years	-0.395 (-1.8 to 1.01)	.58
Peak Vo ₂ , ml/kg/min	0.065 (0.27 to 0.4)	.70
Peak Ex DBP, mmHg	-0.178 (-0.48 to 0.13)	.24
Cholesterol/HDL Ratio	-2.15 (-5.8 to 1.5)	.24
HOMA IR	-8.0 (-18.3 to 2.35)	.13
Hypertension Rx (yes/no)	-10.8 (-3.2 to 18.4)	.007
White matter hyperintensity lesion count		
Gestational Age, weeks	-0.22 (-0.56 to 0.12)	.21
SBP, mmHg	0.07 (-0.05 to 0.20)	.26
BMI, kg/m ²	-0.04 (-0.44 to 0.36)	.84
VPA, hours per week	-0.07 (-1.6 to 1.5)	.93
Alcohol, drinks per week	0.42 (0.03 to 0.80)	.034
Smoking, pack years	0.79 (0.15 to 1.44)	.017
Peak Vo ₂ , ml/kg/min	-0.05 (-0.20 to 0.11)	.54
Peak Ex DBP, mmHg	0.125 (0.007 to 0.244)	.038
Cholesterol/HDL Ratio	-0.21 (-1.98 to 1.56)	.82
HOMA IR	-0.12 (-3.49 to 3.25)	.94
Hypertension Rx (yes/no)	2.26 (-1.6 to 6.2)	.25

Abbreviations and units: SBP, systolic blood pressure (mmHg); BMI, body mass index (kg/m²); VPA, Vigorous Physical Activity (hours per week); Alcohol; Smoking (pack years); Peak VO₂, Peak Oxygen Uptake (ml/kg/min); Ex DBP, Peak exercise diastolic blood pressure (mmHg), Cholesterol/HDL ratio, ratio total cholesterol/high density lipoprotein; HOMA-IR, homeostatic model

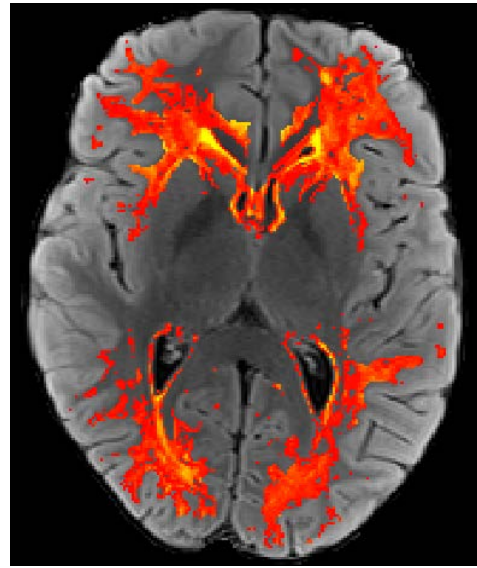
assessment of insulin resistance, Hypertension Rx participant taking prescription medications for hypertension (yes/no). Exposure variables were available for all participants. The point estimate refers to the magnitude of change in blood arrival time, cerebral blood flow or number of white matter hyperintensity lesions per unit change in the non-modifiable and modifiable variables.

eFigure 1. Rows A1 and A2 provide a case comparison of the MRI imaging modalities and analysis tools used to assess brain vessel morphology, white matter lesion count, and cerebral blood flow.

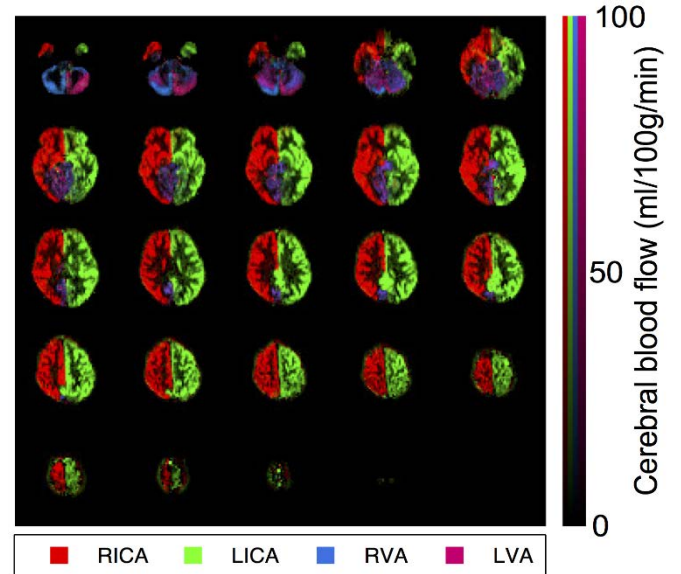
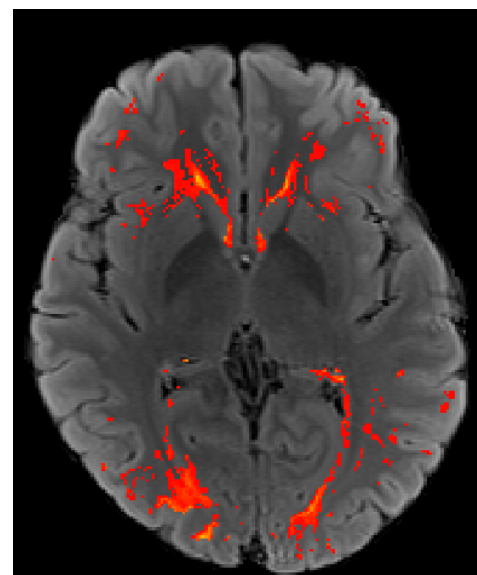
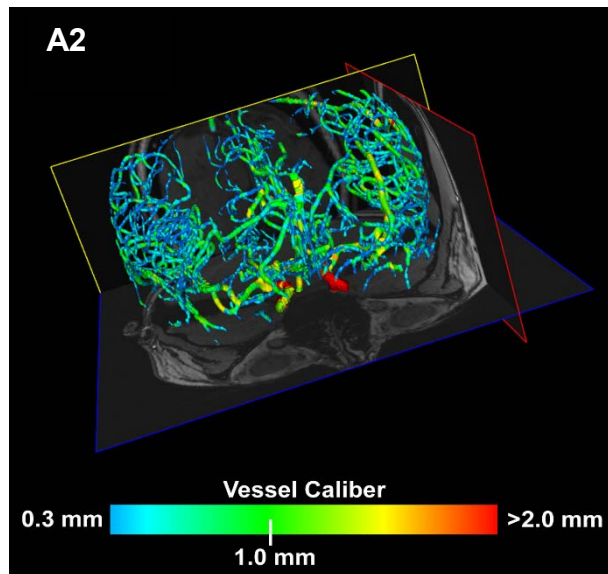
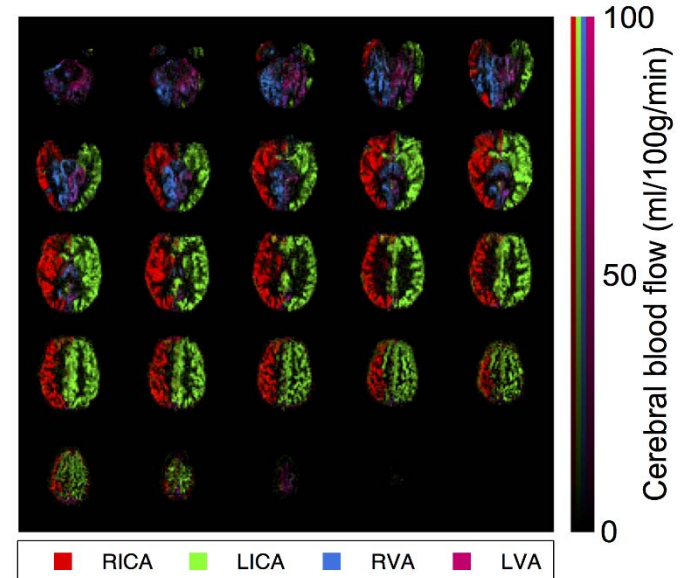
3D Reconstruction of Brain Vessels segmented from Time of Flight MRI arteriogram



Probability map of white matter hyperintensity lesions overlaid on Axial FLAIR image



Axial arterial spin labelled images demonstrating cerebral blood flow



Time of Flight (TOF) magnetic resonance arteriogram was used to acquire images of the brain vessels, this was analyzed using automated tools generating binary segmentations to determine overall vessel density, caliber and tortuosity. 3D reconstructions of Time of Flight images which demonstrate segmented brain vessels are provided in column one of rows A1 and A2. Three image modalities T2 weighted Fluid Attenuated Inversion Recovery (FLAIR), Diffusion Tensor Imaging (DTI) and T1 weighted structural images were used to optimise white matter segmentation and white matter hyperintensity lesion quantification using analysis tools from the Brain Intensity AbNormality Classification Algorithm (BIANCA). BIANCA is a fully automated, supervised method for white matter hyperintensity detection, based on the k-nearest neighbour (*k*-NN) algorithm. The BIANCA output is a probability map of the likelihood that the voxel being classified is a lesion. The probability map is displayed in column 2 of rows A1 and A2, on a spectrum of orange to yellow, and overlaid on an axial FLAIR image for comparison. Voxels likely to be white matter hyperintensity lesions are demonstrated as bright yellow. A threshold of 0.9 was applied to define the voxel as lesion or not which was then fed into cluster analysis to identify individual lesions and quantify white matter hyperintensity volumes. White matter hyperintensity lesions are demonstrated as bright yellow. In a subgroup of the study population (n=52) pseudocontinuous vessel selective arterial spin labelling (ASL) was acquired to allow the assessment of blood flow to the brain. This provides two outputs, a measure of blood arrival time (seconds), and a measure of cerebral blood flow (ml/100g/min) demonstrated in column 3, of rows A1 and A2. The different colours on cerebral blood flow images correspond with the contributing vessels (RICA, right internal carotid artery; LICA, left internal carotid artery; RVA, right vertebral artery; LVA, left vertebral artery.)

Rows A1 and A2 provide a comparison between two young adults with visible differences in brain MRI findings that may be associated with differences in the number of healthier categories on the cardiovascular score. Vessel morphology quantified using Time of Flight imaging is presented in column 1, and white matter intensity lesion count quantified using BIANCA analysis tools presented in column 2 and cerebral blood flow measured using ASL presented in columns 3. Participant A1 is a 21 year old male with BMI 26 kg/m³, resting blood pressure 144/81 mmHg, awake ambulatory blood pressure 135/74 mmHg, 40 minutes of vigorous activity and 14 hours of moderate to vigorous activity per week measured on triaxial accelerometer, non-smoker with alcohol intake greater than 8 drinks per week, blood pressure at peak exercise measured 200/70 mmHg, total cholesterol 178 mg/dl and fasting blood glucose 77 mg/dl. Participant A1 vessel density measures 6.4 vessels/cm³, he has 30 white matter hyperintensity lesions measuring 1mm or more and cerebral blood flow was 62ml/100g/min (lower intensity on colour scale,

column 3). Participant A2 is a 24 year old female with BMI 23 kg/m³, resting blood pressure 134/81 mmHg, awake ambulatory blood pressure 122/77 mmHg, recording 20 minutes of vigorous activity and 21 hours of moderate to vigorous activity per week measured on triaxial accelerometer, non-smoker with alcohol intake less than 2 drinks per week, blood pressure at peak exercise measured 180/90 mmHg, total cholesterol 127 mg/dl and fasting blood glucose 84 mg/dl. Participant A2 vessel density measures 12.6 vessels/cm³, she has 8 white matter hyperintensity lesions and cerebral blood flow was 83ml/100g/min (brighter intensity on colour scale, column 3).

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