# Exome sequencing of healthy phenotypic extremes links *TROVE2* to emotional memory and PTSD

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Many mental disorders represent the extremes of the normal distribution of traits, which are related to multiple cognitive and emotional dimensions. By performing whole-exome sequencing of healthy, young subjects with extremely high versus extremely low aversive memory performance, we identified *TROVE2* as a gene implicated in emotional memory in health and disease. *TROVE2* encodes Ro60, a broadly expressed RNA-binding protein implicated in the regulation of inflammatory gene expression and autoimmunity. A regulatory *TROVE2* variant was linked to higher emotional memory capacity and higher emotional memory-related brain activation in healthy subjects. In addition, *TROVE2* was associated with traumatic memory and the frequency of post-traumatic stress disorder in genocide survivors.

nhanced memory for emotional events, a common observation in animals and humans, is an evolutionary important trait, because it helps remembering both dangerous and favorable situations<sup>1</sup>. On the other hand, strong sensory and emotional memories of various life-threatening and aversive experiences may contribute to the development and symptoms of post-traumatic stress disorder (PTSD)<sup>2,3</sup>, especially when such memories loose their association with the original contextual system<sup>4,5</sup>. In healthy humans, emotionally charged memory (that is, enhanced memory for emotional events) shows large phenotypic variability<sup>6</sup> and has been linked to genetic variants of well-established neuromodulatory systems and molecules in candidate gene studies<sup>6-13</sup>. Similarly, there is substantial variability in the individual vulnerability to develop PTSD, particularly at lower levels of trauma exposure, which can be partially explained by genetic factors<sup>14</sup>.

Next-generation sequencing coupled with efficient DNA capture has recently enabled the use of whole-exome sequencing (WES) for the study of the genetics of human phenotypes<sup>15</sup>. Indeed, WES studies have been particularly successful at identifying functional variants related to complex traits<sup>15-17</sup>. Such variants can be identified through extreme-phenotype sampling followed by deep WES<sup>17-20</sup>. In extreme-phenotype sampling, samples from a carefully selected population at one or both ends of the extremes of a phenotype, which have been adjusted for known covariates, are subjected to sequencing. In these populations, causal variants are expected to be enriched. Thus, even small sample sizes may be sufficient to suggest candidate variants that can subsequently be genotyped in a larger group of phenotyped individuals, as has also been shown recently by empirical research<sup>21</sup>.

Here we performed WES in healthy, young subjects with extreme high or extreme low emotionally charged memory performance, followed by targeted genotyping in a larger population, which showed a normal distribution of the phenotype of interest (n = 2,684). Genotype-dependent differences in emotional memory-related brain activation were studied in a homogenous sub-sample of 1,258 subjects. In addition, we assessed the effect of the identified variants on gene expression in the post-mortem human brain and on symptoms and frequency of PTSD in genocide survivors.

#### Results

**Exome sequencing in phenotypic extremes.** WES was performed in 88 healthy, young participants with extreme high or extreme low aversive memory performance carefully matched for sex (1-to-1 matching), genetic background, age and smoking behaviour (see Methods, Fig. 1, Supplementary Fig. 1 and Supplementary Table 1). Aversive memory was quantified by means of a picture delayed freerecall task. High and low extremes were defined on the basis of the distribution of aversive memory performance in n = 3,418 healthy, young subjects (see Methods).

WES was performed with the SureSelectXT human all exon V5+UTR target-enrichment kit (Agilent), which allows sequencing of exonic and near-gene regulatory variants. To avoid discarding

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**Figure 1 | Frequency histogram of aversive memory performance in 3,418 healthy, young adults.** Dotted vertical blue and red lines at the right distribution tail represent the lower and upper performance margins of subjects, respectively, defined as high extremes. Dotted vertical blue and red lines at the left distribution tail represent the upper and lower performance margins of subjects, respectively, defined as low extremes.

variants that were enriched at high frequencies in the extremes<sup>21</sup>, the empirical minor allele frequency (MAF) in the extreme dataset of n = 88 subjects was set to  $\leq 0.125$  (see Methods). Given that no prior information is available regarding putative differences in effect sizes of variants associated with the phenotype of interest, genebased analyses were done using both burden and adaptive burden tests (see Methods). After adjustment for multiple testing, TROVE2 (encoding TROVE domain family member 2; also known as Sjögren syndrome type A antigen; Ro60 KDa autoantigen), PKD2L2 (encoding polycystin 2 like 2, also known as transient receptor potential cation channel), and CFAP57 (also known as WDR65; encoding cilia and flagella associated protein 57) were significantly associated with group membership, which reflected extreme aversive memory performance (Table 1). We investigated TROVE2 further, because this gene exceeded the adjusted significance threshold in both the burden and adaptive burden test (Table 1). In the burden test, TROVE2 remained significant after Bonferroni correction for the entire number of genes (n = 21,175) that were analysed in the burden test ( $P_{\text{nominal}} = 2 \times 10^{-6}$ ,  $P_{\text{Bonferroni}} = 0.042$ ; Supplementary Fig. 2). Moreover, *TROVE2* was the best hit ( $P_{\text{nominal}} = 0.0002$ ) in the optimized sequence kernel association test (SKAT-O)<sup>22</sup> (Supplementary Table 2). A detailed view of the sequencing data for TROVE2 (Fig. 2) showed that the variant, which is mainly responsible for the results of the gene burden tests, was a 3'-UTR (untranslated region) singlenucleotide polymorphism (SNP) (rs72740218; C/T transition on chr1:193054088 according to GRCh37/hg19 coordinates). Notably, 10 of the 44 high-extreme individuals were heterozygous minor T allele carriers, whereas this was only the case for 2 of the 44 lowextreme individuals. Pyrosequencing-based genotyping confirmed this result (see Methods). According to the Exome Aggregation Consortium (ExAC) browser (version 0.3.1), rs72740218 MAF is 0.08 in European (non-Finnish) populations.

Free-recall performance for positive material relative to neutral material (termed positive memory, in analogy to aversive memory) was also significantly higher in high-extreme subjects. However, this was entirely owing to this group's lower free-recall performance for neutral pictures (Supplementary Table 1). The genetic association findings were unrelated to the difference in positive memory between extreme groups. Firstly, *TROVE2* was not significant (P = 0.6) when tested at the gene level (SKAT-O with positive memory as the quantitative phenotype). Secondly, *TROVE2*-variant rs6692342 was not significantly associated with positive memory (P = 0.2) or with free recall for positive pictures (P = 0.9).

Next, we tested whether the association of the T allele with increased aversive memory performance could also be detected in the entire population of healthy young subjects (n = 2,684 successfully genotyped for rs72740218, including the n = 88 sequenced subjects, see Methods). We identified 19 minor allele homozygotes, 369 heterozygotes, and 2,296 major allele homozygotes (empirical MAF = 0.075, Hardy–Weinberg P > 0.1). The T allele was significantly correlated (P = 0.005) with increased aversive memory performance, also after exclusion of the n = 88 sequenced extremes (P = 0.035, n = 2,596). This sample of n = 2,596 participants consisted of n = 217 subjects that had not been selected for exome sequencing, but nonetheless fullfilled the performance criteria for extreme high or extreme low aversive memory (Supplementary Table 3), and of 2,379 non-extreme individuals. Notably, the significant association between rs72740218 and aversive memory performance in this population of n = 2,596 participants was attributable to subjects that exhibited extreme aversive memory performance (P = 0.0008 for the interaction 'genotype X extreme/non-extreme group membership'; r = 0.11 in n = 217 non-sequenced extremes; r = 0.016 in n = 2,379 non-extremes).

**Functional brain imaging.** In the next step, we used functional brain imaging (functional magnetic resonance imaging, fMRI) to identify *TROVE2* rs72740218-dependent differences in brain activity related to memory encoding of aversive stimuli in n = 1,258 subjects, a sub-sample of the population of n = 2,596 healthy subjects (sequenced extremes were excluded), who participated in the behavioural genetic study. All neuroimaging data were acquired in the same MRI scanner, thereby reducing hard- and software-related methodological variance.

We first investigated encoding-related brain activation independently of whether the information was later recalled or not (see Methods). We found significant (P < 0.05, two-sided test, familywise error (FWE) corrected for the whole brain  $(P_{FWE})$  gene dosedependent (that is, with increasing number of the minor T allele) activity increases in the middle frontal gyrus, Brodmann area 9 (peak at ((-33, 36, 48), t = 5.39;  $P_{FWE} = 0.0015$ )) (Supplementary Fig. 3). Because these activation differences may be independent of memory processes, we then investigated brain activation that was related to successful memory encoding, that is, activation that was specifically related to information that was later recalled (see Methods). We observed significant positive associations between the TROVE2 genotype (with increasing number of the minor T allele) and aversive memory-related activity in the left medial prefrontal cortex (peak at (-5.5, 38.5, 36), superior frontal gyrus/paracingulate gyrus, Brodmann area 32, t = 5.80;  $P_{\text{FWE}} = 0.0003$ ; with FWE-corrected voxels extending to the dorsal anterior cingulate) (Fig. 3 and Supplementary Fig. 4). Even after excluding the 6 minor allele homozygotes from the analysis, we still found significant TROVE2-dependent differences in activation between the major allele homozygotes and the heterozygotes with the peak at the same coordinate (((-5.5, 38.5, 36), t = 5.25;  $P_{\text{FWE}} = 0.0125$ )). There were no significant increases in activity with increasing number of major alleles. Additionally, we tested whether the reported association was specific for the negative valence. An analysis of TROVE2-dependent differences in brain activity, which were related to successful memory encoding of positive stimuli compared to neutral stimuli (see Methods), did not show significant FWE-corrected results; nevertheless the corresponding uncorrected significance level was

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#### Table 1 | Results of gene-based analyses in phenotypic extremes.

Gene symbol	Gene name	Burden test P Value		Adaptive burden test P value				
		Nominal	Adjusted*	Nominal	Adjusted*			
TROVE2	TROVE domain family member 2 (also known as Sjögren syndrome type A antigen, Ro60 KDa autoantigen)	2 × 10 <sup>-6</sup>	0.0004	4×10 <sup>-5</sup>	0.004			
PKD2L2	Polycystin 2 like 2, transient receptor potential cation channel	0.00022	0.045	0.00288	0.317			
CFAP57	Cilia and flagella associated protein 57	0.00026	0.053	0.00035	0.038			

\*Corrected for the number of genes reaching *i*-stat < 0.001 in the respective test (burden test: 203 genes; adaptive burden test: 110 genes).

high (((-5.5, 38.5, 36), t = 3.44;  $P_{uncorrected} = 0.0006$ ;  $P_{FWE} = 0.97$ )). Accordingly, we did not observe significant (P < 0.05, two-sided test, FWE-corrected for the whole brain) associations between the number of minor *TROVE2* alleles and contrast testing for differences in brain activity between successful memory encoding of aversive compared to positive stimuli (see Methods), suggesting that, although the observed association was strongest for aversive stimuli, it was also observable for the positive valence.

In summary, the fMRI experiment showed that the minor allele of *TROVE2* SNP rs72740218, which was associated with increased memory for aversive information, was also related to increased brain activity in the medial prefrontal cortex during successful memory encoding of emotional pictures, whereby the strongest association was observed for aversive ones.

*TROVE2* expression in human frontal cortex. Given the effect of the *TROVE2* minor allele on brain activation that is related to successful memory encoding in the prefrontal cortex, we further investigated possible minor-allele effects on *TROVE2* expression in this part of the human brain. For this analysis, we used the BRAINEAC data, a publicly available resource for the exploration of the regulatory significance of genetic variants in the human brain (http://www.braineac.org/)<sup>23</sup>. Brain samples specified as frontal cortex probes in the BRAINEAC database were taken from the prefrontal cortex<sup>24</sup>, mostly Brodmann area 9/46, a region well-known for its involvement in emotional processing and emotional memory<sup>25,26</sup>. The 3'-UTR variant rs72740218 was significantly associated with

expression of the adjacent *TROVE2* terminal coding exon (exonspecific probeset 2372955; chr1:193053788–193053828, GRCh37/ hg19 coordinates) in the prefrontal cortex of 125 deceased subjects. The minor T allele predisposed to significantly higher expression values (P = 0.005, Fig. 4a), possibly suggesting a local effect of this variant on expression of the corresponding exon. No significance was observed at the full-transcript level (that is, the Winsorized means over all exon-specific probesets) (Supplementary Table 4).

TROVE2 genetic variability in traumatized survivors of the Rwandan genocide. Extremely aversive, in particular life-threatening, incidents can lead to an excessive and persisting emotional memory of the traumatic events, which can result in intrusive and distressing re-experiencing (traumatic memory), a core PTSD symptom. The heritability of re-experiencing traumatic events ranges from 23% to 51%, suggesting that naturally occurring genetic variations have an important effect on this trait<sup>27</sup>. Given the association of TROVE2 with aversive memory and aversive memory-related brain activation in healthy subjects, we hypothesized that TROVE2 would also be associated with emotional memory for traumatic events reflected in increased re-experiencing symptoms. We tested this hypothesis in 271 refugees who have fled from the Rwandan civil war, who have been living in the Nakivale refugee camp in Uganda during the time of investigation, and from whom lifetime data on the prevalence of PTSD were available (137 females; 134 males; mean age, 35 years; range, 18-68 years; see Methods). All subjects had experienced highly aversive situations and were examined



**Figure 2** | Sequencing results of *TROVE2* (positions according to the GRCh37/hg19 coordinates). Blue dots indicate variants with MAF  $\leq$  0.125 detected in the sample of 88 individuals with extreme aversive memory performance. Solidus-separated numbers accompanying each dot indicate the frequency of the occurrence of the respective minor allele in subjects with extremely high and extremely low performance (high/low). The minor allele of variant rs72740218 was observed in 10 high extremes and in 2 low extremes. The *y* axis indicates  $-\log_{10}$  of the *P* value of genetic association tests that were performed separately for each variant. For illustration purposes, two *TROVE2* transcript variants (see also Fig. 4) are shown in the lower part of the figure. Blue filled rectangles represent coding exons, empty rectangles represent non-coding exons and UTRs.



Figure 3 | TROVE2 rs72740218 genotype-dependent differences in brain activity related to successful memory encoding of aversive stimuli compared with neutral stimuli in 1,258 healthy young subjects. Displayed are positive associations between genotype (the number of minor T alleles) and activity. The blue cross indicates the peak genotype-dependent activation (t = 5.80;  $P_{FWE} = 0.0003$ ) in the left medial prefrontal cortex at (-5.5, 38.5, 36). Activations are overlaid on coronal, sagittal and axial sections of brain images, displayed at  $t \ge 3.1$  ( $P_{nominal} < 0.001$ ) and using colour-coded t values. L, left side of the brain; R, right side of the brain.

by trained experts with a structured interview based on the Posttraumatic Diagnostic Scale<sup>28</sup> with the help of trained interviewers chosen from the refugee community. Traumatic events were assessed using a checklist of 36 reported war- and non-war-related traumatic event types (such as, injury by a weapon, rape, accidents) (Supplementary Table 5). In sub-Saharan African samples, the rs72740218 variant is rare (MAF < 0.01, according to dbSNP). Therefore, we analysed all TROVE2-spanning common SNPs that were present on the Human SNP Array 6.0 with an empirical MAF  $\geq$  0.05 in the Rwandan sample (n = 5 tagging SNPs, Table 2). None of these variants was significantly associated with age, sex, the number of experienced traumatic event types, or with the occurrence of any of the 36 distinct traumatic event types (Table 2 and Supplementary Table 5). TROVE2 SNPs were significantly associated with traumatic memory (that is, lifetime symptoms of re-experiencing the traumatic event) and with frequency of lifetime PTSD (Table 2). Variant rs6692342, which is located 555 and 1,007 bases upstream of the respective TROVE2 transcript variants (Fig. 5), showed the strongest association: the minor allele G was associated with increased traumatic memory (P = 0.007) and with increased PTSD frequency (P = 0.0004). Linkage disequilibrium between variants rs6692342 and rs72740218 was not calculated in the PTSD sample, given the very low frequency of rs72740218 in the Rwandan population. In the healthy, young population sample, variants rs72740218 and rs6692342 were unlinked ( $r^2 = 0.02$ ). Because the occurrence of some of the traumatic event types was unevenly distributed between rs6692342 genotype groups (albeit without reaching corrected statistical significance; Supplementary Table 5), we reran the analyses by controlling for such uneven distributions and obtained nearly identical results (Supplementary Table 6). The minor allele G of variant rs6692342 was also moderately associated with increased expression of the adjacent TROVE2 non-coding exon 1 of transcript variants NM\_004600, NM\_001173525,

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**Figure 4 | Association of TROVE2 SNPs rs72740218 and rs6692342 in the human frontal cortex. a,b**, Association of *TROVE2* SNPs rs72740218 (a) and rs6692342 (b) with gene expression. a, Expression values of exonspecific probeset 2372955 (chr1:193053788-193053828). b, Expression values of exon-specific probeset 2372928 (chr1:193028950-193029112; GRCh37/hg19 coordinates). Data and box plots were retrieved from the BRAINEAC project server<sup>23</sup> (http://www.braineac.org/, accessed on 7 October 2016). Box plots demarcate the 25th and 75th percentile (middle line is median), and bars represent the minimum and maximum values. Filled circles represent outliers. eQTL, expression quantitative trait locus.

NM\_001042369 and NM\_001042370 (exon-specific probeset 2372928, chr1:193028950–193029112, GRCh37/hg19 coordinates) in the prefrontal cortex of 123 deceased subjects of the BRAINEAC study (P = 0.045, Fig. 4b), possibly suggesting a local effect of this variant on expression of the corresponding exon. No significance was observed at the full-transcript level (that is, the Winsorized means over all exon-specific probesets) (Supplementary Table 4). The frequency of the minor G allele of rs6692342 was nearly identical in the BRAINEAC and Rwandan samples (25.6% and 24.6%, respectively). Accordingly, genotype frequencies of rs6692342 did not differ between these samples (P = 0.5,  $\chi^2$  test). Notably, genotype and allele frequencies in the BRAINEAC and Rwandan samples for rs6692342 were in close agreement with the reported values for European and Sub-Saharan populations, respectively, in the 1000 genomes project (Phase 3).

#### Discussion

The present study suggests that variants related to increased expression of *TROVE2* transcripts in the human frontal cortex are linked to emotional memory capacity and emotional memory-related brain activation in healthy subjects, and to traumatic memory and risk for PTSD in traumatized genocide survivors.

*TROVE2* is widely expressed in human tissues, including the brain and its frontal cortex<sup>23,29</sup>. *TROVE2* undergoes complex transcriptional regulation, such as alternative splicing with several coding transcript variants and a range of 8–11 coding and non-coding exons<sup>30,31</sup> (Fig. 5). SNP rs72740218 was associated with emotional memory performance and brain activation related to successful memory encoding of emotionally charged information in the medial prefrontal cortex, one of the key brain regions related to emotional processing<sup>32</sup>, although it does not belong to one of the typical localizations found to be activated by emotional memory encoding in genotype-independent studies<sup>33</sup>. It is important to note, however, that genotype-independent analyses may not reveal brain regions for which different genotype groups show opposite activation patterns, for example when major-allele

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and the number of traumatic event types (1 events).											
SNP ID	Localization	MAF	P <sub>sex</sub>	$P_{\rm age}$	Pevents	<b>P</b> <sub>memory</sub>	P <sub>ptsd</sub>				
rs6692342	Upstream	0.25	0.868	0.952	0.712	0.007	0.0004				
rs4657842	Upstream	0.35	0.895	0.328	0.652	0.191	0.023				
rs7554496	Intronic	0.15	0.323	0.800	0.318	0.169	0.581				
rs10801173	3'-UTR; intronic	0.47	0.235	0.316	0.746	0.186	0.024				
rs41520747	Downstream; intronic	0.18	0.360	0.669	0.791	0.587	0.017				

**Table 2** | Associations between common *TROVE2* SNPs and traumatic memory ( $P_{memory}$ ), lifetime PTSD ( $P_{PTSD}$ ), sex ( $P_{sex}$ ), age ( $P_{age}$ ), and the number of traumatic event types ( $P_{events}$ ).

homozygotes show a deactivation, whereas the other genotype groups show an activation, as was the case with SNP rs72740218 (Supplementary Fig. 5). Notably, it has been shown that PTSD patients, when compared to controls, have an increased response in the left dorsal anterior cingulate/medial prefrontal cortex at

almost identical coordinate positions (peak at -3, 39, 39) during encoding of later remembered negative verbal information<sup>34</sup>. Of note, there is evidence for a dissociative subtype of PTSD patients, who typically show increased activation in the anterior cingulate/ medial prefrontal cortex<sup>35</sup>.



**Figure 5** | Schematic representation of selected *TROVE2* RefSeq transcript variants (positions according to GRCh37/hg19 coordinates). UCSC (University of California Santa-Cruz) identifiers are also given beneath each RefSeq identifier. Blue filled rectangles represent coding exons, empty rectangles represent non-coding exons and UTRs. SNPs rs6692342 and rs72740218 are zoomed in with 10 bases up- and downstream; +1: first coding base in the first coding exon.

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SNP rs72740218 is located within the 3'-UTR of transcripts NM\_001173524 and NM\_004600 (Fig. 5), and is significantly associated with expression levels of the terminal coding exon of these variants in the prefrontal cortex (Fig. 4). SNP rs6692342, which was associated with traumatic memory and PTSD frequency, is located 555 bases upstream of transcript variant NM\_001173524 and 1,007 bases upstream of transcript variants NM\_004600, NM\_001173525, NM\_001042369, and NM\_001042370, and is moderately, albeit significantly associated with expression levels of the adjacent noncoding exon 1 of the latter four variants in the prefrontal cortex (Fig. 4). Taken together, the minor alleles of these TROVE2 SNPs were associated with increased expression of adjacent exons and with gain of emotional (in the case of rs72740218) and traumatic (in the case of rs6692342) memory-related phenotypes. Given that free recall was assessed shortly after encoding in this study, further research will be needed to study the role of this gene on emotional memory capacity related to the longer-term (such as, hours, days) consolidation processes.

TROVE2 encodes Ro60, an RNA-binding protein that binds to misfolded, non-coding RNAs, pre-5S rRNA (ribosomal RNA) and Y RNA (small non-coding RNA)<sup>31</sup>. Autoantibodies to Ro60 are prevalent in autoimmune disorders including Sjögren's syndrome and systemic lupus erythematosus<sup>36-38</sup>, and recent research supports the idea of a direct link between Ro60 autoantibody production, type I interferon, and autoimmunity<sup>39</sup>. The findings of the present study support a genetic link between TROVE2 and emotional memory-related traits, possibly by regulation of specific transcripts. Although speculative, one might hypothesize that TROVE2 has a role in a possible link between the regulation of immune-related processes and the regulation of emotional memory-related traits, given the crucial involvement of TROVE2 in autoimmunity. Notably, recent genetic and epidemiological data point to a link between autoimmunity and PTSD: a retrospective cohort study of 666,269 Iraq and Afghanistan veterans revealed significant associations between PTSD and risk for autoimmune disorders, whereby shared etiology was one of the possible explanations for this observation<sup>40</sup>. Recently, a large genome-wide association study (GWAS) of PTSD has shown a significantly increased enrichment ratio for immunerelated expression quantitative trait loci in PTSD<sup>41</sup>. In addition, abnormal cytokine regulation and a proinflammatory milieu are present in PTSD<sup>42-45</sup>. Thus, a link between the regulation of immune functions and emotional memory-related neuropsychiatric phenotypes probably exists. Despite the known, direct connection between the human brain and peripheral tissues relevant to the function of the immune system<sup>46</sup>, it is not yet possible to draw any causal inferences about the mechanistic nature of this link and about a putative involvement of TROVE2. Notably, recent animal research identified meningeal immunity as a direct player in the regulation of complex brain functions, such as learning, memory and social behaviour47,48.

A number of-mostly small-PTSD GWAS in civilian and military or veteran samples have been published<sup>41,49-55</sup>. TROVE2 has not been reported as one of the top hits in these GWAS. Of note, the published GWAS results do not converge so far. It is widely acknowledged that substantial within- and between-sample differences in traumatic event type, duration and rate, time of trauma onset, ancestry, sociodemographic factors and social support render comparability of GWAS results in the PTSD field inherently difficult<sup>56</sup>. The possibility exists that some of the reported findings might prove specific to a certain population. Therefore, the replication issue of genetic studies of PTSD will remain challenging and might be resolved by future large collaborative efforts, which should include different subgroups of large homogenous samples. Notably, a recent study that has reported on combined genetic and transcriptomic findings in human and C. elegans identified TROVE2 as one of the top scoring genes involved in mood regulation and stress response<sup>57</sup>.

In the present study, we used exome sequencing in healthy phenotypic extremes to detect genes that were linked to emotionally charged memory capacity. Notably, the extreme phenotype design proved to be essential for the identification of TROVE2, because the effect size of the minor allele T of rs72740218 was considerably higher in the extremes, also in the non-sequenced samples, compared to the largest, middle part of the phenotypic distribution. It is important to stress that the success of the genetic search presented herein is not necessarily generalizable to every genetically complex cognitive and/or emotional trait. A synergy of factors, such as meticulous matching of phenotypic extremes with a particular focus on genetic background<sup>15</sup>, a relatively high MAF for the implicated variant and the specific genetic architecture of the phenotype of interest, gave rise to the identification of TROVE2. Nevertheless, our experience with this approach and the statistical features of our findings are in close analogy to the observations of a recent study, which identified a genetic modifier of a Mendelian trait (cystic fibrosis) by means of exome sequencing in phenotypic extremes<sup>21</sup>.

In conclusion, *TROVE2*, a gene implicated in autoimmunity, is linked to emotionally charged memory in health and psychiatric disease, particularly in PTSD. Specifically, the present findings suggest that the drawback of the *TROVE2* variant-related enhancement of emotional memory is increased enhancement of intrusive and distressing memory for traumatic events. Given that many mental disorders represent the extremes of a normal distribution of traits on multiple cognitive and emotional dimensions<sup>58</sup>, we believe that appropriate genetic methodologies in healthy phenotypic extremes may help uncover disease dimensions with different symptom patterns, a subtyping that may be necessary to improve understanding and treatment of psychopathology.

#### Methods

**Definition of phenotypic extremes.** Aversive memory was assessed in n = 3,418 subjects who participated in ongoing behavioural and imaging genetics studies of healthy, young adults in the city of Basel, Switzerland (data lock April 2015). The ethics committee of the Cantons of Basel-Stadt and Basel-Landschaft approved the experiments. All participants received general information about the study and gave their written, informed consent for participants. Participants were free of any neurological or psychiatric illness, and did not take any medication at the time of the experiment (except hormonal contraceptives).

Aversive memory was quantified by means of a picture delayed free-recall task. Stimuli consisted of 72 pictures that were selected from the International Affective Picture System<sup>59</sup>, as well as from in-house standardized picture sets that allowed us to equate the pictures for visual complexity and content (such as human presence). On the basis of normative valence scores (from 1 to 9), pictures were assigned to emotionally negative  $(2.3 \pm 0.6)$ , emotionally neutral  $(5.0 \pm 0.3)$ , and emotionally positive (7.6  $\pm$  0.4) conditions, resulting in 24 pictures for each emotional valence. Four additional pictures that showed neutral objects were used to control for primacy and recency effects in memory. Two of these pictures were presented at the beginning and two at the end of the picture task. These pictures were not included in the analysis. The pictures were presented for 2.5 s in a quasi-randomized order. To ensure that the ratio between valence categories was kept constant across consecutive parts of the entire picture sequence, each twelfth part of the sequence contained exactly two positive, two negative and two neutral pictures. Thus, maximally four pictures of the same category occurred consecutively. Ten minutes after picture presentation, memory performance was tested using a free-recall task, which required participants to write down a short description (a few words) of the previously seen pictures. Remembered primacy and recency pictures as well as training pictures were excluded from the analysis. No time limit was set for this task. A picture was scored as correctly recalled, if the rater could identify the presented picture on the basis of the subject's description. Two trained investigators rated the descriptions independently for recall success (inter-rater reliability >99%). A third independent rater decided on those pictures that had been rated differently7. For the purpose of selecting phenotypic extremes, aversive memory performance was calculated by subtracting the number of the freely recalled neutral pictures from the number of freely recalled negative pictures. In a sub-sample of 1,900 subjects with data on a second assessment of free-recall performance 24 h after the first presentation of the identical picture set, both phenotypes showed high levels of inter-trial correlation (Pearson's r = 0.73and r = 0.78 for free recall of negative and neutral pictures, respectively). On the basis of the observed phenotypic distribution, subjects with aversive memory performance  $\geq 10$  and  $\leq 13$  were classified as high-extreme subjects (HES), and subjects with aversive memory performance  $\geq -5$  and  $\leq -1$  were classified as

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low-extreme subjects (LES). We adopted an almost-extreme sampling approach, because the very extremes of cognitive phenotypes are vulnerable to potential measurement errors and phenotype heterogeneity<sup>18</sup>. For example, performance at the very extreme low end of the distribution might be related to erroneous understanding of task instructions or to gross errors in task execution. Moreover, the additive polygenic mode of inheritance of common phenotypes breaks down at the very extremes of the distribution tails<sup>60,61</sup>. Thus, subjects at the very extreme ends, as identified upon visual inspection of the frequency histogram (that is, aversive memory performance <-5, n = 6; aversive memory performance <-13, n = 8), were not considered for further analysis (Fig. 1).

Next, we selected all subjects who had been genotyped on the Genome-Wide Human SNP Array 6.0 (Affymetrix) and performed standard quality control with PLINK (https://atgu.mgh.harvard.edu/plinkseq/) including sex check and identity by descent analysis as described in ref. <sup>62</sup>, resulting in n = 2,991 subjects with quality-controlled SNP array data.

The next steps were performed to calculate each subject's genetic background, to select a homogeneous group of participants of European ancestry, and to compute an individual parameter in order to match the to-be-sequenced extremes for genetic similarity. Thus, we analysed the SNP array data of seven Swiss and German samples<sup>62–64</sup> (total n = 5,172) including our target sample. Genetic data of these subjects was projected onto the first two principal components (PCs) of genetic variation in the HapMap3 reference sample (consisting of African, Asian and European samples) using SMARTPCA65 Participants scoring for PC1 < 0.012 and for PC2 < 0.065 were then filtered out to obtain a cluster of broad European ancestry (Supplementary Fig. 1a, b). Genetic data of the subjects composing this cluster was also checked for the presence of duplicates and cryptic relatedness (identity by descent:  $\hat{p} < 0.2$ ). Before performing the final principal component analysis within this European sample, genetic quality control (MAF > 0.02, call rate > 0.95, Hardy–Weinberg P > 0.001) was applied within each of the seven sub-samples separately. We also excluded SNPs within regions of long-range linkage disequilibrium as has been suggested in ref. 66. The remaining autosomal SNPs of the combined sample were then pruned using PLINK (indep-pairwise command; window-size 200 SNPs, 5 SNP steps,  $r^2 < 0.2$ ). We next used SMARTPCA65 to estimate the PCs of genetic variation within this broad European cluster (Supplementary Fig. 1a, b). The resulting first two PCs were used as parameters for genetic similarity.

After these steps, n = 2,739 subjects of European ancestry remained for further selection of pairs of subjects from the high- and low extreme groups that: (1) have a similar genetic background; (2) have the same sex; (3) were investigated at a similar time point; (4) are of similar age; (5) have similar smoking behaviour. The latter matching criterion was included given the borderline significant correlation between smoking status and being a member of the high or low extreme performance group (P = 0.08 before matching). Matching was done separately for females and males with the library Matching (Version 4.8-3.4) in R67. Membership in the low or high extreme group was used as treatment vector. Matching was done without replacement, the sequence of the subjects entering the matching procedure was chosen randomly. Time point of investigation, age, smoking behaviour and the two results of the first two PCs from the genetic similarity analysis were used as variables to match on. For each HES, the best-matching LES was identified, separately for females and males. Finally, these high extreme-low extreme pairs were randomly assigned on the plate for subsequent exome sequencing. In line with the circumstance that emotionally arousing information is often remembered at the expense of neutral background information68, HES had significantly increased mean free-recall performance for aversive pictures ( $P = 3 \times 10^{-17}$ ) and significantly, albeit orders of magnitude weaker, decreased mean free-recall performance for neutral pictures  $(P = 1 \times 10^{-12})$  than LES (Supplementary Table 1). No difference in mean freerecall performance for positive pictures (P = 0.6) was observed between HES and LES. Overall memory capacity was very similar between extreme groups (P = 0.5). No significant group difference in arousal and valence ratings for any of the 3 picture categories was observed (all comparisons: P > 0.05).

#### Exome sequencing: blood sampling, DNA isolation and related quality

controls. Blood samples were collected between midday and evening (mean time of day: 14:30, range 13:00-20.00) using BD Vacutainer Push Button blood collection sets and 10.0-mL BD Vacutainer Plus plastic whole blood tubes, BD Hemogard closure with spray-coated K2EDTA (Becton, Dickinson and Company, New Jersey, USA). Standard haematological analysis, including blood-cell counting, was performed with a Sysmex pocH-100i Automated Hematology Analyzer (Sysmex Co, Kobe, Japan.) DNA was isolated from the remaining fraction, upon plasma removal. The isolation was performed with the QIAmp Blood Maxi Kit (Qiagen AG, Hilden, Germany), using the recommended spin protocol. In order to obtain high purity DNA, isolated DNA samples were additionally re-purified. For this purpose, 2  $\mu g$  of DNA isolated with the QIAmp/ Oragene procedure, was incubated overnight at 50 °C with proteinase K (lysis buffer: 30 mM TrisCl, 10 mM EDTA, 1% SDS pH 8.0, 150 ng µl<sup>-1</sup> Proteinase K), agitated by gentle orbital shaking. Next, DNA was purified using the Genomic DNA Clean & Concentrate Kit (Zymo Research, Irvine, California, USA). The quality and concentration of DNA were assessed using gel electrophoresis,

NanoDrop ND-1000 (Thermo Scientific, Waltham, Massachusetts, USA) and fluorometry measurements (Qubit dsDNA BR Assay Kit; Invitrogen, Carlsbad, California, USA), respectively. DNA samples of high integrity and purity were further normalized to 24 ng  $\mu$ l<sup>-1</sup> and randomly assigned to a 96-well plate for library preparation.

Exome sequencing: library preparation. Quality checks of the genomic DNA samples and intermediate products of the library preparation (efficiency of DNA fragmentation, pre- and post-capture libraries) were done with the Fragment Analyzer, using the DNF-467 Genomic DNA 50 kb Analysis Kit and DNF-473 Standard Sensitivity NGS Fragment Analysis Kit, respectively (Advanced Analytical Technologies, Ankeny, Iowa, USA). Library preparation for WES was performed with the Agilent SureSelectXT Human All Exon V5+UTR kit using the SureSelectXT automated target enrichment for Illumina paired-end multiplexed sequencing protocol on the Agilent NGS workstation, option B (Agilent Technologies Inc, Santa Clara, California, USA). In brief, 200 ng of genomic DNA was fragmented with the Covaris E220 focusedultrasonicator (Covaris Inc, Woburn, Massachusetts, USA), with the following settings: duty factor: 10%; peak incident power: 175; cycles per burst: 200; treatment time: 360 s; bath temperature: 4-8 °C. The target DNA fragment size was 150-200 bp. After quality assessment the libraries were further prepared by using the SureSelect XT Library Prep Kit ILM (Agilent, USA; SureSelectXT target enrichment system for Illumina paired-end multiplexed sequencing library protocol version B3). AMPure XP bead purification was always implemented between the library preparation steps. First, the 3' ends of the DNA fragments were adenylated, followed by paired-end adaptor ligation and adaptor-ligated library amplification. After library quality assessment, samples were hybridized to the target-specific capture library and the hybridized DNA was captured with streptavidin-coated beads. The libraries with 8-bp indexing primers were then amplified, assayed for quality and quantity and finally pooled for multiplexed sequencing.

Whole-exome sequencing. Libraries were clustered on the Illumina cBot cluster station (HiSeq PE Cluster Kit v4). WES was done on an Illumina HiSeq 2500 machine (paired-end reads, 101 bp per read). The libraries were mixed in 4 pools  $(3 \times 24 + 1 \times 22)$ . Each pool was sequenced in 6 lanes. A fifth pool was mixed with 27 of the samples and this Pool 5 was sequenced in an extra lane. For each sample, over 12 Gb of sequence were generated.

The SureSelectXT Human All Exon V5+UTR kit (Agilent) used in this study targets 359,555 exons in 21,522 genes (that is, 75 Mb of sequence) included in the following databases: CCDS, RefSeq, GENCODE, miRBase, TCGA and UCSC. The sequence of each sample was mapped to the hg19 human reference genome, downloaded from http://genome.ucsc.edu, using BWA 0.7.12 (Burrow-Wheeler Alignment)69. Duplicates were flagged with Picard 1.135 (http://picard.sourceforge.net). Analysis of coverage was done with Picard CalculateHSmetrics and Bedtools<sup>70</sup> version 2.18.1. Finally, 98% of the target bases had a coverage equal or greater than 20× and approximately 50% of target bases had 100× coverage (Bedtools; Supplementary Fig. 6). Base quality score recalibration and local realignment around indels was done with GATK71 version 3.4-0 following the standard GATK protocol72. Single nucleotide variants (SNVs) were called with the Haplotype Caller. No padding was used for variant calling outside non-target regions to prevent false-positive SNV calls. Following the recommendation of ref. 73, variant quality score recalibration was used. We chose 99% sensitivity for a variant to be 'true' on the basis of an adaptive error model and filtered out false-positive variants using this threshold.

Exome sequencing: callset quality control. The final callset was evaluated using variant-level concordance (that is, the percentage of variants in the study sample that matched a defined gold standard) and genotype concordance (that is, the percentage of variants that matched the genotypes derived from the same samples using a different genotyping technique). After defining dbSNP 138.b37 as the gold standard, we ran the VariantEval toolkit of GATK. The variant-level concordance rate between our callset and dbSNP was high (98.33%). Two genotype concordance measures can be derived from comparing sequencing data with array data: nonreference sensitivity (NRS, that is, the rate at which non-reference alleles in the array data are also identified in the sequenced genotypes) and the non-reference discrepancy (NRD; that is, the rate at which sequenced genotypes differ from array genotypes) rate. We used the GATK toolkit GenotypeConcordance for these calculations. 18,709 bi-allelic overlapping variants were identified for both WES data and array genotype data of the Affymetrix 6.0 human SNP array. NRS was 97.5%, suggesting a high sensitivity for common variants, and NRD was 2.4%. The ratio between transitions to transversions  $(T_i/T_v \text{ ratio})$  was 2.61, which matched the expected value of 2.5-2.8 well, for sequences covering both exonic and non-exonic 3' and 5' UTRs74, like the SureSelectXT Human All Exon V5+UTR kit (Agilent), which targets 75 Mb of the human genome. We furthermore checked the rate of novel missense SNPs (that is, not included in dbSNP 138.b37) in our callset. The mean over all samples was low (n = 57.8), suggesting a low number of false-positive calls. Another quality indicator is the het/hom ratio (that is, the ratio between heterozygous and homozygous

non-reference variants). In our callset, the het/hom ratio, which is expected to be approximately 1.5 for European populations<sup>75,76</sup>, was 1.57 for all SNPs and 1.54 for known SNPs (that is, dbSNP SNPs). Variant call format data were annotated with the reference genome GRCh37.75 using SnpEff software version 4.11 (build 2015-10-03)<sup>77</sup>.

**Pyrosequencing.** Targeted genotyping of *TROVE2* SNP rs72740218 was done with pyrosequencing on a PyroMark ID System. The following primers were used: 5'-TACTAAACTAGCTCTTGGGGAAAT-3' (forward primer, 5'-biotinylated), 5'-CAAAGCAAAACTATTTTACAGTGT-3' (reverse primer), 5'-CAAAAGTTCTCTATTAGAT-3' (sequencing primer). *n* = 2,684 subjects were successfully genotyped for rs72740218. One-sided genetic-association testing (additive model) was used for hypothesis confirmation purposes. Researcher team members involved in genotyping were blinded to group allocation.

**Burden testing.** Genotype–phenotype associations were calculated with PLINK/ SEQ version 0.10 (https://atgu.mgh.harvard.edu/plinkseq/). We calculated genebased tests falling into two categories: burden tests<sup>78</sup> and adaptive burden tests (variable threshold test)<sup>79</sup>. Burden tests perform optimally when assuming that a large proportion of variants are causal and the effects are in the same direction. Adaptive burden tests, which use data-adaptive weights or thresholds, are thought to be more robust than burden tests that use fixed weights or thresholds. Following power analyses done in studies of phenotypic extremes with similar sample size as in the present one, we set the empirical MAF as MAF  $\leq$  0.125 to avoid eliminating variants enriched to high frequency in the extremes<sup>21</sup>. To correct for multiple testing we used the *i*-stat statistic (that is, the smallest possible empirical *P* value of a gene), which is implemented in PLINKSeq. According to previous recommendations<sup>15</sup>, the *i*-stat threshold was set to <0.001. Burden-testderived significances were then Bonferroni-corrected for the number of genes with an *i*-stat below this threshold.

fMRI experiment. Subjects were right-handed, free of any lifetime neurological or psychiatric illness, and did not take any medication (except hormonal contraceptives) at the time of the experiment, which was approved by the ethics committee of the Cantons of Basel-Stadt and Basel-Landschaft, Written, informed consent was obtained from all subjects before participation. After receiving general information about the study and giving their informed consent, participants were instructed and then trained on the picture task they later performed in the scanner. After training, they were positioned in the scanner. The participants received earplugs and headphones to reduce scanner noise. Their head was fixated in the coil using small cushions, and they were told not to move their heads. Functional magnetic resonance images were acquired during the performance of the picture task in two separate sessions (total scanning time, approximately 30 min). After finishing the tasks, participants left the scanner and were taken to a separate room for free recall of the pictures. Finally, participants filled out questionnaires, gave saliva for genotype analysis and were debriefed. The total length of the experimental procedure was approximately 3 hours. We excluded 54 subjects from the fMRI experiment. Reasons for exclusion were defined as follows: corrupted or missing data (n = 40), subjects recalling less than one picture in one of the valence categories (n = 10), failed co-registration (n = 4).

Measurements were performed on a Siemens Magnetom Verio 3 T wholebody MR unit equipped with a twelve-channel head coil. Functional time series were acquired with a single-shot echo-planar sequence using parallel imaging (GRAPPA). We used the following acquisition parameters: TE (echo time) = 35 ms, FOV (field of view) = 22 cm, acquisition matrix = 80 × 80, interpolated to 128 × 128, voxel size:  $2.75 \times 2.75 \times 4$  mm<sup>3</sup>, GRAPPA acceleration factor R = 2.0. Using a midsagittal scout image, 32 contiguous axial slices were placed along the anterior-posterior commissure (AC-PC) plane covering the entire brain with a TR = 3,000 ms ( $\alpha = 82^{\circ}$ ). The first two acquisitions were discarded owing to T<sub>1</sub> saturation effects. A high-resolution T<sub>1</sub>-weighted anatomical image was acquired using a magnetization prepared gradient echo sequence (MPRAGE, TR = 2,000 ms; TE = 3.37 ms; TI = 1,000 ms; flip angle = 8; 176 slices; FOV = 256 mm; voxel size = 1 × 1 × 1 mm<sup>3</sup>).

Preprocessing and data analysis was performed using SPM8 (Statistical Parametric Mapping, Wellcome Department of Cognitive Neurology, London, UK; http://www.fil.ion.ucl.ac.uk/spm/) implemented in Matlab (Mathworks Inc., Natick, Massachusetts, USA). Volumes were slice-time corrected to the first slice and realigned to the first acquired volume. Both functional and structural images were spatially normalized by applying DARTEL, which leads to an improved registration between subjects. Normalization incorporated the following steps: (1) Structural images of each subject were segmented using the 'New Segment' procedure in SPM8. (2) The resulting gray- and white-matter images were used to derive a study-specific group template. The template was computed from a subpopulation of 1,000 subjects from this study. (3) An affine transformation was applied to map the group template to MNI space. (4) Subject-to-template and template-to-MNI transformations were combined to map the functional images to MNI space. The functional images were smoothed with an isotropic 8 mm full width at half maximum Gaussian filter. Serial correlations were removed using a first-order autoregressive model. A high-pass filter (128 s) was applied to remove low-frequency noise.

Normalized functional images were masked using information from their respective  $T_1$  anatomical file as follows: a partial volume effect file obtained from the SPM-VBM8 toolbox (http://dbm.neuro.uni-jena.de/vbm8/) was used as a starting point to define the brain mask. This volume represents the three-tissue classification results of the segmentation process (GM, WM, CSF), with two additional mixed classes (GM–WM, GM–CSF). It was binarized, dilated and eroded with a  $3 \times 3 \times 3$  voxels kernel using fslmaths (FSL) to fill in potential small holes in the mask. The previously computed DARTEL flowfield was used to normalize the brain mask to MNI space, at the spatial resolution of the functional images. The mask was finally thresholded at 10% and applied to the normalized functional images. Consequently, the implicit intensity-based masking threshold usually that was employed to compute a brain mask from the functional data during the first level specification (by default fixed at mask.thresh = 0.8) was not needed any longer and set to a lower value of 0.05.

For each subject, analyses were conducted in the framework of the general linear model. Regressors, which modelled the onset and duration of stimulus events, were convolved with a canonical haemodynamic response function. More precisely, the model comprised regressors for button presses that were modelled as stick/delta functions, picture presentations that were modelled with an epoch/boxcar function (duration: 2.5 s), and rating scales that were modelled with an epoch/boxcar function of variable duration (depending on when the subsequent button press occured). Six movement parameters were also entered as nuisance covariates. Pictures accounting for possible primacy and recency effects were modelled separately.

Brain activity contrasts were calculated individually using a fixed-effects model (first level analysis). The following contrasts were specified: (1) brain activity related to memory encoding of aversive stimuli compared to neutral stimuli, independent of whether the information was later recalled or not (aversive pictures - neutral pictures); (2) brain activity related to successful memory encoding of aversive stimuli compared to neutral stimuli (aversive pictures recalled - aversive pictures not recalled) - (neutral pictures recalled neutral pictures not recalled); (3) differences in brain activity between successful memory encoding of aversive compared to positive stimuli (aversive pictures recalled - aversive pictures not recalled) - (positive pictures recalled - positive pictures not recalled); (4) brain activity related to successful memory encoding of positive stimuli compared to neutral stimuli (positive pictures recalled - positive pictures not recalled) - (neutral pictures recalled - neutral pictures not recalled). The resulting contrast parameters were then used for genotype-dependent analyses in a random-effects model (second level analysis). Specifically, we used a regression model to analyse differences in brain activity, whereas the number of alleles served as covariate in our analysis. We controlled for the effects of sex and age by including them as covariates. Significance peaks were assigned to anatomical labels based on the Harvard-Oxford Cortical Structural Atlas<sup>81</sup>. Brodmann areas are given based on ref. 82.

Rwanda sample. Study participants were survivors of the Rwandan genocide who were living as refugees in the Nakivale refugee settlement. As the Nakivale refugee settlement has grown over the last decade and is spread over a large area, participants were sampled proportionally to the population size from each zone. To exclude genetic relatives in the samples, only one person per household was interviewed. Interviewers had been trained to detect current alcohol abuse and acute psychotic symptoms; candidates exhibiting these signs were excluded. All subjects had experienced highly aversive traumatic situations (including life-threatening situations) and were examined in 2006/2007 by psychologists of the University of Konstanz with the help of trained interpreters, or by intensely trained local interviewers using a structured interview that was based on the Post-traumatic Diagnostic Scale<sup>28</sup> with the help of trained interpreters. This procedure has been validated for implementation in East-African crisis regions<sup>83</sup>. Traumatic events were assessed with a checklist of 36 war- and non-war-related traumatic event types, such as, injury by weapon, rape, accident, which have also been employed in previous studies7. Traumatic load was estimated by assessing the number of different traumatic event types experienced or witnessed. This measure has been shown to be more reliable than assessing the frequency of traumatic events<sup>84</sup>. The procedures and study protocols were approved by the Ethics Committees of the University of Konstanz, Germany, and the Mbarara University of Science and Technology (MUST), Mbarara, Uganda.

Instruments were translated into Kinyarwanda using several steps of translations, blind back-translations, and subsequent corrections by independent groups of translators. Following the translations, the psychometric properties of the translated scales were investigated in a validation study including a retest spanning a two-week period and a cross-validation with expert rating<sup>85</sup>. To avoid known ceiling effects (that is, the phenomenon that almost everybody will develop PTSD at extreme levels of trauma load)<sup>86,87</sup>, subjects were selected to have experienced no more than 16 different traumatic event types. Subjects that lacked sufficient data for the estimation of the prevalence of lifetime PTSD were excluded from this study. The significance level of genetic associations with traumatic memory and PTSD risk was calculated by performing forward and backward linear and logistic

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regressions, respectively, under inclusion of age, sex, trauma load, and—wherever indicated—occurrence of specific traumatic event types. The significance level of genetic associations with trauma load and the occurrence of specific traumatic events was calculated by performing forward and backward linear and logistic regressions, respectively, under inclusion of age and sex. The significance level of genetic associations with age and sex was calculated by performing linear regressions and  $\chi^2$  tests, respectively. Saliva samples were obtained from each person using the Oragen DNA Self-Collection Kit (DNA Genotek, Ottawa, Ontario, Canada). DNA was extracted from saliva using standard protocols.

**Data availability.** The data that support the findings of this study are available from the corresponding author upon request.

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#### Author contributions

A.P., D.J.-F.d.Q., A.H., A.M. and M.F. conceived and designed the study. A.H., A.M., V.V., J.P., T.Eg., J.S., D.C., V.F., M.F., P.D., E.L., F.H., N.S., B.D.B., C.V., I.-T.K., S.W., T.El., D.J.-F.d.Q. and A.P. analysed the data. P.E., T.Se., T.Sc., C.B. and N.B. provided bioinformatic support. A.P., A.H. and D.J.-F.d.Q. wrote the manuscript. All authors reviewed and approved the final manuscript.

#### Additional information

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#### **Competing interests**

The authors declare no competing interests.