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Obesity-related genetic determinants of stroke

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As obesity, circulating lipids and other vascular/metabolic factors influence the risk of stroke, we examined if genetic variants associated with these conditions are related to risk of stroke using a case–control study in Galicia, Spain. A selection of 200 single-nucleotide polymorphisms previously found to be related to obesity, body mass index, circulating lipids, type 2 diabetes, heart failure, obesity-related cancer and cerebral infarction were genotyped in 465 patients diagnosed with stroke and 480 population-based controls. An unsupervised Lasso regression procedure was carried out for single-nucleotide polymorphism selection based on their potential effect on stroke according to obesity. Selected genotypes were further analysed through multivariate logistic regression to study their association with risk of stroke. Using unsupervised selection procedures, nine single-nucleotide polymorphisms were found to be related to risk of stroke overall and after stratification by obesity. From these, rs10761731, rs2479409 and rs6511720 in obese subjects [odds ratio (95% confidence interval) = 0.61 (0.39–0.95) ($P=0.027$); 0.54 (0.35–0.84) ($P=0.006$) and 0.42 (0.22–0.80) ($P=0.0075$), respectively], and rs865686 in non-obese subjects [odds ratio (95% confidence interval) = 0.67 (0.48–0.94) ($P=0.019$)], were independently associated with risk of stroke after multivariate logistic regression procedures. The associations between the three single-nucleotide polymorphisms found to be associated with stroke risk in obese subjects were more pronounced among females; for rs10761731, odds ratios among obese males and females were 1.07 (0.58–1.97) ($P=0.84$), and 0.31 (0.14–0.69) ($P=0.0018$), respectively; for rs2479409, odd ratios were 0.66 (0.34–1.27) ($P=0.21$), and 0.49 (0.24–0.99) ($P=0.04$), for obese males and females, respectively; the stroke-rs6511720 association was also slightly more pronounced among obese females, odds ratios were 0.33 (0.13–0.87) ($P=0.022$), and 0.28 (0.09–0.85) ($P=0.02$) for obese males and females, respectively. The rs865686–stroke association was more pronounced among non-obese males [odds ratios = 0.61 (0.39–0.96) ($P=0.029$) and 0.72 (0.42–1.22) ($P=0.21$), for non-obese males and females, respectively]. A combined genetic score of variants rs10761731, rs2479409 and rs6511720 was highly predictive of stroke risk among obese subjects ($P=2.04 \times 10^{-5}$), particularly among females ($P=4.28 \times 10^{-6}$). In summary, single-nucleotide polymorphisms rs1076173, rs2479409 and rs6511720 were found to independently increase the risk of stroke in obese subjects after adjustment for established risk factors. A combined score with the three genomic variants was an independent predictor of risk of stroke among obese subjects in our population.

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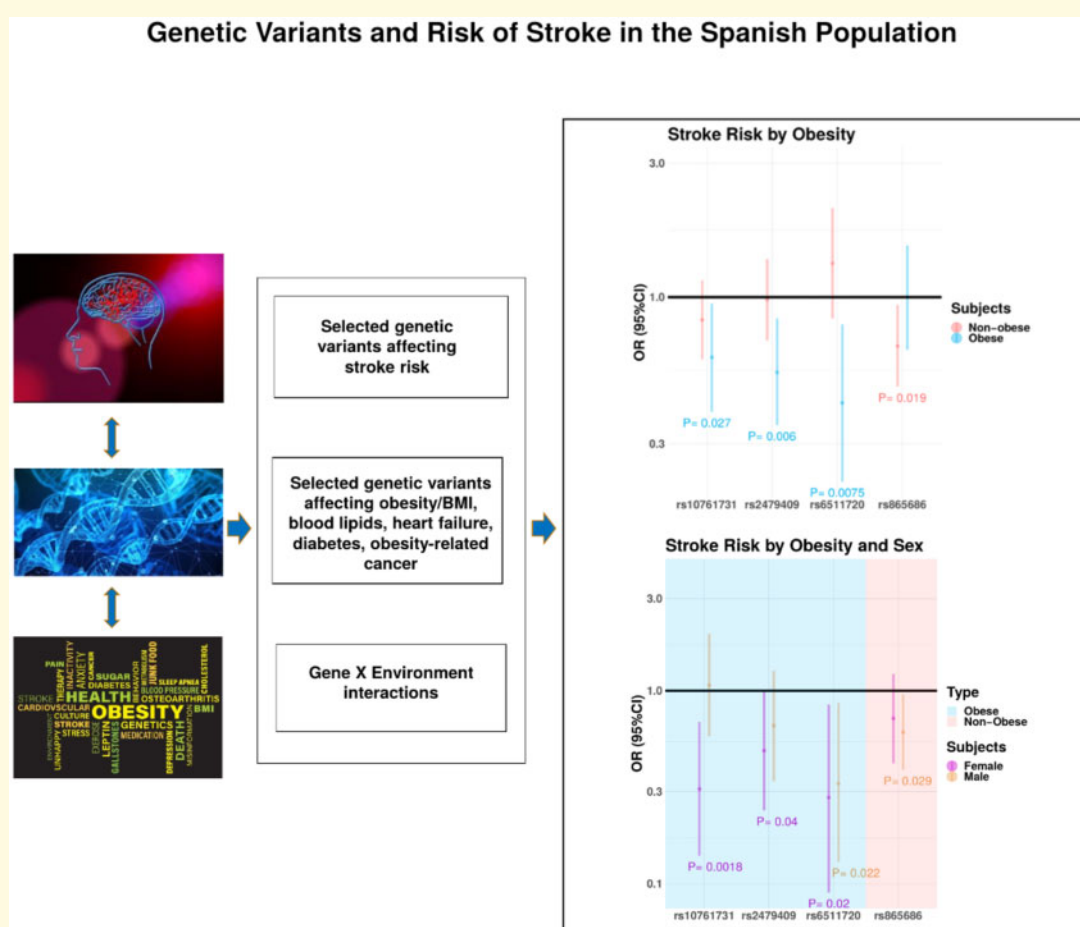
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Abbreviations: BICHUS = Biobanco de Ictus del Complejo Hospitalario Universitario de Santiago de Compostela; BMI = body mass index; CEIC = Ethics Committee of Clinical Research of Galicia; GRS = genetic risk score; GWAS = genome-wide association studies; HDL = high-density lipoprotein; LDL = low-density lipoprotein; MAF = minor allele frequency; MD = mammographic density; OR = odds ratio; SD = standard deviation; SNP = single-nucleotide polymorphisms

Graphical Abstract



genes difficult. Because several mechanisms are involved in stroke aetiology, such as blood pressure, obesity, atrial fibrillation, as well as other conditions, the disease is expected to share genetic influences with these conditions. In addition, genetic factors may shed light into the complex relationship between ischaemic stroke and some of these conditions, such as obesity, which can act as both, a risk or even a protective factor, after occurrence of a first event, a fact underlying the concept of the obesity paradox in stroke aetiology and prognosis.³ Thus, it is likely that the different role of obesity and other conditions in ischaemic stroke could be, at least in part, genetically determined.

Genetic studies associated with obesity and other stroke-related conditions themselves have highlighted strong genetic influences, therefore we have selected genetic variants implicated in major risk factors for stroke to provide new insights on the biology and pathways leading to the disease. We have also selected some common gene variants that directly influence the risk of stroke itself and could therefore modify disease risk, progression or response to pharmacological therapy.

The objective of this study was to examine the potential role of selected single-nucleotide polymorphisms (SNPs) previously found to be related to obesity, body mass index (BMI), circulating lipids, type 2 diabetes, obesity-related cancer or directly related to stroke/cerebral infarction or heart disease, on risk of stroke in the Spanish Galician population, in which no data on the genetics of stroke has been previously published.

Materials and methods

Subjects

Patients consecutively admitted in the Stroke Unit of the University Clinical Hospital of Santiago de Compostela in the BICHUS (Biobanco de Ictus del Complejo Hospitalario Universitario de Santiago de Compostela) registry with a diagnosis of stroke in accordance with the current European guidelines of clinical practice were invited to participate in this study. In total, 465 patients with stroke and 480 population-based healthy controls, free of disease, confirmed not to have had any previous stroke episode through Ianus, the computerized Galician electronic medical history, and selected from the same base-population as cases from a parallel study of metabolic syndrome in Galicia,⁴ Spain, were included. Information on risk factors and anthropometrical and clinical characteristics were collected for each patient and control subject. This research was carried out in accordance with the Declaration of Helsinki of the World Medical Association (2008) and approved by the Ethics Committee of Clinical Research of Galicia (CEIC). All patients and controls were included in the study under signed written informed consent.

Ethics approval

All procedures performed in studies involving human participants were in accordance with the ethical standards of the institutional and/or national research committee and with the 1964 Helsinki declaration and its later amendments or comparable ethical standards. The study was approved by the Ethics Committee of Clinical Research of Galicia (CEIC). Informed written consent was obtained from all individual participants included in the study.

Measurements and laboratory data

Venous peripheral blood samples for genetic analysis were obtained at admission of stroke patients. BMI was calculated in the moment of the inclusion and categorized in non-obese (BMI < 30 kg/m²) and obese (BMI ≥ 30 kg/m²). The diagnosis of diabetes mellitus was based on the latest criteria established by the American Diabetes Association.⁵ Hypertension was defined as habitual systolic/diastolic blood pressure >140/90 mmHg or current use of any antihypertensive medication. Dyslipidaemia was defined by the current treatment with anti-hyperlipidaemic drugs. We did not have specific total cholesterol (TC), low-density lipoprotein (LDL) or high-density lipoprotein (HDL) measurements for the study subjects. All patients were admitted to an acute stroke unit and treated according to the European Stroke Organisation guidelines.⁶

SNP selection

The objective of this study is to assess the independent and interactive roles of genetic variants identified from genome-wide association studies (GWAS) involved in metabolic traits such as obesity, BMI, circulating lipids, type 2 diabetes, heart failure, obesity-related cancer and stroke (listing of SNPs in [Supplementary Table 1](#)),^{7–15} on the risk of stroke. SNPs were selected based on their magnitude and consistency of the association with major risk factors for stroke, replication by several studies and budgetary considerations.

Briefly, (i) we selected 200 SNPs from the SNPs identified by the large scale GWAS studies that were found to be associated with obesity, BMI, circulating lipids, heart failure, obesity-related cancers and stroke; (ii) genotyped them using iPLEX/MalDitof genotyping assay; (iii) analysed them to evaluate their association with the risk of ischaemic stroke, overall and stratified by sex and obesity, and (iv) examined whether a GRS score may play a role. Although there have been an increased number of ischaemic stroke genetic variants being identified in different populations, majority of them were conducted in Caucasians, and very limited data exists on the effect of the identified genetic variants in the Spanish population.

Our SNP selection criteria were similar as the SNP selection criteria used in Mendelian Randomization analysis. Briefly, all the phenotype-related SNPs included in

the present study exhibited a P value in the GWAS Catalogue $\leq 9 \times 10^{-6}$, with majority of them being $\leq 5 \times 10^{-8}$, and confirmed in several independent studies.

Specifically, selected SNPs included common genetic variants influencing obesity at two loci, *FTO* and *MC4R*, which have been reproducibly associated with obesity measured by BMI. BMI-associated loci found in *SH2B1*, *TMEM18*, *NEGR1*, *KCTD15*, *BDNF*, *ETV5/DGKG*, *SEC16B/RASAL2*, *BCDIN3D/FAIM2*, *SH2B1* and *MTCH2* genes were also included. Additionally, three loci in *NPC1*, near *MAF*, and near *PTER*, as BMI-related alleles on the risk of obesity-related diseases such as type 2 diabetes, were also included. Additional associated SNPs from GWAS of type 2 diabetes, related to obesity and from other metabolic traits also obesity-related, such as glucose, insulin/insulin response and C-reactive protein, have been identified and were also included. Recent GWAS studies have also localized common DNA variants affecting circulating serum HDL, LDL, TC and triglycerides (TG). Included are also SNPs at ~ 38 loci that have been associated with one or more of the three traits at genome-wide significance level (*LCAT*, *APOB*, *APOE*, *PCSK9*, *LDLR*, *HMGCR*, *CETP*, *MLXIPL*, *GCKR*, *TRIB1*, *GALNT2*). Finally, we also included 26 SNPs identified from GWAS that increase the risk of obesity-related cancers such as breast cancer, that have previously been shown to exhibit potential interactions with obesity.¹⁶

Genotyping

DNA was extracted from buffy coat by using the Chemagic DNA Buffy Coat Kit special with the Chemagic MSM I system (Perkin Elmer, Waltham, MA), based on magnetic beads. After quantification of dsDNA using PicoGreen (Thermo Fisher Scientific, Waltham, MA), the DNA was diluted to a final concentration of 50 ng/ μ l in water.

Genotyping of the selected 200 SNPs was conducted by the CEGEN-PRB2 USC node using the iPLEX Gold chemistry and MassARRAY platform, according to the manufacturer's instructions (Agena Bioscience, San Diego, CA). All assays were performed in 384-well plates, including negative controls and a trio of DNA samples obtained from the NIGMS Human Genetic Cell Repository at the Coriell Institute for Medical Research (NA10860, NA10861 and NA11984) for quality control.

Quality control

The following SNPs were excluded from analysis: rs4836133, not biallelic; rs12422552, rs13281615, rs2642442 and rs6602024 had a Hardy-Weinberg equilibrium P value lower than 0.00025 among controls (corresponding to 0.05/200); 10 additional SNPs with a minor allele frequency (MAF) lower than 1%. Therefore, the initial 200 SNPs were reduced to 185 SNPs that were

finally analysed in relation to the risk of stroke. Because of the limited existing data on the Spanish, and, particularly, the Galician population, we decided to genotype all selected SNPs despite a lower cost-efficiency. Statistical methods used are not affected by any possible linkage disequilibrium between SNPs.

Patients and outcomes

We excluded samples with more than 5% missing genotype or relevant risk factor data. Two cases were excluded from the analysis because of missing information on important covariates such as sex or BMI. Another case was excluded because of 10 (5%) or more missing genotypes. Therefore, 462 patients were included in the final analysis. Among controls, 3 controls were excluded because they had a previous diagnosis of stroke, and 30 were excluded because of 10 (5%) or more missing genotypes. Therefore, 447 controls were included in the final analysis.

Data analysis

The statistical analyses were performed using the R statistical software version 3.2.3.¹⁷ The categorical or dichotomous clinical variables were expressed as absolute values and percentages and were compared with the Pearson χ^2 test or t -test. The continuous variables were described as mean \pm standard deviation (SD). For the comparison of quantitative continuous variables, Student's t -test or the ANOVA were used.

Because of sample size limitations and the large numbers of studied SNPs, we first carried out an unsupervised Lasso regression procedure for SNP preselection. The procedure is mainly based on the classical cross-validation technique used to evaluate machine learning models, in our case, Lasso models. Briefly, samples were divided into 10 subsets (or folds) of approximately equal size and with equal proportion of cases and controls, and several Lasso models were constructed. The first fold was treated as a validation set, and the Lasso models were fit on the remaining 9-fold samples as a training set. Each one of the folds were used as different validation sets and information about the best SNPs in each round is retained to do an SNP selection at the end of the full process. We used the function *cv.glmnet()* from the R package *glmnet*, with misclassification error as the criterion for 10-fold cross-validation. Using Lasso methods, we preselected any genetic marker that showed differences in its ability to increase the risk of stroke, overall and/or stratified by the exposure of interest, obesity, and including SNP interaction terms with obesity and/or BMI. Next, the preselected SNPs were considered potential candidates for increasing the risk of stroke and were therefore analysed through multivariate logistic regression procedures, in either obese and/or non-obese subjects. Lasso preselection methods are based on cross-validation and

Table 1 Baseline patients' and controls' characteristics

Variable	Stroke patients (n = 462)	Controls (n = 447)	P value ^a
Age (years)	70.0 ± 13.0	64.6 ± 12.3	<0.001
Male (%)	265 (57.4%)	247 (55.3%)	0.567
DM (%)	107 (23.2%)	42 (9.4%)	<0.001
HT (%)	298 (64.5%)	123 (27.5%)	<0.001
HLD (%)	185 (40.0%)	136 (30.4%)	0.003
ICM (%)	49 (10.6%)	21 (4.7%)	0.001
BMI (kg/m ²)	29.4 ± 4.9	28.7 ± 4.5	0.017
Weight (kg)	75.4 ± 15.1	76.8 ± 13.4	0.150
Obesity (%)	186 (40.3%)	142 (31.8%)	0.009
Smoking (%)	100 (21.6%)	95 (21.3%)	0.964

^aStatistically significant difference ($P < 0.05$) (t-test or Chi-squared test).

BMI, body mass index; DM, Diabetes mellitus; HLD, hyperlipidaemia; HT, hypertension; ICM, ischaemic cardiopathy; obese: ≥ 30 kg/m².

therefore are free of multiple testing since no association test was performed. The number of preselected SNPs was next used to establish a new significance threshold for standard multivariate logistic regression procedures. Logistic regression analyses were carried out to assess the independency of genotypes to predict the risk of stroke. Data were presented as odds ratios (OR) and 95% confidence intervals (95% CIs). Information on established risk factors for stroke, such as age, sex, obesity, BMI, smoking, height, *diabetes type 2*, hypertension, hyperlipidaemia and ischaemic cardiopathy (Table 1), were considered as potential confounders and/or effect modifiers in case–control analysis.

Since the relationship between stroke and BMI has been reported to be non-linear, but rather U-shaped, with both, low and high BMI conferring increased risk, we took this into account to model the underlying biological mechanism and conducted separate stratified analysis by BMI: non-obese (BMI <30 kg/m²) and obese (BMI ≥ 30 kg/m²).

Genetic risk score (GRS) calculation. Briefly, GRS was calculated using a weighted method, calculating an average GRS per risk allele from each SNP for each individual.¹⁸

Availability of data and material

The datasets generated in the current research can be obtained from the corresponding author upon reasonable request.

Results

Demographic and clinical characteristics of study subjects are shown in Table 1. The mean age of cases and controls were 70 and 64.6, respectively. Among cases, 57.4% were male, 23.2% were diabetic and 64.5% were hypertensive. The corresponding figures among controls subjects were 55.3%, 9.4% and 27.5%, respectively (Table 1). Since our cases were, on average, 5.4 years

older than controls, we conducted stratified analysis and rerun all analyses excluding cases and controls under two different scenarios to fully account for the age-related differences; results were virtually unchanged (see Discussion section).

SNP selection by Lasso regression

As described above, we first carried out an unsupervised Lasso procedure for SNP selection in two steps. We first preselected any genetic marker that exhibited differences in their ability to increase the risk of stroke, overall or stratified by obesity. Through a 10-fold cross-validation strategy, 30 SNPs were preselected. Next, we repeated the procedure in the subset of 30 SNPs without stratification and with an SNP interaction term for obesity and/or BMI. Thus, a final list of nine SNPs (rs10761731, rs12190287, rs1432679, rs2116830, rs2479409, rs2531995, rs581080, rs6511720, rs865686) was selected. We then conducted multivariate logistic regression analyses to examine the associations between the nine SNPs and the risk of stroke, adjusting for established risk factors for stroke. We carried out case–control analyses in total subjects and stratifying by obesity, i.e. in obese subjects and non-obese subjects, separately (Tables 2–4).

Three SNPs (rs2479409, rs6511720 and rs10761731) showed a strong association with the risk of stroke in obese subjects. Although these associations did not reach the required multiple testing Bonferroni corrected level of significance ($0.05/9 = 0.006$), all three showed borderline independent associations among obese subjects, and showed virtually no association among non-obese subjects (Tables 3 and 4). Only one other SNP, rs865686 in 9q31.2, was found to be significantly associated with the risk of stroke among non-obese subjects ($P = 0.019$), and showed no association in obese subjects (Tables 3 and 4).

We next conducted a stratified analysis of the SNPs by sex. We detected differences by sex in the stroke-SNPs associations. For the three SNPs more strongly associated with stroke among obese subjects, the associations were confined or more pronounced among females. Thus, for rs10761731, in the entire set of obese subjects we found an OR = 0.61 (0.39–0.95) ($P = 0.027$) (Table 3). The corresponding figures among obese males (101 cases and 69 controls) and obese females (85 cases and 71 controls) were 1.07 (0.58–1.97) ($P = 0.84$) and 0.31 (0.14–0.69) ($P = 0.0018$), respectively. For rs2479409, the association was also more pronounced for obese females [ORs = 0.54 (0.35–0.84) ($P = 0.006$), 0.66 (0.34–1.27) ($P = 0.21$) and 0.49 (0.24–0.99) ($P = 0.04$), for overall obese subjects, obese males and obese females, respectively]. The stroke-rs6511720 association was also slightly more pronounced among obese females [ORs = 0.42 (0.22–0.8) ($P = 0.0075$), 0.33 (0.13–0.87) ($P = 0.022$) and 0.28 (0.09–0.85) ($P = 0.02$) for overall obese, obese male and obese female subjects, respectively].

Table 2 Selected SNPs and risk of stroke, overall subjects

Disease/condition	Gene	Region	SNP	Genotype coding	Cases			Controls			OR (95% CI)	P value
					AA:Aa:aa	N	AA:Aa:aa	MAF	N	AA:Aa:aa	MAF	
Blood lipids	<i>JMJD1C</i>	10q21.3	rs10761731	A/A:A/T:T/T	462	152:226:84	42.6%	445	118:213:114	49.6%	0.75 (0.58–0.97)	0.03
Stroke/Cerebral Infarction	<i>TCF21</i>	6q23.2	rs12190287	C/C:C/G:G/G	461	184:220:57	36.2%	443	188:195:60	35.6%	1.15 (0.89–1.49)	0.30
Obesity-related cancer	<i>EBF1</i>	5q33.3	rs1432679	T/T:T/C:C/C	462	127:240:95	46.5%	446	116:230:100	48.2%	0.90 (0.69–1.16)	0.42
Obesity/BMI	<i>KCNMA1</i>	10q22	rs2116830	G/G:G/T:T/T	462	291:152:19	20.6%	446	249:161:36	26.1%	0.80 (0.60–1.08)	0.14
Blood lipids	<i>PCSK9</i>	1p32.3	rs2479409	A/A:A/G:G/G	462	215:196:51	32.3%	446	186:196:64	36.3%	0.81 (0.62–1.05)	0.11
Obesity/BMI	<i>ADCY9</i>	16p13.3	rs2531995	T/T:T/C:C/C	462	182:212:68	37.7%	446	164:208:74	39.9%	0.83 (0.65–1.08)	0.16
Blood lipids	<i>TTC39B</i>	9p22.3	rs581080	C/C:C/G:G/G	457	322:115:20	17.0%	435	273:138:24	21.4%	0.84 (0.61–1.15)	0.28
Blood lipids	<i>LDLR</i>	19p13.2	rs6511720	G/G:G/T:T/T	462	356:96:10	12.6%	446	332:106:8	13.7%	0.86 (0.60–1.23)	0.41
Obesity-related cancer	—	9q31.2	rs865686	T/T:T/G:G/G	462	198:198:66	35.7%	446	175:206:65	37.7%	0.81 (0.62–1.04)	0.10

Adjusted by age, sex, BMI, smoking, diabetes mellitus, hyperlipidaemia, hypertension and ischaemic cardiopathy.

Table 3 Selected SNPs and risk of stroke among obese subjects

Disease/condition	Gene	Region	SNP	Genotype coding	Cases			Controls			OR (95% CI)	P value
					AA:Aa:aa	N	AA:Aa:aa	MAF	N	AA:Aa:aa	MAF	
Blood lipids	<i>JMJD1C</i>	10q21.3	rs10761731	A/A:A/T:T/T	186	63:88:35	42.5%	140	36:65:39	51.1%	0.61 (0.39–0.95)	0.027
Stroke/Cerebral Infarction	<i>TCF21</i>	6q23.2	rs12190287	C/C:C/G:G/G	185	71:84:30	38.9%	140	62:64:14	32.9%	1.50 (0.97–2.34)	0.066
Obesity-related cancer	<i>EBF1</i>	5q33.3	rs1432679	T/T:T/C:C/C	186	54:95:37	45.4%	141	31:74:36	51.8%	0.73 (0.47–1.14)	0.16
Obesity/BMI	<i>KCNMA1</i>	10q22	rs2116830	G/G:G/T:T/T	186	124:55:7	18.6%	141	85:49:7	22.3%	0.65 (0.38–1.10)	0.11
Blood lipids	<i>PCSK9</i>	1p32.3	rs2479409	A/A:A/G:G/G	186	95:75:16	28.8%	141	55:64:22	38.3%	0.54 (0.35–0.84)	0.006
Obesity/BMI	<i>ADCY9</i>	16p13.3	rs2531995	T/T:T/C:C/C	186	72:88:26	37.6%	141	49:67:25	41.5%	0.68 (0.44–1.05)	0.08
Blood lipids	<i>TTC39B</i>	9p22.3	rs581080	C/C:C/G:G/G	182	136:41:5	14.0%	137	85:45:7	21.5%	0.58 (0.34–1.01)	0.054
Blood lipids	<i>LDLR</i>	19p13.2	rs6511720	G/G:G/T:T/T	186	152:32:2	9.7%	141	98:40:3	16.3%	0.42 (0.22–0.80)	0.0075
Obesity-related cancer	—	9q31.2	rs865686	T/T:T/G:G/G	186	82:76:28	35.5%	141	53:67:21	38.7%	1.0 (0.65–1.53)	0.98

Adjusted by age, sex, smoking, diabetes mellitus, hyperlipidaemia, hypertension and ischaemic cardiopathy.

Table 4 Selected SNPs risk of stroke among non-obese subjects

Disease/condition	Gene	Region	SNP	Genotype coding	Cases			Controls			OR (95% CI)	P value
					AA:Aa:aa	N	AA:Aa:aa	MAF	N	AA:Aa:aa	MAF	
Blood lipids	<i>JMJD1C</i>	10q21.3	rs10761731	A/A:A/T:T/T	276	89:138:49	42.8%	305	82:148:75	48.9%	0.83 (0.60–1.15)	0.26
Stroke/Cerebral Infarction	<i>TCF21</i>	6q23.2	rs12190287	C/C:C/G:G/G	276	113:136:27	34.4%	303	126:131:46	36.8%	1.04 (0.74–1.45)	0.83
Obesity-related cancer	<i>EBF1</i>	5q33.3	rs1432679	T/T:T/C:C/C	276	73:145:58	47.3%	305	85:156:64	46.6%	1.03 (0.73–1.44)	0.89
Obesity/BMI	<i>KCNMA1</i>	10q22	rs2116830	G/G:G/T:T/T	276	167:97:12	21.9%	305	164:112:29	27.9%	0.89 (0.61–1.28)	0.53
Blood lipids	<i>PCSK9</i>	1p32.3	rs2479409	A/A:A/G:G/G	276	120:121:35	34.6%	305	131:132:42	35.4%	0.98 (0.70–1.37)	0.90
Obesity/BMI	<i>ADCY9</i>	16p13.3	rs2531995	T/T:T/C:C/C	276	110:124:42	37.7%	305	115:141:49	39.2%	0.90 (0.65–1.25)	0.52
Blood lipids	<i>TTC39B</i>	9p22.3	rs581080	C/C:C/G:G/G	275	186:74:15	18.9%	298	188:93:17	21.3%	0.99 (0.67–1.46)	0.94
Blood lipids	<i>LDLR</i>	19p13.2	rs6511720	G/G:G/T:T/T	276	204:64:8	14.5%	305	234:66:5	12.5%	1.32 (0.84–2.08)	0.23
Obesity-related cancer	—	9q31.2	rs865686	T/T:T/G:G/G	276	116:122:38	35.9%	305	122:139:44	37.2%	0.67 (0.48–0.94)	0.019

Adjusted by age, sex, smoking, diabetes mellitus, hyperlipidaemia, hypertension, and ischaemic cardiopathy.

For rs865686, the only SNP found to be associated with stroke risk among non-obese subjects, the rs865686–stroke association seemed to be slightly more pronounced among non-obese males [OR = 0.67 (0.48–0.94) ($P=0.019$), 0.61 (0.39–0.96) ($P=0.029$) and 0.72 (0.42–1.22) ($P=0.21$), for overall non-obese, non-obese males and non-obese females, respectively].

Multivariate logistic regression models showed independence of associations of the three SNPs found to be associated with the risk of stroke in obese subjects (data

not shown). We constructed a GRS with the three SNPs (rs10761731, rs2479409 and rs6511720) having into account their risk allele effects on risk of stroke in a logarithmic scale. Among obese subjects, the GRS was strongly associated with a statistically significant risk of stroke [1-unit change OR = 2.2 (1.5–3.2) ($P=2.04 \times 10^{-5}$)] (Fig. 1). No association was observed among non-obese individuals [1-unit change OR = 1.1 (0.9–1.3) ($P=0.54$)]. Despite sample size limitations, we also checked for potential differences in the GRS–stroke

association in obese subjects by sex. The GRS–stroke association in obese individuals was more pronounced among females [1-unit change OR = 4.8 (2.4–9.2) ($P = 4.28 \times 10^{-6}$)] than males [1-unit change OR = 1.4 (0.9–2.2) ($P = 0.14$)] (Fig. 1).

We also examined the effects of the selected SNPs on risk of stroke by stroke by hyperlipidaemia (Supplementary Tables 2 and 3). Results were similar as to those stratified by obesity. We also examined the association among non-obese and non-hyperlipidaemic individuals (Supplementary Table 4), and results were similar as those found for non-obese or non-hyperlipidaemic individuals. Finally, we examined the SNPs–stroke relationship among obese or hyperlipidaemic individuals, or both (Table 5), and found a more pronounced effect of the key SNPs on the risk of stroke.

The allele frequency of our nine selected SNPs was similar as that of publicly available control datasets.

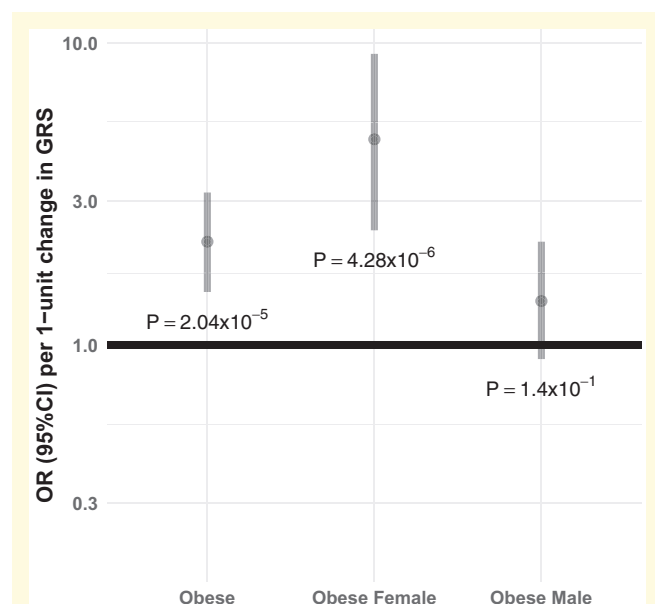


Figure 1 Genetic risk score for SNPs rs10761731, rs2479409 and rs6511720 and risk of stroke among obese subjects by sex.

We have included a Supplementary Table 5 with the allele frequency of the nine stroke-related SNPs from Tables 3 to 5 of our manuscript in publicly available control datasets such as the GWAS Catalogue and the NCBI ALFA (Supplementary Table 5).

Discussion

In this study, we selected 200 SNPs with a potentially relevant role on cerebrovascular disease because of their previously reported associations with metabolic and vascular disorders that play a role in the pathophysiology of stroke, mostly obesity- and lipid-related disorders, such as heart failure, obesity-related cancers, as well as genetic variants directly related to the risk of stroke. After a quality control analysis of the genotyping data, 185 SNPs were finally included in the study. An unsupervised Lasso procedure was carried out, from which a consensus list of nine SNPs was obtained. After adjustment for established risk factors for stroke, three of the SNPs (rs1076173, rs2479409 and rs6511720), were associated with the risk of stroke among obese subjects and one (rs865686) among non-obese subjects. Thus, obesity seems to play a role in the SNPs–stroke relationship as the three genetic variants were found to be independently associated with stroke in obese patients but not in non-obese patients, and, conversely, one of the variants was found to be associated with the risk of stroke only in non-obese patients. These data emphasize that obesity may play a role on the genetics of stroke, as different variants were found to be related to stroke in obese and not in non-obese and vice versa. Obesity may be a determinant factor underlying the genetically-based stroke risk stratification in this population.

The main results of the present study are that three SNPs (rs10761731, rs2479409 and rs6511720) were associated with the risk of stroke among obese subjects. For these three SNPs, the associations were confined or more pronounced among females. We also built a combined GRS weighting the risk of each risk allele of the three genomic variants (rs10761731, rs2479409 and

Table 5 Selected SNPs and risk of stroke among obese and/or hyperlipidaemic subjects

Disease/condition	Gene	Region	SNP	Genotype coding	Cases			Controls			OR (95% CI)	P value
					N	AA:Aa:aa	MAF	N	AA:Aa:aa	MAF		
Blood lipids	JMJD1C	10q21.3	rs10761731	A/A:A/T:T/T	284	94:139:51	42.4%	223	49:110:64	53.4%	0.55 (0.38–0.79)	0.00086
Stroke/Cerebral Infarction	TCF21	6q23.2	rs12190287	C/C:C/G:G/G	283	115:131:37	36.2%	223	97:101:25	33.9%	1.29 (0.92–1.83)	0.14
Obesity-related cancer	EBF1	5q33.3	rs1432679	T/T:T/C:C/C	284	76:145:63	47.7%	224	55:115:54	49.8%	0.88 (0.62–1.23)	0.44
Obesity/BMI	KCNMA1	10q22	rs2116830	G/G:G/T:T/T	284	185:88:11	19.4%	224	130:80:14	24.1%	0.74 (0.49–1.12)	0.16
Blood lipids	PCSK9	1p32.3	rs2479409	A/A:A/G:G/G	284	138:118:28	30.6%	224	92:98:34	37.05%	0.72 (0.50–1.01)	0.059
Obesity/BMI	ADCY9	16p13.3	rs2531995	T/T:T/C:C/C	284	117:130:37	35.9%	224	79:109:36	40.4%	0.75 (0.53–1.06)	0.098
Blood lipids	TTC39B	9p22.3	rs581080	C/C:C/G:G/G	280	202:69:9	15.6%	217	134:70:13	22.1%	0.61 (0.39–0.94)	0.024
Blood lipids	LDLR	19p13.2	rs6511720	G/G:G/T:T/T	284	229:50:5	10.6%	224	161:57:6	15.4%	0.48 (0.30–0.79)	0.0032
Obesity-related cancer	—	9q31.2	rs865686	T/T:T/G:G/G	284	123:118:43	35.9%	224	89:102:33	37.5%	0.87 (0.62–1.21)	0.41

Adjusted by age, sex, smoking, diabetes mellitus, hypertension and ischaemic cardiopathy.

rs6511720), having into account their effects on risk of stroke in a logarithmic scale. The GRS–stroke association in obese individuals was also more pronounced among females. There was one only SNP, rs865686, found to be associated with risk of stroke in non-obese subjects, particularly among non-obese males. These findings, particularly among obese females, are the first report of an association in a Spanish population.

We further checked the potential determinant role of obesity in the genetics of stroke, as supported by our findings, in the recent published literature. We first searched GWAS data from the publicly available MEGASTROKE study datasets,¹⁹ and examined the summary statistics of our main findings, i.e. the SNPs found to be associated or borderline-associated with risk of stroke in the present study. Using a sample size of 239 313 subjects (503 624 subjects in the case of rs6511720 and rs2116830), we validated three (rs10761731, rs6511720, rs865686) of the four SNPs that were associated with risk of stroke in the present study, and two (rs12190287 and rs2116830) of the four that were of borderline significance (Supplementary Table 6).

We also reviewed the existing data of stroke GWAS and obesity/BMI from other publicly available large-scale studies such as Abraham et al.,²⁰ who conducted a meta-analysis of GRSs which included a BMI–GRS that was found to enrich the ischaemic stroke GRS. The authors of that study noted that while recent GWAS had identified a GRS for ischaemic stroke, this GRS had only a modest predictive power in comparison with established stroke risk factors. In their meta-analysis, Abraham et al.²⁰ enriched this ischaemic stroke GRS with 19 additional GRSs from ischaemic stroke risk factors, co-morbidities and stroke subtypes, constructing a meta-GRS that outperformed the ischaemic stroke GRS. In this meta-GRS, the BMI–GRS played an important role, being the fourth GRS in terms of biggest contribution, and the first GRS from a ‘non-cardio-related’ phenotype. This relevant role of BMI in the ischaemic stroke meta-GRS is internally consistent with the results from our study showing differences in the genetic risk of ischaemic stroke by BMI.

We also downloaded the GWAS datasets from Abraham et al.²⁰ to examine the nine stroke-selected SNPs in our study stratified by BMI. At SNP level, we checked Abraham et al.²⁰ Supplementary materials where meta-GRS model coefficients were available for each of 3.2 million SNPs. We found that four of the nine selected SNPs from Table 2 (rs10761731, rs2116830, rs2531995 and rs6511720), exhibited a sufficiently strong effect to be included in the Ischemic Stroke-GRS and/or the BMI–GRS from Abraham et al.’s²⁰ study, and, consequently, they were included in the meta-GRS model.

Little is known about the genes and proteins related to the genetic variants revealed by the study. First, SNP rs2479409 in the Proprotein convertase subtilisin-like kexin type 9 (*PCSK9*, OMIM 607786) gene, may

influence inter-individual variation in circulating LDL cholesterol levels. In a previous study, this common potentially functional SNP showed an unusually extended homozygosity. *PCSK9* is a newly discovered serine protease that plays a key role in LDL cholesterol homeostasis by mediating LDL receptor (LDL-R) breakdown through a post-transcriptional mechanism.^{21–24} *PCSK9* may also regulate apolipoprotein B-containing lipoprotein production,^{25,26} and promote production of nascent very LDL (VLDL) in the fasting state.²⁷ Adenoviral-mediated overexpression of human *PCSK9* in mice promotes the accumulation of LDL cholesterol in plasma but this response is absent in LDL receptor-deficient animals.^{22,24,28} Recent studies show that *PCSK9* binds directly to the extracellular domain of the LDL receptor^{29,30} and increases its degradation.²⁹ With respect to neurological functions, *PCSK9* expression has been detected in the cerebellum, as well as in other tissues.³¹ *PCSK9* may enhance degradation of other receptor types or proteins during the development of cerebellum and telencephalon,³¹ and promote cerebellar cortical neurogenesis, possibly by increased recruitment of undifferentiated neural progenitor cells into the neuronal lineage.³²

rs6511720 in 19p13 locus is another genetic variant also associated with blood LDL-cholesterol.³³ The nearest gene is *LDLR* (Low Density Lipoprotein Receptor gene) which provides instructions for making LDL protein receptor that binds to LDLs. Mutations in the *LDLR* gene cause an inherited form of high cholesterol called familial hypercholesterolaemia. The specific effect of rs6511720[T] in *LDLR* on LDL was quantified and estimated to be -0.26 ± 0.02 SD by Kathiresan et al.³³ and -0.15 ± 0.03 SD in a subsequent study.³⁴

rs10761731 in 10q21.3 is in the Jumonji domain containing 1 C (*JMJD1C*) gene. The protein encoded by this gene interacts with thyroid hormone receptors. This SNP was previously associated with plasma TG level,^{15,35} and a recent combined GWAS analysis found rs10761731 to be associated also with C-reactive protein and HDL-cholesterol.³⁶

rs865686 in 9q31.2 was the only, among all studied SNPs, to be significantly associated with the risk of stroke among non-obese subjects ($P=0.019$). rs865686 has been found to be previously associated with the risk of oestrogen positive breast cancer.³⁷ A study found that the effect of rs865686 on percent mammographic density (MD), an established risk factor for breast cancer, clearly differed across strata of BMI ($P=0.01$). Interestingly, the effect of this SNP on density reflected an obesity paradoxical effect, as it was inversely associated with percent MD among heavy women ($\text{BMI} \geq 25 \text{ kg/m}^2$), but positively associated with percent MD among lean women ($\text{BMI} < 25 \text{ kg/m}^2$; per minor allele change in percent MD: -0.67% and 1.43% , respectively; $P=0.01$).³⁸ In the present study, we found an inverse association between this genetic variant and stroke risk only among non-obese subjects ($\text{OR} = 0.67$, 95% CI 0.48–0.94) which could

have been a chance finding but could also imply that the biological mechanisms of this genetic variant on stroke might involve BMI, or that the effect on stroke risk is dependent of BMI.

The main limitation of our study is our reduced sample size. Although results were statistically significant, they may also represent false positive findings and larger studies are needed to confirm them. We were able to replicate some of our findings on the key SNPs using publicly available datasets. Our population under study is a Spanish population, therefore our findings may vary by ethnicities.

Another potential limitation of our study relates to the age difference between cases and controls [mean age (SD) cases: 70.04 ± 13.02 , mean age (SD) controls: 64.63 ± 12.37]. Although all our models were age-adjusted, we further explored this potential bias in detail through stratified analysis.

We conducted a stratified analysis excluding cases and controls under two different scenarios; in both cases, results of our manuscript were virtually unchanged. First, we excluded cases and controls with the biggest age differences, i.e. we excluded cases from the last decile, i.e. the oldest; and controls from the first decile, i.e. the youngest, that is, we excluded the two tails needed to reduce the difference between means from 5.4 to 0.8 years, which is a non-significant difference, and results remained virtually unchanged. We conducted such a stratified analysis in overall, obese and non-obese subjects, and results remained virtually unchanged (Supplementary Table 7a). Second scenario consisted in excluding only controls from the first two deciles, without excluding any case, i.e. we only excluded the two deciles of youngest controls. Under this scenario, the reduction between means was similar as the one under the first scenario (5.4 years changed to 0.9 years, which is also a non-significant difference). We also conducted this stratified analysis for overall, obese and non-obese subjects, and results remained virtually unchanged (Supplementary Table 7b). These results support the notion that our findings are not likely to be the consequence of a bias arising from the age difference between cases and controls.

In conclusion, SNPs rs10761731, rs2479409 and rs6511720 were shown to significantly increase the risk of stroke in obese subjects in our population. A combined GRS weighting the risk of each risk allele of the three genomic variants was a good independent predictor of the risk of stroke, particularly among female obese subjects, suggesting an additive predictive value of the SNPs on risk. Only one other SNP, rs865686, was found to be significantly associated with the risk of stroke among non-obese subjects. Significant differences between obese and non-obese individuals were detected, which may indicate that obesity is an important modulating factor on the effect of genetics on risk of stroke. Our findings could serve to better stratify future risk prediction tools for this disease in the Spanish population.

Supplementary material

Supplementary material is available at *Brain Communications* online.

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Details of the MEGASTROKE authors are provided in the Supplementary material.

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Competing interests

The authors report no competing interests.

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