- 1 Full title: Systematic analysis of brain lactate and pH levels in 65 animal models related to
- 2 neuropsychiatric conditions
- 3 Short title: Brain lactate and pH in neuropsychiatric disorder models
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 13

14 Abstract

15 Altered brain energy metabolism associated with increase in lactate levels and the 16 resultant decrease in pH have been increasingly implicated in multiple neuropsychiatric 17 disorders, such as schizophrenia, bipolar disorder, autism spectrum disorder and 18 neurodegenerative disorders. Although it is controversial, change of pH/ lactate level as a 19 primary feature of these diseases, rather than a result of confounding factors such as 20 medication and agonal state, has been evidenced. Animal models that can be studied 21 without such confounding factors inherent to humans are a suitable alternative to 22 understand the controversy. However, the knowledge in animal models regarding brain pH and lactate and their relation to behavioral outcomes is limited in the context of 23 24 neuropsychiatric disease conditions. In this study, we investigated the common 25 occurrence of changes in the pH and lactate levels in the brain in animal models by 26 analyzing 65 animal models related to neuropsychiatric and neurodegenerative diseases 27 with 1,239 animals. Additionally, we evaluated the behavioral phenotypes relative to the 28 chemical changes in the brain. Among the models, 27 and 24 had significant changes in 29 brain pH and lactate levels, respectively, including Shank2 KO mice, Clock mutant mice, 30 serotonin transporter KO mice, mice with a paternal duplication of human chromosome 31 15q11-13, Fmr1 KO mice, BTBR mice, APP-J20 Tg mice, social defeat stress-exposed mice, 32 corticosterone-treated mice, and streptozotocin-induced diabetic mice. Meta-analysis of 33 the data revealed a highly significant negative correlation between brain pH and lactate

34 levels, suggestive of increased lactate levels causing decreased brain pH. Statistical 35 learning algorithm based on the comprehensive data has revealed that the increased 36 brain lactate levels can be predominantly predicted by the indices for the percentage of 37 correct response in working memory test, with a significant simple, negative correlation. 38 Our results suggest that brain energy metabolism is commonly altered in many animal models of neuropsychiatric and neurodegenerative diseases, which may be associated 39 40 with working memory performance. We consider our study to be an essential step 41 suggesting that the brain endophenotypes serve as a basis for the transdiagnostic 42 characterization of the biologically heterogeneous and debilitating cognitive illnesses. Based on these results, we are openly accepting collaborations to extend these findings 43 44 and to test the hypotheses generated in this study using more animal models. We 45 welcome any mice/rat models of diseases with or without any behavioral phenotypes.

46

47 Introduction

| 48 | Neuropsychiatric disorders, such as schizophrenia (SZ), bipolar disorder (BD), major |
|----|--|
| 49 | depressive disorder (MDD), autism spectrum disorder (ASD), and Alzheimer's disease (AD), |
| 50 | are common with a prevalence of more than one-third of the population in most countries |
| 51 | being diagnosed with at least one such disorder at some point in their life (1). Although |
| 52 | these diseases clinically fall into different diagnostic categories, some biological features, |
| 53 | such as genetic mutations, molecular changes, and brain activity alterations, are common |
| 54 | among them (2–6), suggesting a common underlying biological basis. Increasing evidence |
| 55 | suggests that metabolic alterations in the brain are shared by the multiple |
| 56 | neuropsychiatric disorders. Increases in the levels of lactate, an end-product of glycolysis |
| 57 | pathway, have been observed in the brain of patients with SZ, BD, ASD, MDD, and epilepsy |
| 58 | (7–15). Increased lactate levels is considered to lead to decreased pH and are associated |
| 59 | with brain energy deficits (12). Recent large-scale meta-analyses have confirmed |
| 60 | increased brain lactate and decreased pH in SZ and BD (16,17). Such increased lactate and |
| 61 | decreased pH have also been observed in the brains of patients with AD (18–24). However, |

| 62 | the observed phenomena are potentially confounded by secondary factors inherent in |
|----|--|
| 63 | human studies, such as antipsychotic treatments (10). Agonal experiences associated with |
| 64 | these disorders may also complicate the interpretation of postmortem study results (25– |
| 65 | 27). Although some human studies suggest that medication use is not a major factor for |
| 66 | regulating brain pH and lactate levels (7,10,11,15,28), excluding the effects of other |
| 67 | potential confounding factors in human studies especially using postmortem brain |
| 68 | samples is technically difficult. Animal models, devoid of such confounding factors, may |
| 69 | help to confirm whether increased brain lactate and decreased pH levels are associated |
| 70 | factors. |
| 71 | Recently, increased brain lactate and decreased pH levels were demonstrated to |
| 72 | be commonly found in five strains of neurodevelopmental mouse models of psychiatric |
| 73 | disorders (29). As all of the mice used in the study were drug-naïve, with equivalent |
| 74 | agonal states, postmortem intervals, and ages within each strain, those findings in mouse |
| 75 | models suggest that increased lactate and decreased pH reflect an underlying |
| 76 | pathophysiology, rather than mere artifacts, in at least a subgroup of patients with these |

| 77 | mental disorders. However, the knowledge of brain pH and lactate in the animal models is |
|----|---|
| 78 | limited to small numbers of models and systematic evaluations using the same platform |
| 79 | have not been conducted so far in animal models. Therefore, we have extended our |
| 80 | previous study (29) to a larger variety of animal models of neuropsychiatric disorders, as |
| 81 | well as of neurodegenerative disorder, AD, and peripheral diseases or insults that are |
| 82 | comorbid with psychiatric conditions (e.g., diabetes mellitus (DM), colitis, and peripheral |
| 83 | nerve injury). Those animal models include 65 strains or conditions of mice and rats with |
| 84 | genetic modifications, drug treatments, and other experimental manipulations (Table 1). |
| 85 | Combining the large-scale brain lactate data with behavioral data (e.g., working memory, |
| 86 | locomotor activity, anxiety-like behavior, and depression-like behavior), we also sought to |
| 87 | investigate the relations between alterations in brain lactate levels and behavioral |
| 88 | outcomes. |
| 89 | |

90 Results

91 Altered brain pH and lactate levels in animal models

| 92 | The raw data of brain pH and lactate, and detailed information of animals (age, sex, and |
|-----|---|
| 93 | treatment methods) are included in Supplementary Table 1. Among the 65 |
| 94 | strains/conditions, 27 demonstrated significant changes in pH (5 increased, 22 decreased) |
| 95 | and 24 in lactate (19 increased, 5 decreased) in comparison with the corresponding |
| 96 | control animals (P <0.05; Supplementary Figure 1 and Supplementary Table 2). |
| 97 | Hierarchical clustering based on effect size and direction of changes classified those 65 |
| 98 | models into four groups: high lactate/low pH group, moderate high lactate/moderate low |
| 99 | pH group, low lactate/high pH group, and a group with minimal to no changes in lactate or |
| 100 | pH, consisting of 16, 6, 15, and 28 models, respectively (Figure 1), where high and low |
| 101 | mean higher and lower in mutant/experimental animals related to the corresponding wild |
| 102 | type/control animals, respectively. High lactate/low pH group included, for example, SZ |
| 103 | model Ppp3r1 KO mice and Nrgn KO mice, SZ/intellectual disability (ID) model Hivep2 (also |
| 104 | known as Shn2) KO mice, AD model APP-J20 Tg mice, and ASD model Chd8 KO mice. Low |
| 105 | lactate/high pH group included mainly mouse models for ASD or developmental delay, |

| 106 | such as Shank2 KO mice, Fmr1 KO mice, BTBR mice, Stxbp1 KO mice, Dyrk1 KO mice, Auts2 |
|--------------------------|--|
| 107 | KO mice, and patDp mice (Figure 1). |
| 108 | The Z-score-based meta-analysis of 1,239 animals analyzed in this study |
| 109 | revealed a highly significant negative correlation between brain lactate and pH levels |
| 110 | individually (Figure 2, Supplementary Figure 2), supporting the idea that decreased pH is |
| 111 | due to increased lactate levels in the pathological conditions related to neuropsychiatric |
| 112 | disorders. |
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| 113 | |
| 113 114 | Poorer working memory performance predicts higher brain lactate levels |
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| 114 115 116 | Most of the animal models we examined are known to show a wide range of behavioral abnormalities, such as deficits in learning and memory, and increased depression-like, |
| 114 115 116 117 | Most of the animal models we examined are known to show a wide range of behavioral abnormalities, such as deficits in learning and memory, and increased depression-like, anxiety-like behaviors or impaired sensorimotor gating. Thereafter, with our |

| 121 | discover intrinsic links between the chemical signatures in the brain and behaviors. Of the |
|-----|--|
| 122 | 65 animal models, we collected comprehensive behavioral data of 24 mouse models, |
| 123 | which were available in public source (e.g., published papers and database repository) or |
| 124 | in-house studies (see Methods and Materials; Supplementary Table 3). We constructed an |
| 125 | effect size-based model for predicting the brain lactate levels from behavioral data using |
| 126 | leave-one-out cross-validation method. Statistical evaluation of the prediction accuracy of |
| 127 | the model revealed a significant correlation between the actual and the predicted brain |
| 128 | lactate levels (Figure 3a), indicating that behavioral measures have a potential to predict |
| 129 | the brain lactate levels of individual models. |
| 130 | The prediction analysis was implemented to evaluate the behavioral measures |
| 131 | most useful to characterize the brain lactate levels of individual strains. The prediction |
| 132 | algorithm used identified behavioral signatures related to brain lactate levels by weighting |
| 133 | behavioral measures according to their individual predictive strength. Thus, we identified |
| 134 | the behavioral measures accompanying changes in brain lactate levels by examining the |
| 135 | weighted behavioral measures used for the prediction in linear regression. Three out of |

| 136 | nine behavioral measures were selected to build the successful prediction model and in |
|--------------------------|---|
| 137 | those measures for working memory was the most selected (Figure 3b). According to |
| 138 | simple correlation analysis, the measures for working memory were negatively correlated |
| 139 | with the brain lactate levels (Figure 3c). These results suggest that higher lactate levels in |
| 140 | the brain are related to lower performance in working memory tests in mouse models of |
| 141 | neuropsychiatric disorders. |
| 142 | |
| 143 | Effects of age and sex on the brain pH and lactate levels |
| 140 | Lifects of age and sex on the brain pri and lactate levels |
| 144 | Ages at sampling were matched within each strain/condition, but varied among |
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| 144 145 | Ages at sampling were matched within each strain/condition, but varied among strains/conditions, ranging from 5 to 103 weeks old in mice (Supplementary Table 1). No |
| 144 145 146 | Ages at sampling were matched within each strain/condition, but varied among strains/conditions, ranging from 5 to 103 weeks old in mice (Supplementary Table 1). No significant correlation was found between pH and age in wild type/control mice. Brain |
| 144 145 146 147 | Ages at sampling were matched within each strain/condition, but varied among strains/conditions, ranging from 5 to 103 weeks old in mice (Supplementary Table 1). No significant correlation was found between pH and age in wild type/control mice. Brain lactate levels had a significant negative correlation with age (Supplementary Figure 5), |

| 151 | injections or behavioral tests, and others had been kept undisturbed until sampling) |
|--------------------------|---|
| 152 | among strains/conditions. We further examined the effects of sex on the brain pH and |
| 153 | lactate levels. To minimize the effects of the limitations mentioned above, we used |
| 154 | Z-scores that were calculated within each strain/condition and focused on |
| 155 | strains/conditions with mixed gender. Female had significantly higher pH and lower |
| 156 | lactate levels than male in wild type/control animals (Supplementary Figure 6). |
| 157 | |
| | |
| 158 | Discussion |
| 158 159 | Discussion We performed a comprehensive analysis of brain pH and lactate in 65 animal models. The |
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| 159 160 161 162 | We performed a comprehensive analysis of brain pH and lactate in 65 animal models. The data suggested the diversity of brain-energy-metabolism among these model animals. Some mouse strains considered to model different diseases were found to exhibit similar pattern of changes in pH and lactate levels. Specifically, SZ models (Ppp3r1 KO and Nrgn |

| 166 | model (STZ-treated mice) commonly exhibited decreased brain pH and increased lactate |
|-----|--|
| 167 | levels. A BD model Polg1 Tg mice showed no differences in pH or lactate levels. However, |
| 168 | other BD model (Clock mutant mice) and ASD models, such as Shank2 KO (31), Fmr1 KO, |
| 169 | Dyrk1 KO (32), Auts2 KO (33), and patDp mice (34), were classified into a group with |
| 170 | opposite changes, or decreased lactate and increased pH group. Animal models with |
| 171 | different patterns of changes in brain pH and lactate levels may represent subpopulations |
| 172 | of patients or specific states of the diseases (13). While increased brain lactate levels in |
| 173 | neuropsychiatric conditions are almost consistent in the literature, decreased lactate |
| 174 | levels has also been found in a cohort of patients with SZ (35) and in euthymic state of BD |
| 175 | (36). Our results from animal studies may also support the idea that the patients |
| 176 | categorized based on the symptoms to particular neuropsychiatric disorders are |
| 177 | biologically heterogeneous (37) from a brain-energy-metabolism viewpoint. |
| 178 | The present animal studies revealed an extraordinarily high negative correlation |
| 179 | between brain lactate and pH levels, strengthening our previous findings from small-scale |
| 180 | animal studies (29). Negative correlation between them has been found in human |

181 postmortem study (10). These results suggest that brain lactate is a main regulator of the

- tissue pH (12), although we could not exclude the possibility that other factors such as
- 183 neuronal activity-regulated production of carbon dioxide, another metabolic acid, may
- also contribute to the changes in brain pH (38,39).

We observed no significant correlation between age and brain pH in wild type/control mice. In human studies, inconsistent results have been obtained with regard to correlation between brain pH and age. Some studies showed no significant correlation, (40,41), whereas other studies showed a negative correlation (42,43). Sex effects on brain pH is also inconsistent in human studies (40,41). Systematic analysis focusing on the effects of age and sex on the brain pH using animal models may help explain the inconsistency found in the human studies.

Does brain lactate exert favorable or unfavorable effects on learning and memory functioning? Our prediction analysis highlighted that poorer working memory performance may be predominantly associated with higher lactate levels in animal models of neuropsychiatric disorders (Figure 3). Additionally, in human studies, higher lactate has

| 196 | been associated with lower cognition in the individuals with SZ (14) and mild cognitive |
|-----|---|
| 197 | impairment (44). Given these observations, lactate production may be expected to exert |
| 198 | negative impacts on brain functions, especially memory formation. However, lactate |
| 199 | production stimulated by learning tasks has been suggested as requisite for memory |
| 200 | formation. Lactate production by the astrocytic glycogenolysis and its transport to |
| 201 | neurons serves as an energy substrate for neuronal activity, referred to as |
| 202 | astrocyte-neuron lactate shuttle (ANLS). Animal studies have demonstrated that the |
| 203 | pharmacological disruption of learning task-stimulated lactate production and transport |
| 204 | via the ANLS immediately before the testing impaired memory formation as assessed by |
| 205 | the plus-shaped maze spontaneous alteration task (testing short-term memory) (45) and |
| 206 | in the inhibitory avoidance task (testing long-term memory) (46,47). Collectively, |
| 207 | considering that brain lactate levels increase during stimulations in a temporally (and |
| 208 | spatially) restricted manner under physiological conditions (48,49), pathologically |
| 209 | persistent elevation of brain lactate levels may exert negative impact on brain functions |
| 210 | including memory processing, although the causality is unknown. Other possibility is that |

| 211 | decreased consumption of lactate for energy production due to mitochondrial dysfunction |
|-----|---|
| 212 | in neurons may underline the impaired learning and memory functioning in the disease |
| 213 | conditions. Mitochondrial dysfunction has been thought to lead to lactate accumulation |
| 214 | because of insufficient capacity of mitochondrial metabolism to metabolize lactate that |
| 215 | was produced (16,50,51). Mitochondrial dysfunction has been consistently implicated in |
| 216 | multiple neuropsychiatric disorders, including SZ, BD, MDD, ASD, and AD (52–54), among |
| 217 | which working memory deficits are common symptoms (55). In addition, given that lactate |
| 218 | rise reflects neuronal activation (29) and multiple brain regions are abnormally activated, |
| 219 | activation in the brain regions other than frontal cortex, one of the brain regions critical |
| 220 | for working memory (56), interfere with working memory performance, as proposed that |
| 221 | activity of core brain region could be interfered with noise from the rest on cognitive tasks |
| 222 | in patients with SZ (57). There is also the possibility that increased lactate may have a |
| 223 | beneficial effect to compensate for the impaired memory and cognition, as lactate |
| 224 | administration that increases brain lactate levels has been shown to attenuate cognitive |
| 225 | deficits in human patients (58) and rodent model (59) of traumatic brain injury. |

| 226 | Additionally, lactate administration has also been shown to exert antidepressant effects in |
|------------|---|
| 227 | depression model mice (60). We also cannot exclude the possibility that increased lactate |
| 228 | is also involved in behavioral alterations other than memory deficit per se, such as anxiety, |
| 229 | as we have found that increased brain lactate levels were associated with altered |
| 230 | anxiety-like behaviors in social defeat stress model of depression (61). Further studies are |
| 231 | required to address these issues, for example, by chronically inducing deficits of |
| 232 | mitochondria function to manipulate endogenous lactate levels in a brain-region-specific |
| 233 | manner and analyzing its effects on working memory. |
| 234 | |
| | As we used whole brain samples to measure the pH and lactate levels, we could |
| 235 | As we used whole brain samples to measure the pH and lactate levels, we could not determine whether the observed changes in pH/lactate levels occur ubiquitously in |
| 235 236 | |
| | not determine whether the observed changes in pH/lactate levels occur ubiquitously in |
| 236 | not determine whether the observed changes in pH/lactate levels occur ubiquitously in the entire brain or selectively in specific brain region(s) in each strain or condition of the |
| 236 237 | not determine whether the observed changes in pH/lactate levels occur ubiquitously in the entire brain or selectively in specific brain region(s) in each strain or condition of the models. Indeed, brain region-specific increase in lactate levels was observed in human |

| 241 | studies are required to address this issue, for example, by means of the measurements in |
|-----|---|
| 242 | micro-dissected brain samples and in vivo analyses using pH- or lactate-sensitive biosensor |
| 243 | electrode (45,62) and MRS (63). |
| 244 | In conclusion, the present study demonstrated that altered brain pH and lactate |
| 245 | levels were commonly observed in many animal models of SZ, BD, ASD, AD and other |
| 246 | neuropsychiatric disorders. These findings provide further evidence supporting the idea |
| 247 | that altered brain pH and lactate levels are not mere artifacts such as medication |
| 248 | confounding, but rather implicated in the underlying pathophysiology of, at least |
| 249 | subpopulations of, patients with the diseases. Alteration in the brain-energy-metabolism |
| 250 | or hyper- or hypo-activity of neurons in the brain leading to abnormal lactate and pH |
| 251 | levels may serve as a potential therapeutic target of neuropsychiatric disorders (17). In |
| 252 | addition, detection of brain lactate, such as by MRS, may help to diagnose and |
| 253 | subcategorize such biologically heterogeneous diseases, as shown in mitochondrial |
| 254 | disease (64). Future studies to identify the effective treatment strategies specific to the |
| 255 | sets of animal models that could recapitulate diversity of brain-energy-metabolism in |

256 human disease conditions may contribute to development of improved treatments for the

- 257 biologically defined subgroups of patients or disease states of the debilitating illnesses
- 258 beyond the clinically defined borders.

259

260 Table 1. Animal models used in this study

| | Name | Description | Related |
|---|-----------|--|---------------------|
| | | | diseases/conditions |
| 1 | APP Tg | Mice expressing familial Alzheimer's | AD(66,67) |
| | | disease-mutant human amyloid beta | |
| | | precursor protein (PDGF-hAPP _{swe/Ind} , line | |
| | | J20) (65) | |
| 2 | Arid1b KO | Mice with heterozygous knockout of the | ASD(69,70) |
| | | AT-rich interaction domain 1b (68) | |
| 3 | Auts2 KO | Mice with heterozygous knockout of the | ASD(71–73), ID(74), |
| | | Autism susceptibility candidate 2 (33) | SZ(75) |
| 4 | Barp KO | Voltage gated calcium channel | |
| | | beta-anchoring and -regulatory protein KO | |
| | | mice (76) | |

| 5 | Bdnf KO | Brain derived neurotrophic factor KO | |
|----|---------------|---|-------------------|
| | | mice* (JAX, 004339) | |
| 6 | BTBR | Inbred mouse strain BTBR T+ tf/J (77,78) | ASD |
| 7 | Camk2a KO | Mice with heterozygous knockout of the | BD(82–84), SZ(85) |
| | | calcium/calmodulin-dependent protein | |
| | | kinase II alpha (79–81) | |
| 8 | Camkk1 KO | Mice with forebrain-specific constitutively | |
| | | active form of calcium/calmodulin kinase | |
| | | kinase 1 (86) | |
| 9 | Ccnd2 KO | Cyclin D2 KO mice (87) | |
| 10 | CFA treatment | Mouse model of chronic inflammatory | Chronic pain |
| | | pain induced by complete Freund's | |
| | | adjuvant (CFA) (88,89) | |
| 11 | Chd8 KO | Mice with heterozygous knockout of the | ASD(91–95) |

| | | long isoform of chromodomain helicase | |
|----|----------------|--|---------------------|
| | | DNA-binding protein 8 (90) | |
| 12 | Chn1 KO | Chimerin 1 (α-chimerin) KO mice (96) | ASD(96) |
| 13 | Clock mutant | Mice with N-ethyl-N-nitrosourea-induced | BD(99,100), SZ(101) |
| | | mutation in circadian locomotor output | |
| | | cycles kaput (JAX, 002923) (97,98) | |
| 14 | Corticosterone | Mice chronically treated with | MD(104–106) |
| | treatment | corticosterone (102,103) | |
| 15 | Crmp2 KO | Collapsin response mediator protein 2 KO | AD(108), SZ(109) |
| | | mice (107) | |
| 16 | Dextran | Mice treated with dextran sulfate sodium | Colitis |
| | treatment | (110) | |
| 17 | Disc1-L100P | Mice with N-ethyl-N-nitrosourea-induced | SZ(112–114) |
| | mutant | L100P amino acid exchange mutation in | |

| | | , |
|---------------|---|--|
| | exon 2 of Disrupted-in-Schizophrenia 1 | |
| | (111) | |
| Disc1-Q31L | Mice with N-ethyl-N-nitrosourea-induced | SZ(112–114) |
| mutant | Q31L amino acid exchange mutation in | |
| | exon 2 of Disrupted-in-Schizophrenia 1 | |
| | (111) | |
| Dyrk1a KO | Mice with heterozygous knockout of the | ASD/ID(70,115,116) |
| | dual specificity tyrosine phosphorylation | |
| | regulated kinase 1a (32) | |
| ECS treatment | Mice treated with electroconvulsive | Treatment for |
| | stimulation (117,118) | MDD(119,120) |
| Fmr1 KO | Fragile X mental retardation protein | ASD, FMR, SZ(85) |
| | translational regulator 1 KO mice (121) | |
| Gasc1 | Gene amplified in squamous cell | ASD(124) |
| | mutant Dyrk1a KO ECS treatment Fmr1 KO | (111)Disc1-Q31LMice with N-ethyl-N-nitrosourea-inducedmutantQ31L amino acid exchange mutation inexon 2 of Disrupted-in-Schizophrenia 1(111)Dyrk1a KOMice with heterozygous knockout of thedual specificity tyrosine phosphorylationregulated kinase 1a (32)ECS treatmentMice treated with electroconvulsivestimulation (117,118)Fmr1 KOFragile X mental retardation proteintranslational regulator 1 KO mice (121) |

| | hypomorph | carcinoma 1 hypomorphic mutant mice | |
|----|-------------|--|----------------------|
| | | (122,123) | |
| 23 | Glra4 KO | Glycine receptor alpha 4 KO mice (125) | ID(126) |
| 24 | Grin1 KO | GABArgic neuron-specific glutamate | SZ(128,129) |
| | (postnatal) | receptor, ionotropic, NMDA1 KO mice | |
| | | (Protein phosphatase 1, regulatory subunit | |
| | | 2-cre; Grin1 ^{loxP/loxP}) (127) | |
| 25 | Grin1 KO | GABArgic neuron-specific glutamate | SZ(128,129) |
| | (adult) | receptor, ionotropic, NMDA1 KO mice | |
| | | (Protein phosphatase 1, regulatory subunit | |
| | | 2-cre; Grin1 ^{loxP/loxP}) (127) | |
| 26 | Gunn rat | Gunn rats (Gunn/Slc-j/j) (130) | SZ(131) |
| 27 | Hivep2 KO | Human immunodeficiency virus type 1 | ID(133,134), SZ(132) |
| | | enhancer binding protein 2 (Schnurri-2) KO | |

| | | mice (132) | |
|----|--------------|---|----------------------|
| 28 | Hyponatremia | Mice treated with 1-deamino-8-D-arginine | DS(138,139) |
| | | vasopressin and fed with a liquid formula | |
| | | (135–137) | |
| 29 | II18 KO | Interleukin 18 KO mice (140,141) | DM(142) |
| 30 | Ketamine | Mice treated with ketamine (143) | Psychosis(144) |
| | treatment | | |
| 31 | Lurasidone | Mice treated with lurasidone (145) | Atypical |
| | treatment | | antipsychotic(146,14 |
| | | | 7) |
| 32 | Mdga1 KO | MAM domain containing | SZ(149–151) |
| | | glycosylphospatidylinositol anchor 1 KO | |
| | | mice (148) | |
| 33 | Mdga2 KO | Mice with heterozygous knockout of the | ASD(153,154) |

| | | MAM domain containing | |
|----|-------------|--|------------------|
| | | glycosylphospatidylinositol anchor 2 (152) | |
| 34 | Methampheta | Mice treated with methamphetamine | Psychosis(156) |
| | mine | (155) | |
| | treatment | | |
| 35 | Nhe5 KO | Na⁺/H⁺ exchanger 5 KO mice (157) | |
| 36 | Nlgn3-R451C | Mice with R451C amino acid exchange | ASD(159,160) |
| | КІ | mutation in neuroligin 3 (77,158) | |
| 37 | Nr3c1 Tg | Mice overexpressing glucocorticoid | MD(161) |
| | | receptor under the Camk2a promoter | |
| 38 | Nrgn KO | Neurogranin KO mice (162–164) | SZ(165,166) |
| 39 | Oxamate | Mice treated with sodium oxamate, an | |
| | treatment | inhibitor of lactate dehydrogenase | |
| 40 | Расар КО | Pituitary adenylate cyclase-activating | MD(168), SZ(169) |

| | | polypeptide KO mice (167) | |
|----|---------------|---|--------------|
| 41 | patDp | Mice with a paternal duplication of human | ASD(170–173) |
| | | chromosome 15q11-13 (34) | |
| 42 | Phencyclidine | Subchronic phencyclidine-treated mice | SZ(175) |
| | treatment | (145,174) | |
| 43 | PCP+Lur | Phencyclidine (PCP)- and lurasidone | |
| | | (Lur)-treated mice (145,174) | |
| 44 | Polg1 Tg | Forebrain-specific catalytic subunit of | BD(177) |
| | | mitochondrial DNA polymerase KO mice | |
| | | (176) | |
| 45 | Ppp3r1 KO | Forebrain-specific protein phosphatase 3, | SZ(180) |
| | | regulatory subunit B, alpha isoform | |
| | | (calcineurin B, type 1) KO mice (178,179) | |
| 46 | Quinpirole | Mice treated with quinpirole, a dopamine | OCD(182) |

| | treatment | D2 receptor agonist (181) | |
|----|---------------|--|------------------|
| 47 | Reln Tg | Mice lacking the C-terminal region of | ASD(184–186), |
| | | Reelin (183) | BD(187), SZ(188) |
| 48 | Restraint | Mice exposed to chronic restraint stress | Chronic stress |
| | stress | (189) | |
| 49 | Sciatic nerve | The sciatic nerve cuffing mouse model of | Chronic pain |
| | cuffing | neuropathic pain (190,191) | |
| 50 | Scn2a KO | Mice with heterozygous knockout of the | ASD(193,194), |
| | | sodium voltage-gated channel alpha | EP(195–197), |
| | | subunit 2 (192) | ID(198,199) |
| 51 | Sert KO | Serotonin transporter KO mice (200) | ASD(201,202) |
| 52 | Shank2 KO | SH3 and multiple ankyrin repeat domain 2 | ASD(154) |
| | | KO mice (31) | |
| 53 | Shank3 KO | SH3 and multiple ankyrin repeat domain | ASD(204–206) |

| | | 3b KO mice (JAX, 017688) (203) | |
|----|----------------|--|------------------|
| 54 | Snap25-S187A | Mice with S187A amino acid exchange | ADHD(207–212), |
| | КІ | mutation in synaptosomal-associated | EP(213,214), |
| | | protein of 25 kDa | SZ(215,216) |
| 55 | Social defeat | Mice exposed to social defeat stress | Acute stress |
| | stress (acute) | (217,218) | |
| 56 | Social defeat | Mice exposed to social defeat stress | Chronic stress |
| | stress | (219,220) | |
| | (chronic) | | |
| 57 | Streptozotocin | Mice treated with streptozotocin (221) | DM(222) |
| | treatment | | |
| 58 | Streptozotocin | Mice treated with streptozotocin and | DM and DS |
| | + restraint | exposed to chronic restraint stress | comorbidity(223) |
| | stress | (189,221) | |

| | | | 1 |
|----|-------------|--|--------------------|
| 59 | Stxbp1 KO | Mice with heterozygous knockout of the | ASD/ID(116,199,225 |
| | | syntaxin-binding protein 1 (224) |), EP(226,227) |
| 60 | Syngap1 KO | Mice with heterozygous knockout of the | ID, SZ, ASD(154), |
| | | synaptic Ras GTPase-activating protein 1 | EP(226) |
| | | (228,229) | |
| 61 | Thalidomide | Rats prenatally exposed to thalidomide | ASD(232) |
| | treatment | (230,231) | |
| 62 | Tnx KO | Tenascin X KO mice (233,234) | EDS(235), SZ(236– |
| | | | 238) |
| 63 | Trx1 KO | Rats with heterozygous knockout of the | EP |
| | | thioredoxin 1 | |
| 64 | Tsc1 KO | Astrocyte-specific tuberous sclerosis | TSC(240) |
| | | complex 1 KO mice (Glial fibrillary acidic | |
| | | protein-cre; Tsc1 ^{loxP/loxP}) (239) | |

| 65 | Valproic acid | Mice prenatally exposed to valproic acid | ASD(242) |
|----|---------------|--|----------|
| | treatment | (241) | |

| 261 | AD, Alzheimer's disease; ADHD, attention-deficit/hyperactivity disorder; ASD, autism |
|-----|---|
| 262 | spectrum disorders; BD, bipolar disorder; DM, diabetes mellitus; EDS, Ehlers-Danlos |
| 263 | syndrome; DS, depression symptom; EP, epilepsy; FMR, Fragile X mental retardation; ID, |
| 264 | intellectual disability, KI, knock-in; KO, knock out; MD, major depressive disorder; OCD, |
| 265 | obsessive-compulsive disorder; SZ, schizophrenia; Tg, transgenic; TSC, tuberous sclerosis |
| 266 | complex. *Mice with off-target deletion of conditional Bdnf allele derived from $Bdnf^{2lox}$ |
| 267 | mouse line. |

268

269 Materials and Methods

270 Experimental animals and ethical statement

- 271 Mice and rats used in this study are listed in Table 1. Animal experiments were approved
- by the Institutional Animal Care and Use Committee of Fujita Health University, based on
- 273 the Law for the Humane Treatment and Management of Animals and the Standards
- 274 Relating to the Care and Management of Laboratory Animals and Relief of Pain. Every
- effort was made to minimize the number of animals used.

276

277 Sampling and handling of the brain samples

- 278 Upon the study, a standardized protocol regarding sampling and handling of the brain
- samples has been established to minimize potential confounding effects because of the
- technical differences among laboratories and performing blind studies, as follows:

281 Animals and samples

| 282 | • Animals: Mouse and rat. For genetically engineered animals, mutants and their |
|-----|---|
| 283 | wild-type littermates should be used. |
| 284 | • Number of animals: \geq 6 per group (identical genetic background, littermate), |
| 285 | preferably. |
| 286 | • Sex of animals: All males, all females, or balanced among groups if mixed. |
| 287 | Samples: Fresh-frozen whole brain. |
| 288 | |
| 289 | Blind study |
| 290 | pH measurements were blinded: Upon sampling, the researchers were supposed to |
| 291 | randomize the animals regarding genotype and collect brain samples into tubes labeled |
| 292 | with serial numbers. The researchers were asked to provide the genotype information and |
| 293 | the corresponding serial numbers for the following statistical analyses, after the |
| 294 | measurements. |
| 295 | |

296 Brain sampling procedures

| 297 | 1. | Sacrifice mouse/ | rat by cervi | cal dislocatio | n followed by de | ecapitation, and r | emove |
|-----|--------|--------------------|---------------|-----------------|-------------------|--------------------|---------|
| 298 | | whole brain from | n the skull. | Do not imm | erse the brain in | any buffer soluti | ions or |
| 299 | | water. | | | | | |
| 300 | 2. | Cut the brain alor | ng the longit | tudinal fissure | e of the cerebrum | 1. | |
| 301 | 3. | Collect the left a | nd right he | mispheres in | to a tube that ca | n be tightly capp | ed like |
| 302 | | Cryotube and sea | ll the caps v | vith Parafilm | (to minimize the | effect of carbon (| dioxide |
| 303 | | from dry ice on th | ne tissue pH | during trans | portation.). | | |
| 304 | 4. | Snap freeze in liq | uid N2, and | store at -80C | until the shipme | nt. | |
| 305 | 5. | Transport the from | zen brain or | n dry ice. | | | |
| 306 | | | | | | | |
| 307 | The | protocol | is | also | publicly | available | at |
| 308 | http:/ | /www.fujita-hu.ac. | jp/~cgbb/er | n/collaborativ | ve_research/inde | x.html. | |
| 309 | | | | | | | |

310 Measurements of tissue pH and lactate levels

| 311 | Whole brain was | used to | measure pH a | and lactate | levels as | previously | described (29). | |
|-----|-----------------|---------|--------------|-------------|-----------|------------|-----------------|--|
|-----|-----------------|---------|--------------|-------------|-----------|------------|-----------------|--|

- 312 Briefly, snap-frozen tissues were homogenized in ice-cold distilled H₂O (5 ml per 500 mg of
- 313 tissue). The pH of the homogenates was measured using a pH meter (LAQUA F-72,
- 314 HORIBA, Ltd., Kyoto, Japan) equipped with a Micro ToupH electrode (9618S-10D, HORIBA,
- 315 Ltd.) after a three-point calibration at pH 4.0, pH 7.0, and pH 9.0. Subsequently, the
- 316 concentration of lactate in the homogenates was determined using a multi-assay analyzer
- 317 (GM7 MicroStat, Analox Instruments, London, UK) after calibration with 8.0 M lactate
- 318 standard solution (GMRD-103, Analox Instruments). A 20-µl aliquot of centrifuged
- 319 supernatant (14,000 rpm, 10 min) was used for the measurement.
- 320
- 321 Effect size (d) was calculated for each strain/condition and each measure (e.g., pH, lactate
 322 value, and behavioral index), as followed:
- 323 d = (M_{mutants} M_{controls})/S_{pooled}

324
$$S_{pooled} = [(S^2_{mutant} + S^2_{control})/2]^{1/2}$$

| 325 | The heat map was depict | ed using the R (version | 3.5.2) gplots package. |
|-----|-------------------------|-------------------------|------------------------|
| | | | |

- 326 Z-score transformation, a traditional method of data normalization for direct 327 comparison between different samples and conditions, was applied for each pH or lactate
- 328 value using individual animal data within each of strain, according to the following
- 329 formula:
- 330 Z-score = (value_P mean value_{P1...Pn})/standard deviation_{P1...Pn}
- 331 where P is any pH or lactate and P1...Pn represent the aggregate measure of all pH or
- 332 lactate values.

333

334 **Prediction analysis**

We collected the comprehensive behavioral data as much as of animal models whose brain pH and lactate levels were examined in this study. The following behavioral data of 24 animal models were obtained from published papers, Mouse Phenotype Database

| 338 | (http://www.mouse-phenotype.org/), or in-house studies (Supplementary Table 3): |
|-----|---|
| 339 | number of transitions in the light-dark transition test, percentage of immobile in the |
| 340 | forced swim test, time spent in open arm in the elevated plus maze test, prepulse |
| 341 | inhibition at 78-110 dB and 74-110 dB, startle response at 120 dB, distance traveled in the |
| 342 | open field test, and correct percentage in the T-maze, Y-maze, or other maze test from |
| 343 | APP Tg mice, Arid1b KO mice mice, Barp KO mice, BTBR mice, Camk2a KO mice, complete |
| 344 | Freund's adjuvant-treated mice, Chd8 KO mice, corticosterone-treated mice, Disc1-L100P |
| 345 | mutant mice, Disc1-Q31L mutant mice, Gasc1 hypomorphic mutant mice, Hivep2 KO mice, |
| 346 | Nhe5 KO mice, Nr3c1 Tg mice, Nrgn KO mice, Pacap KO mice, patDp mice, Ppp3r1 KO mice, |
| 347 | Reln Tg mice, Scn2a KO mice, Sert KO mice, Snap25-S187A KI mice, social defeat |
| 348 | stress-exposed mice, and Syngap1 KO mice. The literature search was conducted in |
| 349 | PubMed and Google Scholar using relevant key words: name of strain or experimental |
| 350 | condition, species (mice or rats), and name of behavioral tests. Among the top hits at the |
| 351 | search, we used the data that were presented in actual values of the mean and SD or SEM, |
| 352 | as priority. For some behavioral measures, possible mean and SD values were estimated |

| 353 | from the graph presented in the paper. In the matrix of strains/conditions and behavioral |
|-----|--|
| 354 | measures, those with any missing values were excluded, resulting in obtaining nine |
| 355 | behavioral measures from 24 strains/conditions of mouse models. Effect size was |
| 356 | calculated for each strain/condition and each measure and used for the prediction |
| 357 | analysis. |
| 358 | Leave-one-out cross-validation was employed to determine whether behavioral |
| 359 | measures can predict brain lactate levels for individual strain of mice. From the analyzed |
| 360 | behavioral dataset of 24 mouse strains, one sample was selected and excluded to serve as |
| 361 | test data of the cross-validation. Thereafter, a multivariate linear regression model was |
| 362 | trained on the remaining 23 samples using a stepwise variable selection procedure with |
| 363 | EZR software (version 1.38; Saitama Medical Center, Jichi Medical University, Saitama, |
| 364 | Japan) (243), and the test sample was predicted. This was repeated 24 times, in which all |
| 365 | samples were chosen once as the test data. Behavioral measures selected at least one |
| 366 | time in the prediction model were considered as predictive behavioral measures. The |

367 prediction performance was analyzed by evaluating correlation between the predicted

368 and actual values for the 24 mouse strains.

369

370 Statistical analysis

- 371 The pH and lactate data were analyzed using unpaired t-test, or one-way analysis of
- 372 variance (ANOVA) or two-way ANOVA followed by *post hoc* Tukey's multiple comparison
- test using GraphPad Prism 8 (version 8.4.2; GraphPad Software, San Diego, CA).

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516

517 References

- 518 1. Cross-national comparisons of the prevalences and correlates of mental disorders. WHO
- 519 International Consortium in Psychiatric Epidemiology. (2000): Bull World Health Organ
- **520** 78: 413–426.
- 521 2. Cardno AG, Owen MJ (2014): Genetic relationships between schizophrenia, bipolar
- 522 disorder, and schizoaffective disorder. *Schizophr Bull* 40: 504–515.
- 523 3. Hall J, Trent S, Thomas KL, O'Donovan MC, Owen MJ (2015): Genetic risk for
- schizophrenia: convergence on synaptic pathways involved in plasticity. *Biol Psychiatry*77: 52–58.
- 4. Forero DA, Herteleer L, De Zutter S, Norrback K-F, Nilsson L-G, Adolfsson R, et al.
- 527 (2016): A network of synaptic genes associated with schizophrenia and bipolar disorder.
- 528 Schizophr Res 172: 68–74.
- 529 5. Douaud G, Groves AR, Tamnes CK, Westlye LT, Duff EP, Engvig A, et al. (2014): A
- 530 common brain network links development, aging, and vulnerability to disease. *Proc Natl*
- 531 *Acad Sci* 111: 17648–17653.
- 532 6. Argyelan M, Ikuta T, DeRosse P, Braga RJ, Burdick KE, John M, et al. (2014):
- 533 Resting-state fMRI connectivity impairment in schizophrenia and bipolar disorder.
- 534 *Schizophr Bull* 40: 100–110.

- 535 7. Dager SR, Friedman SD, Parow A, Demopulos C, Stoll AL, Lyoo IK, et al. (2004):
- 536 Brain metabolic alterations in medication-free patients with bipolar disorder. Arch Gen
- 537 *Psychiatry* 61: 450–458.
- 538 8. Goh S, Dong Z, Zhang Y, DiMauro S, Peterson BS (2014): Brain imaging evidence that
- 539 mitochondrial dysfunction is a neurobiological subtype of Autism Spectrum Disorder.
- 540 *JAMA Psychiatry* 71: 665–671.
- 541 9. Greene AE, Todorova MT, Seyfried TN (2003): Perspectives on the metabolic
- 542 management of epilepsy through dietary reduction of glucose and elevation of ketone
- 543 bodies. *J Neurochem* 86: 529–537.
- 10. Halim ND, Lipska BK, Hyde TM, Deep-Soboslay A, Saylor EM, Herman M, et al.
- 545 (2008): Increased lactate levels and reduced pH in postmortem brains of schizophrenics:
- 546 medication confounds. *J Neurosci Methods* 169: 208–213.
- 547 11. Machado-Vieira R, Zanetti MV, Otaduy MC, De Sousa RT, Soeiro-de-Souza MG,
- 548 Costa AC, et al. (2017): Increased brain lactate during depressive episodes and reversal
- 549 effects by lithium monotherapy in drug-naive bipolar disorder: A 3T 1H-MRS study. J Clin
- 550 *Psychopharmacol* 37: 40–45.
- 12. Prabakaran S, Swatton JE, Ryan MM, Huffaker SJ, Huang JT-J, Griffin JL, et al.
- 552 (2004): Mitochondrial dysfunction in schizophrenia: evidence for compromised brain
- metabolism and oxidative stress. *Mol Psychiatry* 9: 684–697, 643.
- 13. Rossignol DA, Frye RE (2012): Mitochondrial dysfunction in autism spectrum
- disorders: a systematic review and meta-analysis. *Mol Psychiatry* 17: 290–314.
- 556 14. Rowland LM, Pradhan S, Korenic S, Wijtenburg SA, Hong LE, Edden RA, Barker PB
- 557 (2016): Elevated brain lactate in schizophrenia: a 7 T magnetic resonance spectroscopy
- study. *Transl Psychiatry* 6: e967–e967.
- 559 15. Soeiro-de-Souza MG, Pastorello BF, Leite C da C, Henning A, Moreno RA, Garcia
- 560 Otaduy MC (2016): Dorsal anterior cingulate lactate and glutathione levels in euthymic
- 561 bipolar I disorder: 1H-MRS study. Int J Neuropsychopharmacol 19.
- 562 https://doi.org/10.1093/ijnp/pyw032

- 16. Dogan AE, Yuksel C, Du F, Chouinard V-A, Öngür D (2018): Brain lactate and pH in
- schizophrenia and bipolar disorder: a systematic review of findings from magnetic
- resonance studies. *Neuropsychopharmacology* 43: 1681–1690.
- 566 17. Pruett BS, Meador-Woodruff JH (2020): Evidence for altered energy metabolism,
- 567 increased lactate, and decreased pH in schizophrenia brain: A focused review and
- 568 meta-analysis of human postmortem and magnetic resonance spectroscopy studies.
- 569 *Schizophr Res* S092099642030459X.
- 570 18. Lehéricy S, Marjanska M, Mesrob L, Sarazin M, Kinkingnehun S (2007): Magnetic
- 571 resonance imaging of Alzheimer's disease. *Eur Radiol* 17: 347–362.
- 572 19. Liguori C, Stefani A, Sancesario G, Sancesario GM, Marciani MG, Pierantozzi M
- 573 (2015): CSF lactate levels, τ proteins, cognitive decline: a dynamic relationship in
- 574 Alzheimer's disease. J Neurol Neurosurg Psychiatry 86: 655–659.
- 575 20. Liguori C, Chiaravalloti A, Sancesario G, Stefani A, Sancesario GM, Mercuri NB, et al.
- 576 (2016): Cerebrospinal fluid lactate levels and brain [18F]FDG PET hypometabolism within
- 577 the default mode network in Alzheimer's disease. *Eur J Nucl Med Mol Imaging* 43: 2040–
- **578** 2049.
- 579 21. Lyros E, Ragoschke-Schumm A, Kostopoulos P, Sehr A, Backens M, Kalampokini S,
- 580 *et al.* (2019): Normal brain aging and Alzheimer's disease are associated with lower
- 581 cerebral pH: an in vivo histidine 1H-MR spectroscopy study. *Neurobiol Aging*.
- 582 https://doi.org/10.1016/j.neurobiolaging.2019.11.012
- 583 22. Mullins R, Reiter D, Kapogiannis D (2018): Magnetic resonance spectroscopy reveals
- abnormalities of glucose metabolism in the Alzheimer's brain. Ann Clin Transl Neurol 5:
- **585** 262–272.
- 586 23. Paasila PJ, Davies DS, Kril JJ, Goldsbury C, Sutherland GT (2019): The relationship
- 587 between the morphological subtypes of microglia and Alzheimer's disease neuropathology.
- 588 Brain Pathol 29: 726–740.
- 589 24. Youssef P, Chami B, Lim J, Middleton T, Sutherland GT, Witting PK (2018): Evidence
- 590 supporting oxidative stress in a moderately affected area of the brain in Alzheimer's disease.
- *Sci Rep* 8: 1–14.

- 592 25. Li JZ, Vawter MP, Walsh DM, Tomita H, Evans SJ, Choudary PV, et al. (2004):
- 593 Systematic changes in gene expression in postmortem human brains associated with tissue
- pH and terminal medical conditions. *Hum Mol Genet* 13: 609–616.
- 595 26. Tomita H, Vawter MP, Walsh DM, Evans SJ, Choudary PV, Li J, et al. (2004): Effect
- 596 of agonal and postmortem factors on gene expression profile: quality control in microarray
- analyses of postmortem human brain. *Biol Psychiatry* 55: 346–352.
- 598 27. Vawter M, Tomita H, Meng F, Bolstad B, Li J, Evans S, et al. (2006):
- 599 Mitochondrial-related gene expression changes are sensitive to agonal-pH state:
- 600 implications for brain disorders. *Mol Psychiatry* 11: 615–679.
- 601 28. Kato T, Murashita J, Kamiya A, Shioiri T, Kato N, Inubushi T (1998): Decreased brain
- 602 intracellular pH measured by 31P-MRS in bipolar disorder: a confirmation in drug-free
- 603 patients and correlation with white matter hyperintensity. Eur Arch Psychiatry Clin
- 604 *Neurosci* 248: 301–306.
- 605 29. Hagihara H, Catts VS, Katayama Y, Shoji H, Takagi T, Huang FL, et al. (2018):
- 606 Decreased brain pH as a shared endophenotype of psychiatric disorders.
- 607 *Neuropsychopharmacology* 43: 459–468.
- 608 30. Duarte JMN, Do KQ, Gruetter R (2014): Longitudinal neurochemical modifications in
- the aging mouse brain measured in vivo by 1H magnetic resonance spectroscopy.
- 610 *Neurobiol Aging* 35: 1660–1668.
- 611 31. Won H, Lee H-R, Gee HY, Mah W, Kim J-I, Lee J, et al. (2012): Autistic-like social
- 612 behaviour in *Shank2*-mutant mice improved by restoring NMDA receptor function. *Nature*
- **613** 486: 261–265.
- 614 32. Raveau M, Shimohata A, Amano K, Miyamoto H, Yamakawa K (2018):
- 615 DYRK1A-haploinsufficiency in mice causes autistic-like features and febrile seizures.
- 616 *Neurobiol Dis* 110: 180–191.
- 617 33. Hori K, Nagai T, Shan W, Sakamoto A, Abe M, Yamazaki M, et al. (2015):
- 618 Heterozygous disruption of autism susceptibility candidate 2 causes impaired emotional
- 619 control and cognitive memory. *PLOS ONE* 10: e0145979.

- 620 34. Nakatani J, Tamada K, Hatanaka F, Ise S, Ohta H, Inoue K, et al. (2009): Abnormal
- behavior in a chromosome- engineered mouse model for human 15q11-13 duplication seen
- 622 in autism. *Cell* 137: 1235–1246.
- 623 35. Beasley CL, Dwork AJ, Rosoklija G, Mann JJ, Mancevski B, Jakovski Z, et al. (2009):
- 624 Metabolic abnormalities in fronto-striatal-thalamic white matter tracts in schizophrenia.
- 625 Schizophr Res 109: 159–166.
- 626 36. Brady RO, Cooper A, Jensen JE, Tandon N, Cohen B, Renshaw P, et al. (2012): A
- 627 longitudinal pilot proton MRS investigation of the manic and euthymic states of bipolar628 disorder. *Transl Psychiatry* 2: e160–e160.
- 629 37. Insel TR, Cuthbert BN (2015): Brain disorders? Precisely. *Science* 348: 499–500.
- 630 38. Chesler M (2003): Regulation and modulation of pH in the brain. *Physiol Rev* 83:
- **631** 1183–1221.
- 632 39. Zauner A, Bullock R, Di X, Young HF (1995): Brain oxygen, CO2, pH, and
- temperature monitoring: evaluation in the feline brain. *Neurosurgery* 37: 1168–1177.
- 40. Monoranu CM, Apfelbacher M, Grünblatt E, Puppe B, Alafuzoff I, Ferrer I, et al.
- 635 (2009): pH measurement as quality control on human post mortem brain tissue: a study of
- 636 the BrainNet Europe consortium. *Neuropathol Appl Neurobiol* 35: 329–337.
- 41. Preece P, Cairns NJ (2003): Quantifying mRNA in postmortem human brain: influence
- 638 of gender, age at death, postmortem interval, brain pH, agonal state and inter-lobe mRNA
- 639 variance. *Mol Brain Res* 118: 60–71.
- 42. Harrison PJ, Heath PR, Eastwood SL, Burnet PWJ, McDonald B, Pearson RCA (1995):
- 641 The relative importance of premortem acidosis and postmortem interval for human brain
- 642 gene expression studies: selective mRNA vulnerability and comparison with their encoded
- 643 proteins. *Neurosci Lett* 200: 151–154.
- 43. Forester BP, Berlow YA, Harper DG, Jensen JE, Lange N, Froimowitz MP, et al.
- 645 (2010): Age-related changes in brain energetics and phospholipid metabolism. *NMR*
- 646 *Biomed* 23: 242–250.
- 647 44. Weaver KE, Richards TL, Logsdon RG, McGough EL, Minoshima S, Aylward EH, et
- 648 *al.* (2015): Posterior cingulate lactate as a metabolic biomarker in amnestic mild cognitive
- 649 impairment. BioMed Res Int 2015. https://doi.org/10.1155/2015/610605

- 45. Newman LA, Korol DL, Gold PE (2011): Lactate produced by glycogenolysis in
- astrocytes regulates memory processing. *PLOS ONE* 6: e28427.
- 46. Suzuki A, Stern SA, Bozdagi O, Huntley GW, Walker RH, Magistretti PJ, Alberini CM
- 653 (2011): Astrocyte-neuron lactate transport is required for long-term memory formation.
- **654** *Cell* 144: 810–823.
- 47. Descalzi G, Gao V, Steinman MQ, Suzuki A, Alberini CM (2019): Lactate from
- astrocytes fuels learning-induced mRNA translation in excitatory and inhibitory neurons.
- **657** *Commun Biol* 2: 1–11.
- 48. Mangia S, Tkáč I, Gruetter R, Van de Moortele P-F, Maraviglia B, Uğurbil K (2007):
- 659 Sustained neuronal activation raises oxidative metabolism to a new steady-state level:
- 660 evidence from 1H NMR spectroscopy in the human visual cortex. J Cereb Blood Flow
- 661 *Metab* 27: 1055–1063.
- 49. Schaller B, Xin L, O'Brien K, Magill AW, Gruetter R (2014): Are glutamate and lactate
- 663 increases ubiquitous to physiological activation? A 1H functional MR spectroscopy study
- during motor activation in human brain at 7Tesla. *NeuroImage* 93: 138–145.
- 50. Regenold WT, Phatak P, Marano CM, Sassan A, Conley RR, Kling MA (2009):
- 666 Elevated cerebrospinal fluid lactate concentrations in patients with bipolar disorder and
- 667 schizophrenia: implications for the mitochondrial dysfunction hypothesis. *Biol Psychiatry*
- **668** 65: 489–494.
- 669 51. Stork C, Renshaw PF (2005): Mitochondrial dysfunction in bipolar disorder: evidence
- 670 from magnetic resonance spectroscopy research. *Mol Psychiatry* 10: 900–919.
- 671 52. Holper L, Ben-Shachar D, Mann JJ (2019): Multivariate meta-analyses of
- 672 mitochondrial complex I and IV in major depressive disorder, bipolar disorder,
- 673 schizophrenia, Alzheimer disease, and Parkinson disease. *Neuropsychopharmacology* 44:
- **674** 837–849.
- 53. Manji H, Kato T, Di Prospero NA, Ness S, Beal MF, Krams M, Chen G (2012):
- 676 Impaired mitochondrial function in psychiatric disorders. *Nat Rev Neurosci* 13: 293–307.
- 677 54. Pei L, Wallace DC (2018): Mitochondrial etiology of neuropsychiatric disorders. *Biol*
- 678 *Psychiatry* 83: 722–730.

- 679 55. Millan MJ, Agid Y, Brüne M, Bullmore ET, Carter CS, Clayton NS, *et al.* (2012):
- 680 Cognitive dysfunction in psychiatric disorders: characteristics, causes and the quest for
- 681 improved therapy. *Nat Rev Drug Discov* 11: 141–168.
- 682 56. Andrés P (2003): Frontal cortex as the central executive of working memory: time to
- 683 revise our view. *Cortex* 39: 871–895.
- 684 57. Foucher JR, Vidailhet P, Chanraud S, Gounot D, Grucker D, Pins D, et al. (2005):
- 685 Functional integration in schizophrenia: too little or too much? Preliminary results on fMRI
- data. *NeuroImage* 26. https://doi.org/10.1016/j.neuroimage.2005.01.042
- 687 58. Bisri T, Utomo BA, Fuadi I (2016): Exogenous lactate infusion improved
- neurocognitive function of patients with mild traumatic brain injury. Asian J Neurosurg 11:
- **689** 151–159.
- 690 59. Rice AC, Zsoldos R, Chen T, Wilson MS, Alessandri B, Hamm RJ, Ross Bullock M
- 691 (2002): Lactate administration attenuates cognitive deficits following traumatic brain injury.
- 692 Brain Res 928: 156–159.
- 693 60. Carrard A, Elsayed M, Margineanu M, Boury-Jamot B, Fragnière L, Meylan EM, et al.
- 694 (2016): Peripheral administration of lactate produces antidepressant-like effects. *Mol*
- 695 *Psychiatry* 23: 392–399.
- 696 61. Hagihara H, Shoji H, Otabi H, Toyoda A, Katoh K, Namihira M, Miyakawa T (2021):
- 697 Protein lactylation induced by neural excitation. *bioRxiv* 2021.02.02.428370.
- 698 62. Marunaka Y, Yoshimoto K, Aoi W, Hosogi S, Ikegaya H (2014): Low pH of interstitial
- fluid around hippocampus of the brain in diabetic OLETF rats. *Mol Cell Ther* 2.
- 700 https://doi.org/10.1186/2052-8426-2-6
- 63. Davidovic L, Navratil V, Bonaccorso CM, Catania MV, Bardoni B, Dumas M-E
- 702 (2011): A metabolomic and systems biology perspective on the brain of the Fragile X
- syndrome mouse model. *Genome Res* 21: 2190–2202.
- 64. Lin DDM, Crawford TO, Barker PB (2003): Proton MR spectroscopy in the diagnostic
- valuation of suspected mitochondrial disease. Am J Neuroradiol 24: 33–41.
- 706 65. Mucke L, Masliah E, Yu G-Q, Mallory M, Rockenstein EM, Tatsuno G, et al. (2000):
- High-level neuronal expression of A β 1–42 in wild-type human amyloid protein precursor
- transgenic mice: synaptotoxicity without plaque formation. *J Neurosci* 20: 4050–4058.

- 66. Mullan M, Crawford F, Axelman K, Houlden H, Lilius L, Winblad B, Lannfelt L
- 710 (1992): A pathogenic mutation for probable Alzheimer's disease in the APP gene at the
- 711 N-terminus of beta-amyloid. *Nat Genet* 1: 345–347.
- 712 67. Murrell J, Farlow M, Ghetti B, Benson MD (1991): A mutation in the amyloid
- 713 precursor protein associated with hereditary Alzheimer's disease. *Science* 254: 97–99.
- 68. Shibutani M, Horii T, Shoji H, Morita S, Kimura M, Terawaki N, et al. (2017): Arid1b
- 715 haploinsufficiency causes abnormal brain gene expression and autism-related behaviors in
- 716 mice. Int J Mol Sci 18: 1872.
- 717 69. D'Gama AM, Pochareddy S, Li M, Jamuar SS, Reiff RE, Lam A-TN, et al. (2015):
- 718 Targeted DNA sequencing from autism spectrum disorder brains implicates multiple
- 719 genetic mechanisms. *Neuron* 88: 910–917.
- 720 70. Fitzgerald TW, Gerety SS, Jones WD, van Kogelenberg M, King DA, McRae J, et al.
- 721 (2015): Large-scale discovery of novel genetic causes of developmental disorders. *Nature*722 519: 223–228.
- 723 71. Kalscheuer VM, FitzPatrick D, Tommerup N, Bugge M, Niebuhr E, Neumann LM, et
- *al.* (2007): Mutations in autism susceptibility candidate 2 (AUTS2) in patients with mental
- 725 retardation. *Hum Genet* 121: 501–509.
- 726 72. Bakkaloglu B, O'Roak BJ, Louvi A, Gupta AR, Abelson JF, Morgan TM, et al. (2008):
- 727 Molecular cytogenetic analysis and resequencing of contactin associated protein-like 2 in
- autism spectrum disorders. *Am J Hum Genet* 82: 165–173.
- 729 73. Sultana R, Yu C-E, Yu J, Munson J, Chen D, Hua W, et al. (2002): Identification of a
- novel gene on chromosome 7q11.2 interrupted by a translocation breakpoint in a pair of
- 731 autistic twins. *Genomics* 80: 129–134.
- 732 74. Beunders G, Voorhoeve E, Golzio C, Pardo LM, Rosenfeld JA, Talkowski ME, et al.
- 733 (2013): Exonic deletions in AUTS2 cause a syndromic form of intellectual disability and
- suggest a critical role for the C terminus. *Am J Hum Genet* 92: 210–220.
- 735 75. Zhang B, Xu Y-H, Wei S-G, Zhang H-B, Fu D-K, Feng Z-F, et al. (2014): Association
- study identifying a new susceptibility gene (AUTS2) for schizophrenia. Int J Mol Sci 15:
- **737** 19406–19416.

- 738 76. Nakao A, Miki T, Shoji H, Nishi M, Takeshima H, Miyakawa T, Mori Y (2015):
- 739 Comprehensive behavioral analysis of voltage-gated calcium channel beta-anchoring and
- regulatory protein knockout mice. *Front Behav Neurosci* 9.
- 741 https://doi.org/10.3389/fnbeh.2015.00141
- 742 77. Isshiki M, Tanaka S, Kuriu T, Tabuchi K, Takumi T, Okabe S (2014): Enhanced
- synapse remodelling as a common phenotype in mouse models of autism. *Nat Commun* 5:
- **744** 4742.
- 745 78. McFarlane HG, Kusek GK, Yang M, Phoenix JL, Bolivar VJ, Crawley JN (2008):
- Autism-like behavioral phenotypes in BTBR T+tf/J mice. *Genes Brain Behav* 7: 152–163.
- 747 79. Yamasaki N, Maekawa M, Kobayashi K, Kajii Y, Maeda J, Soma M, et al. (2008):
- 748 Alpha-CaMKII deficiency causes immature dentate gyrus, a novel candidate
- rd9 endophenotype of psychiatric disorders. *Mol Brain* 1: 6.
- 750 80. Hagihara H, Horikawa T, Nakamura HK, Umemori J, Shoji H, Kamitani Y, Miyakawa
- 751 T (2016): Circadian gene circuitry predicts hyperactive behavior in a mood disorder mouse
- 752 model. Cell Rep 14: 2784–2796.
- 753 81. Hagihara H, Horikawa T, Irino Y, Nakamura HK, Umemori J, Shoji H, et al. (2019):
- 754 Peripheral blood metabolome predicts mood change-related activity in mouse model of
- bipolar disorder. *Mol Brain* 12: 107.
- 756 82. Le-Niculescu H, Kurian SM, Yehyawi N, Dike C, Patel SD, Edenberg HJ, et al. (2009):
- 757 Identifying blood biomarkers for mood disorders using convergent functional genomics.
- 758 *Mol Psychiatry* 14: 156–174.
- 759 83. Ament SA, Szelinger S, Glusman G, Ashworth J, Hou L, Akula N, et al. (2015): Rare
- 760 variants in neuronal excitability genes influence risk for bipolar disorder. *Proc Natl Acad*
- 761 *Sci* 112: 3576–3581.
- 762 84. Li H, Zhou D-S, Chang H, Wang L, Liu W, Dai S-X, et al. (2019): Interactome
- analyses implicated CAMK2A in the genetic predisposition and pharmacological
- mechanism of bipolar disorder. *J Psychiatr Res* 115: 165–175.
- 765 85. Purcell SM, Moran JL, Fromer M, Ruderfer D, Solovieff N, Roussos P, et al. (2014): A
- 766 polygenic burden of rare disruptive mutations in schizophrenia. *Nature* advance online
- 767 publication. https://doi.org/10.1038/nature12975

- 768 86. Kaitsuka T, Li S-T, Nakamura K, Takao K, Miyakawa T, Matsushita M (2011):
- 769 Forebrain-specific constitutively active CaMKKα transgenic mice show deficits in
- hippocampus-dependent long-term memory. *Neurobiol Learn Mem* 96: 238–247.
- 771 87. Goyal V, Zahra SA, Hennings C, Zimmer-Bensch G, Beetz C, Schmeer CW, et al.
- (n.d.): A conditional knockout mouse model to study the specific role of cyclin D2 in brain
- development, adult neurogenesis and human brain pathologies. Soc Neurosci Annu Meet
- *2019* 227.19.
- 88. Urban R, Scherrer G, Goulding EH, Tecott LH, Basbaum AI (2011): Behavioral indices
- of ongoing pain are largely unchanged in male mice with tissue or nerve injury-induced
- mechanical hypersensitivity. *PAIN* 152: 990–1000.
- 89. Wang X, Guan S, Liu A, Yue J, Hu L, Zhang K, et al. (2019): Anxiolytic effects of
- Formononetin in an inflammatory pain mouse model. *Mol Brain* 12: 36.
- 780 90. Katayama Y, Nishiyama M, Shoji H, Ohkawa Y, Kawamura A, Sato T, et al. (2016):
- 781 CHD8 haploinsufficiency results in autistic-like phenotypes in mice. *Nature* 537: 675–679.
- 782 91. O'Roak BJ, Vives L, Fu W, Egertson JD, Stanaway IB, Phelps IG, et al. (2012):
- 783 Multiplex targeted sequencing identifies recurrently mutated genes in autism spectrum
- 784 disorders. *Science* 338: 1619–1622.
- 92. O'Roak BJ, Vives L, Girirajan S, Karakoc E, Krumm N, Coe BP, et al. (2012):
- 786 Sporadic autism exomes reveal a highly interconnected protein network of de novo
- 787 mutations. *Nature* 485: 246–250.
- 93. Talkowski ME, Rosenfeld JA, Blumenthal I, Pillalamarri V, Chiang C, Heilbut A, et al.
- 789 (2012): Sequencing chromosomal abnormalities reveals neurodevelopmental loci that
- confer risk across diagnostic Bboundaries. *Cell* 149: 525–537.
- 94. Neale BM, Kou Y, Liu L, Ma'ayan A, Samocha KE, Sabo A, et al. (2012): Patterns and
- rates of exonic de novo mutations in autism spectrum disorders. *Nature* 485: 242–245.
- 95. Bernier R, Golzio C, Xiong B, Stessman HA, Coe BP, Penn O, et al. (2014): Disruptive
- 794 CHD8 mutations define a subtype of autism early in development. *Cell* 158: 263–276.
- 795 96. Iwata R, Ohi K, Kobayashi Y, Masuda A, Iwama M, Yasuda Y, et al. (2014): RacGAP
- 796 α2-chimaerin function in development adjusts cognitive ability in adulthood. *Cell Rep* 8:
- **797** 1257–1264.

- 798 97. Vitaterna MH, King DP, Chang A-M, Kornhauser JM, Lowrey PL, McDonald JD, et al.
- (1994): Mutagenesis and mapping of a mouse gene, clock, essential for circadian behavior.
- 800 *Science* 264: 719–725.
- 801 98. Roybal K, Theobold D, Graham A, DiNieri JA, Russo SJ, Krishnan V, et al. (2007):
- 802 Mania-like behavior induced by disruption of CLOCK. Proc Natl Acad Sci 104: 6406–
- **803** 6411.
- 99. Shi J, Wittke-Thompson JK, Badner JA, Hattori E, Potash JB, Willour VL, et al.
- 805 (2008): Clock genes may influence bipolar disorder susceptibility and dysfunctional
- 806 circadian rhythm. Am J Med Genet B Neuropsychiatr Genet 147B: 1047–1055.
- 807 100. Soria V, Martínez-Amorós È, Escaramís G, Valero J, Pérez-Egea R, García C, et al.
- 808 (2010): Differential association of circadian genes with mood disorders: CRY1 and NPAS2
- are associated with unipolar major depression and CLOCK and VIP with bipolar disorder.
- 810 *Neuropsychopharmacology* 35: 1279–1289.
- 811 101. Kishi T, Kitajima T, Ikeda M, Yamanouchi Y, Kinoshita Y, Kawashima K, et al.
- 812 (2009): Association study of clock gene (CLOCK) and schizophrenia and mood disorders
- 813 in the Japanese population. *Eur Arch Psychiatry Clin Neurosci* 259: 293.
- 814 102. Murray F, Smith DW, Hutson PH (2008): Chronic low dose corticosterone exposure
- 815 decreased hippocampal cell proliferation, volume and induced anxiety and depression like
- 816 behaviours in mice. *Eur J Pharmacol* 583: 115–127.
- 817 103. Zhao Y, Ma R, Shen J, Su H, Xing D, Du L (2008): A mouse model of depression
- 818 induced by repeated corticosterone injections. *Eur J Pharmacol* 581: 113–120.
- 819 104. Antonijevic IA, Steiger A (2003): Depression-like changes of the sleep-EEG during
- 820 high dose corticosteroid treatment in patients with multiple sclerosis.
- 821 *Psychoneuroendocrinology* 28: 780–795.
- 822 105. Brown ES, J. Woolston D, Frol A, Bobadilla L, Khan DA, Hanczyc M, et al. (2004):
- 823 Hippocampal volume, spectroscopy, cognition, and mood in patients receiving
- 824 corticosteroid therapy. *Biol Psychiatry* 55: 538–545.
- 825 106. Brown ES, Suppes T (1998): Mood symptoms during corticosteroid therapy: a review.
- 826 *Harv Rev Psychiatry* 5: 239–246.

- 827 107. Nakamura H, Yamashita N, Kimura A, Kimura Y, Hirano H, Makihara H, et al.
- 828 (2016): Comprehensive behavioral study and proteomic analyses of CRMP2-deficient mice.
- 829 Genes Cells 21: 1059–1079.
- 830 108. Yoshida H, Watanabe A, Ihara Y (1998): Collapsin response mediator protein-2 Is
- associated with neurofibrillary tangles in Alzheimer's disease. J Biol Chem 273: 9761-
- **832** 9768.
- 833 109. Nakata K, Ujike H, Sakai A, Takaki M, Imamura T, Tanaka Y, Kuroda S (2003): The
- human dihydropyrimidinase-related protein 2 gene on chromosome 8p21 is associated with
 paranoid-type schizophrenia. *Biol Psychiatry* 53: 571–576.
- 110. Nyuyki KD, Cluny NL, Swain MG, Sharkey KA, Pittman QJ (2018): Altered brain
- 837 excitability and increased anxiety in mice with experimental colitis: consideration of
- 838 hyperalgesia and sex differences. *Front Behav Neurosci* 12.
- 839 https://doi.org/10.3389/fnbeh.2018.00058
- 840 111. Shoji H, Toyama K, Takamiya Y, Wakana S, Gondo Y, Miyakawa T (2012):
- 841 Comprehensive behavioral analysis of ENU-induced Disc1-Q31L and -L100P mutant mice.
- 842 *BMC Res Notes* 5: 108.
- 843 112. St Clair D, Blackwood D, Muir W, Walker M, St Clair D, Muir W, et al. (1990):
- 844 Association within a family of a balanced autosomal translocation with major mental illness.
- 845 *The Lancet* 336: 13–16.
- 846 113. Millar JK, Wilson-Annan JC, Anderson S, Christie S, Taylor MS, Semple CAM, et al.
- 847 (2000): Disruption of two novel genes by a translocation co-segregating with schizophrenia.
- 848 *Hum Mol Genet* 9: 1415–1423.
- 849 114. Ekelund J, Hovatta I, Parker A, Paunio T, Varilo T, Martin R, et al. (2001):
- 850 Chromosome 1 loci in Finnish schizophrenia families. *Hum Mol Genet* 10: 1611–1617.
- 851 115. Krumm N, O'Roak BJ, Shendure J, Eichler EE (2014): A de novo convergence of
- autism genetics and molecular neuroscience. *Trends Neurosci* 37: 95–105.
- 116. McRae JF, Clayton S, Fitzgerald TW, Kaplanis J, Prigmore E, Rajan D, et al. (2017):
- 854 Prevalence and architecture of de novo mutations in developmental disorders. *Nature* 542:
- **855** 433–438.

- 117. Imoto Y, Segi-Nishida E, Suzuki H, Kobayashi K (2017): Rapid and stable changes in
- 857 maturation-related phenotypes of the adult hippocampal neurons by electroconvulsive
- treatment. Mol Brain 10: 8.
- 118. Kobayashi K, Imoto Y, Yamamoto F, Kawasaki M, Ueno M, Segi-Nishida E, Suzuki
- 860 H (2016): Rapid and lasting enhancement of dopaminergic modulation at the hippocampal
- 861 mossy fiber synapse by electroconvulsive treatment. *J Neurophysiol* 117: 284–289.
- 119. Husain MM, Rush AJ, Fink M, Knapp R, Petrides G, Rummans T, et al. (2004):
- 863 Speed of response and remission in major depressive disorder with acute Electroconvulsive
- therapy (ECT): A consortium for research in ECT (CORE) report. *J Clin Psychiatry* 65:
- **865** 485–491.
- 120. Pagnin D, de Queiroz V, Pini S, Cassano GB (2004): Efficacy of ECT in depression: a
- 867 meta-analytic review. *J ECT* 20: 13–20.
- 121. Consorthium TD-BFX, Bakker CE, Verheij C, Willemsen R, Helm R van der,
- 869 Oerlemans F, et al. (1994): Fmr1 knockout mice: a model to study fragile X mental
- 870 retardation. *Cell* 78: 23–33.
- 122. Taga T, Yamaguchi Y, Kokubo Y, Hattori S, Takao K, Inazawa J, et al. (2011):
- 872 Establishment of a new mouse model of neurodevelopmental disorder. J Pharmacol Sci
- **873** 115: 35–35.
- 123. Sudo G, Kagawa T, Kokubu Y, Inazawa J, Taga T (2016): Increase in GFAP-positive
- astrocytes in histone demethylase GASC1/KDM4C/JMJD2C hypomorphic mutant mice.
- 876 *Genes Cells* 21: 218–225.
- 124. Kantojärvi K, Onkamo P, Vanhala R, Alen R, Hedman M, Sajantila A, et al. (2010):
- 878 Analysis of 9p24 and 11p12-13 regions in autism spectrum disorders: rs1340513 in the
- 379 JMJD2C gene is associated with ASDs in Finnish sample. *Psychiatr Genet* 20: 102–108.
- 880 125. Nishizono H, Darwish M, Endo TA, Uno K, Abe H, Yasuda R (2020): Glycine
- receptor α4 subunit facilitates the early embryonic development in mice. *Reproduction* 159:
 41.
- 126. Labonne JDJ, Graves TD, Shen Y, Jones JR, Kong I-K, Layman LC, Kim H-G
- 884 (2016): A microdeletion at Xq22.2 implicates a glycine receptor GLRA4 involved in

intellectual disability, behavioral problems and craniofacial anomalies. *BMC Neurol* 16:

886 132.

- 887 127. Belforte JE, Zsiros V, Sklar ER, Jiang Z, Yu G, Li Y, et al. (2010): Postnatal NMDA
- 888 receptor ablation in corticolimbic interneurons confers schizophrenia-like phenotypes. *Nat*
- 889 *Neurosci* 13: 76–83.
- 128. Begni S, Moraschi S, Bignotti S, Fumagalli F, Rillosi L, Perez J, Gennarelli M (2003):
- Association between the G1001C polymorphism in the GRIN1 gene promoter region and
 schizophrenia. *Biol Psychiatry* 53: 617–619.
- 893 129. Zhao X, Li H, Shi Y, Tang R, Chen W, Liu J, *et al.* (2006): Significant association
- between the genetic variations in the 5' end of the N-Methyl-D-Aspartate receptor subunit
- gene GRIN1 and schizophrenia. *Biol Psychiatry* 59: 747–753.
- 130. Hayashida M, Miyaoka T, Tsuchie K, Yasuda H, Wake R, Nishida A, et al. (2009):
- 897 Hyperbilirubinemia-related behavioral and neuropathological changes in rats: A possible
- schizophrenia animal model. *Prog Neuropsychopharmacol Biol Psychiatry* 33: 581–588.
- 131. Müller N, Schiller P, Ackenheil M (1991): Coincidence of schizophrenia and
- 900 hyperbilirubinemia. *Pharmacopsychiatry* 24: 225–228.
- 901 132. Takao K, Kobayashi K, Hagihara H, Ohira K, Shoji H, Hattori S, et al. (2013):
- 902 Deficiency of Schnurri-2, an MHC enhancer binding protein, induces mild chronic
- 903 inflammation in the brain and confers molecular, neuronal, and behavioral phenotypes
- 904 related to schizophrenia. *Neuropsychopharmacology* 38: 1409–1425.
- 905 133. Srivastava S, Engels H, Schanze I, Cremer K, Wieland T, Menzel M, et al. (2016):
- 906 Loss-of-function variants in *HIVEP2* are a cause of intellectual disability. *Eur J Hum Genet*907 24: 556.
- 908 134. Steinfeld H, Cho MT, Retterer K, Person R, Schaefer GB, Danylchuk N, et al. (2016):
- 909 Mutations in HIVEP2 are associated with developmental delay, intellectual disability, and
- 910 dysmorphic features. *Neurogenetics* 17: 159–164.
- 911 135. Fujisawa H, Sugimura Y, Takagi H, Mizoguchi H, Takeuchi H, Izumida H, et al.
- 912 (2015): Chronic hyponatremia causes neurologic and psychologic impairments. J Am Soc
- **913** *Nephrol* ASN.2014121196.

- 136. Izumida H, Takagi H, Fujisawa H, Iwata N, Nakashima K, Takeuchi S, et al. (2017):
- 915 NMDA receptor antagonist prevents cell death in the hippocampal dentate gyrus induced
- 916 by hyponatremia accompanying adrenal insufficiency in rats. *Exp Neurol* 287, Part 1: 65–
- 917 74.
- 918 137. Kawakami T, Fujisawa H, Nakayama S, Yoshino Y, Hattori S, Seino Y, et al. (2020):
- 919 Vasopressin escape and memory impairment in a model of chronic syndrome of
- 920 inappropriate secretion of antidiuretic hormone in mice. *Endocr J*.
- 921 https://doi.org/10.1507/endocrj.EJ20-0289
- 922 138. Fan S-S, Lin L-F, Chen VC-H, Hsieh C-W, Hsiao H-P, McIntyre RS, et al. (2020):
- 923 Effects of lower past-year serum sodium and hyponatremia on depression symptoms and
- 924 cognitive impairments in patients with hemodialysis. *Ther Apher Dial* 24: 169–177.
- 925 139. Fujisawa C, Umegaki H, Sugimoto T, Samizo S, Huang CH, Fujisawa H, et al. (2021):
- 926 Mild hyponatremia is associated with low skeletal muscle mass, physical function
- 927 impairment, and depressive mood in the elderly. *BMC Geriatr* 21: 15.
- 928 140. Yamanishi K, Doe N, Mukai K, Ikubo K, Hashimoto T, Uwa N, et al. (2019):
- 929 Interleukin-18-deficient mice develop hippocampal abnormalities related to possible
- 930 depressive-like behaviors. *Neuroscience* 408: 147–160.
- 931 141. Yamanishi K, Hashimoto T, Miyauchi M, Mukai K, Ikubo K, Uwa N, et al. (2020):
- 932 Analysis of genes linked to depressive-like behaviors in interleukin-18-deficient mice:
- 933 Gene expression profiles in the brain. *Biomed Rep* 12: 3–10.
- 934 142. Kretowski A, Mironczuk K, Karpinska A, Bojaryn U, Kinalski M, Puchalski Z,
- 935 Kinalska I (2002): Interleukin-18 promoter polymorphisms in type 1 diabetes. *Diabetes* 51:
 936 3347–3349.
- 937 143. Chatterjee M, Ganguly S, Srivastava M, Palit G (2011): Effect of 'chronic' versus
- 938 'acute' ketamine administration and its 'withdrawal' effect on behavioural alterations in
- 939 mice: Implications for experimental psychosis. *Behav Brain Res* 216: 247–254.
- 940 144. Lahti AC, Weiler MA, Tamara Michaelidis BA, Parwani A, Tamminga CA (2001):
- 941 Effects of ketamine in normal and schizophrenic volunteers. *Neuropsychopharmacology*
- **942** 25: 455–467.

- 943 145. Huang M, Kwon S, Rajagopal L, He W, Meltzer HY (2018): 5-HT1A parital agonism
- and 5-HT7 antagonism restore episodic memory in subchronic phencyclidine-treated mice:
- 945 role of brain glutamate, dopamine, acetylcholine and GABA. *Psychopharmacology (Berl)*
- **946** 235: 2795–2808.
- 947 146. Meltzer HY, Cucchiaro J, Silva R, Ogasa M, Phillips D, Xu J, et al. (2011):
- 948 Lurasidone in the treatment of schizophrenia: a randomized, double-blind, placebo- and
- 949 olanzapine-controlled study. *Am J Psychiatry* 168: 957–967.
- 950 147. Ishibashi T, Horisawa T, Tokuda K, Ishiyama T, Ogasa M, Tagashira R, et al. (2010):
- 951 Pharmacological profile of lurasidone, a novel antipsychotic agent with potent
- **952** 5-hydroxytryptamine 7 (5-HT7) and 5-HT1A receptor activity. *J Pharmacol Exp Ther* 334:
- **953** 171–181.
- 954 148. Connor SA, Ammendrup-Johnsen I, Kishimoto Y, Karimi Tari P, Cvetkovska V,
- 955 Harada T, et al. (2017): Loss of synapse repressor MDGA1 enhances perisomatic inhibition,
- 956 confers resistance to network excitation, and impairs cognitive function. *Cell Rep* 21:
- **957** 3637–3645.
- 958 149. Kähler AK, Djurovic S, Kulle B, Jönsson EG, Agartz I, Hall H, et al. (2008):
- 959 Association analysis of schizophrenia on 18 genes involved in neuronal migration:
- 960 MDGA1 as a new susceptibility gene. *Am J Med Genet B Neuropsychiatr Genet* 147B:
- 961 1089–1100.
- 962 150. Li J, Liu J, Feng G, Li T, Zhao Q, Li Y, et al. (2011): The MDGA1 gene confers risk
- to schizophrenia and bipolar disorder. *Schizophr Res* 125: 194–200.
- 964 151. Hossain MR, Jamal M, Tanoue Y, Ojima D, Takahashi H, Kubota T, et al. (2020):
- 965 MDGA1-deficiency attenuates prepulse inhibition with alterations of dopamine and
- 966 serotonin metabolism: An ex vivo HPLC-ECD analysis. *Neurosci Lett* 716: 134677.
- 967 152. Connor SA, Ammendrup-Johnsen I, Chan AW, Kishimoto Y, Murayama C, Kurihara
- 968 N, et al. (2016): Altered cortical dynamics and cognitive function upon haploinsufficiency
- 969 of the autism-linked excitatory synaptic suppressor MDGA2. *Neuron* 91: 1052–1068.
- 970 153. Bucan M, Abrahams BS, Wang K, Glessner JT, Herman EI, Sonnenblick LI, et al.
- 971 (2009): Genome-wide analyses of exonic copy number variants in a family-based study
- 972 point to novel autism susceptibility genes. *PLOS Genet* 5: e1000536.

- 973 154. Pinto D, Pagnamenta AT, Klei L, Anney R, Merico D, Regan R, et al. (2010):
- 974 Functional impact of global rare copy number variation in autism spectrum disorders.
- **975** *Nature* 466: 368–372.
- 976 155. McClay JL, Adkins DE, Vunck SA, Batman AM, Vann RE, Clark SL, et al. (2013):
- 977 Large-scale neurochemical metabolomics analysis identifies multiple compounds
- 978 associated with methamphetamine exposure. *Metabolomics* 9: 392–402.
- 979 156. Glasner-Edwards S, Mooney LJ (2014): Methamphetamine psychosis: epidemiology
- and management. CNS Drugs 28: 1115–1126.
- 981 157. Togashi K, Wakatsuki S, Furuno A, Tokunaga S, Nagai Y, Araki T (2013): Na+/H+
- 982 exchangers induce autophagy in neurons and inhibit polyglutamine-induced aggregate983 formation. *PLOS ONE* 8: e81313.
- 158. Tabuchi K, Blundell J, Etherton MR, Hammer RE, Liu X, Powell CM, Südhof TC
- 985 (2007): A neuroligin-3 mutation implicated in autism increases inhibitory synaptic
- 986 transmission in mice. *Science* 318: 71–76.
- 987 159. Jamain S, Quach H, Betancur C, Råstam M, Colineaux C, Gillberg IC, et al. (2003):
- 988 Mutations of the X-linked genes encoding neuroligins NLGN3 and NLGN4 are associated
- 989 with autism. *Nat Genet* 34: 27–29.
- 160. Südhof TC (2008): Neuroligins and neurexins link synaptic function to cognitive
- **991** disease. *Nature* 455: 903–911.
- 992 161. van West D, Van Den Eede F, Del-Favero J, Souery D, Norrback K-F, Van Duijn C,
- 993 *et al.* (2006): Glucocorticoid receptor gene-based SNP analysis in patients with recurrent
- 994 major depression. *Neuropsychopharmacology* 31: 620–627.
- 995 162. Huang FL, Huang K-P (2012): Methylphenidate improves the behavioral and
- 996 cognitive deficits of neurogranin knockout mice. *Genes Brain Behav* 11: 794–805.
- 997 163. Huang FL, Huang K-P, Wu J, Boucheron C (2006): Environmental enrichment
- 998 enhances neurogranin expression and hippocampal learning and memory but fails to rescue
- 999 the impairments of neurogranin null mutant mice. *J Neurosci* 26: 6230–6237.
- 1000 164. Pak JH, Huang FL, Li J, Balschun D, Reymann KG, Chiang C, et al. (2000):
- 1001 Involvement of neurogranin in the modulation of calcium/calmodulin-dependent protein

- 1002 kinase II, synaptic plasticity, and spatial learning: A study with knockout mice. *Proc Natl*
- 1003 *Acad Sci* 97: 11232–11237.
- 1004 165. Stefansson H, Ophoff RA, Steinberg S, Andreassen OA, Cichon S, Rujescu D, et al.
- 1005 (2009): Common variants conferring risk of schizophrenia. *Nature* 460: 744–747.
- 1006 166. Schizophrenia Working Group of the Psychiatric Genomics Consortium (2014):
- 1007 Biological insights from 108 schizophrenia-associated genetic loci. *Nature* 511: 421–427.
- 1008 167. Hashimoto H, Shintani N, Tanaka K, Mori W, Hirose M, Matsuda T, et al. (2001):
- 1009 Altered psychomotor behaviors in mice lacking pituitary adenylate cyclase-activating
- 1010 polypeptide (PACAP). *Proc Natl Acad Sci* 98: 13355–13360.
- 1011 168. Hashimoto R, Hashimoto H, Shintani N, Ohi K, Hori H, Saitoh O, et al. (2010):
- 1012 Possible association between the pituitary adenylate cyclase-activating polypeptide
- 1013 (PACAP) gene and major depressive disorder. *Neurosci Lett* 468: 300–302.
- 1014 169. Hashimoto R, Hashimoto H, Shintani N, Chiba S, Hattori S, Okada T, et al. (2007):
- 1015 Pituitary adenylate cyclase-activating polypeptide is associated with schizophrenia. *Mol*
- 1016 *Psychiatry* 12: 1026–1032.
- 1017 170. Bolton PF, Veltman MWM, Weisblatt E, Holmes JR, Thomas NS, Youings SA, et al.
- 1018 (2004): Chromosome 15q11-13 abnormalities and other medical conditions in individuals
- 1019 with autism spectrum disorders. *Psychiatr Genet* 14: 131–137.
- 1020 171. Cook Jr EH, Scherer SW (2008): Copy-number variations associated with
- 1021 neuropsychiatric conditions. *Nature* 455: 919–923.
- 1022 172. Dykens EM, Sutcliffe JS, Levitt P (2004): Autism and 15q11-q13 disorders:
- 1023 Behavioral, genetic, and pathophysiological issues. *Ment Retard Dev Disabil Res Rev* 10:
- **1024** 284–291.
- 1025 173. Takumi T, Tamada K (2018): CNV biology in neurodevelopmental disorders. *Curr*
- 1026 *Opin Neurobiol* 48: 183–192.
- 1027 174. Meltzer HY, Rajagopal L, Huang M, Oyamada Y, Kwon S, Horiguchi M (2013):
- 1028 Translating the N-methyl-d-aspartate receptor antagonist model of schizophrenia to
- 1029 treatments for cognitive impairment in schizophrenia. Int J Neuropsychopharmacol 16:
- 1030 2181–2194.

- 1031 175. Peterson RC, Stillman RC (1978): Phencyclidine: An overview. Phencyclidine Abuse:
- 1032 An Appraisal (ed. by Petersen, R.C., Stillman, R.C.). NIDA Res Monogr 21 US Gov Print
- 1033 *Off Wash DC* 1–17.
- 1034 176. Kasahara T, Takata A, Kato TM, Kubota-Sakashita M, Sawada T, Kakita A, et al.
- 1035 (2016): Depression-like episodes in mice harboring mtDNA deletions in paraventricular
 1036 thalamus. *Mol Psychiatry* 21: 39–48.
- 1037 177. Kasahara T, Ishiwata M, Kakiuchi C, Fuke S, Iwata N, Ozaki N, et al. (2017):
- 1038 Enrichment of deleterious variants of mitochondrial DNA polymerase gene (POLG1) in
- 1039 bipolar disorder. *Psychiatry Clin Neurosci* 71: 518–529.
- 1040 178. Zeng H, Chattarji S, Barbarosie M, Rondi-Reig L, Philpot BD, Miyakawa T, et al.
- 1041 (2001): Forebrain-Specific Calcineurin Knockout Selectively Impairs Bidirectional
- 1042 Synaptic Plasticity and Working/Episodic-like Memory. Cell 107: 617–629.
- 1043 179. Miyakawa T, Leiter LM, Gerber DJ, Gainetdinov RR, Sotnikova TD, Zeng H, et al.
- 1044 (2003): Conditional calcineurin knockout mice exhibit multiple abnormal behaviors related
- 1045 to schizophrenia. *Proc Natl Acad Sci* 100: 8987–8992.
- 1046 180. Gerber DJ, Hall D, Miyakawa T, Demars S, Gogos JA, Karayiorgou M, Tonegawa S
- 1047 (2003): Evidence for association of schizophrenia with genetic variation in the 8p21.3 gene,
- 1048 PPP3CC, encoding the calcineurin gamma subunit. *Proc Natl Acad Sci* 100: 8993–8998.
- 1049 181. Asaoka N, Nishitani N, Kinoshita H, Nagai Y, Hatakama H, Nagayasu K, et al.
- 1050 (2019): An adenosine A2A receptor antagonist improves multiple symptoms of repeated
- 1051 quinpirole-induced psychosis. eNeuro 6. https://doi.org/10.1523/ENEURO.0366-18.2019
- 1052 182. Stuchlik A, Radostová D, Hatalova H, Vales K, Nekovarova T, Koprivova J, et al.
- 1053 (2016): Validity of quinpirole sensitization rat model of OCD: linking evidence from
- animal and clinical studies. Front Behav Neurosci 10: 209.
- 1055 183. Sakai K, Shoji H, Kohno T, Miyakawa T, Hattori M (2016): Mice that lack the
- 1056 C-terminal region of Reelin exhibit behavioral abnormalities related to neuropsychiatric
- 1057 disorders. *Sci Rep* 6: 28636.
- 1058 184. Persico AM, D'Agruma L, Maiorano N, Totaro A, Militerni R, Bravaccio C, et al.
- 1059 (2001): Reelin gene alleles and haplotypes as a factor predisposing to autistic disorder. *Mol*
- 1060 *Psychiatry* 6: 150–159.

- 1061 185. Serajee FJ, Zhong H, Mahbubul Huq AHM (2006): Association of Reelin gene
- 1062 polymorphisms with autism. *Genomics* 87: 75–83.
- 1063 186. Zhang H, Liu X, Zhang C, Mundo E, Macciardi F, Grayson DR, et al. (2002): Reelin
- 1064 gene alleles and susceptibility to autism spectrum disorders. *Mol Psychiatry* 7: 1012–1017.
- 1065 187. Goes FS, Willour VL, Zandi PP, Belmonte PL, MacKinnon DF, Mondimore FM, et al.
- 1066 (2010): Sex-specific association of the reelin gene with bipolar disorder. Am J Med Genet B
- 1067 Neuropsychiatr Genet 153B: 549–553.
- 1068 188. Shifman S, Johannesson M, Bronstein M, Chen SX, Collier DA, Craddock NJ, et al.
- 1069 (2008): Genome-wide association identifies a common variant in the Reelin gene that
- 1070 increases the risk of schizophrenia only in women. *PLOS Genet* 4: e28.
- 1071 189. Shoji H, Miyakawa T (2020): Differential effects of stress exposure via two types of
- 1072 restraint apparatuses on behavior and plasma corticosterone level in inbred male
- 1073 BALB/cAJcl mice. *Neuropsychopharmacol Rep* 40: 73–84.
- 1074 190. Sellmeijer J, Mathis V, Hugel S, Li X-H, Song Q, Chen Q-Y, et al. (2018):
- 1075 Hyperactivity of anterior cingulate cortex areas 24a/24b drives chronic pain-induced
- 1076 anxiodepressive-like consequences. *J Neurosci* 38: 3102–3115.
- 1077 191. Yalcin I, Megat S, Barthas F, Waltisperger E, Kremer M, Salvat E, Barrot M (2014):
- 1078 The sciatic nerve cuffing model of neuropathic pain in mice. J Vis Exp JoVE.
- 1079 https://doi.org/10.3791/51608
- 1080 192. Tatsukawa T, Raveau M, Ogiwara I, Hattori S, Miyamoto H, Mazaki E, et al. (2019):
- 1081 Scn2a haploinsufficient mice display a spectrum of phenotypes affecting anxiety,
- 1082 sociability, memory flexibility and ampakine CX516 rescues their hyperactivity. *Mol*
- 1083 *Autism* 10: 15.
- 1084 193. Buxbaum JD, Daly MJ, Devlin B, Lehner T, Roeder K, State MW (2012): The autism
- 1085 sequencing consortium: large-scale, high-throughput sequencing in autism spectrum
- 1086 disorders. *Neuron* 76: 1052–1056.
- 1087 194. Tavassoli T, Kolevzon A, Wang AT, Curchack-Lichtin J, Halpern D, Schwartz L, et al.
- 1088 (2014): De novo SCN2A splice site mutation in a boy with Autism spectrum disorder. *BMC*
- 1089 *Med Genet* 15: 35.

- 1090 195. Allen AS, Berkovic SF, Cossette P, Delanty N, Dlugos D, Eichler EE, et al. (2013):
- 1091 De novo mutations in epileptic encephalopathies. *Nature* 501: 217–221.
- 1092 196. Heron SE, Crossland KM, Andermann E, Phillips HA, Hall AJ, Bleasel A, et al.
- 1093 (2002): Sodium-channel defects in benign familial neonatal-infantile seizures. *The Lancet*
- **1094** 360: 851–852.
- 1095 197. Sugawara T, Tsurubuchi Y, Agarwala KL, Ito M, Fukuma G, Mazaki-Miyazaki E, et
- 1096 *al.* (2001): A missense mutation of the Na+ channel α II subunit gene Nav1.2 in a patient
- 1097 with febrile and afebrile seizures causes channel dysfunction. *Proc Natl Acad Sci* 98: 6384–1098 6389.
- 1099 198. de Ligt J, Willemsen MH, van Bon BWM, Kleefstra T, Yntema HG, Kroes T, et al.
- 1100 (2012): Diagnostic exome sequencing in persons with severe intellectual disability. N Engl
- 1101 *J Med* 367: 1921–1929.
- 1102 199. Rauch A, Wieczorek D, Graf E, Wieland T, Endele S, Schwarzmayr T, et al. (2012):
- 1103 Range of genetic mutations associated with severe non-syndromic sporadic intellectual
- 1104 disability: an exome sequencing study. *The Lancet* 380: 1674–1682.
- 1105 200. Tanaka M, Sato A, Kasai S, Hagino Y, Kotajima-Murakami H, Kashii H, et al. (2018):
- 1106 Brain hyperserotonemia causes autism-relevant social deficits in mice. *Mol Autism* 9: 60.
- 1107 201. Bacchelli E, Maestrini E (2006): Autism spectrum disorders: Molecular genetic
- 1108 advances. Am J Med Genet C Semin Med Genet 142C: 13–23.
- 1109 202. Wiggins JL, Swartz JR, Martin DM, Lord C, Monk CS (2014): Serotonin transporter
- 1110 genotype impacts amygdala habituation in youth with autism spectrum disorders. Soc Cogn
- 1111 Affect Neurosci 9: 832–838.
- 1112 203. Peça J, Feliciano C, Ting JT, Wang W, Wells MF, Venkatraman TN, et al. (2011):
- 1113 Shank3 mutant mice display autistic-like behaviours and striatal dysfunction. *Nature* 472:
- 1114 437–442.
- 1115 204. Durand CM, Betancur C, Boeckers TM, Bockmann J, Chaste P, Fauchereau F, et al.
- 1116 (2007): Mutations in the gene encoding the synaptic scaffolding protein SHANK3 are
- associated with autism spectrum disorders. *Nat Genet* 39: 25–27.

- 1118 205. Gauthier J, Spiegelman D, Piton A, Lafrenière RG, Laurent S, St-Onge J, et al. (2009):
- 1119 Novel de novo SHANK3 mutation in autistic patients. Am J Med Genet B Neuropsychiatr
- 1120 *Genet* 150B: 421–424.
- 1121 206. Moessner R, Marshall CR, Sutcliffe JS, Skaug J, Pinto D, Vincent J, et al. (2007):
- 1122 Contribution of SHANK3 mutations to autism spectrum disorder. *Am J Hum Genet* 81:
- **1123** 1289–1297.
- 1124 207. Barr CL, Feng Y, Wigg K, Bloom S, Roberts W, Malone M, et al. (2000):
- 1125 Identification of DNA variants in the SNAP-25 gene and linkage study of these
- 1126 polymorphisms and attention-deficit hyperactivity disorder. *Mol Psychiatry* 5: 405–409.
- 1127 208. Brophy K, Hawi Z, Kirley A, Fitzgerald M, Gill M (2002): Synaptosomal-associated
- 1128 protein 25 (SNAP-25) and attention deficit hyperactivity disorder (ADHD): evidence of
- 1129 linkage and association in the Irish population. *Mol Psychiatry* 7: 913–917.
- 1130 209. Mill J, Curran S, Kent L, Gould A, Huckett L, Richards S, et al. (2002): Association
- 1131 study of a SNAP-25 microsatellite and attention deficit hyperactivity disorder. Am J Med
- 1132 *Genet* 114: 269–271.
- 1133 210. Kustanovich V, Merriman B, McGough J, McCracken JT, Smalley SL, Nelson SF
- 1134 (2003): Biased paternal transmission of SNAP-25 risk alleles in attention-deficit
- 1135 hyperactivity disorder. *Mol Psychiatry* 8: 309–315.
- 1136 211. Mill J, Richards S, Knight J, Curran S, Taylor E, Asherson P (2004): Haplotype
- analysis of SNAP-25 suggests a role in the aetiology of ADHD. *Mol Psychiatry* 9: 801–
- **1138** 810.
- 1139 212. Feng Y, Crosbie J, Wigg K, Pathare T, Ickowicz A, Schachar R, et al. (2005): The
- 1140 SNAP25 gene as a susceptibility gene contributing to attention-deficit hyperactivity
- 1141 disorder. *Mol Psychiatry* 10: 998–1005.
- 1142 213. Hamdan FF, Myers CT, Cossette P, Lemay P, Spiegelman D, Laporte AD, et al.
- 1143 (2017): High rate of recurrent de novo mutations in developmental and epileptic
- 1144 encephalopathies. *Am J Hum Genet* 101: 664–685.
- 1145 214. Heyne HO, Singh T, Stamberger H, Abou Jamra R, Caglayan H, Craiu D, et al.
- 1146 (2018): De novo variants in neurodevelopmental disorders with epilepsy. *Nat Genet* 50:
- 1147 1048–1053.

- 1148 215. Ayalew M, Le-Niculescu H, Levey DF, Jain N, Changala B, Patel SD, et al. (2012):
- 1149 Convergent functional genomics of schizophrenia: from comprehensive understanding to
- 1150 genetic risk prediction. *Mol Psychiatry* 17: 887–905.
- 1151 216. Houenou J, Boisgontier J, Henrion A, d'Albis M-A, Dumaine A, Linke J, et al.
- 1152 (2017): A multilevel functional study of a SNAP25 at-risk variant for bipolar disorder and
- 1153 schizophrenia. J Neurosci 37: 10389–10397.
- 1154 217. Kollack-Walker, Don, Watson, Akil (1999): Differential Expression of c- fos mRNA
- 1155 Within Neurocircuits of Male Hamsters Exposed to Acute or Chronic Defeat. J
- 1156 *Neuroendocrinol* 11: 547–559.
- 1157 218. Martinez M, Phillips PJ, Herbert J (1998): Adaptation in patterns of c-fos expression
- 1158 in the brain associated with exposure to either single or repeated social stress in male rats.
- 1159 *Eur J Neurosci* 10: 20–33.
- 1160 219. Golden SA, Covington HE, Berton O, Russo SJ (2011): A standardized protocol for
- 1161 repeated social defeat stress in mice. *Nat Protoc* 6: 1183–1191.
- 1162 220. Toyoda A (2017): Social defeat models in animal science: What we have learned from
- 1163 rodent models. *Anim Sci J* 88: 944–952.
- 1164 221. Furman BL (2015): Streptozotocin-induced diabetic models in mice and rats. Curr
- 1165 *Protoc Pharmacol* 70: 5.47.1-5.47.20.
- 1166 222. Lenzen S (2008): The mechanisms of alloxan- and streptozotocin-induced diabetes.
- 1167 *Diabetologia* 51: 216–226.
- 1168 223. Anderson RJ, Freedland KE, Clouse RE, Lustman PJ (2001): The prevalence of
- 1169 comorbid depression in adults with diabetes: a meta-analysis. Diabetes Care 24: 1069–
- **1170** 1078.
- 1171 224. Miyamoto H, Shimohata A, Abe M, Abe T, Mazaki E, Amano K, et al. (2017):
- 1172 Potentiation of excitatory synaptic transmission ameliorates aggression in mice with Stxbp1
- 1173 haploinsufficiency. *Hum Mol Genet* 26: 4961–4974.
- 1174 225. Hoischen A, Krumm N, Eichler EE (2014): Prioritization of neurodevelopmental
- 1175 disease genes by discovery of new mutations. *Nat Neurosci* 17: 764–772.

- 1176 226. Carvill GL, Heavin SB, Yendle SC, McMahon JM, O'Roak BJ, Cook J, et al. (2013):
- 1177 Targeted resequencing in epileptic encephalopathies identifies de novo mutations in CHD2
- 1178 and SYNGAP1. *Nat Genet* 45: 825–830.
- 1179 227. Saitsu H, Kato M, Mizuguchi T, Hamada K, Osaka H, Tohyama J, et al. (2008): De
- 1180 novo mutations in the gene encoding STXBP1 (MUNC18-1) cause early infantile epileptic
- 1181 encephalopathy. *Nat Genet* 40: 782–788.
- 1182 228. Komiyama NH, Watabe AM, Carlisle HJ, Porter K, Charlesworth P, Monti J, et al.
- 1183 (2002): SynGAP regulates ERK/MAPK signaling, synaptic plasticity, and learning in the
- 1184 complex with postsynaptic density 95 and NMDA receptor. *J Neurosci* 22: 9721–9732.
- 1185 229. Nakajima R, Takao K, Hattori S, Shoji H, Komiyama NH, Grant SGN, Miyakawa T
- 1186 (2019): Comprehensive behavioral analysis of heterozygous Syngap1 knockout mice.
- 1187 *Neuropsychopharmacol Rep* 39: 223–237.
- 1188 230. Narita N, Kato M, Tazoe M, Miyazaki K, Narita M, Okado N (2002): Increased
- 1189 monoamine concentration in the brain and blood of fetal thalidomide- and valproic acid-
- 1190 exposed rat: Putative animal models for autism. *Pediatr Res* 52: 576–579.
- 1191 231. Tsugiyama LE, Ida-Eto M, Ohkawara T, Noro Y, Narita M (2020): Altered neuronal
- 1192 activity in the auditory brainstem following sound stimulation in thalidomide-induced
- autism model rats. *Congenit Anom* 60: 82–86.
- 1194 232. Strömland K, Nordin V, Miller M, Akerström B, Gillberg C (1994): Autism in
- thalidomide embryopathy: a population study. *Dev Med Child Neurol* 36: 351–356.
- 1196 233. Okuda-Ashitaka E, Kakuchi Y, Kakumoto H, Yamanishi S, Kamada H, Yoshidu T, et
- 1197 *al.* (2020): Mechanical allodynia in mice with tenascin-X deficiency associated with
- 1198 Ehlers-Danlos syndrome. *Sci Rep* 10: 6569.
- 1199 234. Kawakami K, Matsumoto K (2011): Behavioral alterations in mice lacking the gene
- 1200 for tenascin-X. *Biol Pharm Bull* 34: 590–593.
- 1201 235. Burch GH, Gong Y, Liu W, Dettman RW, Curry CJ, Smith L, et al. (1997): Tenascin-
- 1202 X deficiency is associated with Ehlers–Danlos syndrome. *Nat Genet* 17: 104–108.
- 1203 236. Tochigi M, Zhang X, Ohashi J, Hibino H, Otowa T, Rogers M, et al. (2007):
- 1204 Association study between the TNXB locus and schizophrenia in a Japanese population.
- 1205 Am J Med Genet B Neuropsychiatr Genet 144B: 305–309.

- 1206 237. Wang J, Sun S, Zhang L, Wang Z, Ye L, Liu L, et al. (2011): Further study of genetic
- 1207 association between the TNXB locus and schizophrenia. *Psychiatr Genet* 21: 216.
- 1208 238. Wei J, Hemmings GP (2004): TNXB locus may be a candidate gene predisposing to
- 1209 schizophrenia. Am J Med Genet B Neuropsychiatr Genet 125B: 43–49.
- 1210 239. Shimada T, Sugiura H, Yamagata K (n.d.): Inhibition of Rheb improved abnormal
- 1211 social behavior in astrocyte-specific Tsc1 knockout mice. NEURO2019 42nd Annu Meet
- 1212 Jpn Neurosci Soc 62nd Annu Meet Jpn Soc Neurochem PB-126.
- 1213 240. Crino PB, Nathanson KL, Henske EP (2006): The tuberous sclerosis complex. *N Engl*1214 *J Med* 355: 1345–1356.
- 1215 241. Kotajima-Murakami H, Kobayashi T, Kashii H, Sato A, Hagino Y, Tanaka M, et al.
- 1216 (2019): Effects of rapamycin on social interaction deficits and gene expression in mice
- 1217 exposed to valproic acid in utero. *Mol Brain* 12: 3.
- 1218 242. Christensen J, Grønborg TK, Sørensen MJ, Schendel D, Parner ET, Pedersen LH,
- 1219 Vestergaard M (2013): Prenatal valproate exposure and risk of autism spectrum disorders
- 1220 and childhood autism. JAMA 309: 1696.
- 1221 243. Kanda Y (2013): Investigation of the freely available easy-to-use software "EZR" for
- 1222 medical statistics. *Bone Marrow Transplant* 48: 452–458.

1223

1224 Figure legends

1225 Figure 1. Hierarchical clustering of 65 strains/conditions of animals regarding brain pH

- 1226 and lactate levels. Effect size was calculated for each strain/condition and was used in this
- 1227 analysis. ^{\$}The data of these mice have been reported previously (29).

1228 Figure 2. Highly significant negative correlations between brain pH and lactate levels.

- 1229 Scatter plot showing correlations between pH and lactate levels of 1,239 animals. A
- 1230 Z-score was calculated for each animal within the strain/condition and used in this study.
- 1231 Figure 3. Poorer working memory predict higher brain lactate levels. (a) Prediction of
- 1232 brain lactate levels from behavioral outcomes in the 24 mouse models related to
- 1233 neuropsychiatric disorders. The scatter plot shows significant correlations between
- 1234 predicted and actual lactate levels. (b) Feature preference for constructing the model to
- 1235 predict brain lactate levels. (c) Scatter plot showing correlations between working
- 1236 memory measures and actual brain lactate levels.
- 1237 **Supplementary Figure 1.** Bar graphs showing the raw mean (± sem) of brain pH. Each plot
- 1238 represents individual value. Asterisks indicate significant effects of the genotype/condition.
- 1239 *p < 0.05, **p < 0.01; unpaired t-test, or one-way or two-way ANOVA followed by *post*
- 1240 *hoc* Tukey's multiple comparison test. Detailed statistics are presented in Supplementary
- 1241 Table 2. ^{\$}The data of these mice have been reported previously (29).

1242 **Supplementary Figure 2.** Bar graphs showing the raw mean (± sem) of brain lactate levels.

- 1243 Each plot represents an individual value. Asterisks indicate significant effects of the
- 1244 genotype/condition. *p < 0.05, **p < 0.01; unpaired t-test, or one-way or two-way ANOVA
- 1245 followed by *post hoc* Tukey's multiple comparison test. Detailed statistics are presented in
- 1246 Supplementary Table 2. ^{\$}The data of these mice have been reported previously (29).
- 1247 Supplementary Figure 3. Normal distribution of effect size values of 65 animal models (a,
- 1248 pH: D = 0.12, p = 0.30; b, lactate: D = 0.15, p = 0.093)
- 1249 **Supplementary Figure 4.** No significant correlations between the number of transitions in
- 1250 the light/dark transition test (a), immobility in the forced swim test (b) and actual brain
- 1251 lactate levels of 24 mouse strains used for prediction analysis
- 1252 **Supplementary Figure 5.** Scatter plots showing correlations between age at sampling and
- 1253 pH (a), and lactate levels (b) in wild type/control mice
- 1254 Supplementary Figure 6. Dot plots showing pH (a) and lactate levels (b) of female and
- 1255 male animals in 17 mixed gender strains/conditions. Bars indicate means

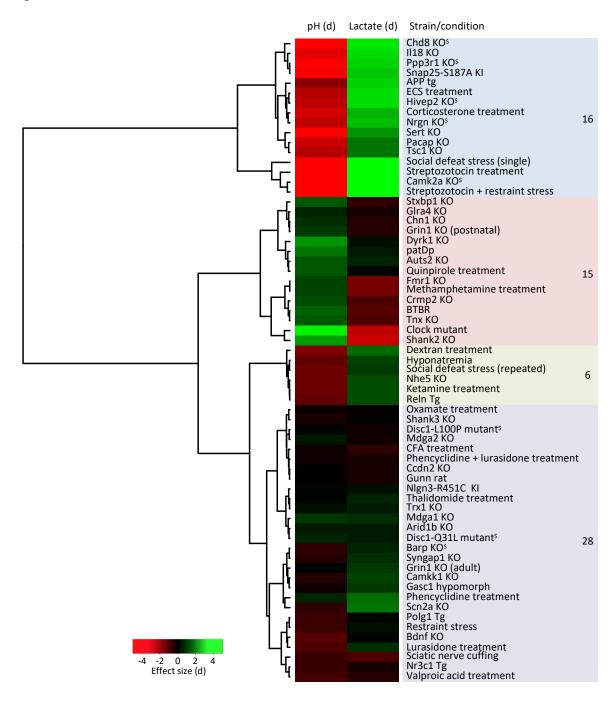
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1257 **Table 1.** Animal models used in this study

1258 **Supplementary Table 1.** Raw data of brain pH and lactate, and detailed information of the

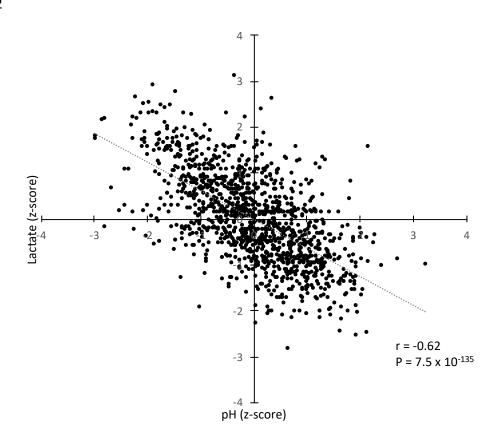
- 1259 animals (age, sex, and treatment methods)
- 1260 Supplementary Table 2. Detailed statistics of pH and lactate measurements in 65 animal
- 1261 models
- 1262 **Supplementary Table 3.** Source of behavioral data used for prediction analysis

1264 Figure 1



1266

1267 Figure 2



1270 Figure 3

