Progressive brain structural abnormality in depression assessed with MR imaging by using causal network analysis

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Abstract

Background. As a neuroprogressive illness, depression is accompanied by brain structural abnormality that extends to many brain regions. However, the progressive structural alteration pattern remains unknown.

Methods. To elaborate the progressive structural alteration of depression according to illness duration, we recruited 195 never-treated first-episode patients with depression and 130 healthy controls (HCs) undergoing T1-weighted MRI scans. Voxel-based morphometry method was adopted to measure gray matter volume (GMV) for each participant. Patients were first divided into three stages according to the length of illness duration, then we explored stage-specific GMV alterations and the causal effect relationship between them using causal structural covariance network (CaSCN) analysis.

Results. Overall, patients with depression presented stage-specific GMV alterations compared with HCs. Regions including the hippocampus, the thalamus and the ventral medial prefrontal cortex (vmPFC) presented GMV alteration at onset of illness. Then as the illness advanced, others regions began to present GMV alterations. These results suggested that GMV alteration originated from the hippocampus, the thalamus and vmPFC then expanded to other brain regions. The results of CaSCN analysis revealed that the hippocampus and the vmPFC corporately exerted causal effect on regions such as nucleus accumbens, the precuneus and the cerebellum. In addition, GMV alteration in the hippocampus was also potentially causally related to that in the dorsolateral frontal gyrus.

Conclusions. Consistent with the neuroprogressive hypothesis, our results reveal progressive morphological alteration originating from the vmPFC and the hippocampus and further elucidate possible details about disease progression of depression.

Introduction

As one of the leading causes of disability worldwide (Murray et al. 2012), depression affects approximately 350 million people each year (Schmaal et al. 2017). Although the neurological substrates of depression are investigated by intensive research studies, the understanding of the pathophysiological mechanism underlying depression remains unclear. As development magnetic resonance imaging (MRI) methods, evidences from structural MRI have consistently pointed to the conclusion that (para-) limbic circuits including dorsomedial prefrontal cortex, orbitofrontal cortex and rostral anterior cingulate cortex (ACC) and the hippocampus presenting structural alteration are involved in the pathophysiological mechanism of depression (Bora, Fornito, Pantelis, & Yücel, 2012; Kempton et al. 2011; Schmaal et al. 2016). However, these findings are not consistent due to various clinical characteristics such as medicine, recurrence status (first *v.* recurrent episode), age of onset, especially for illness duration which is thought to be one of the important potential confounders leading to inconsistent findings in

depression (Chen et al. 2016b). Evidences suggest that depression is a neuroprogressive illness (Morris et al. 2019; Verduijn et al. 2015) and gray matter volumes (GMVs) are differently altered at different stages according to the length of illness duration (Bora et al. 2012; Serra-Blasco et al. 2013). However, the details about the progressive brain structural alterations as illness advances are still unknown in depression.

Evidences coming from biochemical to brain structural morphological studies convergently indicate that depression is a neuroprogressive illness. Even patients with depression suffering from only one depressive episode also display characteristics of a progressive illness (Moylan, Maes, Wray, & Berk, 2013). Depressive episodes cause brain tissue damage and physiological functioning through a variety of mechanisms underpinning symptomatology and functional decline over time probably resulted from toxic or adaptive effects produced during depressive episodes (Moylan et al. 2013). Patients with longer and more frequent depressive episodes appear to be associated with increased vulnerability to further relapses and functional decline such as increased memory decline and dementia risk (Gorwood, Corruble, Falissard, & Goodwin, 2008; Kessing & Andersen, 2004). This conclusion is supported from evidences from clinical, biochemical and neuroimaging studies (Moylan et al. 2013; Ruiz, Del Ángel, Olguín, & Silva, 2018; Verduijn et al. 2015). In structural neuroimaging studies, gray matter alterations of some crucial regions are found depending on the stage of depression (Alexander-Bloch, Giedd, & Bullmore, 2013; Frodl et al. 2003; van Eijndhoven et al. 2009) and structural changes inconsistently found during the first episode appear more commonly in severe protracted illness (Lorenzetti, Allen, Fornito, & Yücel, 2009). One of the most representative brain regions is the hippocampus whose structural alteration is inconsistently found in first-episode patients (Caetano et al. 2004; Campbell, Marriott, Nahmias, & MacQueen, 2004; Eker & Gonul, 2010; Malykhin, Carter, Seres, & Coupland, 2010; McKinnon, Yucel, Nazarov, & MacQueen, 2009) but consistently presents in patients with longer illness duration or more frequent episode (McKinnon et al. 2009). Moreover, a relationship between the hippocampal volume decline and longer cumulative illness duration has been described (Sheline, Gado, & Kraemer, 2003). The same goes for gray matter alterations in rostral ACC and dorsomedial frontal cortex supported from longitudinal work (Frodl et al. 2008). Even though many studies attempt to find correlation between illness progression information (such as illness duration) and morphometric alteration (Chen et al. 2016a; McKinnon et al. 2009), the progressive structural alteration pattern and details about how initial structural alterations extend to other brain regions remain unknown in depression. Exploring initial structural alterations and the causality between these regions is of great significance for revealing neuroprocessive pathogenesis of depression.

A newly proposed method named causal structural covariance network (CaSCN) analysis (Zhang et al. 2017) to elucidate the causal relationships of brain structural alterations as illness advances. This method is inspired by Granger causality (GC) analysis commonly used in functional MRI data delineating information flow between time series of two brain regions (Jiang et al. 2018) and conducted by applying the signed path coefficient GC analysis to structural images. In the method, structural images of patients are sequenced in ascending order of illness duration and treated as pseudo-time series describing progressive property of disease (Zhang et al. 2017). With the help of the CaSCN researchers find original GMV reduction in the hippocampus

and the thalamus expert causal effects on prefrontal cortex and other brain regions in epilepsy (Zhang et al. 2017), important role of the thalamus and frontal lobe in the progression of schizophrenia (Jiang et al. 2018) and progressive pathway originally decreased GMV in the subgenual anterior cortex then propagating to other brain regions such as ventromedial prefrontal cortex and insula in generalized anxiety disorder (Chen et al. 2020). However, the progressive morphological alterations as illness advances and the causal relationship between these structural alterations remain unclear in depression.

In this study, we aimed to investigate GMV alterations at each stage according to illness duration and explore how did initial structural alterations expand to other regions. One hundred ninety-five never-treated first-episode patients with depression and 130 healthy controls (HCs) undergoing T1-weighted MRI scans were included in this study where GMV was quantified using voxel-based morphometry (VBM). We first explored GMV alterations at different stages to assess the gradual changing pattern in depression. This procedure was done to clarify initial and stage-specific structural alterations in depression. Then, regions with GMV alterations at the first stage were treated as seeds for the following CaSCN analysis. This analysis would illustrate how initial alterations spread to other brain regions in depression.

Methods

Participants

Patients with depression were recruited from out-patient/inpatient services of Department of Psychiatry, the First Affiliated Hospital of Zhengzhou University, Zhengzhou, China. One chief physician and one well-trained psychiatrist diagnosed patients according to Diagnostic and Statistical Manual of Mental Disorders, Fourth Edition (DSM-IV) for depression. Inclusion criteria for patients included: (a) First episode and never taking any antidepressants/antipsychotics and any other antidepressant treatment such as psychological therapy and electric shock treatment; (b) No comorbidity of other mental/psychotic disorders; (c) Did not have previous episodes of manic symptoms. All patients were Han Chinese and right handedness. The severity of depression was evaluated using the 24/17-items Hamilton Depression scale (HAMD).

HCs were recruited from the community through poster advertisement. None of them presented a history of serious medical or neuropsychiatric illness or a family history of major psychiatric or neurological illness in their first-degree relatives. All HCs were Han Chinese and right handedness.

In addition, participants (both HCs and patients) in the current study would be excluded it they meet one of the following exclusion criteria: (1) Taking drugs such as anesthesia, sleeping and analgesia in the past 1 month. (2) Substance abuse; (3) A history of brain tumor, trauma, surgery, or other organic body disease; (4) Suffering from cardiovascular diseases, diabetes, hypertension; (5) Contraindications for MRI scanning including fixed dentures, metal braces, artificial heart valves and other metal foreign bodies in the body. (6) Other structural brain abnormalities revealed by MRI scan.

Written informed consents were obtained from all participants before experiment. The study was approved by the research ethical committee of the First Affiliated Hospital of Zhengzhou University.

Data acquisition

T1-weighted anatomical images of participants in dataset 1 were acquired using on 3-Tesla GE Discovery MR750 scanner (General Electric, Fairfield Connecticut, USA). Using an eight-channel prototype quadrature birdcage head coil, we acquired structural T1-weighted images with 3D spoiled gradient echo scan sequence: Repetition time = 8164 ms, echo time = 3.18 ms, inversion time = 900 ms, flip angle = 7 degrees, resolution matrix = 256×256, slices = 188, thickness = 1.0 mm, and voxel size = $1 \times 1 \times 1$ mm^3.

Voxel-based morphometry analysis

All T1 images were processed with stand pipeline steps in the CAT12 toolbox (http://dbm.neuro.uni-jena.de/cat12/). The artifacts of images were checked and the origins of the images were adjusted to the anterior commissure. Images were normalized to Montreal Neurologic Institute space and segmented into gray matter, white matter and cerebrospinal areas. Then images were resampled to a volume image resolution of $1.5 \times 1.5 \times 1.5$ mm^3. Finally, the gray matter maps were smoothed using 6 mm full-width at half-maximum Gaussian kernel (FWHM). The total intracranial volume (TIV) of each participant was also calculated for the next comparative analysis.

Overall and stage-specific GMV alteration in depression

First, two sample *t* test was employed to examine overall GMV aberrance and stage-specific GMV aberrance in depression. Overall GMV aberrance was obtained by comparing GMV of all patients with depression with that in matched HCs. Stage-specific GMV aberrance was obtained by subgroup of patients with depression according to illness duration with that in matched HCs. As there was no acknowledged strategy dividing patients into subgroups, we arbitrarily divided patients into three stages (stage 1: <12 months; stage 2: 12–24 months; stage 3: > = 24 months) according to illness duration distribution of patients in the current study. At each stage, the GMV maps in patients were compared with that in HCs matched for gender, age and education level using two sample *t* test. Moreover, to explore whether aberrance of GMV occurred at illness onset, we also explored altered GMVs in patients with shorter illness duration (<3/6 months). In this procedure, age, gender and educational level were treated as covariates. Because we had used nonlinearly modulated gray matter maps in the preprocessing, the voxel values were already corrected for individual brain sizes. As done in previous study, we did not include total brain volume as an additional covariate (Bludau et al. 2016).

Results reported were corrected for multiple comparison (voxel-wise $p < 0.005$, cluster-level $p < 0.05$; Gaussian random field (GRF) corrected). The mean GMVs of each peak coordinate of statistical results with spherical radius of 4 mm were extracted at each stage/across stages (for overall aberrance) for the following steps. We also compared the TIV of patients with that of HCs at each stage and across stages to explore whether TIV was altered in patients with depression.

Association between GMV alteration and clinical characteristics

Then, we explored correlation between clinical characteristics such as gender, age of onset with the GMV alteration in depression. Specially, to explore the effect of gender on the GMV alteration, we divided patients into male and female groups. Peak coordinates of GMV alteration were identified in previous steps. The mean GMVs of each peak coordinate with spherical radius of 6 mm were calculated and compared between female and male patients. As for the age of onset, because the number of patients whose age of onset were older than 21/25 years, the critical age for distinguishing between adolescent onset patients and adult onset patients in depression (Penttilä et al. 2009; Truong et al. 2013), was only 33/15, we just calculated the Pearson correlation between the mean GMVs and age of onset in patients. In addition, the Pearson correlation between the mean GMVs and illness duration was also calculated. Note the aforementioned steps (statistical and correlation analysis) were done at each stage and across all stages.

Seed-based CaSCN analysis

The CsSCN was performed as done in the previous studies (Jiang et al. 2018; Zhang et al. 2017), the GMV data of all patients were first ranked in ascending order of illness duration. The data sequencing of GMV was granted as time-series information for characterizing the progressive property of depression. Then, seed-based CsSCN similar to signed-path coefficient GC analysis applied in functional MRI data analysis was constructed. The seed regions were selected from VBM analysis at the beginning of the illness (illness duration <3 months). The signed-path coefficient GC analysis implemented in REST (http://www.restfmri.net) was done to measure directed influences between GMV alteration of the seed regions on that of other voxels in gray matter or the other way around. The positive GC value indicated the same GMV alteration in the voxels lagged behind the seed region or driven by the seed region while the negative GC value denoted an opposite alteration lagged behind the seed region implying a compensatory effect (Jiang et al. 2018; Zhang et al. 2017). Age and gender were treated as covariates in conducting CsSCN analysis. Based on the presumption that the GMV alteration was the origination of pathological alteration of brain structures in depression, we only adopted GC value of the seed region on the other voxels in gray matter (Zhang et al. 2017). The GC maps were further transformed into a z score and the results were corrected with Bonferroni correction (where voxel $p < 0.05$ and corresponding $Z > 5.3$).

Results

Clinical demographics

The clinical demographics were presented in online Supplementary Table S1. To exclude the effects of covariates such as age and gender on the comparative results, GMV alteration was determined by comparing GMVs between patients at different stages with that in age-, gender-, education level-matched HCs. The clinical demographics of patients at different stages and matched HCs were in online Supplementary Table S2.

Overall GMV alterations in depression

Overall, patients with depression presented decreased GMVs in the bilateral hippocampus extending to the thalamus and cerebellum while increased GMVs in regions including the medial frontal gyrus parahippocampa gyrus, amygdala, ventral portions

of the ventral medial prefrontal cortex (vmPFC) and the right pre-cuneus. The results reported were corrected for multiple comparison (voxel-wise $p < 0.005$, cluster-level $p < 0.05$; GRF corrected) (Fig. 1 and online Supplementary Table S3).

Different GMV alterations at different stages in depression

Whereafter, we investigated gradual structural alterations at different stages according to illness duration in depression. Patients with depression were divided into three stages (stage 1: 0–12 months; stage 2: 12–24 months; stage 3: > = 24 months) according to illness duration. By comparing GMVs in patients with that in matched HCs, we found stage-specific structural alteration in depression. Specifically, patients presented decreased GMVs in the bilateral hippocampus extending to the thalamus and cerebellum, while increased GMVs in the sgACC/vmPFC at the first stage (< 12 months). At the second stage, GMVs of the thalamus were found decreased while that in regions such as right insula extending to the right amygdala and the right putamen, orbital frontal gyrus and dorsal medial frontal gyrus extending to ACC were found increased in patients with depression. At the third stage, patients presented overall decreased GMV in regions including the thalamus, the hippocampus and the cerebellum (Fig. 2, online Supplementary Table S4). Considering that whether structural alterations in critical regions such as medial frontal gyrus, the hippocampus and the amygdala occurred at the onset of illness was still controversial, we also investigated GMV alteration in patients shorter illness duration (<3/6 months) (Belleau, Treadway, & Pizzagalli, 2019; Bremner et al. 2000; Mervaala et al. 2000; Sheline, Gado, & Price, 1998; Treadway et al. 2015). As a result, GMV reduction was found in the hippocampus and the thalamus and GMV elevation in the sgACC/vmPFC were found in patients with illness less than 3 months. Additional GMV reduction in the cerebellum was found in patients with illness less than 6 months (Fig. 3 and online Supplementary Table S5). We did not observe significant difference of TIV between patients and HCs at each stage and across stages.

Association with clinical characteristics

To explore the effect of gender on the GMV alteration, we compared mean GMVs of each peak coordinate with spherical radius of 4 mm between female and male patients using two sample t test at each stage and across stages. There was no significant difference in GMVs between male and female patients with depression. Then, we explored the Pearson correlation between the mean GMVs of each peak coordinate with spherical radius of 4 mm and illness duration/age of onset at each stage and across stages. Overall, the mean GMVs of the thalamus was significantly correlated with age of onset ($R = -0.208$, $p = 0.004$) and the mean GMVs of the vmPFC was correlated with illness duration ($R = -0.188$, $p = 0.008$) across stage. At the first stage, the mean GMVs of left hippocampus was correlated with illness duration ($R = -0.271$, $p = 0.011$) (online Supplementary Fig. S1).

Causal effects of GMV alteration pattern in depression

To map the causal effects of progressive GMV alteration in patients with depression, the CsSCN was constructed with seminal structural alterations at the onset of the illness (illness duration <3 months). The bilateral hippocampus (MNI: 30, −35, 9 for the right, −32, −33, −9 for the left) and the sgACC/vmPFC (MNI: −2, 18, −12) were selected as seeds for CsSCN analysis.

The positive/negative GC values represented same/opposite GMV alterations in the regions occurring behind the seed region (Jiang et al. 2018; Zhang et al. 2017). As a result, the sgACC/vmPFC presented positive GC values on the bilateral nucleus accumbens (NAc), the right ACC, the inferior frontal gyrus and the cerebellum and while negative GC values on the left precuneus extending to the calcarine, and the left rolandic operculum (Fig. 4, online Supplementary Table S6). Positive GC values were found from the left hippocampus to the right precuneus extending to calcarine, the bilateral NAc and the bilateral middle occipital gyrus and negative GC values to the left inferior parietal lobe and right inferior frontal gyrus (Fig. 4). As for the right hippocampus, only positive GC values were found in the bilateral dorsolateral frontal gyrus (DLPFC), right ACC, bilateral precuneus and the cerebellum (Fig. 4). The summary of the CsSCN analysis was presented in Fig. 5, the GC values were included in online Supplementary Table S7.

Discussion

In this study, we investigated stage-specific morphometric alterations measured with VBM and how these alterations extended to other brain regions as illness advanced. At the first stage (illness duration <12 months), patients with depression were companied with GMV increase in vmPFC while GMV reduction in the bilateral hippocampus and the thalamus. Then as the illness duration was prolonged, GMV alterations spread to other brain regions including the NAc, orbital (and medial) frontal gyrus, the amygdala, the putamen, precuneus and the cerebellum. These results elaborated stage-specific GMV alterations pattern in depression. The CaSCN results revealed causal effect of the bilateral hippocampus and the vmPFC on other brain regions. Specifically, the bilateral hippocampus and the vmPFC corporately exerted causal effect on NAc, the precuneus and the cerebellum. GMV alterations in the hippocampus were also potentially causally related to that in the DLPFC. Consistent with aforesaid stage-specific GMV alteration pattern, these results revealed expanding pattern of GMV alterations from the hippocampus and the vmPFC to other brain regions. In general, our results revealed progressive morphological alteration stemming from and further elucidated possible details about disease progression in depression.

The stage-specific morphological alterations revealed the progressive alteration pattern spreading from original alterations in regions including the hippocampus, the thalamus and the sgACC/vmPFC to other regions such as amygdala, dorsal medial frontal gyrus and NAc. Converging evidences suggested that depression was a neuroprogressive illness (Kendler, Thornton, & Gardner, 2001; Moylan et al. 2013), the morphometric alteration of critical brain regions was related to illness progression information (Alexander-Bloch et al. 2013; Chen et al. 2016a; Frodl et al. 2003; McKinnon et al. 2009; van Eijndhoven et al. 2009). Consistent with these studies, we observed stage-specific GMV alterations in never-treated first-episode patients with depression. Specially, the GMVs of the hippocampus and the vmPFC were found altered at the onset of illness. Whether GMV alterations in critical brain regions such as the hippocampus, the vmPFC and the amygdala was still in dispute (Schmaal et al. 2016, 2017) that might be resulted from illness duration (Chen et al. 2016b). Progressive GMV alterations of the hippocampus, the vmPFC and the amygdala (Belleau et al. 2019; Bora et al. 2012) were related to chronic stress and toxic effects of recurrent depressive episodes (Treadway et al. 2015). Our
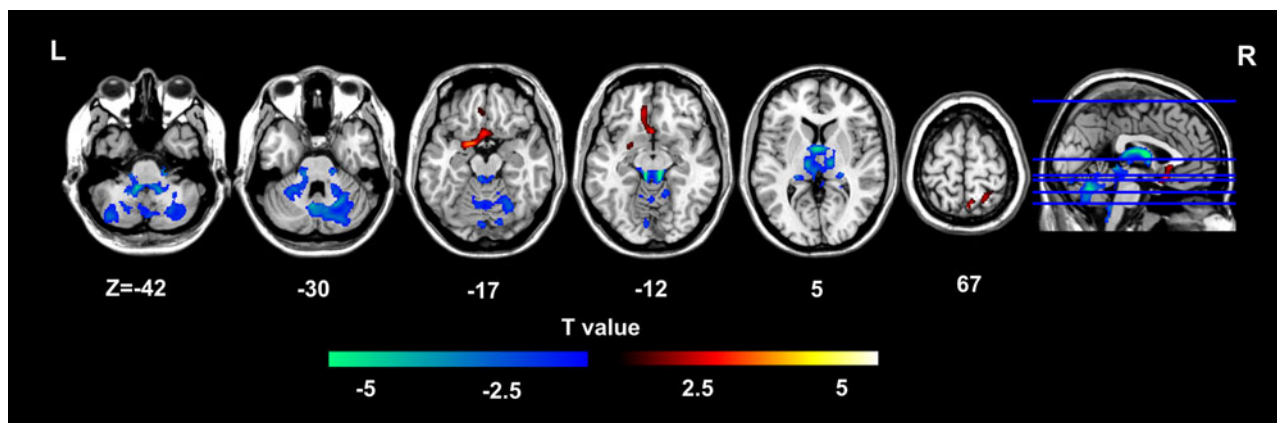
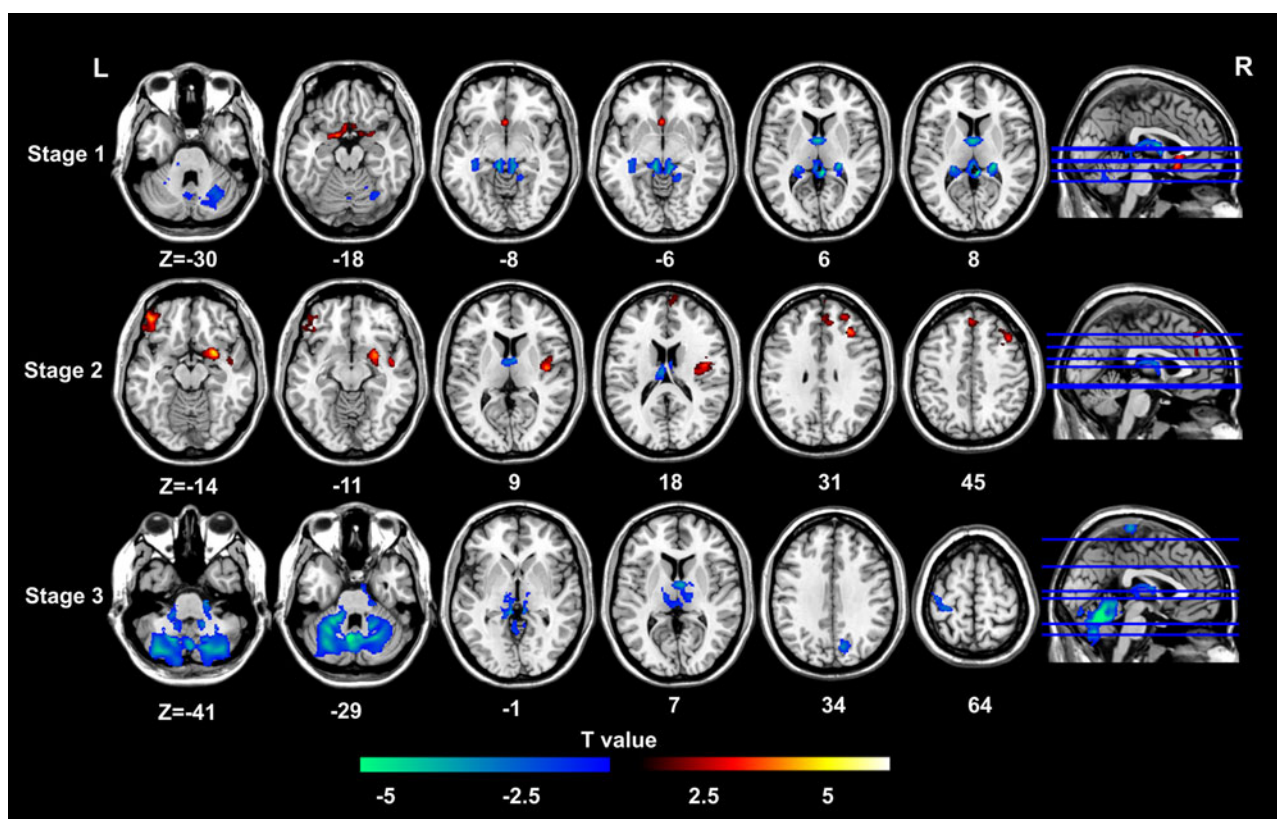**Fig. 1.** Overall GMV alterations in depression.

Fig. 2. Different GMV alterations at different stages in depression.

results suggested that structural alterations of these regions occurred at the onset of the illness. In fact, patients with longer (than the current study) illness duration presented decreased GMVs (Coryell, Nopoulos, Drevets, Wilson, & Andreasen, 2005; Klauser et al. 2015; Yucel et al. 2008) suggesting illness duration burden-mediated alterations in this region. In all, these results confirmed the notion that depression was a neuroprogressive illness and structural alterations of the hippocampus and the vmPFC occurred at the onset of the illness.

At the second stage, we found transient increase of GMVs in regions such as DLPFC, insula, and dorsal medial frontal gyrus. At the third stage, GMVs of these regions presented insignificant

reduction. The possible explanation might be pre-apoptotic osmotic changes (Adler, Levine, DelBello, & Strakowski, 2005; Yucel et al. 2009) in depression. Both decreased (Kandilarova, Stoyanov, Sirakov, & Maes, 2019; Vasic, Walter, Höse, & Wolf, 2008; Wise, Radua, Via, Cardoner, & Abe, 2017) and increased (Adler et al. 2005; Brambilla et al. 2002; Straub et al. 2019; van Eijndhoven et al. 2013; Yucel et al. 2009) GMVs were found in these regions, we noticed that reduced GMVs of these regions were found in patients with much longer illness duration than the current study. Combining the findings that stress-mediated neurotoxic processes resulted in progressive volumetric reductions in these regions (Ansell, Rando, Tuit, Guarnaccia, & Sinha, 2012;
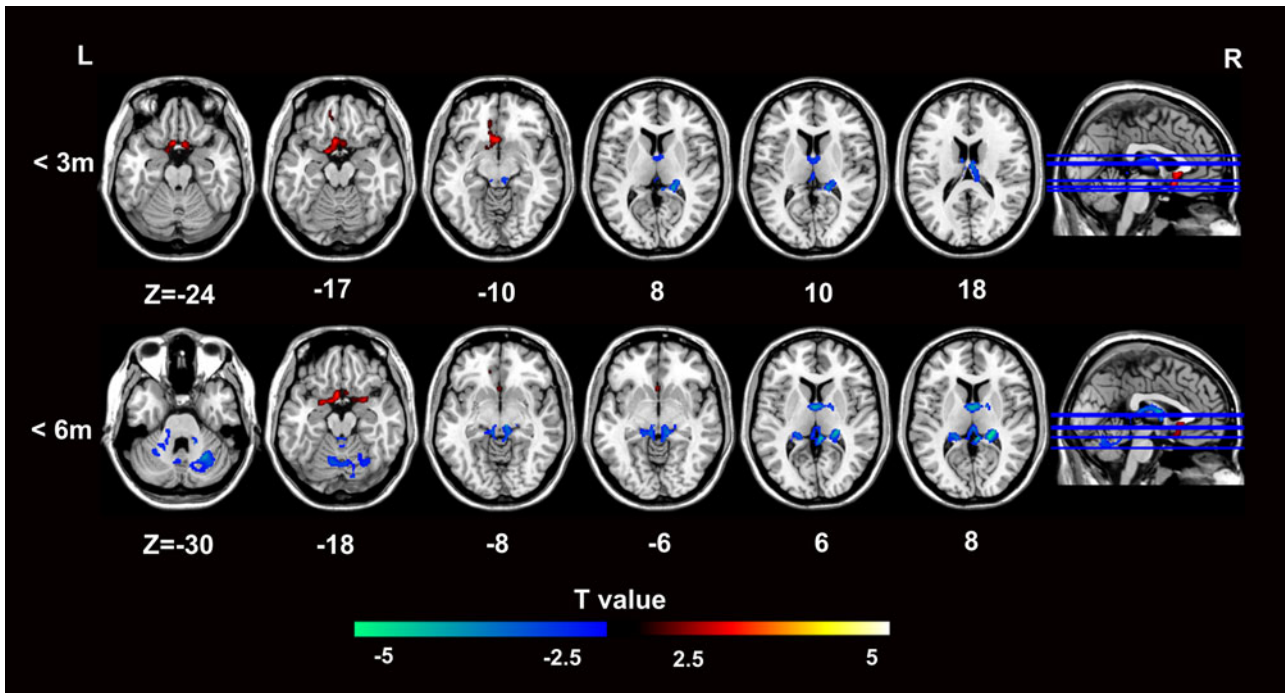
Fig. 3. Altered GMVs in patients with shorter illness duration (< 3/6 months).
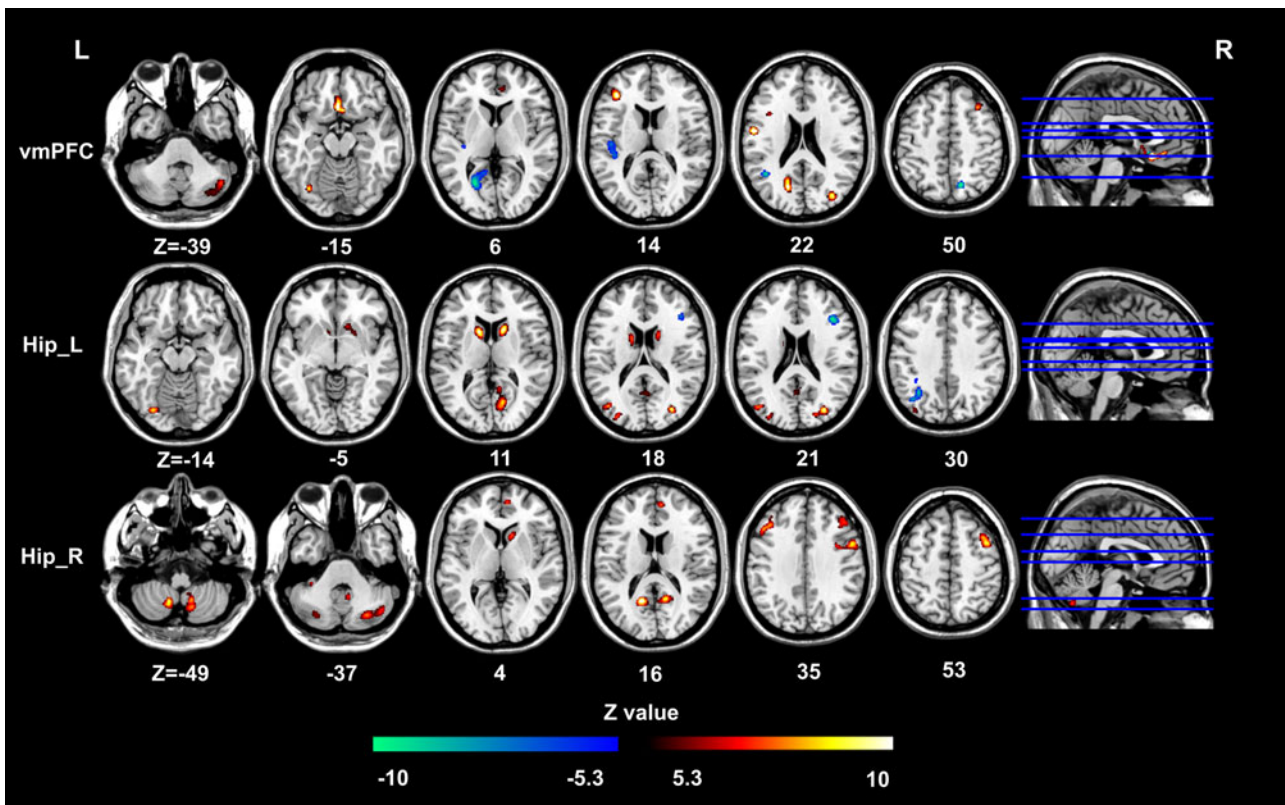

Fig. 4. Causal effects of GMV alterations pattern in depression.

Bora et al. 2012; Hatton et al. 2018), GMV reductions would be found in patients with longer illness duration. However, this conclusion might be treated carefully, as there was no study

investigating structural abnormality in depression with the same specific interval of illness duration. At the third stage, the GMV of these regions began to exhibit decreasing trend in patients
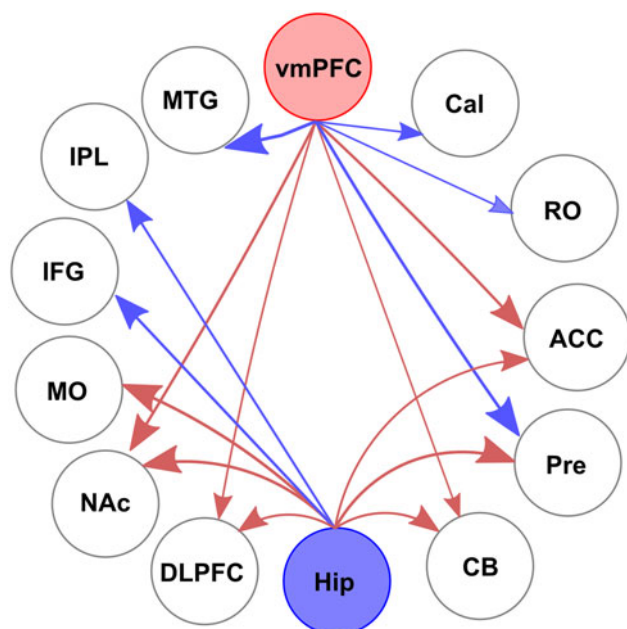
Fig. 5. Summary of the CsSCN analysis. The red arrow represented positive GC values and the negative ones represented negative GC values.

with longer illness duration (online Supplementary Fig. S2). However, the limited sample size and the not enough length of illness duration might restrict the statistical power to detect GMV reductions in these regions. Combined with GMV alterations at the first stage, these results elucidated the stage-specific GMV alterations pattern in depression.

The CaSCN analysis revealed causal relationship between initial GMV alterations in the hippocampus and the vmPFC and that in other brain regions. The vmPPFC was implicated in a variety of social, cognitive and affective functions that were disrupted in depression (Hiser & Koenigs, 2018). Specially, the vmPFC was in charge of the generation and regulation for negative emotions by inhibition of the amygdala (Likhtik, Pelletier, Paz, & Paré, 2005; Quirk, Likhtik, Pelletier, & Paré, 2003; Rosenkranz, Moore, & Grace, 2003), representation of reward/value-based decision making through its interaction with the ventral striatum (Christakou, Robbins, & Everitt, 2004; Richard & Berridge, 2013), processing of self-relevant information and social cognition by interacting with default mode network (DMN) and temporoparietal cortex (Hiser & Koenigs, 2018; Raichle, 2015). Sustained negative affect and impairment of emotional regulation were hallmark features in depression (Joormann & Stanton, 2016). Prior GMV alterations in the vmPPFC then followed by GMV alterations in the amygdala might be associated with emotional regulation dysfunctions in depression. Although we did not find direct linear causal effect from GMVs alterations in the vmPPFC on that in the amygdala, the reason might be that the causal relationship between the two regions was nonlinear or independent. The altered prediction error with reinforcement learning theories was hypothesized to underlie the anhedonia in depression (Gradin et al. 2011). NAc and its connected regions including vmPPFC played an important role in motivated decision making and encoding of prediction errors in depression (Christoffel et al. 2015; Han et al. 2020a; Stuber et al. 2011). Consistent with studies, we observed significant causal effect of the GMV alterations in the vmPPFC on the that in the NAc and middle temporal cortex.

In addition, we also found causal relationship between the GMV alterations in the vmPPFC on that in the precuneus. As an important part of DMN, dysfunctions of the precuneus were related to the rumination about low self-esteem in depression (Cheng et al. 2018; Han et al. 2020b). Taken together, these results suggested that clinical symptoms including emotional regulation especially for sustained negative affect, aberrant reward processing and rumination related GMV aberrance might originate from structural aberrance in the vmPPFC in depression.

The causal effects of the GMVs of the bilateral hippocampus on that of the DLPFC, the precuneus, NAc and the cerebellum were identified in the current study. Receiving dense glutamatergic projections from the hippocampus and the medial PFC (Friedman, Aggleton, & Saunders, 2002; Phillipson & Griffiths, 1985), NAc and its structural covariance network were found to be responsible for the anhedonia in depression (Han et al. 2020a). Especially, the hippocampus input was particularly capable of stably depolarizing NAc neurons, allowing prefrontal cortex input to generate spike firing in these cells (Friedman et al. 2002) and contributing to the proper regulation of goal-directed behaviors (LeGates et al. 2018). In addition to vmPFC, the GMV alterations of the bilateral hippocampus also exerted causal effect on that in the NAc, these results suggested the vmPFC and the hippocampus jointly facilitated the GMV alterations in the NAc. The conclusion held true for the GMV alterations in the precuneus. Recent studies suggested that DLPFC receiving monosynaptic projections from the hippocampus (Barbas & Blatt, 1995; Hoover & Vertes, 2007), was recruited during the regulation of negative emotion through reappraisal/suppression strategies (Eippert et al. 2007; Lévesque et al. 2003; Ochsner et al. 2004; Ochsner, Bunge, Gross, & Gabrieli, 2002; Phan et al. 2005). Its (both anatomical and functional) interactions with the hippocampus played a central role in various behavioral and cognitive functions and were disturbed in psychiatric disease (Sigurdsson & Duvarci, 2015). Negative stimuli, such as stress and cognitive impairment resulted in dysfunction of neural plasticity in the hippocampus then that of the DPLFC in depression (Kuhn et al. 2014). Recent years, the cerebellum draw researcher's attention for its anatomical connections with the limbic regions involved in mood regulation (Turner et al. 2007) and important role in emotion and cognitive processing (Moulton et al. 2011; O'Reilly, Beckmann, Tomassini, Ramnani, & Johansen-Berg, 2010). The interaction between the cerebellum and regions especially the hippocampus was suggested to be central to depression (Steinke et al. 2017). The hippocampal glutamate/glutamine related to cognitive functions (Ende, 2015), was found linked to the cerebellar function (Steinke et al. 2017). Our results suggested that the decreased GMVs in the cerebellum might be originated from GMV alterations in the hippocampus.

We also explored the association between the GMV alterations with clinical characteristics. Consistent with hypothesis that depression was a neuroprogressive illness, GMVs in the vmPFC were positively correlated with illness duration across stages, reflecting the effect of the cumulative adversity and stress on this region (Ansell et al. 2012). As for the hippocampus, we observed negative correlation between the GMVs with illness duration at first stage. The negative correlation between GMVs in the hippocampus and the thalamus with age of onset embodied effect of illness onset on the functional and structural alterations in depression (Ancelin et al. 2019; Brown, Clark, Hassel, MacQueen, & Ramasubbu, 2019). In the current study, we observed the negative correlation between GMV in the hippocampus and the

thalamus and age of onset. Taken together, our results elaborated that GMVs of regions like the thalamus were related to various clinical factors, explaining the possible reason for the inconsonant GMVs results in depression.

Several limitations must be considered in the current study. First, conclusions drawn in this study come from a single dataset, another independent dataset was needed to validate our results in the future. Second, the age of patients enrolled was less than 36 years, whether conclusions held are true for late-onset depression need to be explored (Penttilä et al. 2009; Truong et al. 2013). Third, the CaSCN results could not directly reflect the real sequence of morphological changes, longitudinal studies were needed to further clarify the causal relationship between morphological changes in depression. Fourth, other clinical variables such as severity of depression that might also be related to brain structural alterations could be considered in future. Fifth, we did not consider the causal effect between the GMV alteration in the following brain regions since the second stage.

Conclusion

We explored initial GMV alterations, progressive structural alteration pattern and causal relationships of them using CaSCN analysis in never-treated first-episode patients with depression in this study. Our results revealed progressive structural alteration pattern in depression. Specially, patients with depression were accompanied with GMV increase in vmPFC while GMV reduction in the bilateral hippocampus and the thalamus at the first stage. Then GMV alterations spread to regions such as NAc, orbital (and medial) frontal gyrus, amygdala, the putamen, the precuneus and the cerebellum. The GMV alterations in the bilateral hippocampus and the vmPFC jointly or separately exerted causal effects on that in the following brain regions, hinting their crucial roles in the disease progression. Consistent with the neuroprogressive hypothesis, our results revealed progressive morphological alterations originating from the vmPFC and the hippocampus and elucidated possible details about disease progression of depression.

References

Adler, C. M., Levine, A. D., DelBello, M. P., & Strakowski, S. M. (2005). Changes in gray matter volume in patients with bipolar disorder. *Biological Psychiatry*, 58(2), 151–157. doi: 10.1016/j.biopsych.2005.03.022

Alexander-Bloch, A., Giedd, J. N., & Bullmore, E. (2013). Imaging structural co-variance between human brain regions. *Nature Reviews Neuroscience*, 14(5), 322–336. doi: 10.1038/nrn3465

Ancelin, M. L., Carrière, I., Artero, S., Maller, J., Meslin, C., Ritchie, K., & Chaudieu, I. (2019). Lifetime major depression and grey-matter volume. *Journal of Psychiatry & Neuroscience : JPN*, 44(1), 45–53. doi: 10.1503/jpn.180026

Ansell, E. B., Rando, K., Tuit, K., Guarnaccia, J., & Sinha, R. (2012). Cumulative adversity and smaller gray matter volume in medial prefrontal, anterior cingulate, and insula regions. *Biological Psychiatry*, 72(1), 57–64. doi: 10.1016/j.biopsych.2011.11.022

Barbas, H., & Blatt, G. J. (1995). Topographically specific hippocampal projections target functionally distinct prefrontal areas in the rhesus monkey. *Hippocampus*, 5(6), 511–533. doi: 10.1002/hipo.450050604

Belleau, E. L., Treadway, M. T., & Pizzagalli, D. A. (2019). The impact of stress and major depressive disorder on hippocampal and medial prefrontal Cortex morphology. *Biological Psychiatry*, 85(6), 443–453. doi: 10.1016/j.biopsych.2018.09.031

Bludau, S., Bzdok, D., Gruber, O., Kohn, N., Riedl, V., Sorg, C., & Eickhoff, S. B. (2016). Medial prefrontal aberrations in major depressive disorder revealed by cytoarchitectonically informed voxel-based morphometry. *The American Journal of Psychiatry*, 173(3), 291–298. doi: 10.1176/appi.ajp.2015.15030349

Bora, E., Fornito, A., Pantelis, C., & Yücel, M. (2012). Gray matter abnormalities in major depressive disorder: A meta-analysis of voxel based morphometry studies. *Journal of Affective Disorders*, 138(1–2), 9–18. doi: 10.1016/j.jad.2011.03.049

Brambilla, P., Nicoletti, M. A., Harenski, K., Sassi, R. B., Mallinger, A. G., Frank, E., & Soares, J. C. (2002). Anatomical MRI study of subgenual prefrontal cortex in bipolar and unipolar subjects. *Neuropsychopharmacology : Official Publication of the American College of Neuropsychopharmacology*, 27(5), 792–799. doi: 10.1016/s0893-133x(02)00352-4

Bremner, J. D., Narayan, M., Anderson, E. R., Staib, L. H., Miller, H. L., & Charney, D. S. (2000). Hippocampal volume reduction in major depression. *The American Journal of Psychiatry*, 157(1), 115–118. doi: 10.1176/ajp.157.1.115

Brown, E. C., Clark, D. L., Hassel, S., MacQueen, G., & Ramasubbu, R. (2019). Intrinsic thalamocortical connectivity varies in the age of onset subtypes in major depressive disorder. *Neuropsychiatric Disease and Treatment*, 15, 75–82. doi: 10.2147/ndt.s184425

Caetano, S. C., Hatch, J. P., Brambilla, P., Sassi, R. B., Nicoletti, M., Mallinger, A. G., & Soares, J. C. (2004). Anatomical MRI study of hippocampus and amygdala in patients with current and remitted major depression. *Psychiatry Research*, 132(2), 141–147. doi: 10.1016/j.pscychresns.2004.08.002

Campbell, S., Marriott, M., Nahmias, C., & MacQueen, G. M. (2004). Lower hippocampal volume in patients suffering from depression: A meta-analysis. *The American Journal of Psychiatry*, 161(4), 598–607. doi: 10.1176/appi.ajp.161.4.598

Chen, V. C., Shen, C. Y., Liang, S. H., Li, Z. H., Tyan, Y. S., Liao, Y. T., & Weng, J. C. (2016a). Assessment of abnormal brain structures and networks in major depressive disorder using morphometric and connectome analyses. *Journal of Affective Disorders*, 205, 103–111. doi: 10.1016/j.jad.2016.06.066

Chen, Y., Cui, Q., Fan, Y. S., Guo, X., Tang, Q., Sheng, W., & Chen, H. (2020). Progressive brain structural alterations assessed via causal analysis in patients with generalized anxiety disorder. *Neuropsychopharmacology : Official Publication of the American College of Neuropsychopharmacology*, 45(10), 1689–1697. doi: 10.1038/s41386-020-0704-1

Chen, Z., Peng, W., Sun, H., Kuang, W., Li, W., Jia, Z., & Gong, Q. (2016b). High-field magnetic resonance imaging of structural alterations in first-episode, drug-naive patients with major depressive disorder. *Translational Psychiatry*, 6(11), e942. doi: 10.1038/tp.2016.209

Cheng, W., Rolls, E. T., Qiu, J., Yang, D., Ruan, H., Wei, D., & Feng, J. (2018). Functional connectivity of the precuneus in unmedicated patients with depression. *Biological Psychiatry. Cognitive Neuroscience and Neuroimaging*, 3(12), 1040–1049. doi: 10.1016/j.bpsc.2018.07.008

Christakou, A., Robbins, T. W., & Everitt, B. J. (2004). Prefrontal cortical-ventral striatal interactions involved in affective modulation of attentional performance: Implications for corticostriatal circuit function. *The Journal of Neuroscience : The Official Journal of the Society for Neuroscience*, 24(4), 773–780. doi: 10.1523/jneurosci.0949-03.2004

Christoffel, D. J., Golden, S. A., Walsh, J. J., Guise, K. G., Mitra, H., Friedman, A. K., & Madeline, P. (2015). Excitatory transmission at thalamo–striatal synapses mediates susceptibility to social stress. *Nature Neuroscience*, 18(7), 962–964.

Coryell, W., Nopoulos, P., Drevets, W., Wilson, T., & Andreasen, N. C. (2005). Subgenual prefrontal cortex volumes in major depressive disorder and

schizophrenia: Diagnostic specificity and prognostic implications. *The American Journal of Psychiatry*, 162(9), 1706–1712. doi: 10.1176/appi.ajp.162.9.1706

Eippert, F., Veit, R., Weiskopf, N., Erb, M., Birbaumer, N., & Anders, S. (2007). Regulation of emotional responses elicited by threat-related stimuli. *Human Brain Mapping*, 28(5), 409–423. doi: 10.1002/hbm.20291

Eker, C., & Gonul, A. S. (2010). Volumetric MRI studies of the hippocampus in major depressive disorder: Meanings of inconsistency and directions for future research. *The World Journal of Biological Psychiatry : The Official Journal of the World Federation of Societies of Biological Psychiatry*, 11(1), 19–35. doi: 10.1080/15622970902737998

Ende, G. (2015). Proton magnetic resonance spectroscopy: Relevance of glutamate and GABA to neuropsychology. *Neuropsychology Review*, 25(3), 315–325. doi: 10.1007/s11065-015-9295-8

Friedman, D. P., Aggleton, J. P., & Saunders, R. C. (2002). Comparison of hippocampal, amygdala, and perirhinal projections to the nucleus accumbens: Combined anterograde and retrograde tracing study in the Macaque brain. *The Journal of Comparative Neurology*, 450(4), 345–365. doi: 10.1002/cne.10336

Frodl, T., Meisenzahl, E. M., Zetzsche, T., Born, C., Jäger, M., Groll, C., & Möller, H. J. (2003). Larger amygdala volumes in first depressive episode as compared to recurrent major depression and healthy control subjects. *Biological Psychiatry*, 53(4), 338–344. doi: 10.1016/s0006-3223(02)01474-9

Frodl, T. S., Koutsouleris, N., Bottlender, R., Born, C., Jäger, M., Scupin, I., & Meisenzahl, E. M. (2008). Depression-related variation in brain morphology over 3 years: Effects of stress? *Archives of General Psychiatry*, 65(10), 1156–1165. doi: 10.1001/archpsyc.65.10.1156

Gorwood, P., Corruble, E., Falissard, B., & Goodwin, G. M. (2008). Toxic effects of depression on brain function: Impairment of delayed recall and the cumulative length of depressive disorder in a large sample of depressed outpatients. *The American Journal of Psychiatry*, 165(6), 731–739. doi: 10.1176/appi.ajp.2008.07040574

Gradin, V. B., Kumar, P., Waiter, G., Ahearn, T., Stickle, C., Milders, M., & Steele, J. D. (2011). Expected value and prediction error abnormalities in depression and schizophrenia. *Brain*, 134, 1751–1764. doi: 10.1093/brain/awr059

Han, S., Cui, Q., Wang, X., Chen, Y., Li, D., Li, L., & Chen, H. (2020a). The anhedonia is differently modulated by structural covariance network of NAc in bipolar disorder and major depressive disorder. *Progress in Neuro-psychopharmacology & Biological Psychiatry*, 99, 109865. doi: 10.1016/j.pnpbp.2020.109865

Han, S., Cui, Q., Wang, X., Li, L., Li, D., He, Z., … Guo, X. (2020b). Resting state functional network switching rate is differently altered in bipolar disorder and major depressive disorder. *Human brain mapping* 41(12), 3295–3304. doi: 10.1002/hbm.25017

Hatton, S. N., Franz, C. E., Elman, J. A., Panizzon, M. S., Hagler, D. J. Jr., Fennema-Notestine, C., & Kremen, W. S. (2018). Negative fateful life events in midlife and advanced predicted brain aging. *Neurobiology of Aging*, 67, 1–9. doi: 10.1016/j.neurobiolaging.2018.03.004

Hiser, J., & Koenigs, M. (2018). The multifaceted role of the ventromedial prefrontal cortex in emotion, decision making, social cognition, and psychopathology. *Biological Psychiatry*, 83(8), 638–647. doi: 10.1016/j.biopsych.2017.10.030

Hoover, W. B., & Vertes, R. P. (2007). Anatomical analysis of afferent projections to the medial prefrontal cortex in the rat. *Brain Structure & Function*, 212(2), 149–179. doi: 10.1007/s00429-007-0150-4

Jiang, Y., Luo, C., Li, X., Duan, M., He, H., Chen, X., & Yao, D. (2018). Progressive reduction in gray matter in patients with schizophrenia assessed with MR imaging by using causal network analysis. *Radiology*, 287(2), 633–642. doi: 10.1148/radiol.2017171832

Joormann, J., & Stanton, C. H. (2016). Examining emotion regulation in depression: A review and future directions. *Behaviour Research and Therapy*, 86, 35–49. doi: 10.1016/j.brat.2016.07.007

Kandilarova, S., Stoyanov, D., Sirakov, N., & Maes, M. (2019). Reduced grey matter volume in frontal and temporal areas in depression: Contributions from voxel-based morphometry study. *ACTA Neuropsychiatr* 31(5), 252–257. doi: 10.1017/neu.2019.20

Kempton, M. J., Salvador, Z., Munafò, M. R., Geddes, J. R., Simmons, A., Frangou, S., & Williams, S. C. (2011). Structural neuroimaging studies in major depressive disorder. Meta-analysis and comparison with bipolar disorder. *Archives of General Psychiatry*, 68(7), 675–690. doi: 10.1001/archgenpsychiatry.2011.60

Kendler, K. S., Thornton, L. M., & Gardner, C. O. (2001). Genetic risk, number of previous depressive episodes, and stressful life events in predicting onset of major depression. *The American Journal of Psychiatry*, 158(4), 582–586. doi: 10.1176/appi.ajp.158.4.582

Kessing, L. V., & Andersen, P. K. (2004). Does the risk of developing dementia increase with the number of episodes in patients with depressive disorder and in patients with bipolar disorder? *Journal of Neurology, Neurosurgery, and Psychiatry*, 75(12), 1662–1666. doi: 10.1136/jnnp.2003.031773

Klauser, P., Fornito, A., Lorenzetti, V., Davey, C. G., Dwyer, D. B., Allen, N. B., & Yücel, M. (2015). Cortico-limbic network abnormalities in individuals with current and past major depressive disorder. *Journal of Affective Disorders*, 173, 45–52. doi: 10.1016/j.jad.2014.10.041

Kuhn, M., Höger, N., Feige, B., Blechert, J., Normann, C., & Nissen, C. (2014). Fear extinction as a model for synaptic plasticity in major depressive disorder. *PloS One*, 9(12), e115280. doi: 10.1371/journal.pone.0115280

LeGates, T. A., Kvarta, M. D., Tooley, J. R., Francis, T. C., Lobo, M. K., Creed, M. C., & Thompson, S. M. (2018). Reward behaviour is regulated by the strength of hippocampus-nucleus accumbens synapses. *Nature*, 564(7735), 258–262. doi: 10.1038/s41586-018-0740-8

Lévesque, J., Eugène, F., Joanette, Y., Paquette, V., Mensour, B., Beaudoin, G., & Beauregard, M. (2003). Neural circuitry underlying voluntary suppression of sadness. *Biological Psychiatry*, 53(6), 502–510. doi: 10.1016/s0006-3223(02)01817-6

Likhtik, E., Pelletier, J. G., Paz, R., & Paré, D. (2005). Prefrontal control of the amygdala. *The Journal of Neuroscience : The Official Journal of the Society for Neuroscience*, 25(32), 7429–7437. doi: 10.1523/jneurosci.2314-05.2005

Lorenzetti, V., Allen, N. B., Fornito, A., & Yücel, M. (2009). Structural brain abnormalities in major depressive disorder: A selective review of recent MRI studies. *Journal of Affective Disorders*, 117(1–2), 1–17. doi: 10.1016/j.jad.2008.11.021

Malykhin, N. V., Carter, R., Seres, P., & Coupland, N. J. (2010). Structural changes in the hippocampus in major depressive disorder: Contributions of disease and treatment. *Journal of Psychiatry & Neuroscience : JPN*, 35(5), 337–343. doi: 10.1503/jpn.100002

McKinnon, M. C., Yucel, K., Nazarov, A., & MacQueen, G. M. (2009). A meta-analysis examining clinical predictors of hippocampal volume in patients with major depressive disorder. *Journal of Psychiatry & Neuroscience : JPN*, 34(1), 41–54.

Mervaala, E., Föhr, J., Könönen, M., Valkonen-Korhonen, M., Vainio, P., Partanen, K., & Lehtonen, J. (2000). Quantitative MRI of the hippocampus and amygdala in severe depression. *Psychological Medicine*, 30(1), 117–125. doi: 10.1017/s0033291799001567

Morris, G., Puri, B. K., Walker, A. J., Maes, M., Carvalho, A. F., Bortolasci, C. C., & Berk, M. (2019). Shared pathways for neuroprogression and somatoprogression in neuropsychiatric disorders. *Neuroscience and Biobehavioral Reviews*, 107, 862–882. doi: 10.1016/j.neubiorev.2019.09.025

Moulton, E. A., Elman, I., Pendse, G., Schmahmann, J., Becerra, L., & Borsook, D. (2011). Aversion-related circuitry in the cerebellum: Responses to noxious heat and unpleasant images. *The Journal of Neuroscience : The Official Journal of the Society for Neuroscience*, 31(10), 3795–3804. doi: 10.1523/jneurosci.6709-10.2011

Moylan, S., Maes, M., Wray, N. R., & Berk, M. (2013). The neuroprogressive nature of major depressive disorder: Pathways to disease evolution and resistance, and therapeutic implications. *Molecular Psychiatry*, 18(5), 595–606. doi: 10.1038/mp.2012.33

Murray, C. J., Vos, T., Lozano, R., Naghavi, M., Flaxman, A. D., Michaud, C., & Memish, Z. A. (2012). Disability-adjusted life years (DALYs) for 291 diseases and injuries in 21 regions, 1990-2010: A systematic analysis for the Global Burden of Disease Study 2010. *Lancet (London, England)*, 380(9859), 2197–2223. doi: 10.1016/s0140-6736(12)61689-4

Ochsner, K. N., Bunge, S. A., Gross, J. J., & Gabrieli, J. D. (2002). Rethinking feelings: An FMRI study of the cognitive regulation of emotion. *Journal of Cognitive Neuroscience*, 14(8), 1215–1229. doi: 10.1162/089892902760807212

Ochsner, K. N., Ray, R. D., Cooper, J. C., Robertson, E. R., Chopra, S., Gabrieli, J. D., & Gross, J. J. (2004). For better or for worse: Neural systems supporting the cognitive down- and up-regulation of negative emotion. *NeuroImage*, 23(2), 483–499. doi: 10.1016/j.neuroimage.2004.06.030

O'Reilly, J. X., Beckmann, C. F., Tomassini, V., Ramnani, N., & Johansen-Berg, H. (2010). Distinct and overlapping functional zones in the cerebellum defined by resting state functional connectivity. *Cerebral Cortex (New York, N.Y. : 1991)*, 20(4), 953–965. doi: 10.1093/cercor/bhp157

Penttilä, J., Cachia, A., Martinot, J. L., Ringuenet, D., Wessa, M., Houenou, J., & Paillère-Martinot, M. L. (2009). Cortical folding difference between patients with early-onset and patients with intermediate-onset bipolar disorder. *Bipolar Disorders*, 11(4), 361–370. doi: 10.1111/j.1399-5618.2009.00683.x

Phan, K. L., Fitzgerald, D. A., Nathan, P. J., Moore, G. J., Uhde, T. W., & Tancer, M. E. (2005). Neural substrates for voluntary suppression of negative affect: A functional magnetic resonance imaging study. *Biological Psychiatry*, 57(3), 210–219. doi: 10.1016/j.biopsych.2004.10.030

Phillipson, O. T., & Griffiths, A. C. (1985). The topographic order of inputs to nucleus accumbens in the rat. *Neuroscience*, 16(2), 275–296. doi: 10.1016/0306-4522(85)90002-8

Quirk, G. J., Likhtik, E., Pelletier, J. G., & Paré, D. (2003). Stimulation of medial prefrontal cortex decreases the responsiveness of central amygdala output neurons. *The Journal of Neuroscience : The Official Journal of the Society for Neuroscience*, 23(25), 8800–8807. doi: 10.1523/jneurosci.23-25-08800.2003

Raichle, M. E. (2015). The brain's default mode network. *Annual Review of Neuroscience*, 38, 433–447. doi: 10.1146/annurev-neuro-071013-014030

Richard, J. M., & Berridge, K. C. (2013). Prefrontal cortex modulates desire and dread generated by nucleus accumbens glutamate disruption. *Biological Psychiatry*, 73(4), 360–370. doi: 10.1016/j.biopsych.2012.08.009

Rosenkranz, J. A., Moore, H., & Grace, A. A. (2003). The prefrontal cortex regulates lateral amygdala neuronal plasticity and responses to previously conditioned stimuli. *The Journal of Neuroscience : The Official Journal of the Society for Neuroscience*, 23(35), 11054–11064. doi: 10.1523/jneurosci.23-35-11054.2003

Ruiz, N. A. L., Del Ángel, D. S., Olguín, H. J., & Silva, M. L. (2018). Neuroprogression: The hidden mechanism of depression. *Neuropsychiatric Disease and Treatment*, 14, 2837–2845. doi: 10.2147/ndt.s177973

Schmaal, L., Hibar, D. P., Sämann, P. G., Hall, G. B., Baune, B. T., Jahanshad, N., … Tiemeier, H. (2017). Cortical abnormalities in adults and adolescents with major depression based on brain scans from 20 cohorts worldwide in the ENIGMA Major Depressive Disorder Working Group. *Molecular Psychiatry* 22(6), 900–909. doi: 10.1038/mp.2016.60

Schmaal, L., Veltman, D. J., van Erp, T. G., Sämann, P. G., Frodl, T., Jahanshad, N., … Tiemeier, H. (2016). Subcortical brain alterations in major depressive disorder: Findings from the ENIGMA Major depressive disorder working group. *Molecular Psychiatry* 21(6), 806–812. doi: 10.1038/mp.2015.69

Serra-Blasco, M., Portella, M. J., Gómez-Ansón, B., de Diego-Adeliño, J., Vives-Gilabert, Y., Puigdemont, D., & Pérez, V. (2013). Effects of illness duration and treatment resistance on grey matter abnormalities in major depression. *The British Journal of Psychiatry : The Journal of Mental Science*, 202, 434–440. doi: 10.1192/bjp.bp.112.116228

Sheline, Y. I., Gado, M. H., & Kraemer, H. C. (2003). Untreated depression and hippocampal volume loss. *The American Journal of Psychiatry*, 160(8), 1516–1518. doi: 10.1176/appi.ajp.160.8.1516

Sheline, Y. I., Gado, M. H., & Price, J. L. (1998). Amygdala core nuclei volumes are decreased in recurrent major depression. *Neuroreport*, 9(9), 2023–2028. doi: 10.1097/00001756-199806220-00021

Sigurdsson, T., & Duvarci, S. (2015). Hippocampal-prefrontal interactions in cognition, behavior and psychiatric disease. *Frontiers in Systems Neuroscience*, 9, 190. doi: 10.3389/fnsys.2015.00190

Steinke, J., Gaser, C., Langbein, K., Dietzek, M., Gussew, A., Reichenbach, J. R., & Nenadić, I. (2017). Hippocampal metabolism and prefrontal brain structure: A combined 1H-MR spectroscopy, neuropsychological, and voxel-based morphometry (VBM) study. *Brain Research*, 1677, 14–19. doi: 10.1016/j.brainres.2017.09.004

Straub, J., Brown, R., Malejko, K., Bonenberger, M., Grön, G., Plener, P. L., & Abler, B. (2019). Adolescent depression and brain development: Evidence from voxel-based morphometry. *Journal of Psychiatry & Neuroscience : JPN*, 44(4), 237–245. doi: 10.1503/jpn.170233

Stuber, G. D., Sparta, D. R., Stamatakis, A. M., van Leeuwen, W. A., Hardjoprajitno, J. E., Cho, S., & Bonci, A. (2011). Excitatory transmission from the amygdala to nucleus accumbens facilitates reward seeking. *Nature*, 475(7356), 377–U129. doi: 10.1038/nature10194

Treadway, M. T., Waskom, M. L., Dillon, D. G., Holmes, A. J., Park, M. T. M., Chakravarty, M. M., & Pizzagalli, D. A. (2015). Illness progression, recent stress, and morphometry of hippocampal subfields and medial prefrontal cortex in major depression. *Biological Psychiatry*, 77(3), 285–294. doi: 10.1016/j.biopsych.2014.06.018

Truong, W., Minuzzi, L., Soares, C. N., Frey, B. N., Evans, A. C., MacQueen, G. M., & Hall, G. B. (2013). Changes in cortical thickness across the lifespan in major depressive disorder. *Psychiatry Research*, 214(3), 204–211. doi: 10.1016/j.pscychresns.2013.09.003

Turner, B. M., Paradiso, S., Marvel, C. L., Pierson, R., Boles Ponto, L. L., Hichwa, R. D., & Robinson, R. G. (2007). The cerebellum and emotional experience. *Neuropsychologia*, 45(6), 1331–1341. doi: 10.1016/j.neuropsychologia.2006.09.023

van Eijndhoven, P., van Wingen, G., Katzenbauer, M., Groen, W., Tepest, R., Fernández, G., & Tendolkar, I. (2013). Paralimbic cortical thickness in first-episode depression: Evidence for trait-related differences in mood regulation. *The American Journal of Psychiatry*, 170(12), 1477–1486. doi: 10.1176/appi.ajp.2013.12121504

van Eijndhoven, P., van Wingen, G., van Oijen, K., Rijpkema, M., Goraj, B., Jan Verkes, R., & Tendolkar, I. (2009). Amygdala volume marks the acute state in the early course of depression. *Biological Psychiatry*, 65(9), 812–818. doi: 10.1016/j.biopsych.2008.10.027

Vasic, N., Walter, H., Höse, A., & Wolf, R. C. (2008). Gray matter reduction associated with psychopathology and cognitive dysfunction in unipolar depression: A voxel-based morphometry study. *Journal of Affective Disorders*, 109(1–2), 107–116. doi: 10.1016/j.jad.2007.11.011

Verduijn, J., Milaneschi, Y., Schoevers, R. A., van Hemert, A. M., Beekman, A. T., & Penninx, B. W. (2015). Pathophysiology of major depressive disorder: Mechanisms involved in etiology are not associated with clinical progression. *Translational Psychiatry*, 5(9), e649. doi: 10.1038/tp.2015.137

Wise, T., Radua, J., Via, E., Cardoner, N., & Abe, O. (2017). Common and distinct patterns of grey-matter volume alteration in major depression and bipolar disorder: Evidence from voxel-based meta-analysis. *Molecular Psychiatry* 22(10), 1455–1463. doi: 10.1038/mp.2016.72

Yucel, K., McKinnon, M., Chahal, R., Taylor, V., Macdonald, K., Joffe, R., & Macqueen, G. (2009). Increased subgenual prefrontal cortex size in remitted patients with major depressive disorder. *Psychiatry Research*, 173(1), 71–76. doi: 10.1016/j.pscychresns.2008.07.013

Yucel, K., McKinnon, M. C., Chahal, R., Taylor, V. H., Macdonald, K., Joffe, R., & MacQueen, G. M. (2008). Anterior cingulate volumes in never-treated patients with major depressive disorder. *Neuropsychopharmacology : Official Publication of the American College of Neuropsychopharmacology*, 33(13), 3157–3163. doi: 10.1038/npp.2008.40

Zhang, Z., Liao, W., Xu, Q., Wei, W., Zhou, H. J., Sun, K., & Lu, G. (2017). Hippocampus-associated causal network of structural covariance measuring structural damage progression in temporal lobe epilepsy. *Human Brain Mapping*, 38(2), 753–766. doi: 10.1002/hbm.23415