Rapid volumetric brain changes after acute psychosocial stress

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Abstract (currently 212 of 250 words max.)

Rapid structural brain plasticity after acute stress has been shown in animals. It is unknown whether such stress-related brain changes also occur in humans, in which they have been found, using structural magnetic resonance imaging (MRI), after motor learning and visual stimulation. We here investigated grey matter volume (GMV) changes after acute stress in humans and tested their relation to psychophysiological stress measures.

Sixty-seven healthy men (25.8±2.7 years) completed a standardized psychosocial laboratory stressor (Trier Social Stress Test) or a control version while blood, saliva, heart rate, and psychometrics were sampled. T1-weighted MP2RAGE images at 3T MRI were acquired 45 min before and 90 min after intervention onset. GMV changes were analysed using voxel-based morphometry. Associations with endocrine, autonomic, and subjective stress measures were tested with linear models.

We found significant group-by-time interactions in several brain clusters including anterior/mid-cingulate cortices and bilateral insula: GMV was increased in the stress group relative to the control group, in which several clusters showed a GMV decrease. We found no significant group-by-time interaction for other MRI parameters, including cerebral blood flow, but a significant association of GMV changes with state anxiety and heart rate variability changes.

In summary, we show rapid GMV changes following acute psychosocial stress in
humans. The results suggest that endogenous circadian brain changes are
counteracted by acute stress and generally emphasize the influence of stress on the
brain.

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55 Keywords (7)

Humans, Magnetic Resonance Imaging, Brain, Autonomic Nervous System, Stress,
 Psychological, Neuroplasticity

58 Introduction

A stressor is a real or imagined threat to an organism's integrity or well-being, which 59 elicits a psychological and physiological stress response (Herman et al., 2003). 60 Rapidly activated and rapidly terminated, the stress response is highly adaptive in 61 62 situations of acute threat, but a chronically activated stress system can have detrimental effects and constitutes a major risk factor for physical and mental disease 63 64 (McEwen & Gianaros, 2010). While the stress response is orchestrated by the brain, it involves the whole organism, particularly the autonomic nervous system and 65 endocrine systems, with the hypothalamic-pituitary-adrenal axis (HPA axis) as a 66 67 central component (Kemeny, 2003). In turn, brain structure and function can be affected by stress, and rapid structural brain plasticity after acute stress has been 68 shown in animals (Kassem et al., 2013). In the current study, we investigated rapid 69 70 stress-induced brain changes in humans with structural magnetic resonance imaging 71 (MRI).

72 The stress response comprises a cascade of hormonal signals including corticotropin-73 releasing hormone (CRH), vasopressin, adrenocorticotropic hormone (ACTH), and 74 cortisol (Tsigos & Chrousos, 2002), which activates bodily functions to counteract the 75 stressor. Most importantly, it triggers suppression of the immune system, faster glucose metabolization, and increased blood pressure (Cohen et al., 1991; Nesse et 76 77 al., 2016). Being lipophilic, cortisol can cross the blood-brain barrier and, through its action on brain structures such as the hippocampus, terminate the stress response 78 79 (Tasker & Herman, 2011; Joëls et al., 2013). This highlights the strong association of 80 cortisol with long-term effects of stress on brain plasticity (McEwen & Gianaros, 2011), 81 which occurs predominantly in regions involved in HPA axis regulation, such as prefrontal cortex (PFC), hippocampus, and amygdala (McEwen & Gianaros, 2011). 82 83 Brain plasticity describes the brain's capacity to alter its structure and function to adapt 84 to changing demands (Lövdén et al., 2010). Brain structure and function are thereby

inseparable, with structure constraining function and function shaping structure: In a
supply-demand model, regional volume changes represent a continuous adaptation
of the brain in supply (e.g., brain tissue) to changing environmental demands,
mediated by alterations in activity (Lövdén et al., 2013). In support of this model, MRI
studies often report a parallel development of structural and functional networks (He
et al., 2007).

Stress-induced functional brain changes have been shown using MRI: During stress, 91 the BOLD signal increased in prefrontal areas (Dedovic et al., 2009; Wheelock et al., 92 2016) and decreased in subcortical regions, including the hippocampus (Dedovic et 93 al., 2009; Pruessner et al., 2008). Such stress-related brain changes in the PFC and 94 95 subcortical regions also outlasted the stress task, which was ascribed to sustained 96 vigilance or emotional arousal (Wang et al., 2005). Stress-related changes in 97 functional connectivity have been shown in the salience network (Hermans et al., 98 2014), including the anterior cingulate cortex (ACC) and other cortical midline 99 structures (Veer et al., 2011). These stress-related functional connectivity changes also correlated with individual cortisol trajectories (Veer et al., 2012). Analysing the 100 101 resting-state fMRI from the experiment presented here, we previously found a stress-102 related increase in thalamic functional connectivity, which was linked to subjective 103 stressfulness (Reinelt et al., 2019).

104 The link between chronic stress and structural brain changes in humans has been well-established (for a review see Radley et al., 2015): For example, stress-related 105 106 psychopathologies have been associated with structural plasticity mainly in limbic and 107 prefrontal areas (McEwen, 2005). Patients with post-traumatic stress disorder (PTSD) 108 showed decreased GMV in the hippocampus (Chen et al., 2006; Karl et al., 2006), amygdala and ACC (Karl et al., 2006; Rogers et al., 2009). Also without a clinical 109 110 diagnosis, higher levels of self-reported chronic stress have been associated with 111 lower grey matter volume (GMV) in the hippocampus, amygdala, insula, and ACC 112 (Ansell et al., 2012b; Lotze et al., 2020; Papagni et al., 2011).

In animal models, rapid stress-induced structural changes that have been detected
within hours after acute stress exposure include attenuation of neurogenesis
(marmosets: Gould et al., 1998, rats: Heine et al., 2004), changes in astrocyte density
(in degus; Braun et al., 2009) or decreases in dendritic spine density (in mice; Chen

et al., 2010). In the latter study, a mediating function of the HPA axis in stress-induced
memory deficits and associated brain structural changes was suggested.

Thus, while animal studies have found rapid structural brain changes after acute stress, these have - to our knowledge - not been shown in humans. We here used the Trier Social Stress Test (TSST, Kirschbaum et al., 1993), a strong and naturalistic psychosocial stressor in humans (Kirschbaum et al., 1993), and MRI to investigate structural brain plasticity.

124 In humans, structural brain changes are typically investigated using voxel-based morphometry (VBM; Ashburner & Friston, 2000; Draganski et al. 2004), which uses 125 126 computational tissue classification based on T1-weighted images to detect differences 127 in brain tissue composition. Numerous VBM studies have found rapid and spatially 128 specific brain plasticity in response to exogenous stimuli such as training paradigms: 129 for example, increased GMV in the motor cortex was found after one hour of balance 130 training (Taubert et al., 2016) and after one hour of brain-computer-interface training in targeted brain regions (Nierhaus et al., 2021). Even after less active interventions, 131 132 such as ten minutes of high-frequency visual stimulation (Naegel et al. 2017), or 263 seconds of passive image viewing (Mansson et al. 2020), GMV changes were found 133 134 with VBM.

The physiology behind VBM-derived GMV changes remains unclear¹. Theoretically, 135 genesis of neurons, glia cells and synapses as well as vascular changes could underlie 136 137 structural MRI changes in GM (Zatorre et al., 2012). Supporting findings with stressful interventions (mentioned above; Chen et al., 2010; Braun et al., 2009), animal studies 138 that combined MRI and histological examination after training interventions have 139 140 suggested neural dendrites and astrocytes as drivers of rapid, experience-induced brain changes in structural MRI (Keifer et al., 2015; Sagi et al., 2012). Both can occur 141 142 after minutes to hours (Johansen-Berg et al., 2012).

Not only interventions but also endogenous changes at different time scales can affect
measures of GMV: Ageing is a strong predictor for GMV decreases (Karch et al.,
2019), but rhythmic GMV changes have also been reported over the course of the
menstrual cycle and its hormonal fluctuations (Barth et al., 2016; Lisofsky et al., 2015)

¹ While we use the term "grey matter volume" for VBM changes, we consider it a placeholder, as other physiological changes may contribute to the signal (see below).

147 or with the circadian rhythm (Karch et al., 2019; Nakamura et al., 2015; Orban et al., 2020; Trefler et al., 2016). Total GMV decreased linearly from morning to afternoon in 148 several studies (Karch et al., 2019; Nakamura et al., 2015; Trefler et al., 2016), 149 particularly in medial prefrontal areas and the precuneus (Trefler et al., 2016). In 150 151 addition, CSF increased over the course of the day (Trefler et al., 2016) whereas total 152 white matter decreased in one study (Trefler et al., 2016), but was not associated with 153 time of day in another (Karch et al., 2019). The circadian system and the stress system 154 both maintain homeostasis by adapting to environmental conditions, and they strongly 155 interact on the physiological level with the HPA axis, which is a major component of 156 both systems (Nader et al., 2010; Nicolaides et al., 2014).

Rapid GMV changes may also occur with alterations in the participant's physiological 157 158 state during MRI, for example by changes in hydration (Streitbürger et al., 2012) or 159 osmolality (Höflich et al., 2017; Streitbürger et al., 2012). Furthermore, vascular 160 changes can impact VBM results, because blood and GM have similar T1 relaxation 161 values at 3T (Tardif et al., 2017; Wright et al., 2008), and changes in blood oxygenation 162 and tissue oxygenation (Tardif et al., 2017) or cerebral blood flow (CBF; Franklin et 163 al., 2013; Ge et al., 2017) may "masquerade" as changes in VBM-derived GMV. To specify the stress-related structural plasticity found with VBM and clarify the 164 165 contribution of vasculature, we complemented VBM with other MRI measures: CBF 166 measured with pulsed arterial spin labeling (pASL) and quantitative T1. An increase in 167 T1 values would be consistent with a shift towards T1 values of blood and has been discussed as an increase in vascular tissue in the context of training-induced plasticity 168 (Thomas et al., 2018). On the other hand, increased oxygenation following a breathing 169 challenge has been shown to decrease T1 values (Tardif et al., 2017), which has been 170 171 ascribed to the so-called tissue oxygenation-level dependent (TOLD) contrast 172 (Haddock et al. 2013). To investigate differences between T1 maps, T1-weighted 173 images and (preprocessed) VBM images, we also analysed intensity values from 174 (unpreprocessed) T1-weighted (UNI) images within the VBM clusters.

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To summarize, rapid GMV changes have been detected in humans upon exogenous stimulation and with endogenous fluctuations, and in animals following stress exposure. We hypothesized that acute stress, as a relevant exogenous stimulus triggering an endogenous process (i.e., the stress response), can induce rapid changes in GMV measured with MRI. To test this hypothesis, we had young, healthy men complete either a psychosocial stress test (Trier Social Stress Test, TSST; Kirschbaum et al., 1993) or a closely related control intervention without a psychosocially stressful component (Placebo-TSST; Het el al., 2009). Before and after the intervention, we acquired MRI data. Throughout the entire experiment, we regularly sampled autonomic, endocrine, and subjective markers of the stress response (Figure 1).

As stress-induced brain changes have often been reported in the amygdala and the hippocampus (see above), they served as regions-of-interest (ROIs), complemented by an exploratory whole-brain analysis. To better depict the physiology of stressinduced brain changes, we also compared CBF and quantitative T1 values before and after the intervention. Additionally, we investigated the relation between GMV changes and the other (i.e., autonomic, endocrine, and subjective) stress measures.

193 Methods

194 Participants

195 We recruited male participants between 18 and 35 years of age via leaflets, online advertisements, and the participant database at the Max Planck Institute for Human 196 Cognitive and Brain Sciences in Leipzig. Exclusion criteria, as assessed in a telephone 197 screening, were smoking, excessive alcohol / drug consumption, past or current 198 199 participation in psychological studies, regular medication intake, history of 200 cardiovascular or neurological diseases, and a BMI higher than 27. In addition, standard MRI exclusion criteria applied, such as tattoos, irremovable metal objects 201 (e.g., retainers, piercings), tinnitus, and claustrophobia. 202

We tested 67 young, healthy males. Because of an incidental medical finding, one participant was excluded, so that 66 participants (age: 25.8 ± 2.7 , 21-32 years) entered the analyses, 32 in the stress and 34 in the control group.

206 On separate days prior to the stress/control paradigms, participants underwent 207 extensive baseline measurements that included cognitive testing, blood screening, 208 anthropometrics, structural and resting-state functional MRI scans, resting-state 209 electroencephalography (EEG), self-report questionnaires, and a structured clinical interview (for details, see Babayan et al., 2019). If exclusion criteria were detected 210 during the baseline assessment, participants were excluded from further testing. 211 Included participants were randomly assigned to either the stress or the control group. 212 213 To avoid experimenter biases, the administrative staff remained blind to the testing 214 condition until the first MRI session. All appointments were scheduled for the same 215 time of day (11:45 am) to control for diurnal fluctuations of hormones (e.g., cortisol and ACTH; Nader et al., 2010; Nicolaides et al., 2014). Participants were asked to sleep 216 217 at least 8 hours in the night before the experiment, to get up no later than 9 am, have a normal breakfast and to not eat or exercise until their study appointment while also 218 219 refraining from drinking coffee, black tea, or other stimulant drinks. Written informed 220 consent was obtained from all participants. The study was approved by the ethics 221 committee of the medical faculty at Leipzig University (number 385-1417112014), and 222 participants were financially compensated.

223 Stress and the control groups did not differ significantly in age, hours of sleep on the 224 day of testing, average sportive activity per week, or self-reported chronic stress 225 (Reinelt & Uhlig et al., 2019).

226 Procedure

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The pre-scan was completed on average 45 (SD: ± 3.9) min before intervention onset (before two resting-state fMRI scans, see Figure 1), and the post-scan was completed on average 88 (SD: ± 3.6) min after intervention onset (between four resting-state fMRI scans, see Figure 1).

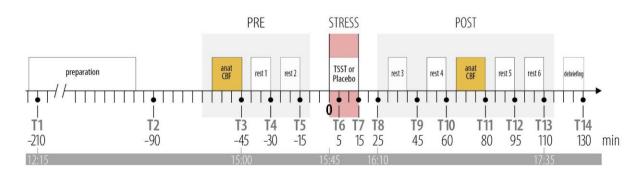


Figure 1. Schematic overview of the experiment: Between-subject design with the stress group (n = 33) undergoing the Trier Social Stress Test (TSST) and the control group (n = 34) a placebo-TSST. Orange boxes indicate two anatomical scans (anat) using T1-weighted MRI (MP2RAGE) and two scans of pulsed arterial spin labelling for cerebral blood flow (CBF).

Psychometric ratings, saliva samples, and blood samples were acquired at 14 time points
throughout the experiment (T1-T14). Minutes are relative to the onset of the intervention
(TSST or placebo-TSST), while the bottom bar informs about the time-of-day. The grey boxes
indicate phases in the MRI. (The TSST and the placebo-TSST took place outside of the MRI.)

240 Intervention

Each participant completed either a psychosocial stress test (Trier Social Stress Test,
TSST; Kirschbaum et al., 1993) or the placebo-TSST as control intervention, which
tightly controls for physical and cognitive load during the TSST (Het et al., 2009).

Participants in the stress group prepared for (5-min) and completed a job interview (5-244 min) as well as a difficult mental arithmetic task (5-min) in front of a committee (one 245 female, one male professional actor), introduced as two professional psychologists 246 trained in the analysis of nonverbal communication. Additionally, the task was 247 248 recorded by a video camera and microphone. In the control condition, participants prepared (5-min) and spoke about their career aims (5-min) and solved an easy mental 249 250 arithmetic task (5-min) with nobody else in the room and no video or audio recording. 251 To extend the stressfulness of the TSST, participants in the stress group were told that 252 a second task would follow during the scanning procedure. To make this scenario 253 more plausible, participants were brought back to the scanning unit in the company of 254 the experimenter and the TSST committee members. Only after rest 4, before the 255 anatomical scan (+60 min after TSST onset), they were told that no additional task 256 would follow. For a more detailed description of the interventions, see supplementary 257 material and Reinelt & Uhlig et al. (2019).

Throughout the experiment, blood was sampled at 14 time points, and saliva and subjective ratings at 15 time points. At each sampling point, participants completed psychometric questionnaires, while autonomic and endocrine data were acquired. For further details, see below as well as Reinelt & Uhlig et al. (2019) and Bae & Reinelt et al. (2019).

263 Magnetic resonance imaging

264 Acquisition

MRI was performed on a 3T MAGNETOM Verio (Siemens AG, Erlangen, Germany) 265 266 scanner with a 32 channel Siemens head-coil. The MP2RAGE sequence was used to acquire structural MR images. The MP2RAGE sequence yields a nearly bias-free T1-267 weighted (UNI) image, which is created by combining the two inversion images (INV1, 268 INV2) and it produces a quantitative T1 map (T1) (Margues et al., 2010). The high-269 270 resolution MP2RAGE sequence had the following parameters (Margues et al., 2010): TI1 = 700 ms, TI2 = 2500 ms, TR = 5000 ms, TE = 2.92 ms, FA1 = 4°, FA2 = 5°, 176 271 272 slices, voxel dimensions = 1 mm isotropic.

273 Cerebral blood flow (CBF) was measured using the pulsed arterial spin labeling 274 (pASL) sequence from Siemens (PICORE). For a detailed description of the pASL 275 data acquisition, preprocessing, analysis and results, see supplement.

276 Preprocessing

VBM: For each scan (pre-intervention, post-intervention), a brain mask was created 277 278 from the INV2-images to remove the noisy background of the UNI images, which is a by-product of the division of the two inversion images. These denoised T1-weighted 279 280 images were preprocessed using the longitudinal preprocessing pipeline (with default (CAT12.6) 2019-04-04) 281 settings. Version 1450 of the CAT12 toolbox 282 (http://www.neuro.uni-jena.de/cat/) including intra-subject realignment. bias correction, segmentation, spatial registration to MNI space, segmentation into three 283 284 tissue types (grey matter, white matter, and cerebrospinal fluid). Finally, the images 285 were smoothed with a Gaussian kernel at 8 mm full-width at half maximum (FWHM). For further analysis, the segmented grey matter images were used. 286

T1 & T1-weighted: The denoised T1-weighted images were warped to MNI-space (using the *normalize:estimate&write* function in SPM). T1 maps were normalized to MNI space by applying the deformations from the normalization of the T1-weighted images. The normalized T1-weighted and T1 images were masked with the same sample-specific GM mask, which was used for the VBM-analysis before smoothing with an 8-mm FWHM Gaussian kernel. *CBF*: PASL data was preprocessed using an inhouse Matlab analysis pipeline, which included motion correction with linear regression. Images were realigned with FSL *McFlirt* and smoothed with a 2D spatial Gaussian filter of 3-mm FWHM (for details, see supplement).

297 Postprocessing

For post-hoc analyses (see below for details), significant (p_{FWE}<0.05) VBM clusters were saved as binarized NIfTI images from the result GUI and used as masks for posthoc tests and to investigate changes in T1 and T1-weighted intensity values as well as CBF. For binarizing masks, multiplication with masks and extraction of GMV, T1 and T1-weighted intensity values, FSL was used (*fslmaths & fslstats* in *fslutils*, (Jenkinson et al., 2012).

VBM post-hoc: GMV values were extracted by multiplying binary masks of VBM
 clusters with the smoothed, preprocessed GM images and extracting the average
 value from each cluster.

307 *T1 & T1-weighted:* Values were extracted by multiplying binary masks of VBM clusters 308 with the smoothed and normalized T1 and T1-weighted images and extracting the 309 average value from each cluster. Additionally, average values from GM voxels outside 310 of the VBM clusters were extracted to serve as a reference for potential global changes 311 in T1 values or T1-weighted intensity values. Therefore, the smoothed, GM masked 312 images were multiplied with an inverse binary VBM-cluster mask.

313 *CBF:* For the CBF analysis, the masks were resampled to a 2-mm isotropic voxel size 314 to match the pASL images using the *coregister:reslice* function in SPM12. The 315 preprocessed CBF maps were multiplied with binary masks for VBM clusters and the 316 average CBF value for each cluster was extracted. As the pASL data is acquired within 317 a manually defined slab, not all VBM clusters were fully covered (see Figure S1). Only 318 clusters, in which CBF data was available for at least 70% of voxels were included in 319 the post-hoc CBF analysis.

320 Anatomical regions-of-interest definition

To test our regional hypotheses, anatomical regions-of-interest (ROIs) were created as binary masks of hippocampus and amygdala using the Anatomy toolbox (Eickhoff et al., 2005) and resampled to 1.5-mm space using SPM12 to match the anatomical images. ROI values were extracted by multiplying masks with the smoothed, modulated, warped, coregistered images using FSL (*fslmaths* & *fslstats* in *fslutils*, Jenkinson, et al., 2012). Below, "Hippocampus" and "Amygdala" (with capitalized first letters) refer to these anatomical ROIs.

328 Quality assessment

Image guality was assessed using the noise-to-contrast ratio (NCR), a guality 329 330 parameter computed by the CAT12 toolbox from noise, bias and white-matter hyperintensities. Based on within-sample comparisons, data from participants whose 331 332 image quality (NCR) was more than 3 standard deviations (SD) below the sample mean were excluded (see supplementary material). Systematic changes in image 333 334 quality were tested with a linear mixed model, which showed a significant group-by-335 time interaction effect for NCR ($X^2(1)=7.9$; p=0.0049; see supplement), driven by a significant decrease in image quality in the control group (t-ratio=3.3, p=0.0016). Head 336 337 movement can negatively influence image quality in MRI (Power et al., 2015) as well 338 as estimates of GMV and cortical thickness (Reuter et al., 2015). As no information 339 about head movement was available from the MP2RAGE data, we calculated mean framewise displacement (MFD) as the sum of the absolute values of the six 340 341 realignment parameters (Power et al., 2015) from the resting-state fMRI scans that directly preceded the MP2RAGE scan. Accounting for head motion by including MFD 342 343 into the above model weakened the group-by-time interaction effect for NCR 344 (X²(1)=3.7; p=0.059). Furthermore, a non-significant trend for an effect of MFD on 345 NCR (F(1)=3.4, p=0.068) was found, suggesting an association between the two quality parameters. To avoid circular analyses (since NCR was derived from the data), 346 347 we included MFD in our statistical models to account for quality changes on volume 348 estimates.

- For extracted T1 and T1-weighted intensity values, values outside the range of 3 SD
 above sample mean were excluded (for details, see respective section below).
- 351 The quality assessment of CBF data is described in the supplement.

352 Psychophysiological stress measures

353 Autonomic

354 Heart rate (HR) and heart rate variability (HRV) were analysed from recordings of 355 electrocardiography (ECG) and photoplethysmography (PPG). A detailed description of autonomic data acquisition and data preprocessing can be found in Reinelt & Uhlig 356 357 et al. (2019). Autonomic recordings were binned into three-minute intervals. The average interbeat interval (the inverse HR) was determined for each interval and HRV 358 359 was quantified as the square root of the mean squared differences of successive differences (RMSSD) in interbeat intervals, indexing parasympathetic cardio-360 361 regulation (e.g., Malik et al., 1996).

362 Endocrine

Saliva was sampled with a Sarstedt Salivette (Sarstedt, Nümbrecht, Germany) for at 363 364 least 2 min per sample. Blood samples (serum and plasma; Sarstedt Monovette) were acquired by the experimenter from a intravenous catheter in the left or right cubital 365 366 vein. Saliva and blood samples were analysed using Liquid chromatography-tandem mass spectrometry (LC-MS/MS) at the Institute for Laboratory Medicine, Clinical 367 368 Chemistry and Molecular Diagnostics, University of Leipzig, following the protocol 369 described in (Gaudl et al., 2016). Saliva cortisol and plasma ACTH were used to 370 assess the association of GMV changes with endocrine stress measures at different times of HPA axis activation: ACTH, which is secreted earlier during HPA axis 371 372 activation, peaked at 15 min after stressor onset, while saliva cortisol, a particularly 373 robust stress marker (Vining et al., 1983), peaked at 25 min after stressor onset. A 374 detailed analysis of changes in endocrine markers and their timing in the current study 375 can be found in (Bae et al., 2019). Participants with a cortisol increase below 1.5 nmol/l 376 following psychosocial stress exposure can be considered non-responders and are 377 often excluded from analyses including endocrine data (Miller et al., 2013).

378 Subjective

We presented questionnaires with OpenSesame 3.1.2 (Mathôt et al., 2012) on a laptop (outside MRI) or on a screen (inside MRI). Participants answered the questions with two keys on the laptop keyboard (outside MRI) or with a button box (inside MRI). For

this analysis, subjective stress was assessed with the state trait anxiety questionnaire (STAI, sum score of the state subscale; (Laux, 1981; Laux & Spielberger, 2001) and the individual stressfulness question "How stressed do you feel right now?", which was answered using a visual analogue scale (VAS) with a sliding bar from 0 ("not at all") to 100 ("very much").

387 Statistical Analysis

- 388 Analysis of neuroimaging data
- 389 Whole-brain analysis in SPM

390 Following quality assessment, three participants (two in the stress group) were excluded from the VBM analysis because of an NCR value more than 3 SD below the 391 392 sample mean. The final VBM sample therefore consisted of 63 participants, 30 in the stress group and 33 in the control group. For statistical analysis of the MRI data, delta 393 394 images were created by subtracting the pre-intervention image from the postintervention image. A two-sample t-test was performed on the difference images to 395 396 investigate the group-by-time interaction. To focus the analysis on GM, thresholding 397 is typically used in VBM analyses (e.g. Streitbürger et al., 2012). Since the voxel values in delta images describe a difference rather than the tissue probability itself, they could 398 399 not be thresholded. Instead, we used a sample-specific GM mask. This mask is 400 automatically created during model estimation in SPM; in our case a one-sample t-test 401 on all smoothed, segmented GM images while applying an absolute masking threshold of 0.1 (probability of this voxel being GM). 402

403 The total intracranial volume (TIV) was estimated for both images (pre-intervention, 404 post-intervention) of each subject using CAT12 and their average was included as a covariate. To account for potential systematic, group-specific changes in image quality 405 (see the section "Quality assessment" above and supplement), MFD was included as 406 407 a proxy for head motion as an additional covariate. The results from the two-sample t-408 test on Δ grey matter images (Δ GM) were investigated using two-sided t-contrasts (i.e., control>stress [1 -1 0 0] and control<stress [-1 1 0 0] with TIV and MFD in columns 3 409 410 and 4).

411 To minimize false positive and false negatives results, we used whole-brain thresholdfree cluster enhancement (TFCE), a non-parametric multiple-comparison correction 412 that does not require a cluster extent threshold, using the TFCE-toolbox 413 414 (http://dbm.neuro.uni-jena.de/tfce) with the default settings of 5000 permutations and 415 the Smith-permutation method. Anatomical labels for significant clusters were found using the DARTEL-based "neuromorphometrics atlas" provided with the CAT12 416 417 toolbox. Below, we use capitalization to indicate the extracted anatomical labels (e.g., "Superior Medial Frontal Gyrus") 418

419 Analysis of extracted imaging markers

Statistical analysis at the ROI level was performed using R 3.0.2 (R Core Team (2013);
<u>http://www.R-project.org/</u>). Group differences in variables-of-interest over time were
investigated with linear mixed models (LMMs; using the *Ime4* package; (Bates et al.,
2015), which included a random intercept for each subject to account for interindividual differences. Visualizations were created in R using *ggplot* (Wickham, 2009).
The raincloud plots were adapted (Allen et al., 2019).

426 Linear mixed model design

427 Across all analyses, the model was built following the same procedure (the full scripts 428 can be found on https://gitlab.gwdg.de/necos/vbm.git):

- 429 1. A null model including a random intercept, covariates of no interest, as well as
 430 reduced fixed effects was set up and compared to a full model (Forstmeier &
 431 Schielzeth, 2011).
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- 436 3. The difference between the full and the null model was tested using the *anova*437 function and setting the argument *test* to "chisq" to do a X² (Chi²) test.
- 438 4. The *drop1* function was used to extract the results from the individual effects.
- 439 5. Non-significant interactions were dropped from the full model to reduce440 complexity (reduced model).

6. In case of significant interactions, the effects at the individual levels of
predictors (e.g., within-group or for each cluster) were analyzed post-hoc using
the *emmeans* & *contrast* function with *Holm* correction from the *emmeans*package (Lenth, 2021). Estimated marginal means and 95% confidence
intervals obtained with *emmeans* were used for plotting.

446

447 We tested the assumptions for LMMs by visually inspecting the distribution of residuals 448 in a QQplot and a scatterplot of the residuals plotted against fitted values. The main 449 criterion for the latter was symmetry along the y-axis. Influential cases were identified 450 and excluded. Multicollinearity was tested by extracting the variance inflation factor 451 (VIF), using the vif function in the car package (Fox & Weisberg, 2018). To increase 452 the likelihood of symmetrically distributed residuals, distribution of all variables was estimated visually using histograms, and data was transformed (default: natural 453 454 logarithm) when data distribution appeared asymmetrical. The covariate MFD was 455 also log-transformed and both covariates of no interest, TIV and log_e(MFD) were z-456 transformed to increase interpretability of the results (Schielzeth, 2010).

457

458 Post-hoc analysis of VBM results: Post-hoc analysis in significant VBM clusters was performed to confirm SPM analyses, in which the 2-by-2 design (group-by-time) was 459 460 reduced to a two-sample t-test over the difference images (post- minus pre-461 intervention). The full model included the main effects, all two-way interactions, and 462 the three-way interaction of group, time, and cluster (plus covariates log_e(MFD) and 463 TIV), while the null model lacked all interactions. GMV values were square-root 464 transformed. If the three-way interaction was not significant, it was excluded from the 465 full model (reduced model).

In addition to the "global" model including all clusters, group-by-time interaction effects were additionally tested in "local" models for each cluster separately, which allowed the investigation of regional differences and patterns. Since the effect of interest here was the group-by-time interaction effect, the null model only included the main effects of group and time as fixed effects. The model equation is depicted below; $\beta_{3...} \beta_7$ denotes all two-way interactions and the main effects of all variables in interaction terms, *u* and *e* depict random intercepts per subject and subject residuals.

15

The GMV values from the individual clusters were \log_{e} -transformed. The *p* values from the full-null-model comparison were corrected using the *Holm-Bonferroni* method in the *p.adjust* function from the *stats* package.

Following a significant group-by-time interaction effect, post-hoc tests were conducted
to test within-group effects using the *emmeans* function with *Holm-Bonferroni*correction from the *emmeans* package (Lenth, 2021).

479

480 Full model:

481
$$\sqrt{GMV} \sim \beta_0 + \beta_1(Group \times Time \times Cluster) + \beta_2(Group \times Time) + \beta_3(...)\beta_7$$

482 +
$$\beta_8 log_e(MFD) + \beta_9(TIV) + u_{subject} + \varepsilon_{subject}$$

483

484 Reduced model:

$$\begin{array}{ll} 485 & \sqrt{GMV} \sim \beta_0 \ + \ \beta_1(Group \times Time) \ + \ \beta_2(Cluster \times Time) \\ 486 & + \ \beta_3(Group) \ + \ \beta_4(Time) \ + \ \beta_5(Cluster) \ + \ \beta_6log_e(MFD) \\ 487 & + \ \beta_7(TIV) \ + \ u_{subject} \ + \ \varepsilon_{subject} \end{array}$$

488

489 Null model:

490
$$\sqrt{GMV} \sim \beta_0 + \beta_1(Group) + \beta_2(Time) + \beta_3(Cluster) + \beta_6 log_e(MFD)$$

491 $+ \beta_7(TIV) + u_{subject} + \varepsilon_{subject}$

492

493 Total GM, total WM, and CSF:

494 Only data of participants included in the VBM analysis were used.

Log-transformation was applied to values of total GM and total WM, while total CSF was left untransformed. The full models included the main effects and the group-bytime interaction (plus covariates log_e(MFD) and TIV), while the null models lacked the interaction. Significant interaction effects were followed by post-hoc tests using the *emmeans* function.

500

501 *Quantitative T1 values:* Only data of participants included in the VBM analysis were 502 used.

503 Before analysis. T1 values were z-transformed and outliers of 3 SD below the sample 504 mean were removed. Because 11 of the resulting 13 outliers came from the same two participants, these were excluded from the T1 analysis entirely (remaining sample: 505 506 n=61). For the "global" model, T1 values were left untransformed (criterion: symmetry 507 of the distribution of residuals; see above). The full model included the main effects, 508 all two-way interactions, and the three-way interaction of group, time, and cluster (plus covariates loge(MFD) and TIV), while the null model lacked all interactions. If the three-509 510 way interaction was not significant, it was excluded from the full model (reduced 511 model). The null model remained unchanged. Significant interaction effects were 512 followed by post-hoc tests using the *emmeans* function.

513

514 *T1-weighted intensity values:* Only data of participants included in the VBM analysis 515 were used.

516 Before analysis, T1-weighted intensity values of 3 SD above the sample mean were 517 excluded as outliers. Since the resulting 6 outliers came from the same participant, he 518 was excluded from the analysis (analysed sample: n=62). The full model included the 519 main effects, all two-way interactions, and the three-way interaction of group, time, 520 and cluster (plus covariates log_e(MFD) and TIV), while the null model lacked all 521 interactions. In the "global" model, T1-weighted intensity values followed a 522 symmetrical distribution and were left untransformed.

523

524 Anatomical ROIs: We investigated group differences in GMV over time within the 525 hypothesized four ROIs in four separate models (left and right amygdala, left and right 526 hippocampus). As the effect-of-interest was the group-by-time interaction, the null 527 model only included main effects of group and time. GMV values were log_e-528 transformed.

529 CBF changes in the VBM clusters and in the whole brain

530 Following quality assessment, three participants were excluded from the pASL 531 analysis. To investigate the impact of group and time on CBF within the VBM clusters, LMMs were set up in analogy to the VBM-ROI analysis. In addition to the factors group, time, cluster, and their interaction, a random effect per participant was included. The covariates TIV and MFD (included in the VBM-LMMs) were not included in the pASL analysis, because the preprocessing of the pASL data already included motion correction and TIV does not affect the intervention-induced change in CBF within a predefined region. (For a control analysis showing no significant effect of TIV, MFD or age on CBF data across all voxels from VBM clusters, see supplement).

As an exploratory analysis, group-specific CBF changes over time were assessed similarly to the VBM analysis, that is, groups were compared with a two-sample t-test on the difference images (post-pre) in SPM12. No nuisance variables were included, the sample-specific GM mask was used, and the threshold for TFCE correction was p_{FWE}<0.05.

544 Analysis of endocrine, autonomic, and subjective stress measures

We investigated changes in autonomic (HR, HRV), endocrine (saliva cortisol, plasma 545 546 ACTH), and subjective stress measures (STAI - state anxiety, VAS "stressfulness") over time between groups using LMMs. All time points beginning from directly after 547 548 the first (T3) until directly after the second (T11) anatomical MR scan were included 549 (10 time points). One "non-responder" participant was excluded from the endocrine 550 analysis due to a cortisol increase below 1.5 nmol/l (Miller et al., 2013), another was identified as an influential outlier by visual inspection of the residuals plot and excluded 551 552 from the saliva cortisol model. The full model included group and time as well as their interaction and baseline (mean between 2 time points before intervention) values as 553 554 fixed effects and a random intercept per subject. Full models were compared against 555 the respective null model lacking the interaction effect with X² tests. Saliva cortisol, 556 plasma ACTH, HR, and STAI score values were loge-transformed, HRV and VAS 557 stressfulness values were square-root transformed. (More details on LMM analysis can be found in the section Analysis of extracted imaging markers above.) 558

559 Association of VBM changes with other stress measures

560 We conducted two types of analyses to investigate the association of GMV changes 561 with endocrine, autonomic, and subjective stress measures: LMMs were used to 562 analyse the effect of the trajectory of endocrine, autonomic, and subjective stress 563 measures on GMV changes. Linear models (LMs) were used to test the association 564 between stress reactivity and GMV changes by analyzing the association of Δ GMV 565 values (post-pre) and the peak reactivity value of the stress measures (maximum-566 baseline). Peak reactivity is commonly used in stress research (Engert et al., 2013; 567 Van Cauter & Refetoff, 1985), also to determine individuals with a cortisol increase 568 below physiological relevance ("non-responders"; Engert et al., 2013; Miller et al., 569 2013; Van Cauter & Refetoff, 1985).

570 LMMs have the advantage of covering the trajectory of stress measures by including 571 data from all timepoints (before, during, and after the intervention). However, this high 572 number of observations in stress measures also adds a lot of variance compared to 573 GMV data, available at only two time points, which may overfit the model. Please note 574 that both LMMs and LMs (with Δ values) are complementary analyses, which - since 575 they are not built on the same data - cannot be directly compared with regard to 576 variance explained (e.g., adjusted R²) or model fit (e.g., Akaike Information Criterion 577 AIC).

P values from LMMs and LMs were multiple comparison-corrected using Holm's method (Holm, 1979; 6 stress measures, 2 analyses, LMM and LM, each = 12) as implemented in the *p.adjust* function of the *stats* package. In case of significance, the *emtrends* function from the *emmeans* package (Lenth, 2021) was used to extract the within-group estimates and test for a significant interaction effect. The *drop1* function was used to extract the estimates and *p* values for the single predictors.

584

Association of VBM changes with other stress measures (LMMs): Stress measures (saliva cortisol, plasma ACTH, HR, HRV, STAI score, and VAS score) were included in separate full-model LMMs and tested against a null model without them. The model equation is depicted below; $\beta_{3...} \beta_7$ denotes all two-way interactions and the main effects of all variables in the interaction term, *u* and *e* depict random intercepts per subject and subject residuals.

591

592

593

595 $\sqrt{GMV} \sim \beta_0 + \beta_1(Group \times Time \times StressMeasure) + \beta_2(Group \times Time)$

596 597

```
+ \beta_3(...)\beta_7 + \beta_8Cluster + \beta_9log_e(MFD) + \beta_{10}(TIV) + u_{subject}
+ \varepsilon_{subject}
```

598 Null model:

599
$$\sqrt{GMV} \sim \beta_0 + \beta_1(Group \times Time) + \beta_4Cluster + \beta_5 \log_e(MFD) + \beta_6(TIV)$$

600 $+ u_{subject} + \varepsilon_{subject}$

601

Association of Δ VBM with peak reactivity of other stress measures (LMs): Δ GMV values were calculated by subtracting the pre- from the post-scan value. Δ values of stress-measures (saliva cortisol, plasma ACTH, HR, HRV, STAI score, and VASscore) were peak reactivity values calculated by subtracting the baseline value from the maximum value within 15-45 minutes after intervention onset (Engert et al., 2013; Van Cauter & Refetoff, 1985). The assumptions for LMs were tested as described above for LMMs.

ΔGMV was the dependent variable in all models. The full model included group and
 peak reactivity of stress measures as well as their interaction and the mean of pre and post-TIV as well as MFD as independent variables. This was compared against a
 null model lacking the peak reactivity of stress measures using an F-test.

613

614 Full model:

615
$$\Delta GMV \sim \beta_0 + \beta_1 (Group \times Peak reactivity) + \beta_2 (Group) +$$

616
$$\beta_3(Peak reactivity) + \beta_4(Cluster) + \beta_5(\underline{MFD}) + \beta_6(\underline{TIV})$$

617

618 Null model:

619 $\Delta GMV \sim \beta_1(Group) + \beta_2(Cluster) + \beta_5(\underline{MFD}) + \beta_6(\underline{TIV})$

620 Results

621 Analysis of neuroimaging data

622 Whole-brain VBM

After guality assessment, the VBM was analysed in 63 participants: 30 in the stress 623 group (TSST) and 33 in the control group (placebo-TSST). The results from the two-624 sample t-test on Agrey matter images (AGM) were investigated using two-sided t-625 contrasts (i.e., control>stress and control<stress). The T contrast for control>stress 626 627 did not yield statistically significant results. The opposite contrast (control<stress) showed a significant (p_{FWE}<0.05) effect in 16 clusters (see Table 1, & Figure 2), 628 629 including cortical midline structures (CMS) and bilateral insula. (The cluster with an extent of 1 voxel was excluded from further analyses). 630

631 The unthresholded results maps can be found at 632 <u>https://www.neurovault.org/collections/SFQXOIUB/</u>.

633 Post-hoc LMMs in VBM clusters

The VBM GM values from the whole-brain analysis result clusters were extracted and the findings were tested in a post-hoc analysis using LMMs. The "global" model confirmed the significant group-by-time interaction effect across all clusters $(X^2(1)=6.12, p=0.0133)$. The three-way interaction group-by-time-by-cluster was not significant (X²(46)=41.64, p=0.6551), showing no evidence for significantly different group-by-time effects between clusters. The three-way interaction was thus removed from the model.

Post-hoc tests revealed a non-significant trend for a GMV decrease in the control group (-1.3%, β_c = -0.004, t/t(2020)= -2.09, p=0.0737) and no significant change in the stress group (+0.8%, β_s = 0.004, t/t(2007)= 1.50, p=0.1331).

In individual "local" models, the full-null-model comparison showed a significant groupby-time interaction effect in all 15 clusters tested (see Table 1 for details). Post-hoc
tests revealed three patterns behind the interaction (Figure 2):

- eight clusters, including the biggest cluster in the anterior cortical midline (Left
 Superior Medial Frontal Gyrus) and the Left Anterior Insula, showed a
 significant GMV decrease in the control group, and no significant change in the
 stress group;
- 651 2) four clusters, including the Right Angular Gyrus and Left Mid-Cingulate Cortex,
 652 showed a significant GMV increase in the stress group and no significant
 653 change in the control group; and
- 654 3) three clusters, including the Right Posterior Insula, showed both a significant
 655 GMV decrease in the control group and a significant GMV increase in the stress
 656 group.
- 657

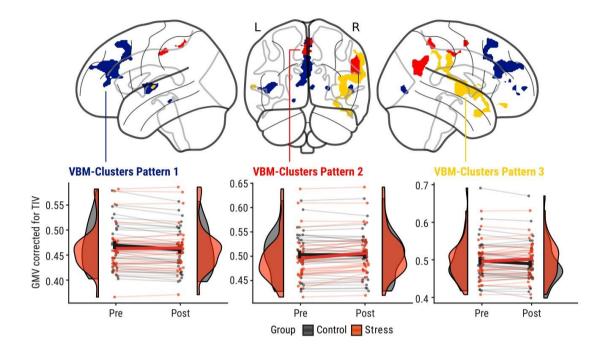
	Hemis- phere	Cluster Name	Cluster Size	р _{ғwе} (TFCE)	x y z	Linear Mixed Model (Holm- Bonferroni- corrected)	Post-Hoc Test (Holm-Bonferroni- corrected)	Estimates [Pattern]
1	L	Superior Medial Frontal Gyrus	2364	0.014	-03 50 30	X ² (1)= 9.1, p=0.0175	$t/t_{c}(66.5) = -4.2,$ p = 0.0002 $t/t_{s}(68.6) = 0.7$ p = 0.4915	$\beta_c = -0.013^*$ $\beta_s = 0.002$ [1]
2	R	(posterior) Insula	2441	0.015	43 -12 04	X ² (1)= 14.3, p=0.0019	$t/t_{c}(66.5) = -3.8,$ p= 0.0007 $t/t_{s}(68.8) = 2.2,$ p= 0.034	β_c =-0.011* β_s = 0.007* [3]
3	L	(anterior) Insula	466	0.027	-40 -08 06	X²(1)= 11.3, p=0.0062	t/t _c (66.5)= - 4.3, p=0.0001 t/t _s (68.3)= 1.0 p= 0.3012	$\beta_c = -0.014^*$ $\beta_s = 0.004$ [1]
4	R	Angular Gyrus	696	0.035	54 -63 28	X²(1)= 15.5, p=0.0011	$t/t_{c}(66.6) = 0.0,$ p= 0.9845 $t/t_{s}(70.8) = 5.6,$ p< 0.0001	$\beta_c = 0.0001$ $\beta_s = 0.038^*$ [2]
5	L	Parahippo campal Gyrus	35	0.038	43 -12 04	X²(1)= 17.4, p=0.0005	$t/t_c(66.5)=$ 4.4, p< 0.0001 $t/t_s(68.7)=$ 0.3, p=0.734	$\beta_c = -0.029^*$ $\beta_s = -0.002$ [1]
6	R	Inferior Occipital Gyrus	118	0.042	52 -80 03	X ² (1)= 12.6, p=0.0042	$t/t_c(66.6) = -3.8,$ p = 0.0006 $t/t_s(71.2) = 1.7,$ p = 0.0919	$\beta_c = -0.029^*$ $\beta_s = 0.015$ [1]
7	L	Mid- Cingulate	160	0.042	-03 -24 46	X²(1)= 8.2, p=0.0214	$t/t_c(66.5)=0.4,$ p= 0.7114	$\beta_c = 0.0001$ $\beta_s = 0.014^*$ [2]

		Cortex					t/t _s (68.5)= 4.4, p= 0.0001	
8	R	Cerebro- Motor- Area	77	0.043	-04 -06 57	X ² (1)= 8.1, p=0.0214	$t/t_{c}(66.8) = -1.5,$ p=0.1307 $t/t_{s}(67.5) = 2.7,$ p=0.0193	$\beta_c = -0.005$ $\beta_s = 0.009^*$ [2]
9	R	Lateral Orbital Gyrus	79	0.045	36 39 -15	X ² (1)= 15.6, p=0.0011	$t/t_{c}(66.5) = -3.3,$ p = 0.0031 $t/t_{s}(69.8) = 2.7,$ p = 0.0091	$\beta_c = -0.020^*$ $\beta_s = 0.019^*$ [3]
10	R	Precuneus	141	0.046	03 -50 57	X ² (1)= 11.8, p=0.0052	$\begin{array}{l} t/t_{c}(66.4)=\ 0.4,\\ p=0.7201\\ t/t_{s}(67.7)=\ 5.2,\\ p<0.0001 \end{array}$	$\beta_c = 0.002$ $\beta_s = 0.026^*$ [2]
11	R	Frontal Pole	52	0.046	24 63 03	X ² (1)= 8.9, p=0.0175	$t/t_{c}(66.4) = -4.8,$ p<0.0001 $t/t_{s}(68.3) = -0.05,$ p= 0.9626	$\beta_c = -0.021^*$ $\beta_s = -0.0002$ [1]
12	R	Superior Medial Frontal Gyrus	44	0.047	06 52 04	X²(1)= 16.6, p=0.0007	$\begin{array}{l} t/t_{c}(67.0) = \ -7.5, \\ p < 0.0001 \\ t/t_{s}(67.4) = \ -0.5, \\ p = \ 0.5824 \end{array}$	$\beta_c = -0.019^*$ $\beta_s = -0.002$ [1]
13	L	Superior Temporal Gyrus	48	0.048	-63 -10 04	X²(1)= 12.4, p=0.0042	$t/t_{c}(66.5) = -2.9,$ p = 0.0088 $t/t_{s}(68.9) = 2.4,$ p = 0.0193	$\beta_c = -0.018^*$ $\beta_s = 0.017^*$ [3]
14		//	1	0.048	51 -46 51	-	-	-
15	R	Middle Frontal Gyrus	22	0.048	45 46 12	X²(1)= 8.1, p=0.0215	$\begin{array}{l} t/t_{c}(66.4)=\ -3.8,\\ p=0.0007\\ t/t_{s}(68.1)=\ 0.6,\\ p=0.5344 \end{array}$	$\beta_c = -0.016^*$ $\beta_s = 0.003$ [1]
16	R	Middle Frontal Gyrus	23	0.050	42 54 -02	X²(1)= 7.8, p=0.0215	t/t _c (66.7)= -3.7, p< 0.0009 t/t _s (71.5)= 0.7, p= 0.5177	$\beta_c = -0.027^*$ $\beta_s = 0.005$ [1]

658

Table 1. Results from VBM analysis and post-hoc linear mixed models (LMMs) on grey matter volume (GMV) in VBM clusters. Depicted are hemisphere, cluster name (derived from CAT12's "neuromorphometrics atlas"), cluster size in voxels, p_{FWE} after threshold-free cluster enhancement (TFCE) correction, coordinates in MNI space (x y z), LMM results, post-hoc-test results, group estimates, and pattern (see Figure 2). The cluster with an extent of 1 voxel was excluded from further analyses. LMM statistical parameters (degrees of freedom (DF), X²

- value, p value) were obtained from a full-null model comparison. Post-hoc results include the
- t-ratio with DF and p value. P<0.05 indicates a significant group-by-time interaction effect.
- 667 N=63 (stress group=30).



668

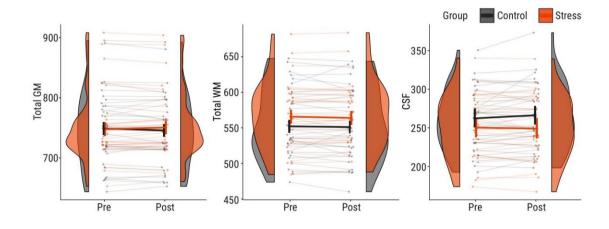
Figure 2. *Top row*: VBM results indicating a significant (p_{FWE}<0.05) group-by-time interaction
effect on GMV, colours indicate three distinguishable patterns: pattern 1 (blue) - control:
decrease, stress: no significant change; pattern 2 (red) - control: no significant change, stress:
increase; pattern 3 (yellow) - control: decrease, stress: increase. *Lower row*: Changes in GMV
group distributions (half violin) with individual changes (points, lines) and group means (central
line with error bars). N=63 (stress group=30).

675 Analysis of total GM, total WM, and CSF

A significant group-by-time interaction effect was found for total GM (X²(1)=6.04, p=0.0140) and CSF (X²(1)=4.7, p=0.0305), while no significant change was found for WM (X²(1)=0.20, p=0.657). Post-hoc tests were not significant for total GM (control: t/t_c(60.3) = -1.96, p=0.1084; stress: t/t_s(62.9) = 1.70, p=0.1084), but qualitatively showed a decrease in the control group (-0.4%, β_c = -0.004) and an increase in the stress group (0.4%, β_s = 0.004). CSF increased significantly in the control group

682 (1.5%, $\beta_c = 3.98$, t/t_c(60.2) = 2.6, p=0.0232) and decreased non-significantly in the 683 stress group (-0.4%, $\beta_s = -1.23$, t/t_s(62.3) = -0.7, p=0.4857).

684



685

Figure 3. Change in total grey matter (GM), total white matter (WM), and total cerebrospainal fluid (CSF) values in the control group (grey) and in the stress group (red). Shown are scans (points) per subject (thin lines) and group distributions (half violin) for pre- and postintervention scans. Bold lines indicate estimated marginal means and 95% confidence intervals obtained from linear mixed models. If data were transformed (log_e) for statistical analysis, the estimates were back-transformed for visualization. N=63 (stress group=30).

692 Additional MR parameters in VBM clusters

693 T1 values

The group-by-time interaction effect found in the VBM data was not significant in the extracted quantitative T1 values (F(1)=0.40, p=0.5297). There was a significant timeby-cluster interaction effect, indicating an increase in T1 values over time (F(14)=9.82, p<0.0001). Post-hoc tests showed this was the case in 7 out of the 15 clusters not including the three biggest clusters in the SMFG and bilateral insula (Table S1, Figure S3). Post-hoc tests and visual inspection of the results (Figure 4) indicated that on average the T1 value increased (~47 ms, ~ 3.4%) with time across groups.

A control analysis (see supplement) showed a T1 increase of similar magnitude (29ms, 2.4%, F(1)=40.36, p<0.0001) in GM voxels outside of the VBM-Clusters. To follow-up on this we compared T1values within GM masks produced at different

thresholds (0.1,0.2,0.3). A significant increase in T1 values was found at thresholds of
0.1 (and 0.2 and 0.3), but not at 0.5 (see Table S2), indicating that this effect was
driven by the outer edges of GM. We investigated whether the definition of GM
boundaries would similarly affect our VBM and found the VBM-results to be robust
against those changes.

709 T1-weighted intensity values

- The group-by-time interaction effect found in the VBM data was not significant in the
- extracted quantitative T1-weighted intensity values ($X^2(1)=3.13$, p=0.99). The main
- effect of time was not significant either (F(1)=2.17, p=0.141, Figure 4), but a significant
- main effect of group (F(1)= 7.3, p= 0.0088) indicated a difference in initial T1weighted
- 714 intensity values that remained constant over time.

715 Cerebral blood flow

- For CBF, there was a non-significant trend for a group-by-time interaction across all included clusters (X²(1)=3.33, p=0.068). Post-hoc tests in both groups separately showed no significant effect in either group. Qualitatively, CBF decreased in the control group (by 1.1 ml/100mg/min ~2.6%, $t/t_c(951) = -1.82$, p(cor) = 0.1383) and increased in the stress group (by 0.4 ml/100mg/min ~1%, $t/t_s(951)=0.775$, p=0.4387), resembling pattern 3 of the VBM results (Figure 4).
- In local post-hoc tests, no CBF changes survived multiple-comparison correction (all $p_{corr} > 0.29$). For more details of the CBF results, see supplement.

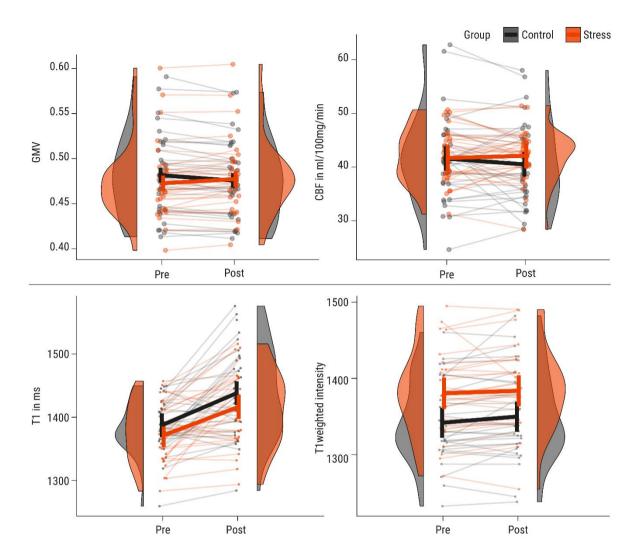


Figure 4: Change in grey matter volume (GMV), cerebral blood flow (CBF), T1, and T1weighted intensity values in the control group (grey) and in the stress group (red). Shown are scans (points) per subject (thin lines) averaged across clusters and group distributions (half violin) for the pre- and post-intervention scan. Bold lines indicate estimated marginal means and 95% confidence intervals obtained from linear mixed models. If data were transformed (log_e or square-root) for statistical analysis, the estimates were back-transformed for visualization.

732 Anatomical ROIs: Amygdala and Hippocampus

724

Comparing the full to the null model showed no significant group-by-time interaction effect on GMV in the left Amygdala ($X^2(1)=0.60$, p=0.4372), right Amygdala ($X^2(1)=0.77$, p=0.3803), left Hippocampus ($X^2(1)=0.13$, p=0.7227), or right Hippocampus ($X^2(1)=0.02$, p=0.8805).

737 Autonomic, endocrine, and subjective stress measures

The TSST induced a robust stress response in autonomic, endocrine, and subjective stress measures, as also shown in previous publications from our study (Reinelt & Uhlig et al., 2019 and Bae & Reinelt et al., 2019). Significant ($p_{corr}<0.05$ with Bonferroni-Holm correction) group-by-time interaction effects were present in all investigated autonomic, endocrine, and subjective markers (Table 2 and Figure 5).

- Post-hoc tests and visualization (Figure 5) show the dynamics of the stress response:
 subjective stress peaked earliest (+5 min) and saliva cortisol latest (+25 min). Heart
 rate was the first parameter to return to baseline (+25 min) while the group difference
- in saliva cortisol remained longest (+90 min).

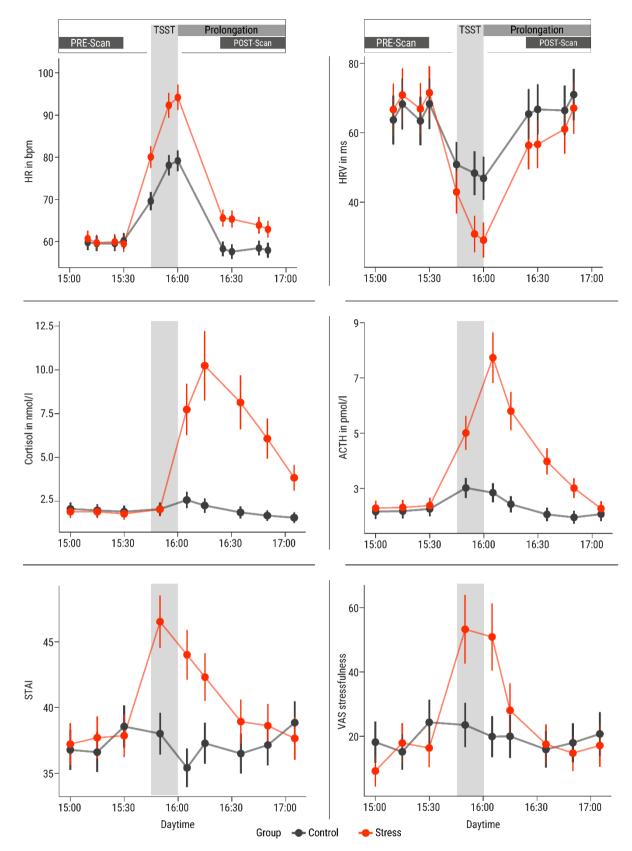
Dependent Variable	N	DF	X ²	р
Saliva cortisol	64	8	309.1	<0.0001
Plasma ACTH	57	8	216.6	<0.0001
Heart rate	60	12	279.3	<0.0001
Heart rate variability	60	11	44.4	<0.0001
State anxiety (STAI)	66	8	89.7	<0.0001
VAS stressfulness	66	8	71.8	<0.0001

747

748

Table 2. Results from linear mixed models on autonomic, endocrine, and subjective stress measures. Statistical parameters were obtained from a full-null-model comparison. Fixed effects: time, group, group-by-time interaction (full model only); Random effects: participant. Depicted are degrees of freedom (DF), the X² and the *p* value from the full-null-model comparison. ACTH = adrenocorticotropic hormone; STAI = State Anxiety Inventory.

754



755

Figure 5: Time courses (x-axis: time of day) of saliva cortisol (nmol/l) and plasma
adrenocorticotropic hormone (ACTH) (pmol/l) concentrations, heart rate (beats per minute)
and heart rate variability (RMSSD in ms) and subjective stress (sum score) measured by state

anxiety (State Anxiety Inventory, STAI) and a visual analogue scale (VAS) of stressfulness. Plotted are the estimated marginal means from the linear mixed models (see above). If data were transformed (log_e or square-root) for statistical analysis, the estimates were backtransformed for visualization. Error bars depict upper and lower 95% confidence intervals for model estimates. Grey: control group, orange: stress group. (Only timepoints between the two anatomical scans are included; for the full time courses and their statistical analysis, see Bae & Reinelt, et al., 2019; Reinelt & Uhlig, et al., 2019.)

- 766 Association of GMV with other stress measures in VBM clusters
- 767 Association of VBM changes with other stress measures

After multiple-comparison correction, no significant association of GMV changes with autonomic (HR and HRV), endocrine (saliva cortisol and plasma ACTH), and subjective (STAI score and VAS-score) stress measures was found in any cluster in the LMM analysis (see Supplement for details).

- 772 Association of ΔVBM with peak reactivity of other stress measures
- *Endocrine stress measures:* In the full-null-model comparison, there was no significant
- effect of saliva cortisol (F(2)=0.63,p_{corr}=1) or plasma ACTH peak reactivity (F(2)=2.03, $p_{corr}=0.1321$) on Δ GMV (Figure S5).
- 776Autonomic stress measures: In the full-null-model comparison, there was no777significant effect of HR peak reactivity (F(2)=3.51, p_{corr} =0.2736, Figure S5) on ΔGMV.778HRV peak reactivity (F(2)=6.24, p_{corr} =0.0224) was significantly associated with ΔGMV.
- Post-hoc tests showed no significant interaction effect for group (t/t(827)= -1.59,
- p=0.1107), but a negative association between HRV peak reactivity and Δ GMV both

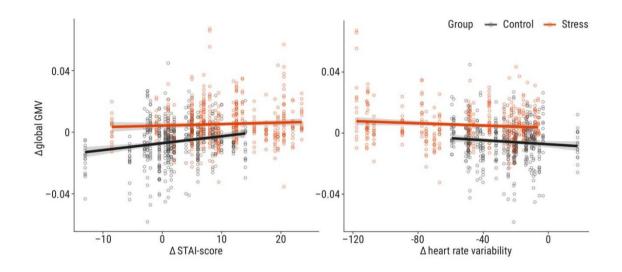
in the stress (β_s = -0.0000327) and the control group (β_c =-0.0000885).

- In both groups, the participants who showed more pronounced HRV decreases also
 showed stronger GMV increases (or weaker GMV decreases, Figure 6).
- 784

Subjective stress measures: In the full-null-model comparison, there was a significant

- effect of STAI score peak reactivity on Δ GMV (F(2)=7.586, p_{corr}=0.0065). Post-hoc
- tests showed a significant interaction effect with group (t/t(987)=2.335, p=0.0197) and
- a positive association between STAI score peak reactivity and Δ GMV both in the stress

- (β_s =0.0000902) and the control group (β_c =0.0003895). In both groups, the participants who showed more pronounced STAI score increases also showed stronger GMV increases (or weaker GMV decreases, Figure 6).
- 792 In the full-null-model comparison, there was no significant effect of VAS stressfulness
- peak reactivity of Δ GMV (F(2)=3.879,p_{corr}=0.1894,Table S6, Figure S5).



794

Figure 6: Association of Δ grey matter volume (GMV; post-pre) with peak reactivity of stress measures. Shown are significant associations from linear models (LMs): state anxiety (State Anxiety Inventory, STAI; positive association) and heart rate variability (RMSSD; negative association). The LMs revealed no significant association with saliva cortisol, ACTH, heart rate and subjective stressfulness (Figure S5). Line indicates slope and standard error. Points indicate GMV values per voxel-based morphometry (VBM) cluster and subject, each subject is represented in one column of points. Grey: control group, orange: stress group.

802 Discussion

Using voxel-based morphometry, we found rapid volumetric brain changes that differed between groups over time in 15 clusters, mainly along the cortical midline and in bilateral insula. We identified three patterns of GMV changes across the clusters: the stress group showed a GMV increase (patterns 2 and 3) or no change (pattern 1) while the control group showed a GMV decrease (patterns 1 and 3) or no change (pattern 2). Our stress intervention induced a pronounced stress response on the autonomic, endocrine, and subjective levels. Changes in GMV were related to peak reactivity in subjective stress and heart rate variability but not in heart rate, salivacortisol, plasma ACTH, or subjective stressfulness.

812 To explore the microstructural and physiological basis of these findings, we also 813 analyzed quantitative T1 and CBF imaging parameters. The significant group 814 difference over time was not present in T1 or T1-weighted intensity values. In T1 815 values, a significant increase over time across groups occurred, which post-hoc tests showed to be significant in half of the clusters. In addition, no changes in CBF survived 816 817 multiple-comparison correction, while - qualitatively - CBF changed similarly to pattern 1 of GMV changes (decrease in the control group, no change in the stress group). 818 Thus, the stress-related brain changes are reflected in local GMV increases relative 819 820 to the control group. In clusters with no significant GMV change, the increase may be 821 masked by the GMV decrease observed in the control group. We did not observe the 822 hypothesized GMV changes in hippocampus and amygdala.

In summary, we found that the dynamics of rapid volumetric brain changes differed between groups, suggesting that endogenous circadian brain changes (GMV decrease) are counteracted by acute stress.

826

827 In our study, the two anatomical scans were separated by approximately 2.5 hours, from early to late afternoon. Total GMV has previously been shown to linearly 828 829 decrease by ~1% from morning to afternoon (Karch et al., 2019). Circadian changes 830 in total GMV can be accompanied by regional GMV changes, for example, in the MPFC and precuneus (Trefler et al., 2016). Thus, the local GMV decrease in the 831 832 control group may correspond to endogenous circadian changes, which was absent 833 in the stress group. Exogeneous behavioural interventions have been shown to 834 attenuate endogenous daytime effects on GMV (Trefler et al., 2016; Thomas et al., 2016) and so may a stressful intervention like the TSST. 835

In a follow-up analysis, total GM and CSF changed significantly in the control group (Figure 3): Total GM decreased, while CSF increased from early to late afternoon, following the pattern of circadian rhythm-related GMV changes reported in Trefler et al. (2016). In the stress group, total GM and CSF changed significantly in the opposite direction compared to the control group: GM increased and CSF decreased. Total white matter did not change significantly in both groups. We thus speculate that processes related to the circadian rhythm (i.e., supporting diurnal brain homeostasis;
Trefler et al. 2016) are involved in the changes in our control group, while in the stress
group, the behavioural intervention counteracts these processes.

Furthermore, VBM measures of GM have been shown to be affected by hydration status, also suggesting an impact of fluid homeostasis (Streitbürger et al., 2012). While we minimized variability of food and fluid intake by providing a standardized lunch, we cannot exclude the possibility of hydration differences in our study. On the other hand, dehydration mainly affects areas close to the ventricles rather than cingulate and insular cortices (Streitbürger et al., 2012).

In summary, GMV decreases in the control group may reflect circadian changes (e.g., in fluid homeostasis associated with astrocyte swelling or shrinkage). In the stress group, such processes may be counteracted by processes regulating energy demand following neuronal activation in response to the stressful intervention. This increased energy demand following brain activity under stress may also be reflected in increased CBF, which has been shown to affect VBM measures of GMV (Ge et al., 2017).

857

The rapidness of brain changes we detected with structural MR imaging methods 858 859 raises the question of their physiological origins. Mouse studies have connected VBM changes to altered dendritic spine density: Aversive, stressful stimulation, like auditory 860 861 fear conditioning (Keifer et al., 2015) or restraint (Kassem et al., 2013) led to volumetric 862 changes, measured with volumetric MRI (Kassem et al., 2013) or VBM (Keifer et al., 863 2015), which were correlated with spike density changes in functionally relevant 864 regions, such as amygdala and insula (Keifer et al., 2015) as well as ACC (Kassem et 865 al., 2013). While synaptic and dendritic plasticity may be detectable after minutes to 866 hours, given their size is on the scale of nm to um, both are unlikely to introduce 867 changes detectable with a 1.5-mm voxel size (Johansen-Berg et al., 2012). Changes 868 to dendritic morphology may rather be accompanied by migration or swelling of capillaries and glia in order to compensate for heightened energy demand resulting in 869 870 increased tissue volume, which manifests itself as GMV changes detected by VBM 871 (Lövdén et al., 2013). Following the supply-demand model, changes in brain function 872 may thereby precede changes in brain structure (Lövdén et al., 2013).

873 Astrocytes are prominent candidates for targeting cellular structures in brain plasticity. These non-myelinating glia cells are involved in neuronal metabolism and fluid 874 homeostasis, and they can mediate the excitability of neurons (Shao & McCarthy, 875 1994). Activation may cause astrocytes to swell within seconds or minutes, leading to 876 877 a general shift from extra- to intracellular space and affecting MRI measures 878 (Johansen-Berg et al., 2012). Astrocytes also express corticosteroid receptors (Bohn 879 et al., 1991), and their structure and function can be affected by chronic (Tynan et al., 880 2013) as well as acute stress (Braun et al., 2009). Stress-induced astrocyte plasticity 881 has also been linked to stress-related psychiatric diseases (for a review, see Bender 882 et al., 2016).

Thus, the observed GMV changes may fully or partly reflect (transient) local tissue (e.g., glial) changes and/or vascular changes to accommodate changes in energy demand following neural activity. These alterations, which are present more than an hour after the stress episode, may also be related to the induction of – potentially longterm - morphological changes.

888

889 Consistent with the overall GMV decrease in the control group, we find decreased CBF 890 in that group across all clusters (although not statistically significant). In two VBM 891 clusters, we also found CBF increases in the stress group, which, however, also did 892 not survive multiple-comparison correction. Qualitatively, CBF was increased in the 893 left and right SMFG of the stress group, whereas there was no significant effect in the control group. CBF increases have previously been shown (using ASL) during an in-894 scanner stressor, for example in the right PFC, ACC, insula, and putamen (Wang et 895 896 al., 2005). Many brain vessels are located along the medial wall, including the middle 897 cerebral artery, but also the insula displays a particularly high density of vessels, 898 including the anterior cerebral artery (Mouches & Forkert, 2019). Thus, our main VBM 899 clusters (bilateral SMFG and insula) are in the vicinity of major vessels. During stress-900 induced physiological activity, changes in blood parameters (e.g., blood flow) and 901 vasodilation could influence the VBM analysis. Changes in CBF have been shown to 902 closely overlap spatially with changes in VBM (Franklin et al, 2013). However, we did not find significant CBF changes in the two SMFG clusters. One reason may be the 903 904 limited sensitivity of the pASL analysis due to the relatively low resolution, the time 905 delay to the intervention (~90 min) or limited spatial coverage (Figure S1). On the other

906 hand, previous studies have shown overlapping but incongruent patterns of CBF and 907 VBM changes (Ge et al., 2017, Franklin et al., 2013), which may indicate that other processes, such as changes in brain metabolites in response to functional activation, 908 909 may affect the T1-weighted signal and thus contribute to apparent GMV changes 910 measured with VBM (Ge et al., 2017). In line with that, changes in blood oxygenation 911 after a breathing intervention (with an increased CO₂-concentration) affected the 912 estimation of GMV and decreased longitudinal relaxation rate T1 in GM (Tardif et al., 913 2017). It has been proposed that an intervention-induced increase in oxygen-demand 914 in specific brain areas may similarly affect estimations of GMV through changes in CBF and tissue oxygenation (Tardif et al., 2017). In our study, T1 values showed a 915 916 significant increase over time in both groups and seven clusters but no significant 917 group difference, that is, the VBM interaction was not mirrored in T1 values. This increase in T1 values was not limited to the VBM clusters but occurred in all GM. With 918 919 an increasing threshold of GM definition (probability of this voxel being in GM), the 920 magnitude of this main effect of time decreased (0.1: 29 ms, 0.2: 24 ms, 0.3: 20 ms) 921 and was not significant at a threshold of 0.5 (2 ms). This indicates that the T1 increase 922 was stronger near the tissue boundaries of GM and CSF. Likewise, VBM clusters with 923 a significant increase in T1 were often located in frontal and parietal areas (Figure S3). 924 Since T1 is strongly related to water content of tissue (Mathur-De Vré 1984), this could 925 suggest an inflow of CSF, which was supported by a significant increase in total CSF 926 volume in the control group, but not in the stress group. The T1-weighted intensity 927 values did not show any significant changes.

928

929 Functionally, the main clusters of stress related VBM changes in cortical midline 930 structures (CMS) and bilateral insula can be related to the processing of 931 emotional/stressful and self-relevant information.

The biggest cluster extended from the superior medial frontal cortex to the anterior cingulate cortex. Functionally, the medial frontal cortex has been involved in emotion processing (Etkin et al., 2011) and in the regulation of the physiological and behavioural stress response (McKlveen et al., 2015). It also has a high density of glucocorticoid receptors, which are central to the negative feedback mechanism of the HPA axis (Buchanan et al., 2010). Yet, we found no significant association of GMV with endocrine stress measures.

35

939 A significant association was found with the subjective and autonomic stress measures of state anxiety (STAI) and HRV, respectively. Decreased HRV correlated 940 941 inversely with GMV changes in both groups, suggesting that control participants 942 whose parasympathetic activity changed similarly to participants in the stress group 943 showed less decrease in GMV than other control participants. In parallel, higher state 944 anxiety was associated with less GMV decrease in both groups, but even stronger in 945 the control group. These results indicate that parasympathetic deactivation and state 946 anxiety, which can result from psychological stress, are linearly associated with GMV 947 changes, and counteract the GMV decrease. In general, CMS - especially anterior ones – have been associated with self-relatedness and self-relevance (for a review, 948 949 see Northoff & Bermpohl, 2004), a feature of any stressor and particularly of the TSST, 950 in which participants "apply" for their individual dream jobs. Although participants knew 951 the job interview was not real, they showed pronounced stress responses. Negative 952 self-relevant stimuli and psychosocial stress have been shown to increase activity in 953 CMS (e.g., MPFC; Lemogne et al., 2011) as well as connectivity between the 954 amygdala and CMS (Veer et al., 2011), respectively.

955 In our study, two major clusters of stress related GMV changes showed peaks in the 956 left anterior insula and the right posterior insula. The insula has been understood as 957 primary viscerosensory or interoceptive cortex with a posterior-to-anterior gradient 958 (Craig, 2002): pain, temperature, and other homeostatically relevant bodily stimuli 959 enter the posterior insula before they are integrated with other (e.g., exteroceptive) 960 information and evaluated in the anterior insula, influencing subjective experience and 961 guiding behavior (Craig, 2002). The insula is also highly connected and often co-active with frontal CMS (e.g., MPFC and ACC), where the strongest cluster of stress-related 962 GMV changes was found in our study, and they constitute a central axis of the salience 963 964 network, which processes homeostatically relevant stimuli (Seeley, 2019). The 965 integrative, multisensory function of the insula is also supported by animal studies showing, for example, that the posterior insula can shift behavioural strategies upon 966 967 the detection of aversive or stressful interoceptive states (Gehrlach et al., 2019).

968 While we did not investigate functional activation in the current analysis, we have 969 previously shown increased connectivity to the thalamus in response to stress (Reinelt 970 & Uhlig et al., 2019) and it is likely that increased brain activity and/or CBF in relevant 971 areas follow our stress intervention. Indeed, we find a (non-significant) increase from

972 pre- to post- intervention in CBF in the bilateral SMFG of the stress but not the control973 group.

974 In contrast to our hypothesis, we did not find significant GMV changes in hippocampus 975 and amygdala. In animal models of acute stress (Kassem et al., 2013, Chakraborty et 976 al. 2020) and in stress-related mental disorders in humans (Chen et al., 2006; Karl et 977 al., 2006) stress-induced brain changes in hippocampus and amygdala are found. At 978 sub-clinical levels of chronic stress however, some studies did find changes in GMV 979 (Dedovic et al., 2010; Savic, 2015; Suffren et al., 2021; Spalletta et al., 2014, but others 980 did not: GMV reductions associated with stressful life events were, for example, found 981 in the ACC, hippocampus, and parahippocampal gyrus, but not in the amygdala 982 (Papagni et al., 2011) as well as in the MPFC and right insula, but not in the 983 hippocampus or amygdala (Ansell et al., 2012). Possibly, GMV alterations in 984 hippocampus and amygdala may be related to pathophysiological processes in the 985 context of chronic or severe stress (Ansell et al., 2012) rather than the brain response 986 to acute stress.

987 Limitations

There are several limitations to our study. VBM (and MRI in general) can be 988 989 considered a physiologically coarse method, and, despite several candidate 990 processes (discussed above), the physiological origin of GMV (MRI) changes remains 991 unclear. VBM has also been criticized for introducing bias and neglecting non-linear 992 effects, which are more pronounced when comparing heterogeneous groups 993 (Bookstein, 2001; Davatzikos, 2004). By comparing two (randomly assigned) groups 994 from a homogenous sample in our study, we expected to minimize potential biases. 995 The inclusion of young, healthy, male participants allowed us to investigate stress-996 induced changes using a multimodal approach without confounds like the impact of 997 the ovarian cycle. However, the generalisability of our results remains to be tested in 998 studies with more heterogeneous samples. The significant group-by-time interaction 999 effect on GMV suggests that the differences are intervention-induced. While we kept 1000 the procedure as similar as possible between groups, we extended the TSST stressor 1001 by telling participants in the stress but not the control group there would be another 1002 task. Thus, it is possible that not the TSST alone but the prolongation of the stressor 1003 (or stress-related vigilance) in the stress group accounts for the group difference in

1004 GMV. Furthermore, a higher temporal resolution would add information about the trajectory of changes and about possible immediate transient changes and the stability 1005 of changes we observed in the stress and in the control group. Head motion is a major 1006 neuroimaging confound (Beyer et al., 2020.), and it can decrease measures of GMV 1007 (Reuter et al., 2015). We aimed to physically minimize head motion during data 1008 1009 acquisition and included the realignment / motion parameter MFD from the preceding 1010 resting-state scans as a proxy covariate in the VBM analyses. Head motion 1011 parameters (e.g., using gyrometry or video-based measures) from the actual 1012 MP2RAGE scan could be acquired using additional hardware.

1013 Conclusion

We find rapid differential brain changes following a psychosocial stress intervention 1014 1015 versus a placebo version of that task. Brain changes are observed in areas associated 1016 with the processing of emotional and self-relevant information, but also with regulating 1017 HPA axis activity and sympathetic arousal. Stressed participants additionally show (non-significantly) increased cerebral blood flow in prefrontal areas. Neither changes 1018 1019 in CBF nor in T1 or T1-weighted intensity values account for the observed group differences over time. Our findings of rapid GMV changes following acute psychosocial 1020 1021 stress detected with MRI in humans emphasize the influence of stress on the brain, suggesting that diurnal mechanisms of brain homeostasis are perturbed by acute 1022 1023 stress.

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- 1027 Conflict of Interest
- 1028 We have no conflicts of interest to declare.
- 1029 Data availability
- 1030 The data that support the findings of this study are openly available in

1031 <u>https://osf.io/vjyan/?view_only=c5873b39b3234453a625575192361057</u>. In

- 1032 agreement with participant consent, this includes only derived data, which cannot be
- 1033 used to identify individual participants. The code to reproduce the analysis can be
- 1034 found on <u>https://gitlab.gwdg.de/necos/vbm.git</u>.

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