# **Archival Report**

# Large-scale Persistent Network Reconfiguration Induced by Ketamine in Anesthetized Monkeys: Relevance to Mood Disorders

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### ABSTRACT

BACKGROUND: Ketamine is a highly attractive candidate for developing fast-onset antidepressant agents; however, the relevant brain circuits that underlie sustained, efficacious antidepressant effects remain largely unknown.

**METHODS:** We used a holistic scheme combining whole-brain resting-state fMRI and graph theoretical analysis to examine the sustained effects on brain networks after administration of a single dose of ketamine and to identify the brain regions and circuits preferentially targeted by ketamine. Topological differences in functional networks of anesthetized macaque monkeys were compared between ketamine (.5 mg/kg) and saline treatment after 18 hours. **RESULTS:** We observed persistent global reconfiguration of small-world properties in response to ketamine intake, accompanied by large-scale downregulation of functional connectivity, most prominently in the orbital prefrontal cortex, the subgenual and posterior cingulate cortices, and the nucleus accumbens. Intriguingly, intrinsic connectivity with the medial prefrontal areas in the reward circuits were selectively downregulated. Global and regional regulations of the brain networks precisely opposed the maladaptive alterations in the depressed brain. **CONCLUSIONS:** Our results demonstrated that local synaptic plasticity triggered by blockade of *N*-methyl-D-aspartic acid receptors was capable of translating into prolonged network reconfiguration in the distributed cortico-limbic-striatal circuit, providing mechanistic insight into developing specific loci or circuit-targeted, long-term therapeutics.

*Keywords:* Functional connectivity, Graph theory, Ketamine, Macaque monkey, Mood disorders, Neural network plasticity

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Mood disorders, such as major depressive disorder (MDD), are likely accompanied by distributed system-level disturbances in brain circuitry (1-6). There is increasing recognition that therapeutic interventions could generate structural and functional network reorganization through the possible neural plasticity (4,7) and regulate system-level abnormalities in the brain, eventually leading to complete rehabilitation. Converging evidence has demonstrated that a single subanesthetic dose of ketamine, a noncompetitive N-methyl-D-aspartic acid (NMDA) receptor antagonist, produces a rapid-acting and long-lasting antidepressant response (8-13) attributable to synaptic plasticity rather than simple antagonism of NMDA receptors (7,11). These features are extremely attractive for novel pharmacological strategies (14) and have inspired a flurry of preclinical and clinical studies of the neurobiological mechanisms of ketamine action (15,16). To date, however, several key questions regarding the antidepressant action of ketamine remain largely unsolved. First, what are the relevant brain circuits that underlie the long-term, efficacious action of ketamine? Second, why do many patients show a response 24

hours after ketamine administration? (17). Accordingly, is there sustained neural network reconfiguration after acute ketamine treatment, considering the metabolic half-life of ketamine is shorter than 3 to 4 hours? (18). Finally, although synaptic plasticity triggered by the transient blockade of NMDA receptors could help restore disrupted homeostatic regulation and lost synaptic connections (4,7,11), the involved brain regions where synaptic plasticity occurs in complex mood and emotion circuitry, thereby contributing to long-lasting antidepressant effects, remains unknown.

To address these questions, we tested the therapeutic effects of a single dose of ketamine on healthy adult macaque monkeys. Growing evidence has validated the use of resting-state functional magnetic resonance imaging (rsfMRI) in anesthetized macaques (19–27) and has underscored its potential to bridge information between human and animal models (28–31). Although the effect of anesthetic agents on functional brain networks remains poorly understood, recent study has demonstrated that stable functional connectivity patterns under a narrow range of medium level isoflurane

(e.g.,  $\pm$ .25%) are suitable for anesthetized nonhuman primate investigations (26). Furthermore, whole-brain rsfMRI allows unbiased, simultaneous identification of all pharmacologically affected regions in the brain. Through transiently and reversibly controlled neurochemical perturbations, nonhuman primate models may serve as ideal testing benchmarks to clarify the underlying biomechanisms of drug action in the absence of any pre-existing homeostatic dysfunction as part of the complex disease process (e.g., multidimensional symptomatology in psychiatric disorders), comorbidity, or medication status.

Given the ubiquitous distribution of NMDA receptors throughout the brain (14), a randomized, placebo-controlled functional connectome study was conducted in anesthetized monkeys 18 hours after ketamine and saline administration. The dose used (.5 mg per kg) has achieved clinically meaningful improvements in MDD patients (8–10,17), and the time point was chosen for the most prominent antidepressant response (9), without additional schizophrenia-like symptoms (32). Although recent rsfMRI studies have evaluated the antidepressant effects of ketamine at a priori selection of candidate brain regions or pathways (33-35), a global view of the action of ketamine on the whole-brain scale is still lacking. Therefore, we applied graph theoretical analysis to quantitatively examine the overall topological organization of brain networks (36) and used network-based statistics (NBS) (37) to characterize specific features within a network. This study represents the first fMRI investigation of the antidepressant effects of ketamine in nonhuman primates, using a holistic scheme that could possibly identify hitherto unidentified systems relevant to novel therapeutic targets in the brain reward circuitry. Our primary hypotheses were that a single subanesthetic dose of ketamine would produce sustained network reconfiguration in healthy subjects after it was metabolically eliminated and that this prolonged action, which counteracts abnormalities of functional networks in MDD patients, would provide a plausible mechanistic underpinning for the long-term antidepressant effects of ketamine.

#### **METHODS AND MATERIALS**

#### **Animal Preparation**

All experimental procedures in nonhuman primate research in this study were approved by the Institute of Neuroscience Animal Care and Use Committee and by the Shanghai Institute for Biological Sciences Biomedical Research Ethics Committee and conformed to the National Institutes of Health guidelines for the humane care and use of laboratory animals.

Nine adult macaque monkeys (3 male and 1 female *Macaca fascicularis* and 5 male *Macaca mulatta*) weighing 5.0 to 10.0 kg (7.7  $\pm$  1.8 kg) were prepared and maintained for fMRI scans. Animals were intramuscularly injected with either a single subanesthetic dose of ketamine (.5 mg per kg) or placebo saline (.90% w/v of NaCl) in random order (Figure 1A). In light of previous nonhuman primate (38) and human clinical studies (17), the ketamine dose was determined to produce sufficient regulatory effects in subjects. Follow-up fMRI scans were scheduled 18 hours after ketamine or saline administration. The imaging interval between saline and

ketamine administration was spaced at least 1 month apart to avoid possible carry-over effects. Before each scanning session, an anesthesia cocktail of dexmedetomidine (18-30 µg per kg) and midazolam (.2-.3 mg per kg), supplemented with atropine sulfate (.05 mg per kg), was introduced to the animals. After monkeys were intubated, under an anesthesiologist's guidance (GL), the anesthesia was maintained using the lowest possible concentration of isoflurane gas. For all animal scans, the mean (±SD) inhaled concentration was .92% (±.26%). Subjects received intermittent positive pressure ventilation by an MRI-compatible ventilator (CWE Inc., Weston, Wisconsin) to ensure a constant respiration rate (31.8  $\pm$  2.3 breaths/min). Vital signs, including blood oxygenation, rectal temperature, heart rate (Small Animal Instruments Inc., Stonybrook, New York), respiration rate, and end-tidal CO<sub>2</sub> (Smiths Medical ASD Inc., Dublin, Ohio), were continuously monitored during the experiment and maintained tightly within normal limits. Oxygen saturation was maintained over 95%, and body temperature was kept constant using a hot water blanket (Gaymar Industries Inc., Orchard Park, New York). Lactated Ringer's solution was given at 10 mL per kg per hour during the anesthesia procedure.

#### **Image Acquisition**

A cohort of image data was acquired from the Institute of Neuroscience on a 3-T whole-body scanner (Siemens Healthcare, Germany) running with or without an enhanced gradient coil insert (AC88; 80 mT/m maximum gradient strength, 800  $\text{mT} \cdot \text{m}^{-1} \cdot \text{s}^{-1}$  maximum slew rate). A total of 57 of 96 imaging datasets were obtained from the standard Trio system, using a protocol similar to that used with AC88. Two sets of custommade 8-channel phased-array transceiver coils were used for the imaging sessions on the AC88 and Trio systems (provided by Dr. Lawrence Wald's laboratory at Massachusetts General Hospital, Boston, Massachusetts, and developed in-house), respectively.

Whole-brain resting-state fMRI data were collected using a gradient-echo echo-planar imaging (EPI) sequence (TR = 2000 ms; TE = 29 ms; flip angle =  $77^{\circ}$ ; slices = 32; field of view = 96  $\times$  96 mm; 1.5  $\times$  1.5 mm<sup>2</sup> in plane resolution; slice thickness = 2.5 mm; GRAPPA factor = 2). For each experiment, 4 to 6 EPI runs were acquired, and each run contained 200 functional volumes. A pair of gradient echo images (echo time: 4.22 ms and 6.68 ms, respectively) with the same orientation and resolution as the EPI images were acquired to generate a field map for distortion correction of the EPI images. High-resolution T1-weighted anatomical images were acquired using an MPRAGE sequence (TR = 2500 ms; TE = 3.12 ms; TI = 1100 ms; flip angle =  $9^{\circ}$ ; acquisition voxel size =  $.5 \times .5 \times .5$  mm<sup>3</sup>; 144 sagittal slices). Six whole-brain anatomical runs were acquired and averaged for better brain segmentation and three-dimensional cortical reconstruction. Each experiment lasted for approximately 3 to 4 hours, and a total of 96 imaging datasets (47 for ketamine condition and 49 for saline condition) were collected from 9 monkeys.

#### **Network Construction**

Node and Edge Definition. A network is composed of nodes and edges between nodes. Herein, nodes represent



**Figure 1.** Resting state functional brain connectome study of ketamine. (**A**, upper panel) The experimental paradigm. Each animal functional magnetic resonance imaging (fMRI) scan was scheduled 18 hours after a single dose administration of ketamine or saline was given in random order. The scan interval between the saline and ketamine treatments was spaced at least 1 month apart to avoid any carry-over effects. (**A**, lower panel) Flow chart of graph theoretical analysis. Panel 1: resting-state fMRI data were acquired from anesthetized monkeys. Panel 2; Entire monkey brain was charted with 94 regions, including 78 cortical and 16 subcortical regions. Panels 3 and 4: Mean time courses of each brain region were calculated and subjected to region-specific Pearson correlation, resulting in a 94  $\times$  94 correlation matrix. Panel 5: Topological features of the correlation matrices after ketamine and saline administration were analyzed and statistically compared. (**B**) Grand mean correlation matrices of saline and ketamine regimen groups.

brain regions, and edges represent the statistical correlation in fMRI signals across different regions. To define the monkey brain nodes, the regional map cortical parcellation was mapped onto the F99 macaque standard surface template (39) and transformed to voxel space with a 2-mm extrusion

using Caret software (http://www.nitrc.org/projects/caret/). To construct a complete brain network, we further collated the subcortical parcellation of the macaque monkey from the INIA19 template (40), which included the caudate, putamen, thalamus, hypothalamus, nucleus accumbens (NAc) and globus pallidus

(amygdala and hippocampus were included in the regional map cortical parcellation [see Supplementary Table S1 for the complete anatomical labels of all brain regions]). Thus, our anatomical template contained a total of 94 brain regions, 47 of which were mirrored from one hemisphere to the other. To define the network edges, we calculated region-wise Pearson correlation coefficients and generated a 94  $\times$  94 correlation matrix for each imaging dataset (Figure 1B shows the grand mean correlation matrices of ketamine and saline groups). The mean time series of each region (node) was obtained by averaging the time series of all voxels within that region.

Threshold Selection. As there is no current consensus on the selection of network thresholds in graph theoretical analysis, network sparsity was determined as the threshold according to previous studies (41,42). Sparsity level S, defined as the ratio of the number of existing edges divided by the maximum possible number of edges in a network, was applied to all correlation matrices. This treatment normalized all resultant networks to have the same number of edges and minimized the effects of possible discrepancies in the overall correlation strength between groups. Practically, the threshold for each correlation matrix was determined repeatedly over a wide range of sparsity levels with an increment of .01 according to two criteria: 1) that the average degree (node degree is the number of connections linked to the node) over all nodes of each threshold network was larger than  $2 \times \log(N)$ (where N = 94 here); and 2) that the normalized clustering coefficient  $\gamma$ , and the normalized characteristic path length  $\lambda$ , fulfilled the criteria of [ $\gamma > 1$ ] and [ $\lambda \approx 1$ ] for all individuals (43). This data-driven procedure guaranteed that the threshold networks were biologically plausible, showing the properties of small-worldness, and held sparse properties with as few spurious edges as possible (41). After preprocessing and network construction (see Supplementary Material for details), 76 imaging datasets entered the subsequent statistical comparisons.

#### **Global and Regional Properties Analysis**

The Brain Connectivity Toolbox (44) and GRETNA software were used to investigate the topological features of the functional networks constructed at each sparsity level within the data-derived sparsity range S (.1  $\sim$  .3). The global measures included 1) small-world parameters involving the clustering coefficient  $C_{p}$ , characteristic path length  $L_{p}$ ,  $\gamma$ ,  $\lambda$ , and small-worldness  $\sigma$ ; and 2) network efficiency involving local efficiency  $E_{loc}$ , and global efficiency  $E_{glob}$  (see Supplement 1 for details). For the calculation of  $\gamma$  and  $\lambda$ , 100 random networks were generated for each weighted network, using a modified Maslov's wiring program, which preserved the original weight of each node during normalization (45). Nonparametric permutation tests (10,000 permutations) for global differences in these topological metrics at each sparsity level (.1  $\sim$  .3, step increment = .01) were tested for significance with an false discovery rate (FDR) of 5%. To avoid multiple comparison problems, the area under the curve for each network metric within the chosen sparsity range was also computed for statistical comparison (41,46). For regional measurements, we calculated the connectivity strength of each node and compared differences between the two conditions (permutation tests with FDR of 5%).

#### **Functional Connectivity Analysis**

To further localize specific pairs of brain regions in which functional connectivity was altered after ketamine application, the NBS approach was used to seek between-group differences (37). The NBS approach copes with the multiple comparison problems of comparing connection data with  $[N \times (N - 1)/2]$  connections. The correction strategy is analogous to cluster-based strategies used in voxel-wise MRI data analysis by evaluating the null hypothesis at the level of connected subnetworks rather than individual connections. In this method, subnetworks were identified with a strategy similar to identifying significant clusters in fMRI analysis (see Supplement 1 for details), and connections in subnetworks that were significant at a corrected level of p < .05 were reported.

#### RESULTS

### Ketamine-related Regulations of Small-World Properties

We determined a data-specific small-world regimen at a sparsity range of  $.1 \le S \le .3$  to construct a simplified graphic network model consisting of brain regions (nodes) and connections (edges drawn between nodes to represent functional connectivity) (Figure 1B). We began by examining the smallworld properties of the networks (Figure 1B) and observed that functional networks of both saline and ketamine conditions possessed typical features of small-worldness (i.e.,  $\gamma > 1$  and  $\lambda~\approx~$  1) (Figure S2 in Supplement 1). In comparison to saline treatment, the ketamine group consistently showed significant decreases in  $C_{p}$  (FDR-corrected p < .05),  $E_{loc}$  (FDR-corrected p < .05), and  $E_{glob}$  (FDR-corrected p < .005) (Figure 2A,2F, 2G), and significant increases in  $L_p$  (FDR-corrected p < .0005) and  $\lambda$  (FDR-corrected p < .05) at each sparsity level (Figure 2B,2D). Neither changes in  $\gamma$  (FDR-corrected p = .14) nor in  $\sigma$  (FDR-corrected p = .35) between the two groups were statistically significant (Figure 2C,2E). These findings were confirmed by comparing the parameter area under the curve of each global network metric (Figure 2H).

#### Ketamine-related Regulations of Regional Nodal Strength

The connectivity strength of each node was compared between the two conditions, showing that ketamine produced substantial downregulation (Figure 3, cold colors) and upregulation (Figure 3, warm colors) in widely distributed brain regions (Figure 3 and Table S2). For simplicity, we categorized the affected brain nodes into two main classes by their significance levels. The most striking reduction in connectivity strength occurred in the bilateral orbital (orbitoinferior and orbitomedial) frontal cortices (OFC), striatum (bilateral caudate and putamen), bilateral globus pallidum, right gustatory cortex, right secondary somatosensory cortex and limbic structures including the left anterior cingulate cortex (ACC), right posterior insula, and bilateral hippocampus, parahippocampus, and



Figure 2. Ketamine-related regulations of global small-world properties of functional brain network. (A-G) Small-world properties were plotted as a function of sparsity level, S, within the small-world regimen of .10  $\leq$  S  $\leq$  .30. Asterisks in the plot denote significant group differences (false discovery rate corrected, p < .05). (H) Altered area under the curve (AUC) of small-world network properties in the ketamine group compared to the saline group. Significant differences were found between the clustering coefficient  $C_p$  (p = .0035), the shortest path length  $L_p$  (p = .0001), the normalized shortest path length  $\lambda$  (p = .0061), the global efficiency  $E_{glob}$  (p = .0001), and the local efficiency  $E_{loc}$  (p = .0006) values of the saline group and those of the ketamine group. Error bars are standard errors of the mean.

thalamus (FDR-corrected p < .01). Modest but significant decreases were found in the right ACC, left posterior cingulate cortex (PCC), sensory areas (somatosensory, visual, auditory, motor and gustatory cortices), right ventrolateral premotor, left

medial prefrontal cortex (PFC), and right ventral temporal cortex (FDR-corrected p < .05). In contrast, brain nodes with increased connectivity strength were restricted to the left superior and inferior parietal cortices (FDR-corrected p < .05).



**Figure 3.** Ketamine-related alterations of nodal strength in functional brain network. Spheres in warm (red) or cold (teal and dark blue) colors indicate brain regions with increased or decreased nodal strength in response to ketamine intake. Size of the spheres represents statistical significance,  $-\log_{10}(p)$  (corrected for multiple comparisons). See Table S2 for details. Brain areas were rendered on the transparent surfaces of the F99 template using BrainNet Viewer software. L, left; R, right. See Supplementary Table S1 for abbreviations of brain regions.

Notably, assessment of the left dorsolateral, polar and centrolateral PFC in ketamine versus saline controls also revealed increased connectivity strength; however, they did not withstand correction for multiple comparisons (FDR-corrected p =.07, p = .09, and p = .10, respectively).

# Ketamine-related Regulations of Functional Connectivity

NBS analysis was conducted to characterize the specific features within the network. As shown in Figure 4A, downregulated functional connectivity was persistent among the limbic system (subgenual, retrosplenial, anterior, and posterior cingulate cortices, hippocampus, thalamus, and anterior insula), striatum (NAc, caudate), globus pallidum, OFC and ventrolateral PFC, frontal eye field area, premotor cortex, sensory areas and subareas of the temporal and parietal lobes (see Table S3 in Supplement 1 for each decreased connection ranked by significance level; p < .05, corrected for multiple comparison). To illustrate higher order topological reconfiguration of the network, we continued to sort each affected node by the total number of altered connections (i.e., degree of affected nodes) and plotted a schematic diagram according to classic anatomical divisions of the brain (Figure 4B and Table S4). This clearly showed that the subgenual cingulate cortex (also known as Cg25) became a principal ketamine-mediated target because the connectivity between Cg25 and the other 14 brain areas (both hemispheres) decreased significantly in response to ketamine intake. Topranked brain regions targeted by this NMDA receptor antagonist also included NAc and PCC, each of which had more than nine decreased connections to other structures. Another pronounced feature in Figure 4B is the preponderant downregulation of the frontocingulate and cingulate-striatal pathways among all altered connections. These results are compatible with the predictive role of the frontocingulate circuit postulated in MDD treatment response (47).

# **Overall Ketamine-related Regulations of Functional Brain Networks**

Taking both node and edge results into account (see Table S5 in Supplement 1 for combination criteria), we found large-scale robust reconfiguration of the whole-brain functional network 18 hours after ketamine administration (Figure 5). The most obviously affected areas, such as the OFC, Cg25, NAc, and PCC, were located predominantly within the cortical-limbic-striatal loops. Overall marked reduction in coherent neural activity was observed primarily in the limbic system (Figure 5, deep blue regions). By contrast, limited cortical areas involving superior and inferior parietal cortices exhibited upregulation of functional connectivity.



**Figure 4.** Ketamine-related decrease in functional connectivity. (**A**) Significantly decreased intra- (left and right panels for left and right hemispheres, respectively) and interhemisphere (middle panel) functional connectivity. Thickness of lines representing decreased functional connectivity was scaled with the statistical significance,  $-\log_{10}(p)$ . (**B**) A hierarchical diagram of the altered connections and connected brain regions in **A** was plotted to present higher order topological reconfiguration evoked by ketamine. Size of spheres indicated the degree of relevant brain areas (i.e., number of decreased connections with other regions). All involved brain regions (including left and right hemispheres) were depicted on a ring and categorized (color-coded) by anatomical locations. See Table S3 for more information. L, left; R, right. See Supplementary Table S1 for abbreviations of brain regions.

## DISCUSSION

### **Global Regulation of Small-World Networks**

The brain is organized in an economical small-world architecture that supports both functional integration and segregation (36,41,44), although this delicate balance in brain networks can be vulnerable to disruption by various pathological processes. Previous studies provide consistent evidence of deviant topological organization of functional brain networks in depressed patients, characterized by decreased path length ( $L_p$  and  $\lambda$ ) and increased global efficiency ( $E_{glob}$ ) (46,48). Strikingly, in the present study, sustained regulation of the functional network integration induced by ketamine in normal monkeys was exactly opposite to the maladaptive alterations observed in



Figure 5. Overall illustration of affected macaque brain regions shown by lateral (left), medial (middle), and ventral (right) views of the right hemisphere. Brain regions were anatomically defined according to the regional map by Bezgin. Levels of downregulation (cold colors) and upregulation (warm colors) were defined on the basis of the node (Figure 3) and edge (Figure 4) results (see Supplement 1 for detailed rules). The most prominent up- and down-regulated brain regions were labelled. Caret software was used to visualize the results on the macaque brain surfaces with inflated F99 template. See Supplementary Table S1 for abbreviations of brain regions.

MDD patients (49). This indicates that a single exposure to ketamine may restore the brain's capacity for functional information integration for a prolonged period by reversing the impaired network integration in depression. We also found significant decreases in network metrics representing brain segregation ( $C_p$  and  $E_{loc}$ ), which has not been reported in depressed patients previously. We propose that chronic recovery of MDD is concomitant with normalized balance between functional integration and segregation, which can be achieved by ketamine-mediated network reconfiguration.

At the network level, numerous rsfMRI studies in clinical patients have suggested a crucial role of increased connectivity within the "default-mode network" (DMN) in the pathophysiology of major depression (46,50-52), because DMN is supposed to subserve episodic memory retrieval and selfreferential cognition and is behaviorally linked to the ruminative nature of depression in patients. A recent study demonstrated that 10 weeks of treatment with duloxetine normalized the abnormally increased coherence of neural activity within the DMN network in patients with dysthymia (53). Remarkably, the downregulated regions involving the medial PFC, PCC, and rostral and medial temporal lobes, identified by our network approach (rather than a priori seed-based correlation) constituted the main nodes of DMN reported previously in monkeys (19,28). It is interesting to speculate that single-dose ketamine treatment caused specific network-targeted downregulation, which may lead to the normalization of DMN connectivity in depression, thereby contributing to the relief of specific symptom like rumination.

Previous studies showed that ketamine rapidly induced synaptogenesis and reversed structural and functional deficits resulting from long-term stress exposure (7,11). Our results provide the first imaging evidence at the macroscopic scale suggesting that local synaptic alterations triggered by the transient blockade of NMDA receptors were able to translate into a sustained global reconfiguration of neural networks, counteracting the disrupted topological organization in depression.

#### **Regional Regulation of Small-World Networks**

Although NMDA receptors are ubiquitous in the entire brain (14) and immediate ketamine action is blockage of NMDA receptors, we demonstrated a highly heterogeneous, persistent ketamine-related activity pattern showing that

downregulation was prominently distributed in the OFC, striatum, and primary limbic structures, whereas upregulation was restricted mainly to parts of the parietal cortex. A wealth of evidence has revealed depression-related abnormalities in structural architecture, metabolic activity and functional connectivity within the OFC (1,54), PCC (1,51), ACC (47,55), striatum (1,56), and inferior parietal cortex (5,46). Our results showed that ketamine not only prioritized its targets in the cortical-limbic-striatal loops but also exerted target-specific regulation by reversing local alterations of the networks caused by illness. Notably, changes in both nodal strength and edge connection occurred in the thalamus, which plays a vital role in the pathophysiology of mood disorders (1). Due to limited spatial resolution here, we could not assess the potential effects involving the habenula (included in the thalamus node), a region heavily implicated in the depression circuit (57) and demonstrated in our recent work (58).

The fact that the key ketamine targets identified here, including Cg25, NAc, and PCC, are central to prevailing theories of heuristic depression circuits is of considerable interest (Figure 4B) (1,2,5,59). Functionally interactive networks of corticostriatal and corticolimbic pathways are critical to integrate mood and associate visual, motor, somatic, and cognitive behaviors (1). As key players in the cortico-limbicstriatal loop, Cg25 and NAc are actively involved in autonomic and homeostatic processes (3,60), as well as in emotional and cognitive control (3,59). Furthermore, both have been observed to be metabolically hyperactive in MDD patients (2,50,59). Deep brain stimulation (DBS) in the Cg25 of refractory MDD patients successfully lowered hyperactivity in the Cg25, OFC, and medial PFC, leading to remarkable clinical improvements (60,61). Furthermore, DBS in the ventral striatum (mainly NAc) also significantly decreased activity in the OFC, Cg25, PCC, thalamus, and caudate nucleus (62). Regulation of glutamatergic inputs to the NAc from the Cg25, medial PFC, hippocampus and insula, where restingstate hyperconnectivity was reported in MDD patients (1,52), could undertake a central role in rapidly alleviating anhedonia in depression. The action of ketamine observed here is congruent with current literature supporting the role of Cg25 activity as a promising predictor of antidepressant response.

We further observed that many local brain regions were profoundly affected by ketamine. Specifically, ketamine

selectively downregulated the medial PFC (albeit upregulation in the lateral PFC was not statistically significant after FDR correction) (Figure 3), which tends to enhance voluntary control of emotion generation and regulation but attenuate sensory-related reward processing (2,3,63). The dorsolateral PFC and inferior parietal cortex have been shown to be hypoactivated in depression (5), and DBS treatment in the Cg25 actually increased functional activity in the dorsolateral PFC and inferior parietal cortex (61). Upregulation of these two regions implies improved cognitive control over the vegetative-somatic part (5). Taken together, differential modulation in subdivisions of the PFC exerted by drug treatment is anticipated to achieve equivalent beneficial outcomes acquired by DBS therapy. This points to an important selective pathway through which ketamine may rectify malfunctioning emotion generation, procession and regulation in depression. Nevertheless, the underlying mechanisms of how local synaptic alterations evolve into discriminative regulation within the PFC need future investigation.

Several limitations in interpreting the present results should be considered. The effects of isoflurane, the most commonly used anesthetic in monkeys, could be reflected as changes in the correlation strength between brain areas, localization, or inclusion of distributed nodes within specific networks (19,28). However, recent research has shown that within a carefully controlled narrow range of isoflurane levels, such as  $\pm$  .26% in our study, statistical coupling between brain areas was consistent and reliable for investigation of functional brain architecture (19,26). Moreover, we argue the potential effect of anesthetic agents was removed by contrasting the saline and ketamine treatments in the same group subjects and the thresholds for network construction were applied uniformly to each subject in both conditions. However, overinterpretation of the present findings from healthy subjects should be kept in mind (49,64-66) until monkey models of mood disorders, such as depression and anxiety, have been developed (30) and used under the same experimental protocol. It was reported previously that schizophrenia-like symptoms can be induced by acute ketamine administration (67), although after a delay period (< 5 hours), the psychotomimetic effects do not last long in monkeys (32). Hence, our findings were not likely contaminated with such an effect as the monkeys were scanned 18 hours after administration. This study did not examine the neural origin of the sustained effects imposed by the action of ketamine, which needs to be addressed with the help of neurophysiological recordings. Further, the link between the neurobiological alterations and the graph network-model differences is missing, which definitely merits future work to clarify and validate.

#### Conclusions

In summary, our whole-brain analyses revealed large-scale network reconfiguration of the distributed cortico-limbicstriatal circuits, an effect visible at least 18 hours after application. Strikingly, the ketamine-induced activity patterns precisely opposed the maladaptive activity in the depressed brain, suggesting that ketamine may mediate its antidepressant effects in multiple behavior domains. Our findings pave a new avenue to understand the mechanisms underlying the efficacy of antidepressant action and to aid the development of improved therapeutics that guide plastic synaptic connections in these key areas analogically targeted by ketamine.

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#### **ARTICLE INFORMATION**

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