An intermittent hypercaloric diet alters gut microbiota, prefrontal cortical gene expression and social behaviours in rats

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1 An intermittent hypercaloric diet alters gut microbiota, prefrontal cortical gene 2 2 expression and social behaviours in rats

- 4 Abstract
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6 **Objectives:** Excessive consumption of high fat and high sugar (HFHS) diets alters reward 7 processing, behaviour, and changes gut microbiota profiles. Previous studies in gnotobiotic 8 mice also provide evidence that these gut microorganisms may influence social behaviour. To 9 further investigate these interactions, we examined the impact of the intermittent access to a 10 HFHS diet on social behaviour, gene expression and microbiota composition in adolescent rats. 11 **Methods:** Male rats were permitted intermittent daily access (2h / day) to a palatable HFHS chow diet for 28 days across adolescence. Social interaction, social memory and novel object 12 13 recognition were assessed during this period. Following testing, RT-PCR was conducted on hippocampal and prefrontal cortex (PFC) samples. 16S ribosomal RNA amplicon sequencing 14 was used for identification and relative quantification of bacterial taxa in faecal samples. 15

Results: We observed reduced social interaction behaviours, impaired social memory and novel object recognition in HFHS diet rats compared to chow controls. RT-PCR revealed reduced levels of monoamine oxidase A (*Maoa*), catechol-O-methyltransferase (*Comt*) and brain derived neurotrophic factor (*Bdnf*) mRNA in the PFC of HFHS diet rats. Faecal microbiota analysis demonstrated that the relative abundance of a number of specific bacterial taxa differed significantly between the two diet groups, in particular, *Lachnospiraceae* and *Ruminoccoceae* bacteria.

Discussion: Intermittent HFHS diet consumption evoked physiological changes to the brain, particularly expression of mRNA associated with reward and neuroplasticity, and gut microbiome. These changes may underpin the observed alterations to social behaviours.

26 1. Introduction

27

The global rate of obesity is rapidly growing, and it is of great concern that the incidence of 28 29 overweight and obesity is increasing amongst young people and children [1], who most 30 frequently consume hypercaloric high fat and high sucrose (HFHS) 'junk' foods [2]. Studies 31 in rodents have indicated that chronic exposure to hypercaloric diets causes multiple changes 32 to behavioural processes and reward systems, including decreased dopamine turnover in the mesolimbic system [3]. The effects of chronic HFHS diet consumption may be particularly 33 34 pronounced during critical windows of neurodevelopment. This is supported by emerging data 35 indicating that adolescence may be a sensitive period for susceptibility to diet-induced 36 behavioural changes in mood [4], reward seeking [5, 6] and cognition [7].

37

38 Beyond a role in cognition, recent studies have suggested that hypercaloric diet-induced 39 obesity may evoke changes to social behaviour in rodents [8-10]. High fat diet consumption 40 increased social interaction in adult male mice, but impaired recognition memory for a novel 41 versus familiar mouse [11], and social recognition is reduced in juvenile rats following short 42 term exposure to high fat diets [10]. Social play, a characteristic adolescent social behaviour in 43 rats that decreases into adulthood [12], was shown to be reduced following neonatal 44 overfeeding, suggesting that early-life nutrition may impact the expression of this behaviour in 45 rats [8]. However, the litter size manipulation utilised in neonatal rodent overfeeding protocols 46 may have also contributed to the altered social repertoires observed.

47

Previous research has demonstrated overlapping neuronal substrates supporting social
behaviour and those that are altered by HFHS diet. Maturation of the prefrontal cortex (PFC)
throughout adolescence [13] represents a critical period of vulnerability to diet-evoked

cognitive deficits [14]. The PFC has a critical role in social processing [15, 16], and the appropriate maturation of this region is fundamental for the development of social cognition [17]. Further experimental evidence highlights that the rodent homologue of the medial PFC and the hippocampus are important for social behaviour, including social memory and sociability [18-20]. As aspects of social interaction are rewarding, it is proposed that the increased dopamine efflux and ongoing refinement of reward-associated neural connections within the PFC across adolescence accentuate this behaviour in young rats [12]

58

Previous studies have highlighted that dysfunction in the PFC is induced through intermittent access to a HFHS diet [21], or a continuously-available high fat diet [7] during adolescence, supporting evidence that PFC neuropathology underpins social deficits [22]. In particular, intermittent access to palatable foods has been shown to impact on reward neurocircuitry [23, 24], and furthermore allows examination of behaviour both immediately following palatable food consumption, and when animals have not had recent access to the same palatable food source.

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Moreover, dietary manipulations also influence gut microbial composition [25], and alterations to gut flora has been linked to changes in cognition, mood and behaviour [26, 27]. Studies utilising germ-free (GF) mice demonstrated that the presence, composition, and functionality of the gut microbiota is crucial for normal social behaviours, which are reduced in GF mice [26]. GF mice and antibiotic-induced gut dysbiosis rodent models have demonstrated associations between the disruption of the gut microbial community and cognitive, social and emotional alterations [26, 27].

75 Building on the hypothesis that intermittent exposure to a HFHS diet during the juvenile 76 developmental phase alters cognitive control and neurotransmitter systems within the brain, we sought to examine the effects of intermittent HFHS food consumption on social interaction 77 78 and social memory in young rats. Spontaneous novel object recognition and odour recognition 79 memory were examined to assess potential HFHS diet effects on long-term memory and 80 olfaction. To highlight putative molecular pathways impacted by intermittent HFHS food 81 consumption, we examined the expression of specific genes associated with neuroplasticity, 82 monoamine signalling, and neuroinflammation in the PFC and hippocampus. Furthermore, we examined faecal microbiota composition to explore diet-induced alterations. Exploratory 83 84 statistical analyses through linear modelling were performed to determine associations between 85 faecal microbiota composition, behaviour and cortical gene expression.

- 86
- 87 **2. Methods**
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89 **2.1.** Animals

90 Male (n = 32) albino Sprague Dawley rats (Animal Resources Centre, Western Australia) arrived at postnatal day (P)21 (mean body weight = ~ 50 g) and were housed in 91 92 groups of four in a temperature (21 °C \pm 2 °C; humidity 55 \pm 5%) and light (12 h cycle lights 93 on at 0700) controlled colony room. Standard laboratory rat chow (Meat Free Rat and Mouse 94 Diet, Specialty Feeds, Western Australia; energy composition of 14 kJ/g; 23% protein, 12% fat, 65% carbohydrates) and water was available ad libitum throughout the experiment. 95 96 Behavioural tests were performed between 0800 and 1400 and procedures were approved by 97 the institution's Animal Care and Ethics Committee.

99 2.2. Diet administration

100 Rats were allocated to diet conditions: Control (normal rodent chow-fed, n = 8) or 101 HFHS condition (n = 8). An additional age/weight matched cohort (n = 16) were allocated as 102 sample animals for social memory and social interaction. Body weights were standardised in 103 all treatment groups prior to the commencement of the diet (control: 75.5 ± 2.0 g; HFHS: 76.4 104 \pm 2.0 g), and rats were habituated to handling by the experimenters for seven days prior to 105 commencing diet manipulations. Group-housing was used to negate confounding effects of 106 social isolation stress [28]. Rats in the HFHS diet condition were provided with 2 h daily 107 homecage access (between 0900-1100) to semi-pure HFHS pellets (Specialty Feeds, Western Australia, SP04-025; 18.4kJ/g digestible energy; composed of 20% fat (lard), 39.6% sucrose, 108 109 19.4% protein, providing 36% energy from lipids and 55% from sucrose), in addition to ad 110 *libitum* standard chow and water access. Consumption of HFHS diet was calculated in the 2 h 111 diet access period. Body weight was recorded at baseline before the diet began, and thereafter 112 twice per week. Total 24 h energy intake per cage of four rats was calculated by measuring 113 chow consumption and HFHS diet consumption as mass difference twice a week [29].

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115 **2.3.** Behavioural analysis

A timeline of the general experimental procedures is presented in Figure 1A. Diet administration began on P28, coinciding the commencement of adolescence in male rats [13]. Behavioural tests were conducted in a room illuminated at 30 Lux, and sessions were recorded with a ceiling-mounted video camera. Social interaction, social memory, social odour preference, novel object recognition and odour recognition memory was assessed. Behaviours were scored by an observer who was blind to the group allocations using ODLog (v2.7, Macropod Software, Australia).

124 2.3.1. Social interaction

Social interaction tests were conducted in a square test arena (dimensions: 50 cm [length] x 50
cm [width] x 60 cm [height]) constructed from black Perspex. All rats were habituated to the
arena 24 h prior to testing by being placed individually into the arena for 10 minutes.

128

129 Rats were held in individual cages for 15 minutes prior to social interaction testing. In 130 the social interaction test, one rat from either the control or HFHS diet condition rat was placed 131 in the arena with an unfamiliar partner matched for body weight (+/- 10g). To differentiate 132 between animals, one rat was marked on its back with a black odourless fabric pen marker 24 h prior to testing. Test session duration was 10 min. The two rats were placed into the test arena 133 134 simultaneously facing each other in opposing corners. Rats in the HFHS diet condition were 135 tested 1 h after access to the HFHS pellets (post), and 23 h after HFHS pellet access (pre), 136 counterbalanced across days and animals. The arena was cleaned with 70% ethanol between 137 testing sessions to eliminate residual odour cues.

138

As social behaviour in rats has been shown to depend on the playfulness of its partner, both animals in a sample pair were considered as one experimental unit [12]. Videos were scored to measure i) the total time (s) spent in social interaction; ii) frequency of social investigation behaviour (sniffing, licking, grooming); iii) frequency of social play behaviour (pinning, pouncing); and iv) frequency of aggressive-like behaviour (biting, boxing, overt physical harm).

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146 2.3.2. *Social memory*

Social memory testing was performed immediately after HFHS consumption to reduceconfounding effects of reduced social contact in the HFHS diet rats. Social memory tests were

149 conducted in a circular arena (dimensions: 100 cm diameter, 50 cm height) constructed from 150 grey Perspex. The arena contained two wire chambers with plastic bases (dimensions: 18 cm 151 [length] x 20 cm [width] x 22 cm [height]). The wires were interspaced 1 cm apart to allow the 152 test rat to interact with the sample rats without physical contact. Sample, control and HFHS 153 diet rats were habituated to the testing apparatus 24 h prior to testing by being placed 154 individually into the arena with the empty chambers for 10 minutes.

155

156 Social memory was tested in two phases (see Supplementary Figure 1A). In Phase 1, 157 rats were placed in the arena for 5 min with one sample rat in a chamber and the other chamber 158 left empty. Time exploring the chamber containing the sample rat versus the empty chamber 159 was used as a measure of sociability [30]. The experimental rat was then removed and placed 160 into individual holding cages for a 5 min inter-trial interval (ITI) period. In Phase 2, the arena 161 contained the original sample rat (familiar) in a chamber and the previously empty chamber 162 contained a novel rat. The experimental rat was returned to the arena to explore for a 3 min 163 period. Between test phases the arena was cleaned with 70% ethanol to eliminate odour cues.

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Videos were scored to measure the duration of time the rat spent exploring the chambers during each phase. Sociability was quantified as the time spent exploring the chamber containing the sample rat as opposed to the empty chamber, and social recognition memory was measured as the time spent in proximity to the chamber containing the novel rat versus the familiar sample rat.

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2.3.3. Social odour preference

The wire chambers used for social recognition were either filled with soiled bedding from a
cage of young male rats (~5 weeks of age) housed in an adjacent holding room, or clean corn

174 cob bedding. Rats were allowed to freely explore the arena for 5 min and the amount of time
175 spent exploring empty chambers containing either soiled or clean bedding was videoed and
176 then scored by an experimenter.

177

178 *2.3.4. Odour memory*

179 Odour memory was conducted in the square test arena (as described in 2.3.1). Identical 180 cylindrical stainless-steel containers (10 cm [height] x 6 cm [width]) with perforated stainless-181 steel lids were filled with corn cob bedding and then scented with 3 mL of peppermint or 182 almond extract (Queen, Australia) to serve as odour stimuli (see Supplementary Figure 1B). The odour memory test consisted of 2 phases: a 5 min sample and 3 min test. During the sample 183 184 phase two of the same scented containers were placed in opposite corners of the arena, and the 185 rat was allowed to explore. The rat was then removed from the arena and placed in a holding 186 cage for a 5 min retention period. The arena was thoroughly cleaned with 70% ethanol and one of the scented containers was replaced with an identical container filled with a novel odour for 187 188 the test phase. Videoed behaviour was assessed for the duration of time the rat spent exploring 189 each of the odour containers during each phase.

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2.3.5. *Object recognition memory*

Object recognition (Supplementary Figure 1C) was conducted in the square test arena (as described in 2.3.1). Commercial objects (*e.g.* plastic bottles and tin cans) were used with differing heights (16-24 cm) and widths (7-14 cm). Rats explored two identical sample objects in the arena (sample phase; 5 min). The following day, 24 h after the sample phase, rats were tested for recognition of a familiar *versus* a novel object (test phase; 3 mins). The time the rat spent exploring each object during each phase was measured.

199 *2.4. Sample collection*

Following 28 days of diet access, rats were sacrificed prior to receiving the HFHS diet. 200 201 Rats were anaesthetised with sodium pentobarbital (100 mg/kg i.p.), brains removed and the 202 PFC and hippocampus (composed of dorsal and ventral poles) dissected and snap frozen in 203 liquid nitrogen and stored at -80°C for subsequent analysis by RT-PCR. Retroperitoneal and 204 gonadal white adipose tissues (rpWAT; gnWAT) were dissected and weighed. Livers were 205 weighed and visually scored for markers of hepatic steatosis based on previous criteria [31]. 206 One faecal bolus was collected from the terminal caecum, snap frozen and stored at -80°C for 207 later microbiota analysis.

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2.5. Quantitative RT-PCR

210 RNA was extracted using Tri-Reagent (Sigma-Aldrich) and RNeasy Mini kit (Qiagen), and quantity and purity of RNA was determined by UV/Vis spectroscopy (Nanodrop; Thermo-211 Fisher Scientific). RNA was converted to cDNA using a RT² First Strand Kit (Qiagen). Gene 212 expression was quantified by Custom RT² Profiler PCR Arrays (Qiagen) with RT² SYBR 213 214 Green Mastermix (Qiagen, Australia), and RT-PCR was then performed using a 215 QuantStudioTM 7 Flex Real-Time PCR System (Applied Biosystems). Target genes were 216 NLR family, pyrin domain containing 3 (Nlrp3), glutamate decarboxylase 1 (Gad1), brainderived neurotrophic factor (Bdnf), dopamine receptor D1 (Drd1), dopamine receptor D2 217 218 (Drd2), monoamine oxidase A (Maoa), catechol-O-methyltransferase (Comt), 5hydroxytryptamine (serotonin) receptor 4, G-coupled (Htr4), tumour necrosis factor alpha 219 220 $(Tnf-\alpha)$, interleukin 6 (116), and integrin, alpha M (Itgam) (all reagents from Qiagen; see Supplementary Table 1 for reference sequences). Analysis of relative gene expression was 221 222 normalised to the housekeeping gene beta actin (*Actb*) using the $\Delta\Delta C_T$ method [32].

224 2.6. 16S rRNA gene amplicon sequencing and bioinformatics

225 Total DNA was isolated using the Bioline ISOLATE Faecal DNA Kit (Bioline). PCR was 226 performed using Q5 DNA polymerase (New England Biolabs) with a primer set selected to amplify V3-V4 region of 16S rRNA gene (forward: ACTCCTACGGGAGGCAGCAG and 227 228 reverse: GGACTACHVGGGTWTCTAAT). Sequencing was performed on an Illumina MiSeq 229 instrument (2×300 bp paired-end sequencing), following the method detailed by Fadrosh, Ma 230 [33]. Sequences were joined in Quantitative Insights Into Microbial Ecology (QIIME) 1.9.1 231 (http://giime.org) using the fastq-join method. Maximum-allowed percent differences within 232 the overlapping region was zero. Sequences were de-multiplexed using the QIIME split library 233 protocol, keeping only sequences with Phred quality score higher than 20. The dataset was 234 inspected for chimeric sequences using Pintail [34]. Operational taxonomic units (OTUs) were 235 clustered at 97% sequence identity using UCLUST [35] (min = 1443, max = 7082, median = 236 4466). Taxonomic assignments were performed against the GreenGenes database [36]. OTUs 237 with a relative abundance of less than 0.01% were excluded.

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239 2.7. Statistical analyses

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2.7.1. Behaviour, physiological parameters and brain mRNA expression

Results were analysed using repeat measures analysis of variance (ANOVA; body weight and energy intake), mixed design ANOVAs (social recognition memory, social interaction, sociability, novel odour recognition and novel object recognition), and one-way ANOVA (rpWAT, gnWAT, liver weight, RT-PCR values) with *post-hoc* Tukey and equality of error variance assessed, or multivariate linear models following significant correlations with *post-hoc* testing. $\Delta\Delta C_T$ values that exceeded ±2 standard deviations from the mean were excluded from analysis, resulting in group sizes of 6-8 per gene.

Social recognition memory and novel object recognition performance were converted to Exploration Ratios (Time[novel-familiar]/Time[novel+familiar]) to permit exploratory bivariate analysis using correlates (Pearson's *R*, one-tailed). This allowed the exploratory examination of associations between cortical mRNA expression across HFHS and control diet rats, and the performance of behaviours found to significantly differ between diet groups. Liver scores (mass and evidence of steatosis) were analysed using the Kruskal-Wallis test. Data were analysed with IBM SPSS Statistics 24, GraphPad Prism 7 and R.

- 256
- 257 2.7.2. Microbiota

Visualisation, alpha diversity and distance measures of microbiota were performed using the R packages *phyloseq, vegan* and *MixOmics*. Data were total-sum scaled (*i.e.* relative abundance of OTUs) and centre-log ratio transformed where appropriate [37]. Permutational ANOVA (PERMANOVA) of Bray-Curtis dissimilarity index was conducted with 999 permutations. The *DESeq2* package was used to undertake differential abundance testing [38], and multivariate analysis of variance (MANOVA) was used to test associations between *Firmicutes* to *Bacteroidetes* (FB) ratio, behaviour, and gene expression.

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Significance for differential abundance analyses was assessed on the basis of a threshold *q*-value of 0.05 (*i.e. p*-value adjusted using the False Discovery Rate approach Benjamini, Drai [39]). Bivariate correlations were calculated using a two-tailed Pearson's *R* test.

- 270
- **3. Results**
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- 273 *3.1. Body Weight, energy consumption and physiological measurements*

274 Consistent with physical maturation during adolescence, all rats gained weight across the 275 experiment, however HFHS diet rats showed a significantly greater increase in body mass than controls (time × diet group $F_{(8,112)} = 5.07$, p < 0.001; Figure 1B). Overall, rats consumed 276 increasing amounts of energy across the four-week experimental period ($F_{(3,18)} = 81.4$, $p < 10^{-10}$ 277 0.001), and HFHS diet rats consumed more energy than control rats (diet group \times time $F_{(1,6)}$ = 278 10.8, p < 0.001; Figure 1C). At the experimental end point, HFHS diet rats had a greater body 279 mass ($F_{(1,14)} = 4.516$, p < 0.05), rpWAT ($F_{(1,14)} = 5.54$, p < 0.05), gnWAT ($F_{(1,14)} = 4.71$, p < 0.05) 280 281 0.05), and evidence of hepatopathology (U = 5, p < 0.01; Supplementary Table 2).

- 282 --- Figure 1 here ---
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3.2. Effect of HFHS diet on social interaction before and after HFHS feeding

285 To assess the effect of HFHS diet consumption on social behaviour, we examined the total social exploration time one-hour prior to (pre) or following (post) HFHS food access. Social 286 interaction duration during each test session did not differ in the standard chow fed control 287 288 animals. However, HFHS diet rats spent less time engaged in social interaction pre-HFHS food access, compared to post-HFHS food access (diet access × diet group $F_{(1,14)} = 5.66$, p < 0.05; 289 290 effect of diet group pre $F_{(1,14)} = 9.271$, p < 0.01, but not post F < 1; Figure 2A). Social 291 investigation frequency was increased in the HFHS rats post-consumption (diet access \times diet group $F_{(1,14)} = 8.6$, p < 0.05; HFHS $F_{(1,14)} = 21.59$, p < 0.001, control F < 1; Figure 2B). No 292 significant differences were observed in the frequency of social play behaviours (Figure 2C), 293 294 and no aggressive behaviours were observed. Together, this data suggests that social 295 motivation is decreased in rats that consume intermittent HFHS diet when they have not had 296 access to the palatable HFHS food for a 23-hour period.

297

298 3.3. Effect of HFHS diets on social recognition memory

299 Social behaviour has been typically examined in mice using the 'three-chamber' social 300 approach test. We adapted this protocol for use in rats to examine whether changes in social 301 recognition memory was altered by HFHS diet consumption. During the social approach phase 302 of the sociability test (Figure 2D) both control and HFHS rats preferentially explored the novel 303 'sample' rat compared to the empty cage ($F_{(1,14)} = 275.5$, p < 0.001) with no significant differences between groups or interaction effects ($F_s < 1$). However, social recognition was 304 305 impaired in HFHS rats, which explored the familiar and novel rat equally, contrasting to the strong preference of control rats to explore the novel rat (chamber \times diet group $F_{(1,14)} = 39.15$, 306 p < 0.001; control $F_{(1,14)} = 109.3$, p < 0.001; HFHS $F_{(1,14)} = 2.6$, p = 0.13; Figure 2E). 307 308 Exploration ratios calculated from the test data (control = 0.80 ± 0.03 ; HFHS = 0.56 ± 0.03 ; as 309 mean \pm SEM) differed significantly between groups ($F_{(1,14)} = 33.2, p < 0.001$).

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1 3.4. No effect of diet on social odour preference or odour recognition memory

To confirm that the lack of social recognition memory in the HFHS rats was not due to a lack of olfactory sensitivity, we tested their ability to discriminate between clean and soiled bedding and between two non-social odours. Control and HFHS diet rats preferentially explored the chamber containing a social odour ($F_{(1,14)} = 217.8$, p < 0.001; Figure 2F).

316 During odour recognition testing, control and HFHS diet rats showed no group or odour preference during the sample phase (no main effect of odour F < 1, diet group $F_{(1,3)} = 3.7$, p =317 0.15, odour × diet group $F_{(1,3)} = 3.4$, p = 0.16; Figure 2G). At the time of testing, both control 318 319 and HFHS rats preferentially explored the novel odour container, demonstrating odour 320 recognition memory (odour × diet group $F_{(1,14)} = 3.0$, p = 0.11; Figure 2H). Together, these 321 results indicated that HFHS rats were unimpaired in odour discrimination, implying that the 322 social recognition impairment (described in section 3.3) was not due to a lack of sensitivity to 323 olfactory cues.

324

325

3.5. Effects of HFHS diet on novel object recognition

326 HFHS diet rats were tested on their ability to explore novel compared to previously explored 327 objects. Control rats showed intact object recognition memory by preferentially exploring the 328 novel object; though HFHS rats explored the familiar and novel objects equally, indicating 329 impaired object recognition (object × diet group, $F_{(1,14)} = 50.7$, p < 0.001; control $F_{(1,14)} = 120.5$, p < 0.001; HFHS F < 1; Figure 2I). Exploration ratios calculated from the test data (control = 330 0.73 ± 0.01 ; HFHS = 0.52 ± 0.02) differed significantly between groups ($F_{(1.14)} = 60.8$, p < 100331 332 0.001). 333 --- Figure 2 here ---334 335 3.6. Diet effects on PFC and hippocampal mRNA expression 336 337 To determine whether short, intermittent periods of exposure to HFHS diet changed gene expression within the hippocampus and mPFC, we quantified mRNA expression of genes 338 339 related to neuroplasticity, dopamine and monoamine signalling and neuroinflammation (Table 340 1). We found the majority of transcript changes occurred in the PFC. Compared to controls, the HFHS diet fed rats had reduced *Maoa* expression in the PFC ($F_{(1,13)} = 8.50$, p < 0.05) and 341 hippocampus ($F_{(1,14)} = 6.89$, p < 0.05); Comt expression was significantly reduced in the PFC 342 $(F_{(1,14)} = 19.0, p < 0.001)$, as was PFC *Bdnf* was in HFHS consuming rats $(F_{(1,13)} = 4.99, p < 0.001)$ 343 344 0.05).

345

---- Table 1 here -----



348 The relative abundance of a number of specific taxa differed significantly between the two diet 349 groups as shown by DESEq2 analysis (Figure 3A, Supplementary Table 3). HFHS diet 350 increased levels of bacteria from Firmicutes phylum Clostridales family, including Lachnospiraceae (genus Blautia, q < 0.04; unspecified genus q < 0.03), Ruminoccoceae (genus 351 352 unspecified q < 0.01) and Veillonellaceae (genus Phascolarctobacterium q < 0.02). HFHS diet increased bacteria from Actinobacteria phylum, family Bifidobacteriaceae (genus 353 354 *Bifidobacterium*, q < 0.04), *Bacteroidetes* phylum, order *Bacteroidales* (unspecified genus q < 0.04) 355 0.05) and *Tenericutes* phylum, order *Erysipelotrichaceae* (genus Allobaculum q < 0.05).

356

357 Alpha diversity did not differ between the HFHS and control groups measured by 358 observed species, Chao 1, Shannon or Simpson indices (see Figure 3B; Fs < 1). Although there was visual overlap apparent on multidimensional scaling of the Bray-Curtis dissimilarity index 359 360 (Figure 3C), PERMANOVA revealed significant dissimilarity on the basis of diet group ($R^2 =$ 361 0.18, p < 0.01). PERMDISP2 revealed no significant heterogeneity of variances between the two groups (p = 0.39). Partial least squares discriminant analysis (PLS-DA), a linear 362 classification model, identified the two components that discriminate maximally between the 363 364 HFHS and control diet groups, showing a large proportion of variance accounted for by the 365 first component (21%) and a lesser degree by the second (8%; Figure 3D).

- 366 ---- Figure 3 here ----
- 367
- 368 **3.8.** Associations between diet effects, behavioural performance and gene expression

369 Correlations were performed between behaviours that differed between diet groups (social 370 interaction pre-consumption of diet, social recognition and novel object recognition) and biological measurements (WAT, bodyweight; and cortical gene expression). A number of
significant associations were observed, in particular positive correlations between PFC
expression of *Maoa* and social interaction pre-HFHS diet and object memory.

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375 A number of bivariate correlations between physiological parameters (WAT and bodyweight) and gene expression were significant (Figure 4A and B). In particular, PFC and 376 hippocampal Itgam expression was positively correlated with WAT (PFC: $R^2=0.52$, p < 0.05, 377 HPC: $R^2 = 0.66$, p < 0.01) and bodyweight (HPC: $R^2 = 0.67$, p < 0.01), and hippocampal Maoa 378 expression was negatively correlated with WAT ($R^2 = -0.45$, p < 0.05). Correlations between 379 380 physiological parameters (WAT and bodyweight) and behavioural performance were observed 381 (Figure 4C), in particular significant negative correlations between WAT and social recognition memory ($R^2 = -0.56$, p < 0.05), social interaction pre-HFHS diet ($R^2 = -0.58$, p < -0.58), p < -0.58, p < -0.58382 0.01) and novel object recognition performance ($R^2 = -0.65$, p < 0.01). 383

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Total WAT was significantly associated with PFC gene expression ($F_{(1,12)} = 5.4$, $p < 10^{-10}$ 385 0.05); specifically *Tnf-a* (adjusted $R^2 = 0.41$, p < 0.01), *Comt* (adjusted $R^2 = 0.23$, p < 0.05), 386 Maoa (adjusted $R^2 = 0.29$, p < 0.05), and Bdnf (adjusted $R^2 = 0.74$, p < 0.001). A number of 387 388 bivariate correlations between bodyweight and gene expression were significant (Figure 4A and A) however these associations did not persist in multivariate linear modelling (overall 389 model $F_{(1,12)} = 2.1$, p = 0.17). There were no significant associations between hippocampal gene 390 391 expression and body weight (F < 1). WAT weight predicted *Il6* expression in the hippocampus $(F_{(1,13)} = 4.86, p < 0.05).$ 392

Associations between hippocampal and PFC genes differentially expressed in control and HFHS groups (see Table 1, Figure 4) and behavioural performance were examined. No predictive relationships were observed between PFC *Bdnf*, *Comt* or *Maoa* expression and social interaction pre-diet consumption, social memory or novel object recognition (p = 0.17; p =0.09; p = 0.16 for overall model of each gene respectively). There was no evidence for a predictive relationship between hippocampal *Maoa* expression and behaviours (p = 0.35).

400

401 **3.9.** Associations between gut microbiota composition and social behaviour

402 Scores on pre-diet social behaviour, social recognition memory and novel object recognition tasks respectively were all significantly associated with the relative abundance of a number of 403 bacterial taxa (all associations where q < 0.05 presented in Table 2). Social memory 404 405 performance was associated with a large number of taxa. Higher social memory scores were 406 associated with a greater abundance of bacteria from the Bifidobacteriales and Bacteroidales 407 order, Lachnospiraceae family (Blautia and multiple unspecified genera), Ruminococcaceae 408 family and genus Allobaculum. Novel object recognition was negatively associated with 409 abundance of *Bacteroidales* and a number of taxa from the *Lachnospiraceae* family. Only three 410 taxa were significantly associated with social behaviour pre HFHS diet: a relative reduction of 411 Bifidobacteriales order and two unspecified genera from the Lachnospiraceae family.

- 412
- 413 ----- Table 2 here -----
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- 415 *3.10. Firmicutes to Bacteroidetes ratio*

There were no significant differences between the diet groups on *Firmicutes* to *Bacteroidetes* ratio (FB ratio; $t_{(9.63)} = -1.03$, p = 0.33). Samples were pooled across diet groups for subsequent FB ratio analyses, with diet group included to control for potential interaction effects. Multivariate linear modelling demonstrated a significant relationship between FB ratio and the three behavioural dependent variables: social memory, novel object recognition and pre-diet social interaction ($F_{(3,11)} = 5.26$, p < 0.05). *Post-hoc* tests demonstrated strong evidence that FB ratio negatively predicted pre-diet social behaviour ($F_{(2,13)} = 11.46$, p < 0.001), but not object or social recognition memory.

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425 3.11. Associations between gut microbiota and hippocampal and PFC gene 426 expression

The hippocampal and PFC genes found to differ in expression between the control and HFHS diet groups (PFC: *Bdnf*, *Maoa*, *Comt*; hippocampus: *Maoa*, $p_s < 0.05$) were tested for their associations with differential abundance of bacterial taxa. Of these, significantly differentially abundant taxa (q < 0.05) were apparent only for *Maoa* (Table 3). PFC *Maoa* expression was positively associated with one genus of the *Lachnospiraceae* family, whilst a number of bacteria across the four primary phyla were differentially abundant on the basis of hippocampal *Maoa* expression in both positive and negative directions.

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----- Table 3 here -----

435 **4. Discussion**

436

The data presented in this study shows that daily intermittent consumption of a HFHS diet during adolescence leads to deficits in social interaction and social memory, and impaired object recognition memory in rats. This study also demonstrated associations between dietinduced alterations to social behaviour with microbiota and changes in gene expression associated with reward pathways and neuroplasticity.

443 We observed that the effects of HFHS diet on social interaction were limited to 444 immediately prior to ingestion when rats had not consumed HFHS pellets for 23 h, though not 445 after access to HFHS foodstuffs. Based on decreased expression of Maoa and Comt genes that 446 regulate catecholamine metabolism, we postulate that a junk food mimetic diet can lead to 447 altered monoamine neurotransmission and a resultant increase in anxiety-like behaviour. Thus, 448 intermittent access to a HFHS diet may influence social interaction, as comparable interaction 449 durations were observed following access to a diet rich in fats and sugars. Moreover, social 450 interaction frequency was significantly increased after rats had access to the HFHS food, suggesting that the rewarding aspects of social interaction may have been amplified following 451 452 ingestion of a diet modelled on obesity-associated nutritional intake, and that recent HFHS diet 453 consumption may also reduce anxiety.

454

455 Social play is important for neurobehavioural development and is also intrinsically 456 linked to proliferation of neurotransmitter pathways, with the dopaminergic mesolimbic system playing a major role in normal social interactions [40]. We observed no differences in 457 458 frequencies of social play behaviours between diet groups, though these data should be 459 interpreted with some caution. The group housing conditions and brief period of isolation used 460 prior to behavioural testing may have obscured subtle variations between groups as social 461 isolation amplifies subsequent social play behaviour [8]. Another possible explanation is that 462 social play activities tend to decline as adolescence progresses, and that the lack of measurable 463 differences could be attributed to the age of test animals representing mid-to-late adolescence 464 [12]. Extended studies focusing on both dietary habits in early adolescence and potential delayed or enduring long-term effects into adulthood are needed to assess whether poor 465 466 nutrition reflected by a HFHS diet are associated with potential critical windows of 467 susceptibility representing social behavioural changes.

469 Social recognition performance differed between control and HFHS rats, with rats exposed to the dietary intervention demonstrating no preference for the test chamber containing 470 471 the novel rat during the test phase. This is supported by a recent study showing that acute 472 exposure to a high fat diet in juvenile rats impaired social memory [10]. As rats showed 473 differences in their duration of time engaged in social interaction prior to consuming the HFHS 474 food, the social memory testing was conducted following HFHS access to ensure that any 475 memory deficits observed were not due to reduced social contact in the treated animals. Initial sociability during the sample phase did not differ between HFHS and control diet rats, 476 477 indicating that social memory was impacted specifically by the diet constituents. Social 478 memory has been shown to depend upon both PFC and hippocampal function [18, 41], and our 479 measured alterations to markers of monoamine neurotransmission and neuroplasticity may 480 underlie the observed social changes. This is also complemented by impaired long term novel 481 object recognition, which is also associated with hippocampal dysfunction [42]. Moreover, 482 both HFHS and control diet rats showed preference for a social odour and showed intact odour 483 recognition memory. Thus, intermittent HFHS diet did not impact olfactory discrimination, 484 and indicates that social memory deficits are not associated with impaired olfactory function.

485

With respect to the observed variations in mRNA expression of enzymes *Maoa* and *Comt* in the PFC, it is highly plausible that a HFHS diet adversely affects neurotransmitter activity, specifically dopamine, that is integral to social behaviour and cognition. Dopamine has a primary role in the corticolimbic circuitry involved in the regulation of food reward [43]. By mediating deamination of dopamine, monoamine oxidase activity has a key role in controlling the availability of cortical dopamine and also functions in conjunction with catecholamine-*O*-methyltransferase in dopamine breakdown and excretion as inactive 493 homovanillic acid. Changes to monoamine signalling may underpin the altered social 494 behaviour and social memory observed in HFHS diet rats, supported by reports of diet-induced 495 alterations to dopamine receptor expression in the striatum [44]. With no measurable change 496 in dopamine receptor (Drd1a/Drd2) expression in the hippocampus or PFC, it is suggestive 497 that impaired catecholamine metabolism, rather than reuptake is the major driver of 498 behavioural changes related to dopamine following obesogenic diet consumption [6, 45]. 499 Further studies should examine whether other reward associated genes, such as serotonin and 500 µ-opioid receptors are altered by this diet protocol, and also the involvement of oxytocin 501 signalling mechanisms [10].

502

503 Reduced PFC Bdnf expression was observed in HFHS consuming rats, which also correlated positively with novel object recognition performance. This diet-induced change may 504 505 reinforce the changes to social behaviours and cognition as BDNF signalling has a critical role 506 in memory encoding [46]. Decreased levels of BDNF observed in the hypothalamus, PFC, and/or serum have been shown to correlate with mood disorder-like behaviours in animals and 507 508 humans [47] and high fat diet consumption reduces hippocampal BDNF levels [48, 49] linking 509 BDNF to emotional processes. Gut microbiota composition may influence cortical BDNF, as 510 demonstrated by previous studies indicating reduced cortical and hippocampal Bdnf gene 511 expression in GF mice [50], and antibiotic-induced microbiota dysbiosis altered protein levels 512 of BDNF in the amygdala and hippocampus as well as reduced anxiety-like behaviours in the 513 light-dark box [51]. Thus, microbiome influences on BDNF may be a critical factor in 514 cognition and emotional regulation.

515

516 Excessive consumption of saturated fats has been shown to induce secretion of pro-517 inflammatory cytokines by adipocytes and macrophages, and affect the integrity of the blood518 brain barrier [52], allowing pro-inflammatory cytokines and immune-response cells to reach 519 the brain [53]. Interestingly, no significant changes between groups were observed in 520 inflammatory marker mRNA expression (*Il6*, *TNF-a*, *Nlrp3*, *Itgam*), and trends indicated that PFC expression of *ll6* and *Nlrp3* were lower in HFHS diet rats. This may be due to the age of 521 522 the rats, as emergent evidence suggests that the modulatory effects of obesogenic diets on 523 inflammatory markers occur in an age-dependent manner, with younger rats showing resistance 524 to neuroinflammation [9]. However, Itgam (also called cluster of differentiation molecule 11b, 525 or CD11b) expression in the PFC and hippocampus positively correlated with WAT, indicative 526 that increased adiposity was associated with aspects of neuroinflammation [54]. Moreover, 527 evidence indicates that obesity-induced neuroinflammation is dependent on the type of diet in 528 terms of fat and sugar content, the duration of the diet, and regional differences in brain 529 structures [55]. Future studies utilising immunohistochemistry to examine microglia 530 morphology and astrogliosis are needed to validate the region-specific impact of obesogenic 531 diets on neuroinflammatory effects.

532

533 The effects of obesogenic high fat, high sugar and Western diets on the gut microbiome 534 have been extensively studied in rodents, with typical observations including the altered 535 abundance of the Bacteriodetes and Firmicutes phyla [56-59]. Notably, Bacteroites (order Bacteroidales) phyla were increased in HFHS diet-fed rats. This contrasts other studies and 536 537 indicates that not all the members of the *Bacteriodetes* family are decreased with adiposity. 538 Whilst we did not observe an overall shift in the FB ratio, the data presented here suggests that 539 intermittent HFHS diet protocol significantly altered the gut microbiota signature, and supports 540 the concept that a phylum-wide binary distinction does not sufficiently reflect the complexity 541 of diet-induced changes to the gut microbiome as suggested in previous reports [60, 61]. FB ratio changes may therefore become more prominent with more chronic hypercaloric feedingschedules, and the development of pronounced obesity.

544

545 Moreover, our detected increase in the abundance of the Firmicutes family 546 *Ruminococcaceae* is consistent with previous studies that found these taxa to be increased in 547 mice [62] and rats [63] consuming a high fat diet. Taxa from Lachnospiraceae and *Ruminoccoceae* families of the *Clostridiales* order were the most common bacterial predictors 548 549 of social behaviour and recognition memory, converging with clinical studies that show 550 alterations in microbiome populations in neuropsychiatric disorders including major depressive 551 disorder and autism [64, 65]. Social avoidance behaviour in non-obese diabetic mice has been 552 associated with increased abundance of Lachnospiraceae, Ruminococcaceae and Clostridiales, 553 and the transfer of intestinal microbiota from these mice to microbiota-depleted recipients 554 evoked similar behavioural phenotypes [66]. As such, our observations converge with evidence 555 indicating the influence of diet on social behaviours via the gut-brain-microbiota axis [67, 68]. 556

557 Further studies using faecal transplants from HFHS diet animals are necessary to elucidate the mechanisms underpinning the neural effects of gut microbiome. Our study was 558 559 limited by faecal samples being taken only at the experiment endpoint, and behaviour and 560 microbiome analyses may have been more powerful if taken from the same time points. Moreover, a direct comparison between HFHS diet effects and behaviour could be made if an 561 562 additional group that received ad libitum access to the HFHS was included in the study. In 563 addition, these animals could further serve as an additional control as behaviour around the 564 HFHS diet access period to be likely changed due to conditioning. Furthermore, as locomotor 565 activity can be influenced by motivation, anxiety and body weight, and can by itself influence the results of behavioural readouts, additional examination of locomotor behaviour in this studyis warranted to further define diet induced alterations to social behaviour.

568

569 The results presented here support the need for further studies including generating 570 metagenomic predictions from the bacterial communities shed light onto the metabolic 571 pathways impacted by intermittent HFHS diet consumption. Modulation of the gut-brain axis dynamics has clinical implications for neuropsychiatric conditions, and emerging 572 'psychobiotic' treatment strategies that have been indicated to ameliorate depressive [69] and 573 574 anxiety-like behaviours [51] in mice, such as increased hippocampal *Bdnf* expression resulting 575 from prebiotic administration [70]. As such, harnessing the microbiome may provide a route 576 for the attenuation of diet and obesity evoked cognitive and emotional alterations.

577

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780 **<u>Tables</u>**

Table 1. The effects of intermittent high fat and high sucrose (HFHS) diet exposure on prefrontal cortex and hippocampal gene expression, mean (\pm SEM), * = *P*<0.05, **=*P*<0.01, # 783 = *P*<0.10

784

- **Table 2.** Associations between relative abundance of taxa in faecal microbiota and behavioural
 outcomes (q<0.05).
- 787
- 788 **Table 3.** Associations between relative abundance of taxa in faecal microbiota and gene

789 expression (q<0.05).

Table 1. The effects of intermittent high fat and high sucrose (HFHS) diet exposure on

791 prefrontal cortex and hippocampal gene expression. Table shows Mean (SEM), * = P < 0.05,

******=*P*<0.01, # = *P*<0.10

Gene		Prefrontal corte	X	Hij	ppocampus	
	Control	HFHS	<i>p</i> -value	Control	HFHS	<i>p</i> -value
Neuroplasticity	· · · · · · · · · · · · · · · · · · ·					
Gad1	0.84 (0.04)	0.94 (0.07)	n.s.	1.00 (0.08)	0.94 (0.06)	n.s.
Bdnf	1.00 (0.10)	0.72 (0.03)*	0.045	1.00 (0.08)	0.96 (0.17)	n.s.
Dopamine receptors						
Drd1a	1.00 (0.23)	0.65 (0.13)	n.s.	1.00 (0.11)	0.95 (0.09)	n.s
Drd2	1.00 (0.32)	0.56 (0.15)	n.s.	0.93 (0.03)	0.85 (0.07)	n.s.
Monoamine synthesis						
Maoa	1.00 (0.04)	0.86 (0.02)*	0.012	1.00 (0.04)	0.83 (0.05)*	0.02
Comt	1.00 (0.02)	0.83 (0.03)**	0.001	1.00 (0.07)	1.08 (0.09)	n.s.
Serotonin receptor						
Htr4	0.85 (0.07)	0.79 (0.08)	n.s.	1.00 (0.05)	0.96 (0.04)	n.s.
Inflammation						
Tnf-α	1.00 (0.16)	0.79 (0.11)	n.s.	1.00 (0.21)	0.65 (0.06)	n.s.
Il6	1.00 (0.15)	$0.62~(0.08)^{\#}$	0.060	0.81 (0.14)	0.59 (0.11)	<i>n.s.</i>
Nlrp3	1.00 (0.06)	$0.85 (0.03)^{\#}$	0.056	1.00 (0.18)	1.03 (0.14)	<i>n.s.</i>
Itgam	1.00 (0.10)	1.09 (0.09)	n.s.	1.00 (0.11)	1.23 (0.19)	n.s.

	et social	action	hange q	0.01										0.01	0.01												
	Pre-di	inter	log2FoldC	-0.04										-0.04	-0.04												
	gnition	ry	ge q		0.03			<0.01								0.02	0.03		0.02				0.04				
	Object reco	memo	log2FoldChan;		-7.27			-9.99								-8.32	-7.89		-8.44				-6.90				
<0.05).	gnition	ry	ge q	<0.01		<0.01	0.04	<0.01	0.04	0.04	0.05	0.04	0.02					0.01	0.04	0.01	0.01	0.01		<0.01	0.02	0.04	0.04
al outcomes (q	Social reco	memo	log2FoldChang	5.13		8.51	4.59	4.20	-4.87	4.28	4.24	4.66	4.30					4.72	4.48	4.51	4.91	5.42		6.06	4.45	4.13	2.90
t and behaviours			Genus							Unspecified										Blautia				Unspecified			Allobaculum
a in faecal microbiota			Family		Unspecified										Todascatascado	Lacinospiraceae									Ruminococcaceae		Erysipelotrichaceae
tive abundance of tax			Order	Bifidobacteriales	Bacteroidales			I								Clostridiales								I			Erysipelotrichales
ons between relat			Class	Actinobacteria	Bacteroidia											Clostridia											Erysipelotrichi
Table 2. Associati			Phylum	Actinobacteria											Time	r minicules											Tenericutes

Maoa	Prefrontal cortex	og2Fold	Change q									9.91 0.01					
e	sndu	I	q	0.05	0.01	0.01	0.03	0.03	0.03	<0.01	0.04		0.01	0.03	0.02	0.01	0.01
Mao	Hippocar	log2Fold	Change	-7.19	-7.87	-8.18	-7.18	-7.07	-7.88	10.40	7.17		8.43	-7.53	-8.32	-8.96	-8.37
		Conne	ACIIUS	Unspecified			Bifidobacterium		Unspecified	Alistipes	IInenenified	nontrondento	Unspecified			Alloudculuill	
		Ramity	гашцу	IInsnarifiad	nultradello		Bifidobacteriaceae		Unspecified	Rikenellaceae	eeorerinsondoe I	raciiiiospiiaceae	Ruminococcaceae		Laninal atriahaman	El ysiperuni unaccac	
		Order	DIUCI			Bifidobacteriales			Doctoridalas	Dacter Oluares		Clostridiales			Eminolotrioholog	Et ystpetou ichates	
		Clace	CLADS			Actinobacteria			Destancialis	Dacterorula		Clostridia			Lancinol otriohi	Et ystpetou ichi	
·(consh)		Phylum	mmin t			Actinobacteria			Destancidator	Dactel Olderes		Firmicutes			Tonomionitod	I AIIAI ICUIAS	

Table 3. Associations between relative abundance of taxa in faecal microbiota and gene expression (a<0.05).

799 Figure Legends

800 Figure 1. Experimental design and physiological effects of HFHS diet consumption. A) 801 Timeline of experimental procedures showing the ages of the rats at each behavioural test 802 (conducted at the same age in all animals) and at sacrifice. Social interaction testing was 803 conducted both before and after access to palatable HFHS food in the HFHS rats. As HFHS 804 rats showed differences in social interaction pre HFHS food, social memory testing, and other 805 behavioural tests were conducted after HFHS access, to ensure that any memory or behavioural 806 deficits observed were not due to reduced social contact in the HFHS diet rats. B) Mean body weights of control and HFHS rats across the 4-week diet exposure period. C) Mean energy 807 808 consumption (kJ) per cage of rats across the 4-week diet exposure period. Error bars represent 809 +SEM. * indicates *P*≤0.05, ** *P*<0.01, *** *P*<0.001.

810

811 Figure 2. Impact of HFHS diet consumption on behaviour. Social behaviours between 812 control / HFHS diet exposed rats and a novel weight / age matched conspecific. HFHS diet rats were tested either 23h after HFHS pellet access "pre" or 1h after access to the HFHS pellets 813 814 "post", A) Total duration of social contact between rats, B) frequency of social interactions, 815 and C) frequency of social play. Performance of HFHS diet and control rats in social 816 recognition memory - D) exploration times of the chamber containing the sample rat "sample" 817 and empty chamber "empty" during the sample phase of social memory testing, E) exploration 818 times of the chamber containing the familiar sample rat and chamber containing a novel sample 819 rat. F) Exploration time of chambers containing soiled bedding "social odour" or clean 820 bedding. G) Exploration of the odours during the sample phase. H) Novel odour recognition performance in control and HFHS diet rats during the test phase following a 5 min delay. I) 821 822 Novel object recognition performance during the test phase following a 24h delay. Error bars represent +SEM. ** P<0.01. Error bars represent +SEM. * indicates P≤0.05, ** P<0.01, *** *P*<0.001 between groups comparisons.

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827 Figure 3. Impact of HFHS diet on faecal microbiota. A) Graphical depiction of DESEq2 828 analysis. Each coloured circle represents one bacterial genus that was more abundant in the 829 HFHS than control group (q < 0.05). Log2 fold change refers to the difference abundance of 830 the log2 values between diet groups for each bacterial genus. B) No significant differences in 831 alpha diversity of faecal microbiota between HFHS and control diet groups. Each panel 832 represents one alpha diversity measure as follows: Observed = total number of OTU's 833 observed; Chao1 = richness estimator (estimate of the total number of OTU's present in a 834 community); Shannon and Simpson = microbial indexes of diversity. Boxes span the first to 835 third quartiles; the horizontal line inside the boxes represents the median. Whiskers extending 836 vertically from the boxes indicate variability outside the upper and lower quartiles, and the 837 single black circles indicate outliers (all *P*>0.05). C) Permutational ANOVA (PERMANOVA) 838 of Bray-Curtis dissimilarity index revealed significant dissimilarity on the basis of diet group. 839 D) Partial least-squares discriminant analysis (PLS-DA) Figure showing a large proportion of 840 variance accounted for by the first component (21%) and a lesser degree by the second (8%). 841 Each point represents a sample.

842

Figure 4. Correlations between behaviour, cortical gene expression and physiological effects of the HFHS diet. Heatmap of bivariate correlations (Pearson's R^2) between the behavioural assays social recognition memory, social interaction and novel object recognition performance, and A) prefrontal cortex gene expression, B) hippocampal gene expression and C) physiological parameters. *=P<0.05, **=P<0.01


Figure 1



Figure 2





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a) Prefrontal Cortex

b) Hippocampus

Gene	Social recognition memory	Social interaction pre-HFHS diet	Spontaneous object recognition	WAT	Body Weight
NIrp3					
Gad1					
Bdnf					
Drd1a					
Drd2					
Maoa	*		*	*	
Comt					
Htr4					
Tnf	*		*		
116					
ltgam				**	**

c) Physiological parameters

Spontaneous object recognition	**	*
Social interaction pre-HFHS diet	**	
Social recognition memory	*	
Parameter	WAT	Body Weight

Supplementary Information

Supplementary Table 1. Reference sequences of genes of interest

Gene	Gene symbol	Accession number
NLR family, pyrin domain containing 3	Nlrp3	NM_001191642
Glutamate decarboxylase 1	Gad1	NM_017007
Brain-derived neurotrophic factor	Bdnf	NM_012513
Dopamine receptor D1	Drd1a	NM_012546
Dopamine receptor D2	Drd2	NM_012547
Monoamine oxidase A	Maoa	XM_001058993, XM_343764
Catechol-O-methyltransferase	Comt	NM_012531
5-hydroxytryptamine receptor 4	Htr4	NM_012853
Tumour necrosis factor-alpha	Tnf	NM_012675
Interleukin 6	116	NM_012589
Integrin, alpha M	ltgam	NM_012711

NM_03114	
Actb	
Actin, beta	

4

Supplementary Table 2. Effect of diet type on physiological parameters (mean ±SEM) measured after 28 days of diet exposure. * indicates

 $P \leq 0.05$.

Diet group	Body Weight /g	rpWAT /g	gnWAT /g	Liver score	Liver weight /g
Control	318.6 (8.3)	3.3 (0.4)	2.2 (0.2)	0	13.7 (0.5)
HFHS	366.4 (20.1)*	5.0 (0.6)*	3.6 (0.6)*	1*	16.5 (1.4)*

Supplementary Table 3. Analyses of differences in relative abundance differences in faecal microbiota of HFHS group relative to Control (q<0.05).

obacteria Ac	ctinobacteria				ιυζεισιατικά	Ч
obacteria Ac	ctinobacteria		Unspecified	Unspecified	5 89	<0.01
DDACIEFIA AG	cunooacteria	- 	ĸ	ι.	3.28	0.02
		BIIIGODACIEITAIES	Bifidobacteriaceae	Bifidobacterium	3.03	0.04
					3.00	0.03
					2.84	<0.01
					3.35	0.01
eroidetes F	3acteroidia	Bacteroidales	Unspecified	Unspecified	2.90	0.03
					3.38	0.05
					1.86	0.05
					2.51	0.05
					5.16	0.01
					4.30	0.04
					5.38	0.00
				Blautia	5.53	00.00
					4.13	0.03
			- -		6.26	0.00
nicutes	Clostridia	Clostridiales	Lachnospiraceae		5.55	00.00
					4.28	0.04
			I		3.37	0.03
					4.28	0.02
				Unspecified	4.99	0.00
					5.03	0.01
					5.00	0.01

S

0.01	0.03	0.05	0.00	0.01	0.00	0.02	0.02	0.04	0.02	0.00	0.04	0.00
5.37	4.36	4.81	5.18	4.90	6.98	4.16	4.47	4.07	5.29	9.68	2.31	3.31
	Unspecified			Unspecified		Phascolarctobacterium		r - 2: 11	Ouspectified		A II about 1100	AIIOUaculuiii
	I achnosniraceae			Ruminococcaceae		Veillonellaceae		r - 2:11	Ouspecified		La minolotnichonomo	EI ysipeiou iciiaceae
			I				I				Lancin olotai oloc	Et ystpetou ichates
											<u>Tanninalatai</u> ahi	Et ystpetoutcill
											Tommer	I ellet i cules

Supplementary Figure 1 A) Schematic of social memory testing procedure. B) Schematic of novel odour recognition procedure, where A and B are different odours contained in identical containers. C) Schematic of novel object recognition procedure.