

1 **A Metabolomics–based Approach for Ranking the Depressive Level in Chronic**  
2 **Unpredictable Mild Stress Rat Model**

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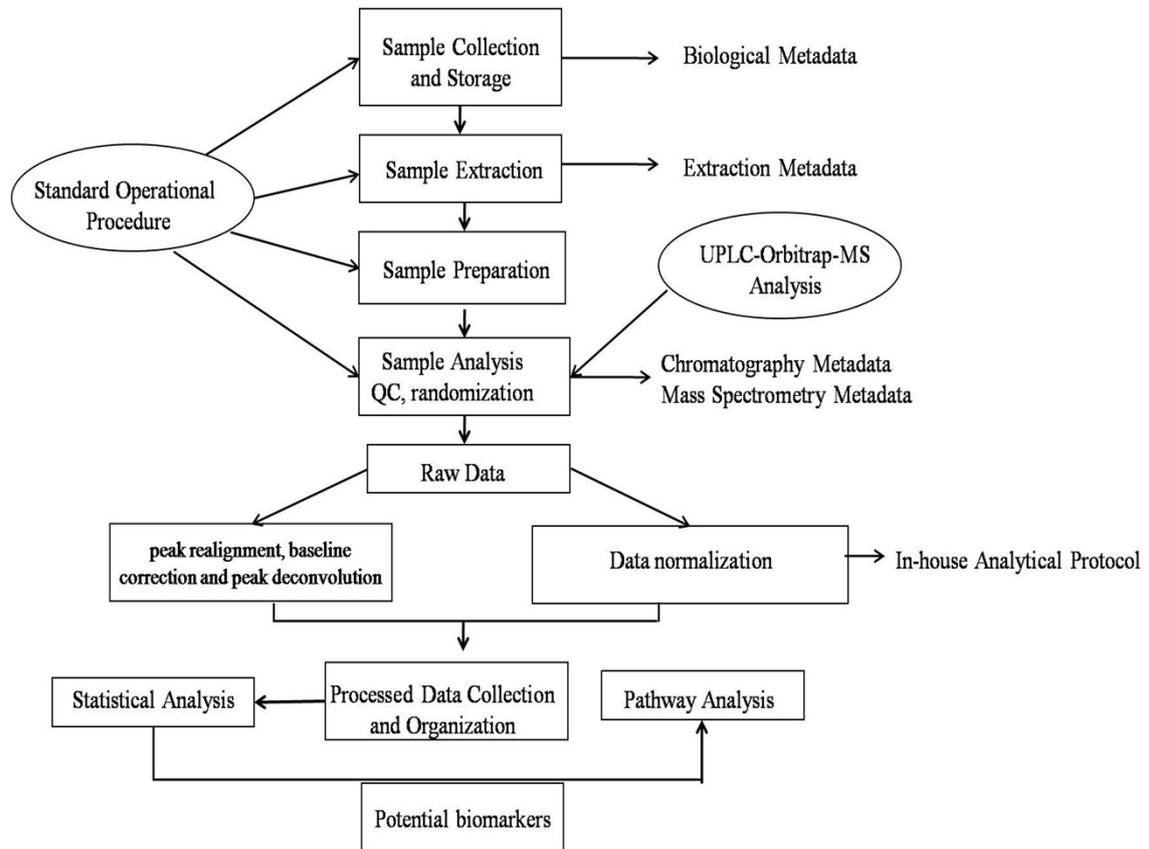
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### The experimental procedure of entire work



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## 50 **Biochemical interpretation for the remaining metabolites in plasma, hippocampus and PFC samples**

### 51 1. Amino acids metabolism

52 The significant alteration of several branched chain amino acids (BCAAs) were also noticed in model group.  
53 In this study, the level of BCAAs including isoleucine (Ile) and valine (Val) was down-regulated in hippocampus  
54 after CUMS procedure compared to that of control group. BCAAs had been proved critical to human life and they  
55 were particularly involved in stress, energy and muscle metabolism<sup>1,2</sup>. Recent studies showed that Ile help to form  
56 glutamine astrocytes to maintain the nitrogen balance in brain<sup>3,4</sup>. It could be transported through the blood–brain  
57 barrier and participated in the synthesis of glutamate by providing amino group. When combined with glutamine,  
58 the glutamyl-isoleucine complex proved to be involved in the control of locomotivity. The locomotivity of rats  
59 which received glutamyl-isoleucine complex injection in ventral tegmental area had been greatly improved  
60 which was partly due to the alteration of transmit afferent glutamatergic projections to PFC induced by glutamyl-  
61 isoleucine<sup>5</sup>. Based on the behavioral results especially for OPT, a decrease of locomotivity was observed due to the  
62 metabolic disturbance of Ile. Moreover, BCAAs also participated in the anabolism, energy metabolism and the  
63 regulation of blood glucose<sup>3</sup>. BCAAs also shared the same carrier-mediated transfer system with serotonin so the  
64 abnormal level of BCAAs could had an impact on the concentration of serotonin which was closely related to  
65 MDD. Ile was capable to participate in the biosynthesis of both carbohydrates and fats which suggested it was also  
66 involved in the perturbation of energy metabolism. Generally, these results indicated that MDD was a complicated  
67 psychiatric disorder in which lots of metabolic pathways were involved and metabolomics study could provide  
68 new thoughts of MDD from an overall perspective so as to deepen the understanding for it.

69 Glycine (Gly) was a simple, nonessential amino acid which acted as a coagonist with aspartic acid (Asp) in  
70 stimulation of NMDA receptors. Contrary to Asp which functioned as an excitatory neurotransmitter, Gly was  
71 another kind of inhibitory neurotransmitter and the regulation for the dynamic balance between the level of Asp  
72 and Gly was vital for NMDA receptors to perform normal function<sup>6</sup>. The decreased level of Gly along with the  
73 evaluation level of Asp might due to the parafunction of NMDA receptor-mediated neurotransmission. Besides, as  
74 a non-essential amino acid, the change of digestive and absorptive capacity along with the loss of appetite might be  
75 respond for the significant reduction of Gly which was observed in our study.

76 Beta-alanine was formed in vivo by the degradation of dihydrouracil and carnosine. It was a component of the  
77 naturally occurring peptides carnosine, anserine and pantothenic acid which was related to the biosynthesis of  
78 coenzyme A (CoA)<sup>7</sup>. As was mentioned above, NAA was synthesized from aspartic acid and acetyl-coA, and there  
79 was a metabolic disturbance of NAA in model rats which was also related to the changing level of beta-alanine.

80 Moreover, intracerebral ventricle administration of beta-alanine could induce a significantly inhibited exploratory  
81 behavior in animal model which was consistent with our results in OPT<sup>8</sup>. Therefore, these results indicated that the  
82 dysregulation of beta-alanine was also a factor which would induce depressive-like behaviors in CUMS model.

83 Lysine (Lys) was an essential amino acid and the deficiency of Lys was responsible for immunodeficiency  
84 and the requirement for it was increased when experiencing stress. The significant reduction of Lys level had been  
85 found in patients suffering Parkinson's disease and MDD<sup>9, 10</sup>. Besides, when received lysine therapy, it could  
86 normalize the level and had been associated with improvement of some patients with these conditions. Some  
87 researchers believed that the deficiency of Lys had an impact on the release of serotonin in amygdala and  
88 norepinephrine in hypothalamus. However, the exact mediating mechanism remained unclear, so it was necessary  
89 to further look into the function of Lys in MDD on this basis which might provide a new research focus for MDD  
90 in the future.

## 91 2. Energy metabolism

92 Blood derived glucose is the major source for energy metabolism in the brain, and the metabolic disturbance  
93 of glucose in blood has been proved to be related with some central nervous system (CNS) disease including  
94 schizophrenia and bipolar disorder<sup>11, 12</sup>. It had been observed that the level of glucose and sorbitol which was  
95 synthetically produced from glucose was decreased, suggesting there was a perturbation in the glucose metabolism  
96 through sorbitol pathway<sup>13</sup>. Besides, the concentration of citric acid and succinic acid were significantly decreased,  
97 and there were another two key metabolites involved in the citric acid cycle which was closely associated in the  
98 energy metabolism. Previous research had found a deficiency for peripheral concentration of glucose in MDD  
99 patients<sup>14</sup>, worse still, and both the turbulence of glucose metabolism could greatly affect the energy metabolism  
100 and the energy deficiency would lead to symptoms like exhaustion and fatigue which were common in depressive  
101 patients.

102 Glycerol was an important component of triglycerides (i.e. fats and oils) and of phospholipids. It was a three-  
103 carbon substance that formed the backbone of fatty acids in fats. When the body used stored fat as a source of  
104 energy, glycerol and fatty acids were released into the bloodstream. The glycerol component was capable to be  
105 converted to glucose by the liver and provides energy for cellular metabolism. In conjunction with the observed  
106 lipids metabolic disturbance in this study, we could infer that the abnormal level of glycerol was involved in the  
107 perturbation for both energy metabolism and lipids metabolism.

## 108 3. Lipid metabolism

109 The remarkably changed level of several lipid species including PCs, LPCs, LPEs, linolenic acid and

110 dihydroxyacetone phosphate was observed in CUMS model rats which suggested that the pathogenesis of MDD  
111 may be associated with the abnormalities in lipid metabolism. Linolenic acid was a kind of polyunsaturated fatty  
112 acid which functioned as the precursor of the principal omega-6 polyunsaturated fatty acid arachidonic acid.  
113 Arachidonic acid could participate in the regulation of neuronal signal transduction as a second messenger. The  
114 lower level of linolenic acid indicated an association of MDD with abnormality in fatty acid metabolism. DHAP  
115 was an important intermediate in lipid biosynthesis and ATP synthesis, therefore, the decreased level of DHAP  
116 might indicate a decreased generation of ATP in model rats. Some studies had pointed out the disturbances of  
117 lipids metabolism was closely associated with the CNS diseases such as MDD or Alzheimer's disease<sup>15, 16</sup>. By the  
118 hydrolysis action of phospholipase A2, the lysophospholipids could be biosynthesized from phosphoglycerides.  
119 Researchers had explored the relationship between phospholipase A2 gene and the pathogenesis of bipolar  
120 disorder and found the level of activity of phospholipase was increased in the serum of depression subjects<sup>17</sup>. The  
121 evaluated concentration of LPCs was probably related to the oxidative stress via the 5-lipoxygenase pathway, and  
122 the enhanced oxidative stress induced by LPCs could act on endothelial cells and lead to some diseases including  
123 metabolic syndrome, cardiovascular and cerebrovascular diseases<sup>18, 19</sup>. Moreover, a lipidomics indicated a high  
124 correlation between the concentration of PC-O in plasma and depressive symptoms. Plasmalogen which  
125 functioned as an antioxidant to defend oxidative stress could be synthesized in the desaturation of alkyl-acyl PCs  
126 and PEs, and therefore, the results indicated the enhanced oxidative stress and reduced antioxidation ability were  
127 involved in the pathogenesis of MDD. Additionally, the disturbed metabolism of some unsaturated fatty acids such  
128 as docosahexaenoic acid (DHA) and 3-hydroxy-hexadecanoic acid (HHA) which acted as the important  
129 constituent of cytomembranes also had been observed in CUMS model. For DHA, it was one of the most common  
130 omega-3 essential fatty acids in brain phospholipids and it had been reported that the reduction level of DHA could  
131 finally result in a decrease for serotonin which was closely related to MDD<sup>20</sup>. DHA was a major component of  
132 neuron membranes in the brain which played a key role in the development of brain cell especially for the  
133 formation of synapse. It was able to keep the normal nerve function and metabolism activity and was also involved  
134 in the formation of memory. Study suggested that DHA could protect neuron from damage and down-regulate the  
135 expression of caspase-3 protein which proved to be a hallmark of apoptosis<sup>21</sup>. In this study, the decreased level of  
136 DHA in model rats had been observed which was correspond with previous study which indicated a metabolic  
137 disorder for DHA after CUMS procedure. Besides, HHA was an intermediate in fatty acid biosynthesis which was  
138 converted from 3-oxo-tetradecanoic acid via fatty-acid synthase and 3-oxoacyl- acyl-carrier-protein reductase. The  
139 reduction of both DHA and HHA indicated that the CUMS procedure could further affect the fatty acid

140 metabolism.

141 4. Antioxidant metabolism

142 The level of azelaic acid which could inhibit the generation of reactive oxygen species (ROS) via the  
143 inhibition of enzyme activity for NADPH oxidase was significantly lower in the plasma of CUMS model rats.  
144 Studies have shown that MDD had a close relationship with the increased oxidative stress<sup>22, 23</sup>, and this may partly  
145 due to the down-regulation of azelaic acid. The reduction of azelaic acid in plasma was likely to indicate a decline  
146 in the function of antioxidant defense system which could finally cause the increased oxidative stress.

147 Myo-inositol was a cyclic polyalcohol which functioned as a second messenger in the metabolism of  
148 phosphatidylinositol and involved in the synthesis of membrane inositol phosphates. It was also mainly in the  
149 astrocyte and played an important role in the cellular signal transduction in phosphatidylinositol cycle astrocyte.  
150 Besides, it was one of the most important osmoregulators and had a crucial role in trophic function of cells and  
151 antioxidation. Abnormal level of myo-inositol and the metabolism of phosphatidylinositol could probably be  
152 associated with the pathophysiology of psychiatric disorders. An evaluation of plasma myo-inositol was observed  
153 in model group, and it was regulated by the antidepressive treatment which suggested abnormal level of myo-  
154 inositol and the metabolism of phosphatidylinositol could probably be associated with the pathophysiology of  
155 MDD.

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**S-Table.1** Stressor weekly schedule

Time	Stressor	Lasting period
Monday	Cage cleaning, changing the soiled padding and weighing the rats	8:00
	Food and water deprivation	13:00
Tuesday	Sucrose preference test	9:00-11:00
	Paired housing	15:00-8:00
Wednesday	Single housing	8:00
	Soiled cage	15:00-8:00
	White noise	20:00-23:00
Thursday	Cage cleaning and changing the solid padding	8:00
	Food deprivation	8:00-20:00
	Cage tilting	20:00-8:00
	Water deprivation	8:00-20:00
Friday	Stroboscopic illumination	20:00-23:00
	Cage tilting	23:00-11:00
	Paired housing	8:00-20:00
Saturday	Overnight illumination	20:00-8:00
	Soiled cage	15:00-8:00
Sunday	White noise	12:00-15:00

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## 173 Supplementary Information Table.2

174 **S-Table.2** Food consumption and body weight of rats during the period of chronic stress

Week	Item (g)	Control	Model	Treat
5	Food Consumption	215.0±11.6	210.1±8.2	220.5±13.4
	Body weight	291.7±17.8	308.2±26.7	302.3±22.7
8	Food Consumption	231.6±15.2	199.6±17.2*	204.9±9.5*
	Body weight	435.8±24.7	361±28.8*	374.9±36.3*
12	Food Consumption	243.6±10.6	210.5±7.9*	231.7±13.7
	Body weight	498.2±35.7	417.5±29.5**	450.1±41.3

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## 178 Supplementary Information Table.3

179 **S-Table.3** Retention time shift of identified metabolites in plasma

No	Metabolite	t <sub>R</sub> (min)	Shift (min)
181	1 L-Phenylalanine <sup>a</sup>	2.53	0.06
182	2 Gamma-Aminobutyric acid <sup>a</sup>	7.04	0.11
183	3 L-Tryptophan <sup>a</sup>	4.54	0.14
184	4 Glycine <sup>a</sup>	0.91	0.02
185	5 Dopamine <sup>a</sup>	1.08	0.04
186	6 Beta-Alanine <sup>a</sup>	6.92	0.09
187	7 Azelaic acid <sup>a</sup>	1.51	0.03
188	8 Myoinositol <sup>a</sup>	0.67	0.02
189	9 Glucose <sup>a</sup>	0.65	0.01
190	10 L-Kynurenine <sup>a</sup>	5.85	0.05
191	11 Hypoxanthine <sup>a</sup>	0.65	0.02
192	12 Glycerol <sup>a</sup>	0.94	0.01
193	13 Quinolinic acid <sup>a</sup>	0.94	0.02
194	14 Kynurenic acid <sup>a</sup>	0.69	0.02
195	15 N-Acetyl-L-aspartic acid <sup>a</sup>	4.28	0.05
196	16 Citric acid <sup>a</sup>	1.08	0.02
197	17 Sorbitol <sup>a</sup>	5.33	0.10
	18 Corticosterone <sup>a</sup>	6.85	0.15

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199 **S-Table.4** Retention time shift of identified metabolites in hippocampus

200	No	Metabolite	t <sub>R</sub> (min)	Shift (min)
201	1	L-Tryptophan <sup>a</sup>	4.46	0.06
	2	L-Tyrosine <sup>a</sup>	1.04	0.02
202	3	Citric acid <sup>a</sup>	1.02	0.04
203	4	L-Valine <sup>a</sup>	5.22	0.07
	5	N-Acetyl-L-aspartic acid <sup>a</sup>	4.43	0.10
204	6	L-Kynurenine <sup>a</sup>	5.96	0.06
205	7	Quinolinic acid <sup>a</sup>	0.90	0.02
	8	Inosine <sup>a</sup>	1.87	0.05
206	9	Glutathione <sup>a</sup>	0.98	0.02
207	10	3-Hydroxy-hexadecanoic acid <sup>a</sup>	5.07	0.09
	11	L-Isoleucine <sup>a</sup>	1.23	0.03
208	12	L-Phenylalanine <sup>a</sup>	2.50	0.03
209	13	Myoinositol <sup>a</sup>	0.62	0.02
	14	Gamma-Aminobutyric acid <sup>a</sup>	6.90	0.03
210	15	Glycerol <sup>a</sup>	0.92	0.01
211	16	L-Serine <sup>a</sup>	1.72	0.04
	17	Homocysteine <sup>a</sup>	1.98	0.05
212	18	Succinic acid <sup>a</sup>	1.42	0.04
213	19	Beta-Alanine <sup>a</sup>	7.01	0.18

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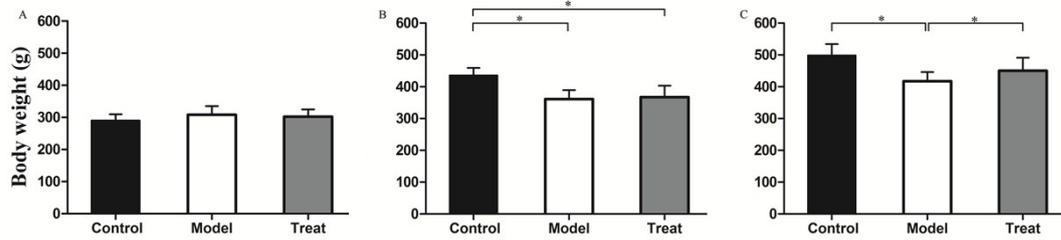
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**S-Table.5** Retention time shift of identified metabolites in PFC

No	Metabolite	t <sub>R</sub> (min)	Shift (min)
1	Kynurenic acid <sup>a</sup>	0.73	0.02
2	L-Tryptophan <sup>a</sup>	4.46	0.06
3	Dopamine <sup>a</sup>	0.96	0.08
4	Quinolinic acid <sup>a</sup>	0.99	0.07
6	Inosine <sup>a</sup>	1.90	0.06
7	Linolenic acid <sup>a</sup>	8.99	0.23
8	L-Dopa <sup>a</sup>	0.75	0.02
9	5-Hydroxyindoleacetic acid <sup>a</sup>	0.81	0.02
10	N-Acetyl-L-aspartic acid <sup>a</sup>	4.45	0.12
11	Docosahexaenoic acid	5.78	0.17
12	L-Isoleucine <sup>a</sup>	1.24	0.04
13	Gamma-Aminobutyric acid <sup>a</sup>	7.09	0.16
14	Homovanillic acid <sup>a</sup>	0.68	0.02
15	L-Kynurenine <sup>a</sup>	5.98	0.08
16	L-Phenylalanine <sup>a</sup>	2.52	0.05
17	L-Lysine <sup>a</sup>	5.27	0.13
18	Tyramine <sup>a</sup>	9.65	0.20
19	L-Tyrosine <sup>a</sup>	1.05	0.03
20	L-Aspartic acid <sup>a</sup>	1.14	0.04

245 Supplementary Information Fig.1



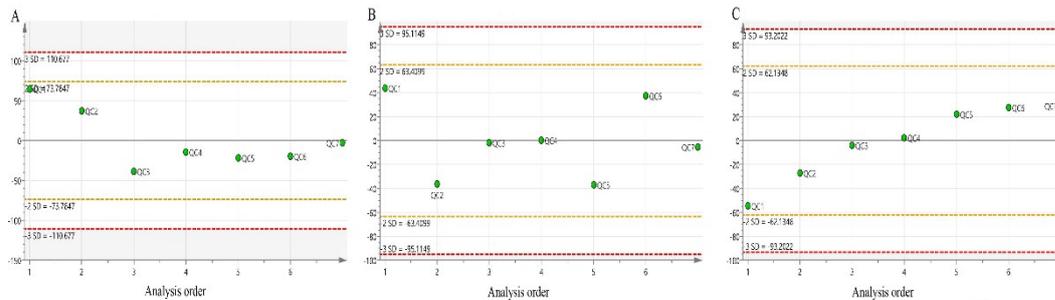
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247 **S-Fig.1** The body weight of baseline (a), week3 (b) and week7 (c) for control, model and treated group.Data are  
 248 represented as mean±SD. \* means a statistically significant difference at  $p < 0.05$ .

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251 Supplementary Information Fig.2



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253 **S-Fig.2** The PCA score plot of each QC sample in plasma, hippocampus and PFC.

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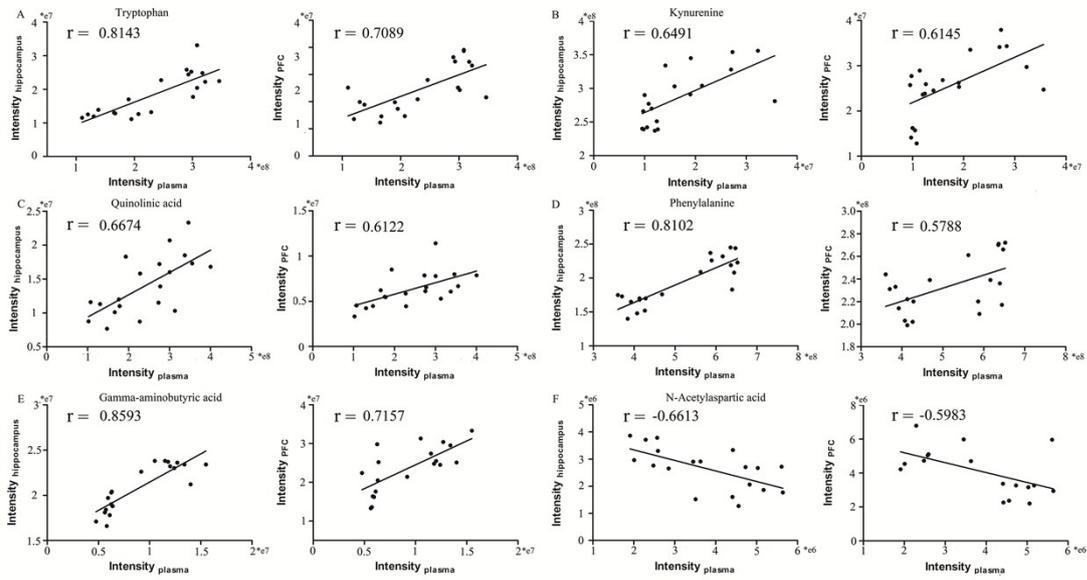
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259 Supplementary Information Fig.3



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261 **S-Fig.3** The binary logistic regression plot for the simplified panel between plasma, hippocampus and PFC

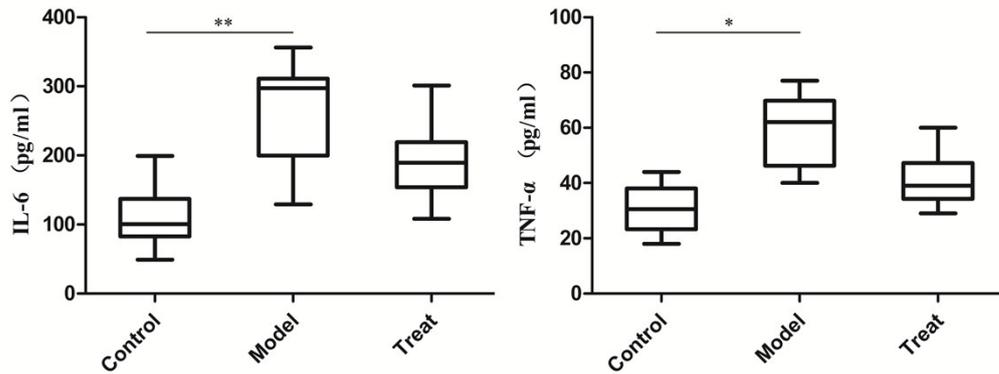
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266 Supplementary Information Fig.4



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268 **S-Fig.4** The box plot of IL-6 and TNF- $\alpha$  in the plasma of rats.

269 \*\* means a statistically significant difference at  $p < 0.01$ , \* means a statistically significant difference at  $p < 0.05$ .

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