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A functional neuroimaging association study on the interplay between two schizophrenia genome‑wide associated genes (*CACNA1C* **and** *ZNF804A***)**

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Abstract

The *CACNA1C* and the *ZNF804A* genes are among the most relevant schizophrenia GWAS fndings. Recent evidence shows that the interaction of these genes with the schizophrenia diagnosis modulates brain functional response to a verbal fuency task. To better understand how these genes might infuence the risk for schizophrenia, we aimed to study the interplay between *CACNA1C* and *ZNF804A* on working memory brain functional correlates. The analyses included functional and behavioural N-back task data (obtained from an fMRI protocol) and *CACNA1C*-rs1006737 and *ZNF804A*-rs1344706 genotypes for 78 healthy subjects and 78 patients with schizophrenia (matched for age, sex and premorbid IQ). We tested the effects of the epistasis between these genes as well as of the three-way interaction $(CACNAIC \times ZNAF804A \times \text{diagnosis})$ on working memory-associated activity (N-back: 2-back vs 1-back). We detected a signifcant *CACNA1C* × *ZNAF804A* interaction on working memory functional response in regions comprising the ventral caudate medially and within the left hemisphere, the superior and inferior orbitofrontal gyrus, the superior temporal pole and the ventral-anterior insula. The individuals with the GWAS-identifed risk genotypes (*CACNA1C*-AA/AG and *ZNF804A*-AA) displayed a reduced working memory modulation response. This genotypic combination was also associated with opposite brain activity patterns between patients and controls. While further research will help to comprehend the neurobiological mechanisms of this interaction, our data highlight the role of the epistasis between *CACNA1C* and *ZNF804A* in the functional mechanisms underlying the pathophysiology of schizophrenia.

Keywords *CACNA1C* gene · *ZNF804A* gene · Epistasis · Schizophrenia · fMRI · Working memory

Introduction

Schizophrenia (SZ) is a severe and disabling psychiatric disorder whose heritability has been estimated to be up to 80%, highlighting its strong genetic component [[1\]](#page-7-0). Genome-wide association studies (GWAS) have provided

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compelling evidence of the polygenic architecture of SZ, with probably thousands of genetic variants with additive effects $[1, 2]$ $[1, 2]$ $[1, 2]$. The organisational complexity that involves such polygenicity is further complicated by the fact that genes are not functioning alone, and many of them interplay with each other, the so-called genetic epistasis. Since then, the challenge has been to study the modifying efect that one allele may exert over another at a diferent locus, an efect related to the dependencies within molecular pathways to ensure biological function [\[3](#page-7-2)]. As well, the convergence of GWAS data has allowed highlighting relevant pathways in the pathophysiology of SZ, such as synaptic plasticity [[4](#page-7-3), [5](#page-7-4)]. The *CACNA1C* and *ZNF804A* genes are part of these pathways, and they map to two of the most robustly associated loci with the susceptibility

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for the disorder [[4–](#page-7-3)[8](#page-7-5)]. However, how they increase the vulnerability for SZ remains relatively unknown, and their epistatic efect has been scarcely studied.

On the one hand, the *CACNA1C* gene encodes for the α-1C subunit of the Cav 1.2 voltage-dependent L-type calcium channel, an ion channel that regulates the calcium infux into the cell upon the polarisation of the membrane and represents the predominant calcium channel in the brain [[9–](#page-7-6)[11\]](#page-7-7). The location of this channel in neuronal bodies, dendritic spines and shafts is indicative of critical roles in the regulation of postsynaptic signalling pathways, neurotransmitter release, neuronal excitability, synaptic plasticity and cell survival [[12\]](#page-8-0). Within *CACNA1C* variability, the rs1006737-G/A has been associated with the risk of SZ through GWAS and meta-analysis [\[8](#page-7-5), [13\]](#page-8-1) and with the modulation of *CACNA1C* mRNA levels in the dorsolateral prefrontal cortex in human prenatal post-mortem brain samples [\[14](#page-8-2)]. Reinforcing the relevance of this genetic variant, a study based on human-induced neurons has reported the association between the SZ's risk allele and an increased mRNA expression and Cav1.2 current density [[15\]](#page-8-3). Additionally, studies on post-mortem human brain samples have related this same risk allele to *CACNA1C* expression changes [\[14,](#page-8-2) [16\]](#page-8-4).

On the other hand, the *ZNF804A* gene encodes for the zinc-fnger protein 804A. While its exact function remains unclear, the presence of the zinc-fnger domain suggests a role as a transcription factor and as a gene-expression regulatory element of genes related to synaptic plasticity processes, such as cell adhesion, neurite outgrowth and dendritic branching [[17–](#page-8-5)[19\]](#page-8-6). To these data, recent studies also add evidence on its implication in mRNA processing and RNA translation [\[20,](#page-8-7) [21](#page-8-8)]. Indeed, among genes regulated by *ZNF804A,* there are *RBFOX1*, *DRD2* and *COMT,* which have also been associated with the risk for SZ [\[20](#page-8-7), [22](#page-8-9)]. The *ZNF804A* is expressed throughout foetal development and in the adult human brain [[18,](#page-8-10) [23\]](#page-8-11), and its dysregulation may contribute to altered neuronal and synaptic structures related to psychotic disorders [\[24](#page-8-12)]. Regarding the genetic variability of *ZNF804A*, the rs1344706-A/C has been associated with psychosis [[2,](#page-7-1) [4](#page-7-3), [6,](#page-7-8) [25](#page-8-13), [26\]](#page-8-14) and with higher schizotypy scores, a risk phenotype associated with the susceptibility for psychosis distributed in the general population [[27,](#page-8-15) [28](#page-8-16)]. Moreover, from a molecular point of view, it has been seen that the rs1344706-A allele is associated with reduced *ZNF804A* expression in prenatal and adult post-mortem human brain [[18\]](#page-8-10), which was later confirmed by another post-mortem foetal brain study evidencing a reduced expression of the most abundant *ZNF804A* splice variant in A risk homozygotes [\[23](#page-8-11)]. For both, *CACNA1C*-rs1006737 and *ZNF804A*rs1344706, the A allele has been identifed as the risk variant associated with SZ through candidate gene, GWAS and meta-analytic approaches [\[2](#page-7-1), [6](#page-7-8), [8](#page-7-5), [26,](#page-8-14) [29,](#page-8-17) [30\]](#page-8-18).

To get a comprehensive overview of how genetic variability contributes to SZ, functional MRI (fMRI) is considered a powerful tool to assess the relationship between genetic and biological mechanisms underlying the cerebral activation patterns and cognitive features in psychiatric disorders [\[31](#page-8-19)]. In this regard, there is extensive research on the role of *CACNA1C* and *ZNF804A* in the modulation of brain function using multiple approaches and paradigms. Nonetheless, the previous studies are mainly based on healthy participants [\[32](#page-8-20)[–37](#page-8-21)]. Focusing on working memory, several studies have reported independent associations for both genes with changes in the connectivity between the dorsolateral prefrontal cortex and the hippocampus in healthy subjects [\[32,](#page-8-20) [34,](#page-8-22) [38](#page-8-23)]. Regarding the *CACNA1C,* there is only one study that reported the efect of the rs2007044 variability (a variant in linkage disequilibrium with rs1006737) on working memory brain activity response in a case–control sample of Chinese origin [\[39](#page-8-24)]. On the other hand, most of the *ZNF804A*-fMRI data on SZ come from studies based on resting-state paradigms or evaluating diferent cognitive dimensions [\[40](#page-8-25)[–43](#page-8-26)]. Only one study showed that within afected individuals, the rs1344706 modulated the connectivity between the right dorsolateral prefrontal cortex and the left hippocampal formation during the N-back task performance [\[40](#page-8-25)].

Based on this evidence, a common downstream physiological pathway for *CACNA1C* and *ZNF804A* genes has been suggested [[44\]](#page-8-27) since genes that disrupt the same molecular pathway are more likely to infuence similar phenotypes $[45]$ $[45]$. For this reason, inspecting epistatic effects in quantifiable and brain-based phenotypes may add relevant data on their joint role. Indeed, previous evidence points towards an interplay between these two genes on brain function during a verbal fuency task [[46](#page-9-0)], showing that carrying both risk genotypes (*CACNA1C*-AA/AG and *ZNF804A*-AA) could be associated with opposite efects in fMRI response in individuals with SZ and healthy subjects. Also, from structural approaches in bipolar disorder, which has a substantial shared background with schizophrenia [\[47,](#page-9-1) [48\]](#page-9-2), there are data suggesting a *CACNA1C* and *ZNF804A* epistasis on white matter microstructure alterations [[49\]](#page-9-3). In this sense, further neuroimaging studies analysing the epistasis between *CACNA1C* and *ZNF804A* in healthy controls and patients are needed, and they could beneft from using more homogeneous samples to overcome some of the limitations resulting from the disorder's epidemiological characteristics.

According to the above mentioned, our main goal was to investigate the *CACNA1C* and *ZNF804A* epistatic efects concerning brain function during the performance of a working memory task in a matched sample of healthy subjects and patients with SZ. Secondly, we aimed to assess whether this putative epistatic efect exerted a diferential modulation depending on the health/disease status. We hypothesised that the efect of the genetic variability at the *CACNA1C* gene on the brain response to the N-back task would be modulated by the variability at the *ZNF804A* gene*,* or vice versa, and that this epistatic efect would be diferent regarding the diagnosis.

Methods and materials

Sample

The sample consisted of 78 healthy subjects (HS) and 78 patients with a confrmed diagnosis of SZ according to DMS-IV-TR (based on an interview by two psychiatrists). All participants were of European ancestry with ages comprised between 18 and 65 years old, had a current $IQ > 70$ (WAIS-III) [[50](#page-9-4)] and were right-handed. The HS had no personal or family history of psychotic disorders or treatment. All participants met the same exclusion criteria, which included: major medical illness afecting brain function, neurological conditions, history of head trauma with loss of consciousness and present or history of drug abuse or dependence. The patients were evaluated with the Positive and Negative Symptoms Scale (PANSS) [[51,](#page-9-5) [52](#page-9-6)]. The premorbid IQ in patients (and the corresponding estimated IQ in controls) was assessed using the Word Accentuation Test [\[53\]](#page-9-7). Healthy subjects and patients with SZ were matched for age, sex, and premorbid IQ to conduct the neuroimaging association analyses. The description of the sample is summarised in Table [1](#page-2-0).

Ethical approval was obtained from the Germanes Hospitalàries Research Ethics Committee, and all participants provided written informed consent about the study procedures and implications. All procedures were carried out according to the Declaration of Helsinki.

Molecular analysis

Genomic DNA was extracted for all individuals either from buccal mucosa through cotton swabs using ATP Genomic Mini Kit Tissue (Teknokroma Analitica, S.A., Sant Cugat del Vallès, Spain) or from peripheral blood cells using Realpure SSS kit (Durviz, S.L.U., Valencia, Spain). Two SNPs were genotyped, the rs1006737-A/G at *CACNA1C* gene (12p13.33) and the rs1344706-C/A at *ZNF804A* gene (2q32.1). The allelic discrimination was performed using a fluorescence-based procedure (Applied Biosystems Taqman 5′-exonuclease assays) using standard conditions, and the polymerase chain reaction plates were read on ABI PRISM 7900HT instrument with SDS v2.1 software (Applied Biosystems). The genotyping call rate was > 0.99 , and the accuracy of the method was tested by running in duplicate the 10% of the samples and confrming all the repeated genotypes. The minor allele frequency in our sample (rs1006737-A=0.30 and rs1344706-C=0.42) was similar to the one described for the European superpopulation in the 1000 Genomes Project ($rs1006737-A=0.32$ and $rs1344706-C=0.38$, and the genotype frequencies were in Hardy–Weinberg equilibrium in both diagnostic groups.

Table 1 Demographic, clinical and genetic description of the sample included in the study

	Healthy subjects $(n=78)$	Patients with SZ $(n=78)$	
Age	37.31 (10.09)	37.56 (9.80)	<i>t</i> -student = $-$ 0.16, $p = 0.88$
Sex	53:25 (67.9%)	53:25 (67.9%)	χ^2 = 0.00, p = 1.00
Premorbid IO	104.13(7.23)	102.33(7.94)	<i>t</i> -student = 1.38, $p = 0.14$
Illness duration ^a		13.91 (9.99)	
PANSS total ^b		72.62 (21.28)	
PANSS positive ^b		17.23(6.37)	
PANSS negative ^b		20.97(8.16)	
PANSS general psychopathology ^b		34.41 (10.05)	
CPZ equivalents ^c		569.56 (447.0.2)	
CACNA1C Acar + ZNF804A AA	16(0.21)	17(0.22)	χ^2 = 0.12, p = 0.99
CACNA1C Acar + ZNF804A Ccar	20(0.26)	21(0.27)	
CANCA1C GG + ZNF804A AA	12(0.15)	11(0.14)	
$CACNAICGG + ZNF804$ Ccar	30(0.38)	29(0.37)	

All the quantitative variables include mean and standard deviation (sd). The sex description includes male/female count (% of males) for both healthy subjects and patients with schizophrenia (SZ). The clinical description of patients includes: illness duration (in years), PANSS scores, and Chlorpromazine (CPZ) equivalents (mg/day). The count (frequency) of each genotype combination is given

a Data of Illness duration were available for 73 patients

b Data of PANSS scores were available for 73 patients

c Data of CPZ equivalent doses were available for 76 patients

To maximise the power and given the small number of individuals carrying *CACNA1C*-AA and *ZNF804A*-CC genotypes, all the analyses were carried out by grouping the minor and the heterozygous genotypes (Table [1](#page-2-0)), following the same criteria as previously [[46\]](#page-9-0). Then, the resulting dichotomised genotypes were used in all the analyses: *CAC-NA1C*-GG homozygotes *vs CACNA1C*-AA/AG (A-allele carriers, Acar); *ZNF804A*-AA homozygotes *vs ZNF804A*-AC/CC (C-allele carriers, Ccar).

N‑back task

Functional images were acquired while participants performed a sequential-letter version of the N-back task [[54](#page-9-8)], which engages many storage and executive processes related to attention and working memory. The task had two levels of memory load (1-back and 2-back) presented in a blocked design manner. Each block consisted of 24 letters that were shown every $2 s$ (1 s on, 1 s off), and all blocks contained five repetitions located randomly within the blocks. Individuals were told to indicate repetitions by pressing a button. Four 1-back and four 2-back blocks were presented in an interleaved way, and between them, a baseline stimulus (an asterisk fashing with the same frequency as the letters) was presented for 16 s. Characters were shown in green for 1-back blocks and red for 2-back blocks. The same day and before the scanning session, all participants underwent a training session outside the scanner.

fMRI acquisition parameters

The fMRI data acquisition was performed with a GE Sigma 1.5T scanner (General Electric Medical Systems, Milwaukee, Wisconsin, USA) at Hospital Sant Joan de Déu (Barcelona, Spain). The fMRI scanners included 266 volumes for each individual and a gradient echo-planar imaging sequence depicting the blood oxygen level-dependent (BOLD) signal. Each volume contained 16 axial planes acquired with the following parameters: repetition time=2000 ms., echo time=20 ms., flip angle=70°, section thickness=7 mm, section skip = 0.7 mm, in-plane resolution = 3×3 mm. The frst 10 volumes were discarded to avoid T1 saturation effects

Brain functional data analysis

The fMRI image analyses were performed using FEAT tool included in FSL Software (FMRIB Software, University of Oxford, Oxford, UK) [[55](#page-9-9)]. In the frst-level analysis, images were corrected for movement and co-registered to a common stereotaxic space [Montreal Neurologic Institute (MNI) template]. To minimise unwanted movementrelated effects, subjects with an estimated maximum absolute movement>3.0 mm or an average absolute move $ment > 0.3$ mm were previously excluded from the study. Normalised volumes were spatially smoothed using Gaussian flter with a full-width at half-maximum of 5 mm, and general linear models were ftted to generate individual activation maps for three diferent contrasts: 1-back *vs* baseline, 2-back *vs* baseline and 2-back *vs* 1-back. Additionally, to control for the movement parameters, the movement variables were added to the model as nuisance variables. All the statistical tests were performed using a cluster-wise correction method for multiple comparisons. The initial set of clusters was defned with a cluster-forming threshold of $Z=2.6$ (equivalent to a *p* value < 0.005) using the standard feld theory correction implemented in FSL. Afterwards, only those clusters with a p value < 0.05, family-wise corrected for multiple comparisons using Gaussian random feld methods, were considered and reported (according to standard procedures in FSL). Subsequently, in the second-level analysis, we tested in the whole sample (healthy subjects and patients): (i) the *CACNA1C* × *ZNF804A* epistasis and, (ii) the *CACNA1C* \times *ZNF804A* \times diagnosis three-way interaction. This was conducted through a full-factorial ANOVA, including the main efects of diagnosis, *CACNA1C* and *ZNF804A* and all the two-way interactions (whole-brain corrected and adjusted by age, sex, and premorbid IQ). This was tested in the 2-back vs 1-back contrast to specifcally assess working memory functional response [[56](#page-9-10)]. Afterwards, to interpret the direction of the results, using the FSLSTATS tool in FSL, individual mean activity scores were estimated from the areas where significant effects were detected, and these values were plotted using SPSS (IBM SPSS Statistics, version 27.0, released 2020, IBM Corporation, Armonk, New York). It must be acknowledged that the mean activity scores obtained from the 2-back *vs* 1-back contrast do not represent mean activity per se, but the mean activity change occurred between 1-back and 2-back levels.

To assess the diagnostic relevance of these results, we frst evaluated the diagnostic diferences in 2-back *vs* 1-back contrast by employing an ANOVA model (whole-brain corrected) comparing brain activity between HS and patients (adjusted for age, sex, and premorbid IQ). The results retrieved the clusters with higher activation in HS as compared to patients and the clusters with higher activation in patients as compared to HS (described in detail in Supplementary Material). These regions were then transformed into two brain masks. Afterwards, we repeated the aboveexplained full-factorial ANOVA tests within these two brain masks.

N‑back behavioural measures

The behavioural measure used was the signal detection theory index sensitivity, *d*′ score [\[57](#page-9-11)]. Higher values of the *d*′ score indicate a better ability to discriminate between targets and distractors, while negative values indicate that subjects are not performing the task. Therefore, all the individuals included in the analyses had positive *d*′ values (both, *d*′1 for 1-back and *d*′2 for 2-back).

Statistical analyses

Demographic and clinical data were analysed using SPSS. First, in the complete sample, the effect of the *CAC-NA1C* \times *ZNF804A* epistasis on sex, age and premorbid IQ was examined through χ^2 and ANOVA. Second, we tested the epistasis in relation to the risk of the disorder by means of χ 2. Finally, within patients, we assessed the epistatic efect on the clinical variables (PANSS score and Chlorpromazine equivalents) using ANOVA tests. No signifcant results were derived from these analyses (Table [1\)](#page-2-0).

The statistical analyses conducted for the fMRI data have been described previously in the fMRI data analysis section.

Regarding the N-back behavioural analysis, we studied both: (i) the *CACNA1C* × *ZNF804A* epistasis and, (ii) the three-way interaction (*CACNA1C* × *ZNF804A* × diagnosis), on the variability between *d*′1 and *d*′2 performance using a full factorial repeated measures ANOVA (SPSS). In this model, the two *d*′ values were considered as the withinsubjects two-level factor and the diagnosis, *CACNA1C* and *ZNF804A* as the between-subjects factors (adjusted by age, sex, and premorbid IQ).

Results

Brain functional data

We tested the *CACNA1C* \times *ZNF804A* epistasis and threeway interaction (*CACNA1C* × *ZNF804A* × diagnosis) on the brain activity patterns during working memory (2-back vs 1-back contrast of the N-back task).

On the one hand, we observed a significant *CAC-* $NAIC \times ZNF804A$ epistasis in one cluster (445 voxels, peak activation at MNI [− 2, 6, − 6], *Z*max=4.15, *p* value $=0.0149$) (Fig. [1\)](#page-5-0). This cluster was located medially at the ventral caudate and the olfactory cortex and, within the left hemisphere, extended to the superior and inferior orbitofrontal gyrus, the superior temporal pole and reached the ventral-anterior insula. To better describe this result, we extracted and plotted the mean activity scores of the cluster separately for HS and patients. We observed that the epistatic efect worked in the same direction in both groups (see the dashed arrows in Fig. [1b](#page-5-0)). Beyond the epistatic efect, it is of note that all individuals, except the patients carrying both risk alleles (*CACNA1C*-Acar+*ZNF804A*-AA), responded to the increased difficulty of the task by decreasing the mean activity (as indicated by the negative values of the mean activity change in Fig. [1b](#page-5-0)). On the contrary, the patients carrying both risk alleles presented a mean activity change in the opposite direction compared to the rest of the subjects (see the positive values of the mean activity change in Fig. [1b](#page-5-0)).

On the other hand, the three-way interaction was non-signifcant.

To assess the relevance of the detected efect in relation to the SZ's diagnosis, we extracted the clusters with signifcant activity diferences between patients and controls (described in Supplementary Material). Within these regions, the analyses of the *CACNA1C* × *ZNF804A* epistasis and three-way interaction confirmed the previously explained results. The same cluster where the epistasis was detected in the whole-brain analysis, albeit reduced in size (encompassing the medial caudate and the olfactory cortex), remained significant (187 voxels, peak activation at MNI $[-2, 6, -6]$, Z max = 4.15, *p* value = 0.0149).

N‑back behavioural data

The epistasis showed a trend effect on the performance differences between the two levels of the task (*d*′1 and *d*′2) $(F=3.52, p$ value = 0.063). Independently of the diagnosis, individuals carrying *CACNA1C*-GG+*ZNF804A*-Ccar genotypes, and also those with both risk genotypes (*CACNA1C*-Acar+*ZNF804A*-AA), showed less ability to adapt to the task increased difficulty (Fig. [2\)](#page-5-1). The three-way interaction did not retrieve signifcant results on N-back performance.

Discussion

Besides the extensive research done on the role of *CAC-NA1C*-rs1006737 and *ZNF804A*-rs1344706 in brain functional phenotypes, there is only one previous fMRI study exploring the genetic epistasis between these two genes. This study reports an epistatic efect in healthy subjects and a three-way interaction with the diagnosis on verbal fuency's functional correlates [[46\]](#page-9-0). Our study adds evidence on the interaction between these genes on another cognitive domain afected in schizophrenia, as is working memory, and describes a *CACNA1C* × *ZNF804A* epistasis on N-back associated functional response across patients with SZ and healthy subjects.

The analysis assessing the interplay between *CAC-NA1C* and *ZNF804A* on brain activity associated with N-back performance (2-back *vs* 1-back contrast) revealed signifcant epistasis between these two SZ risk genes. The epistasis was found in regions comprising the caudate, the inferior frontal gyrus, the superior temporal pole, and the insula. The fact that the epistasis worked in the same

Fig. 1 a Axial view of the cluster with signifcant *CACNA1C* × *ZNF804A* epistasis at 2-back vs 1-back contrast, resulting from the analysis including both healthy subjects and patients with schizophrenia (Z max = 4.15, p value = 0.0149). The right side of the image represents the right side of the brain. The MNI coordinates are given for the shown slices. Units of the bar are the standardised *Z* scores (*Z* threshold = 2.6, *p* value < 0.05). **b** Bar plots with corresponding mean

Patients with Schizophrenia ZNF804A \Box Ccar -0.20 A $d² - d¹1$ score -0.60 $-0.78(0.28)$ $-0.88(0.20)$ -1.00 $-1.22(0.17)$ $-1.21(0.23)$ -1.40 -1.80 GG Acar CACNA1C

Fig. 2 Plots representing the *d*′2–*d*′1 score (N-back behavioural measures), which is used to evaluate performance diferences between the two levels of the task (according to Egli et al. [\[56\]](#page-9-10)). The bars correspond to the estimated marginal means and ± 2 standard

errors (se) for healthy subjects in the left and patients with schizophrenia in the right by *CACNA1C* × *ZNF804A* genotypes. The grey dashed lines indicate the directionality of the *CACNA1C* × *ZNF804A* epistasis trend $(F=3.52, p$ value=0.063)

direction in both diagnostic groups explains why the *CAC-NA1C* × *ZNF804A* × diagnosis three-way interaction was not detected in this cluster. However, the estimation of the mean activity change showed that the directionality of the mean activity shift in patients with SZ carrying the risk genotype combination (*CACNA1C*-Acar+*ZNF804A*-AA) was opposite as compared to the rest of the individuals. This is indicative of an increase in brain activity in response to the task difficulty, which is contrary to the activity decrease observed in the rest of the subjects.

The areas where the epistasis was found have been previously associated with divergent brain function between patients and controls in response to the N-back task. On the one hand, regions such as the superior temporal pole were previously associated with N-back diferences between HS and patients with SZ, in a study performed by our group in a partially overlapping sample [\[58\]](#page-9-12). Also, through metaanalytic approaches, regions such as the left insula have been related to SZ's distinctive functional activity in response to this task [[59](#page-9-13)]. On the other hand, when we conducted the analysis within the regions with diagnostic diferences, the epistasis was also signifcant. The diagnostic relevance of the implicated regions and the directionality of the efect driven by the previously identifed risk alleles point towards the biological plausibility of the fnding. However, despite the biological meaningfulness of our data obtained through a cluster-wise correction method, which helps in type I error control [[60\]](#page-9-14), we must acknowledge that our results have to be interpreted cautiously because the detection of epistatic efects in other regions or even three-way interactions could be hampered by our limited sample size.

Framing our results with previous evidence, our data are partially aligned with Tecelão et al. [[46](#page-9-0)]. This study found that healthy individuals carrying both risk genotypes (*CACNA1C*-Acar and *ZNF804A*-AA) showed reduced activation in the precuneus, the posterior cingulate cortex, the calcarine sulcus and the thalamus. In contrast, they did not describe any efect on subjects with SZ. Unlike the preceding data [\[46](#page-9-0)], we did not fnd the diagnosis to modulate the directionality of the genetic epistasis. While our study and the previous one used a comparable sample, the same scanner's magnetic feld and similar acquisition parameters, this dissimilarity could be due to other methodological diferences. First, the three-way epistasis previously described modulated the functional response to verbal fuency, while we assessed working memory. Also, distinct results could arise from diferences in the characteristics of the samples. In the preceding study, the sample included individuals from diferent ethnical origins and with demographic diferences across diagnostic groups. In contrast, our sample included only individuals of European ancestry and the putative efect of age, sex and premorbid IQ on brain function was controlled by matching HS and patients with SZ.

Considering the behavioural results, the epistasis did not reach signifcance. This result could be understood from the perspective that behavioural phenotypes are further from the genetic background, and therefore, genetic variability at this level is considered less penetrant [\[61\]](#page-9-15). Nonetheless, considering together both behavioural and functional results, it must be mentioned that the individuals who showed higher modulation in the functional response were also the ones whose performance was least afected by the change at behavioural difficulty (*CACNA1C-GG+ZNF804A-AA* and *CACNA1C*-Acar+*ZNF804A*-Ccar). This might suggest a link between the observed epistatic efect on brain activity modulation and the putative efect on behavioural response. Together our and previous data indicate the interest of the analyses of epistatic efects on the brain and behavioural phenotypes. While the assessment of epistatic and three-way interactions on neuroimaging phenotypes has been typically conducted in samples sizes comparable to ours [[62–](#page-9-16)[65](#page-9-17)], advances towards a better understanding of inter-individual diferences in brain function require the reproducibility in samples of thousands of participants and meta-analytical evidence [[66\]](#page-9-18).

Lastly, some limitations of our study should be acknowledged. The main one is accounted for the sample size. Although our sample of 78 HS and 78 patients with SZ is larger than the median sample size of brain-wide association studies according to a recent revision [[66](#page-9-18)] and, also than the previous fMRI study reporting *CACNA1C* and *ZNF804A* epistasis [\[46\]](#page-9-0), neuroimaging genetic association studies conducted in samples with less than 100 individuals may be conditioned by type I and type II errors [[60](#page-9-14)]. On the one hand, considering type I error, there are several methodological aspects in our analyses that have been used to prevent it, such as our hypothesis-driven approach and the polymorphic variants selection based on SZ's GWAS signifcance; the homogeneity of our sample in terms of ethnicity, demographic variables, and general cognitive abilities, derived from the use of matched groups; and the stricter significance threshold together with the cluster-wise correction method. On the other hand, type II errors could have impeded the detection of epistatic efects in other regions or even three-way interactions. While we are aware that the lack of power statistical analyses limits this interpretation, their implementation in our study was difficulted by the statistical model used for the neuroimaging analysis (wholebrain three-way interaction). To our knowledge, the available power tools are focused on ROI-based approaches and two-sample T test. Also, we considered that *post hoc* power analyses have been repeatedly discouraged and regarded as uninformative [[67–](#page-9-19)[69](#page-9-20)]. Finally, we must consider that, as in our statistical model patients with SZ and HC were both included, variables related exclusively to the illness status could not be considered. Bearing this in mind, we examined

the possible efect of illness duration, PANSS total score, estimated medication dose through Chlorpromazine (CPZ) equivalents on the estimated brain mean activity and the *d*′ diference (*d*′2–*d*′1 score) through bivariate correlations within patients. Whereas no effects were detected neither in relation to mean brain activity (illness duration $r = 0.164$, $p=0.17$; PANSS score $r=0.09$, $p=0.47$; medication dose $r=0.07$, $p=0.56$; medication type $F=0.23$, $p=0.80$), nor on the task performance (illness duration $r = 0.05$, $p = 0.68$; PANSS score $r=0.01$, $p=0.97$; medication dose $r=0.13$, $p = 0.28$; medication type $F = 0.92$, $p = 0.41$), we cannot completely rule out the modulatory efects of patients' clinical conditions and medication on these phenotypes. Finally, data from larger samples (ideally including thousands of individuals to ensure the reproducibility of the results), the assessment of larger genetic variability, (two SNPs do not represent the polygenic nature of working memory and SZ), and higher resolution scanners (with higher sensitivity for detecting changes in brain activation), are needed to compare these results and replicate thereof.

In conclusion, our study adds novel evidence on the interplay between *CACNA1C* and *ZNF804A*, two of the variants most strongly associated with SZ, on working memory functional response, evaluated with the N-back task during an fMRI protocol. Furthermore, we observed an opposite activity pattern between patients and healthy subjects when considering only those carrying the GWAS-identifed risk genotypes. While further studies are needed to comprehend the neurobiological mechanisms by which these two genes interact, the converging evidence suggests the role of this epistatic efect in the altered functional mechanisms underlying the pathophysiology of schizophrenia and encourages new research on their putative common pathway.

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Author contributions MF-V and MG-R conceived the study. MG-R, CA-P, AL and AS conducted the DNA extraction and genotyping. PS-P, JO-G, JJG, AG-P, SS and EP-C conducted the recruitment and/ or the clinical evaluation. RS, TM and EP-C designed the MRI protocol and supervised the fMRI analyses. PS-P and PF-C pre-processed the fMRI images. MG-R, CA-P and MF-V performed the data curation and the statistical analyses. PF-C, RS and SP participated in the revision of the methodology. MG-R, CA-P and MF-V wrote the frst draft and subsequent drafts of the paper. MG-R, CA-P and MF-V interpreted the results and revised the manuscript. MF-V supervised the study activity planning and execution. VM, EP-C and MF-V participated in the funding acquisition. All the authors reviewed and approved the final manuscript.

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Availability of data The data that support the fndings of this study are available from the corresponding author upon reasonable request.

Declarations

Conflict of interest The authors declare that there are no competing interests.

Ethics approval Ethical approval was obtained from local research ethics committees. All procedures were carried out according to the Declaration of Helsinki.

Consent to participate All participants provided written informed consent about the study procedures and implications.

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