

Behavioural and transcriptomic characterization of the comorbidity between Alzheimer's disease and Major Depression

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ABSTRACT

Major Depression (MD) is the most prevalent psychiatric disease in the population and is considered a prodromal stage of the Alzheimer's disease (AD). Despite both diseases having a robust genetic component, the common transcriptomic signature remains unknown. In this regard, we investigated the cognitive and emotional responses in 3- and 6-month-old in APP/PSEN1-Tg mutant mice, before β -amyloid plaques were detected. Then, we studied the deregulation of genes and pathways in prefrontal cortex, striatum, hippocampus and amygdala, using transcriptomic and functional data analysis. The results demonstrated that depressive-like and anxiety-like behaviours, as well as memory impairments are already present at 3-month-old together with the deregulation of several genes and gene sets, including components of the circadian rhythms, electronic transport chain and neurotransmission. Finally, DisGeNET GSEA provides translational support for common downregulated gene sets related to MD and AD. Altogether, the results demonstrate that MD could be an early manifestation of AD.

ABBREVIATIONS

AD	Alzheimer's disease
APP	Beta-Amyloid precursor protein
BSPD	Behavioural and psychological symptoms of dementia
DE	Differential expression

EPM	Elevated plus maze
FC	Fold change
FDR	False discovery rate
GSEA	Gene set enrichment analysis
GWAS	Genome-wide association study
ICD-9	International Classification of Diseases, 9 th Edition
MD	Major Depression
NES	Normalized enrichment score
NOR	Novel object recognition
OF	Open field
PFC	Prefrontal cortex
PSEN1	Presenilin-1
TST	Tail suspension test

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INTRODUCTION

Depressive disorder affects over 4.4% of the population¹, and it is characterized by feelings of sadness, anhedonic state, changes in appetite and sleep, feelings of worthlessness, guilt, and may lead to attempts of suicide¹. Major Depression (MD) manifests throughout the life course. In older people it is often associated with poor cognition that may not return to normality with effective treatment of the mood disorder^{2,3}. In addition to the cognitive phenotype of MD in older people, a substantial body of data strongly suggests onset of MD in later life is associated with increased risk of Alzheimer's disease (AD), the commonest form of dementia⁴⁻⁶. Furthermore, although cognitive and functional impairments are the predominant symptoms of AD, other behavioural and psychological symptoms of dementia (BPSD) that include depression, sleep and activity disturbance are common manifestations of the disease^{7,8}. These observations have led to the suggestion that MD may in some cases be a prodromal phase of AD. Indeed, both MD and AD have a considerable heritable component and share some mechanistic components including neuroinflammation^{9,10}, oxidative stress¹¹, certain dysregulations in cellular signalling¹² and neurotransmission^{13,14} amongst others.

Despite these advances, the aetiology of the comorbidity between AD and MD remains unknown although the observation that multiple behaviours that are reminiscent of BPSD are also observed in rodent models of disease¹⁵ suggesting that there might have common molecular processes. Hereby, we study for the first time, using behavioural, transcriptomic and bioinformatic approaches, depressive-like symptoms in an AD mouse model (APP/PSEN1-Tg mice) at ages before the neuropathological features are manifest and when cognitive impairment is not evident¹⁶. To that end, we have performed RNA sequencing analyses to study changes that occur in brain areas related to the control of behavioural and cognitive behaviours, including prefrontal cortex (PFC), striatum, hippocampus and amygdala, in mice at 3 and 6 months old. In order to study the mechanisms involved in the AD-MD comorbidity, a pre-ranked Gene Set Enrichment Analysis (GSEA) has been carried out. Using the transcriptomic results, we evaluated the enrichment in genes sets obtained from public resources containing functional and disease information.

RESULTS

The transgenic mice expressing human APP/PSEN1-Tg carrying familial AD mutations used in these studies (B6C3-Tg) have an onset of plaque pathology at around 6 months, which is followed by cognitive impairments with both increasing by 12-15 months of age. To explore behavioural alterations in these mice, we used a range of well-established experimental paradigms at 3 months (before the onset of pathology) and 6 months (at onset). Then, we evaluated the

differentially expressed genes and pathways in PFC, striatum, hippocampus and amygdala at both ages.

Anxiety-related behaviour in APP/PSEN1-Tg mice

To evaluate if APP/PSEN1-Tg animals experience anxiety-like behaviour, 3 and 6-month-old APP/PSEN1-Tg were subjected to the elevated plus maze (EPM). The APP/PSEN1-Tg transgenic mice spent lower percentage of time in open arms than Non-Transgenic at both 3 ($t_{30}=2.30$, $p=0.0286$; Figure 1A) and 6 months old ($t_{26}=2.419$, $p=0.0229$; Figure 1D), whereas no differences were found in the total number of arm entries ($t_{30}=0.65$, $p=0.520$, Figure 1B and $t_{26}=1.21$, $p=0.236$, Figure 1E), indicating that APP/PSEN1-Tg animals displayed higher level of anxiety-like behaviours without locomotor impairments.

Early onset of despair-like behaviour in APP/PSEN1-Tg mutant mice

Stress induced immobility is a despair responsive phenotype often used as a proxy for mood state in rodent models. To evaluate this response, we performed the tail suspension (TST) in APP/PSEN1-Tg transgenic and control mice.

At 3 months old, the analysis of the TST results using an ANOVA for repeated measurements revealed *stress* ($F_{1,30}=20.77$, $p<0.001$), *genotype* ($F_{1,30}=5.27$, $p=0.029$) and *stress*×*genotype* ($F_{1,30}=8.61$, $p=0.006$; Figure 1C) effects. After Bonferroni's correction, results showed that transgenic mice presented higher stress-induced immobility ($p<0.001$) in comparison with the pre-stress condition. Stress only increased the percentage of the immobility in APP/PSEN1-Tg mutants in comparison with Non-Transgenic animals ($p=0.005$).

At 6 months, the ANOVA for repeated measurements showed *stress* ($F_{1,24}=31.33$, $p<0.001$) and *genotype* ($F_{1,24}=4.62$, $p=0.042$; Figure 1F) effects. These results indicate that transgenic mice spent a higher percentage of immobility time and after repeated stress, but also this behaviour increases in both groups of mice.

Early-adulthood long-term memory impairments in APP/PSEN1-Tg mice

Loss of memory is affected early during the time-course of the AD, being one of the most recognizable symptoms of the disease¹⁷. For this reason, we assessed the short- and long-term recognition memory in 3- and 6-month-old APP/PSEN1-Tg mice using the novel object recognition test.

At 3 months old, a two-way ANOVA showed a *genotype* ($F_{1,29}=8.30$, $p=0.007$), and *object* effect ($F_{1,29}=36.93$, $p=0.001$; Figure 2A). The *genotype* effect indicates that control animals had greater discrimination index than APP/PSEN1-Tg group.

At 6 months, a two-way ANOVA revealed a main effect of *genotype* ($F_{1,24}=22.44$, $p<0.001$), an *object* effect ($F_{1,24}=6.51$, $p=0.018$) and *object* $\times$ *genotype* interaction ($F_{1,24}=14.64$, $p=0.001$; Figure 2D). The *genotype* effect shows that control animals had greater discrimination index than transgenic mice. The *post-hoc* Bonferroni's analysis showed that Non-Transgenic mice could discriminate both the novel object 1 and 2 in the same manner ($p=0.394$), whereas APP/PSEN1-Tg animals could only discriminate novel object 1, having a greater discrimination index for the novel object 1 than novel object 2 ($p<0.001$). Non-Transgenic animals had higher discrimination index than APP/PSEN1 when they are exposed to novel object 2 ($p<0.001$). In fact, APP/PSEN1-Tg animals could not discriminate between familial and novel object 2, indicating important memory impairments.

Early poor left-right discrimination learning of APP/PSEN1-Tg mice

In order to evaluate working memory and attention deficits present in AD¹⁸, we performed a left-right discrimination learning paradigm in 3 and 6 month APP/PSEN1-Tg transgenic and Non-Transgenic mice using the T-maze.

The two-way ANOVA showed a *trial* effect ($F_{9,270}=2.152$, $p=0.026$) and *trial* $\times$ *genotype* ($F_{9,270}=2.023$, $p=0.037$; Figure 2B) at 3 months old. The *post-hoc* analysis revealed that APP/PSEN1-Tg animals took more time to reach the platform than control animals on trial 1 ($p=0.044$) and trial 5 ($p=0.027$) during the acquisition learning. However, this analysis suggests that control mice spent more time to reach the platform during the trial 2 of the reversal-learning phase ($p=0.02$) than transgenic mice. The pair-wise comparison showed that APP/PSEN1-Tg reduced the time to escape on acquisition trial 2 ($p=0.037$) and trial 2 of the reversal learning ($p=0.017$) in comparison with the trial 1 of the acquisition. We found that APP/PSEN1-Tg animals spent more trials than Non-Transgenic animals ($t_{30}=2.35$, $p=0.026$; Figure 2C) to reach the acquisition criterion. Nevertheless, both groups spent a similar number of trials to reach the criteria during reversal learning ($p=0.443$).

At 6 months old, the ANOVA revealed a *trial* ($F_{9,216}=3.84$, $p<0.001$) and *genotype* ($F_{1,24}=6.53$, $p=0.017$, Figure 2E) effects, suggesting that APP/PSEN1-Tg mutant mice showed longer latencies to reach the platform than control animals during acquisition and reversal learning phases. The mean latency to get the acquisition criteria showed a trend to be statistically

different in the number of trials that APP/PSEN1-Tg in comparison with control mice ($t_{24}=1.91$; $p=0.068$; Figure 2F).

Hyposmia in APP/PSEN1-Tg mice at 6 months old

Since olfactory impairment is present in up to 90% of AD patients¹⁹, we assessed the olfactory function in transgenic and control mice (Figure 3A and C).

At 3 months old, both experimental groups could discriminate between the first water presentation and limonene odour (Wilcoxon test, Non-Transgenic group, $p=0.05$ and APP/PSEN1-Tg, $p=0.01$; Figure 3A).

At 6 months, both APP/PSEN1-Tg transgenic mice and Non-Transgenic mice could discriminate between the first water presentation and limonene (Wilcoxon test, Non-Transgenic, $p=0.006$, and APP/PSEN1-Tg, $p=0.008$; Figure 3C). Additionally, APP/PSEN1-Tg mutant mice showed a higher investigation time during the fifth water presentation than control group (Kruskal-Wallis test, $\chi^2=3.84$, $p=0.05$; Figure 3C). Whereas both experimental groups spent the same time investigating the cotton swab at 3 months old ($t_{22}=0.66$, $p=0.52$; Figure 3B), APP/PSEN1-Tg mutant increased the investigation time than Non-Transgenic control animals, showing an indiscriminate investigation at 6 months-old ($t_{21}=2.52$, $p=0.02$; Figure 3D), independently of the type of odour presented.

DE analysis in PFC, striatum, hippocampus and amygdala at two different ages

We performed gene expression analysis in regions of the brain known to be loci for these functions. We compared the transcriptome signature of APP/PSEN1-Tg transgenic and control mice at 3 and 6 months old, to determine the significant differentially expressed (DE) genes with a cut-off $|\logFC| < 0.585$, adjusted $p < 0.05$, deregulated in the brain areas of interest (Figure 4; Supplementary Tables 2-5).

Among the dysregulated genes in PFC of younger APP/PSEN1-Tg mice, we found 5 corresponding to the so-called canonical clock genes: *Ciart*, *Dbp*, *Bhle41* and *Nr1d1* were downregulated, and *Nfil3* was upregulated, together with other genes, such as *App*, *Prpn*, *Inhba*, and *Fosl2* (Figure 4A; Supplementary Table 2). At 6 months-old mice, *Dbp* and *Nr1d1* remained downregulated in this area, whereas *App*, *Prnp* were also upregulated together with *Itga* and *Maml3* (Figure 4B; Supplementary Table 2).

In the striatum of 3-months-old mice, we only found the downregulation of *Ciart*, and the overexpression of *App*, *Prpn* and *Edn1* (Figure 4C; Supplementary Table 3). By contrast, the

deregulation of older mice in the striatum was restricted to only one downregulated transcript, *RP23-152P11.2*, whilst *App* and *Prnp* remained upregulated (Figure 4D; Supplementary Table 3).

In the hippocampus of 3-months-old APP/PSEN1-Tg mice, 8 genes were downregulated, including *Ptx4* and *Mc4r* and *Zap70*. Among the upregulated genes, we found *Plch1*, *Cdh23*, *Itga10*, *App*, *Prnp*, and *Inhba* (Figure 4E; Supplementary Table 4). At 6 months, the analysis revealed that only *App* and *Prnp* remained upregulated (Figure 4F; Supplementary Table 4).

Interestingly, the amygdala of young transgenic mice was the most affected structure. More than 100 genes were upregulated in the amygdala of the 3-month-old AD mice (Figure 5A; Supplementary Table 5), including *Tnfrsf8l3*, *Sstr1*, *Sstr4*, *Chrm5* and *Aldh1a3* (Figure 4G; Figure 5A and C). Among the almost 100 downregulated genes in the amygdala at 3 months old (Figure 4G; Supplementary Table 5), we found *Grin3b*, *Chrna10* and *Ciart*. However, when we analysed the number of deregulated genes at 6 months old, both the upregulated and downregulated genes dramatically decreased in all brain areas (Figure 4H, Figure 5B). In amygdala, the upregulation of genes diminished to three genes, *App*, *Prnp* and *Clec7a* (Figure 4H, Figure 5B, D) while the downregulated genes were restricted to *Dbp* and *Ciart* (Figure 4H; Figure 5C, H).

When we compared those genes that were consistently deregulated at both ages per area, we observed that the upregulation of *App* and *Prnp* were extended throughout PFC, hippocampus and amygdala (Figure 4A,E,G; Figure 5E). Moreover, this upregulation at 6 months-old was affecting all brain regions Figure 4B,D,F and H; Figure 5E). By contrast, *Ciart* was downregulated in PFC, striatum, and amygdala of APP/PSEN1-Tg mice at 3 months old. Only *Nr1d1*, *Dbp* in PFC and *Dbp* and *Ciart* in amygdala were downregulated in the older transgenic mice (Figure 4B,H; Figure 5H).

Enriched gene sets at 3 and 6 months-old

We then performed bioinformatic analyses to determine pathways altered in the transgenic mice in the pre-disease and early pathology periods (3 months and 6 months). This functional analysis showed enriched gene sets related to depressive disorders appear at 3 month-old within PFC, hippocampus and amygdala, areas that are intimately involved in both cognitive function and mood regulation (Figure 6A,B,D and E; Supplementary Table 6). In the striatum, we only identified two positively enriched gene sets - those of circadian rhythms and Alzheimer's disease (Figure 6C) - that also appear in PFC, hippocampus and amygdala at early stages. In the 6 months-old animals, however, the number of gene sets that were significantly enriched in

APP/PSEN1-Tg transgenic mice was higher. We identified additional negatively enriched pathways linked to the electron transport chain, found in the PFC, striatum and hippocampus (Figure 6F, G and H; Supplementary Table 7) and also pathways implicated in AD and neuroinflammation. In parallel, the positively enriched depressive-related gene sets not only increased in number but also the dysregulation of these pathways extended to all the brain structures analysed (Figure 6F-I) at this later age. Additionally, the neurotransmission-related pathways were more enriched in 6-month-old transgenic mice than at early ages, suggesting that neurodegeneration increased the number of affected gene sets. By contrast, the impairments in circadian rhythms seem to appear in the preclinical phase in the amygdala (Figure 6B-E), persisting at least to the period when pathology becomes apparent (Figure 6I).

We then extended these findings to human data by performing GSEA analysis using DisGeNET (version v7.0; <http://www.disgenet.org/>) gene sets (Supplementary Figure 3; Supplementary Tables 8 and 9). DisGeNET is a knowledge resource that collects information about the genetic underpinnings of human diseases. This GSEA, which is specific for diseases and disease-related phenotypes, showed positively enriched gene sets corresponding to several subtypes of AD and dementias in the PFC and hippocampus of 3-month-old animals. Additionally, we found positively enriched gene sets associated with memory impairment phenotypes, anxiety disorders, traits and symptoms related to motor impairment, and to neurodegenerative diseases in the hippocampus of younger animals. These results are consistent with the deregulated pathways shown in Figure 6 and with the results of the behavioral tests. In 6-month-old animals, the DisGeNET GSEA showed that positively enriched gene sets of several subtypes of AD and dementias and those related to memory impairment were extended to all brain areas. This dysregulation of processes related to memory impairment in old animals is consistent with the working memory deficits and learning impairments that displayed 6-month-old animals displayed in the behavioural experiments. Moreover, positively enriched gene sets related to diseases of the central nervous system were observed in the hippocampus and striatum of 6-month-old animals. Most of these diseases are cerebrovascular diseases, which have been related to MD²⁰. The connection between this class of disorders and MD have been suggested to be mediated by inflammation²¹, which is consistent with the dysregulation of neuroinflammation pathways found in hippocampus of young and old animals (Figure 6A,D,H).

DISCUSSION

This study provides the first evidence of early, pre-pathological, depression-like symptoms, as well as cognitive impairment, and the underpinning transcriptomic changes specifically in PFC, striatum, hippocampus and amygdala in a rodent AD model (B6C3-Tg

(APP^{swe}, PSEN1^{dD9})85Dbo/MmJax). In particular, APP/PSEN1-Tg transgenic mice show both pre-pathological and peri-pathological deficits in different behaviours. On the one hand, the anxiety-related behaviours and despair behaviours after stressful conditions, hyperlocomotion and diminishing discrimination begins, in the model used, at 3 months of age, before the onset of pathology. On the other hand, the hyposmia traits, working memory deficits and reversal learning impairments appear later at 6 months old, at the time when amyloid plaque pathology begins to become apparent.

The behavioural experiments indicate that APP/PSEN1-Tg mice showed early anxiety-like and depressive-like traits, symptoms which would be expected to be associated with dysfunction of the amygdaloid, hippocampal and PFC circuitries. Supporting these observations, the genes *Nr1d1* and *Bhlhe41*, which have been previously associated with both control of circadian rhythms function and with depression^{22,23}, were downregulated in the PFC of transgenic mice. Moreover, *Plchl* is upregulated at 3 months old in the transgenic mice. The product of this gene is part of the pathway generating second messengers, such as inositol 1,4,5-triphosphate and diacylglycerol; a pathway which is intimately linked to the depressive-like phenotype²⁴. At 3 but not at 6 months old, we found the upregulation of *Inhba* in PFC and hippocampus, which could represent a compensatory change to mitigate the depressive-like behaviour. In fact, the activin signalling pathway plays a key role in the response to antidepressant treatment in humans²⁵. *Nr1d1* remains downregulated at 6 months old, without changes in *Inhba* signalling, due to possible deeper detrimental effects at older ages, e.g. deficits in working memory. Additionally, *Mc4r* is downregulated in hippocampus at 3 months old and facilitates anxiety-like and depression-like behaviours pursuant to chronic stress²⁶. Indeed, a general overexpression of *Prnp* and *App* in 3- and 6-month-old APP/PSEN1-Tg mutant mice could also contribute to this depressive-like symptomatology, since previous studies found alterations of these protein levels in cortical areas and peripheral blood of MD^{27,28}. Noteworthy, this mouse overexpresses APP695 containing the double Swedish mutation, so the general upregulation of *App* found in all brain areas of interest is directly induced by the model. Moreover, *Prnp* may modulate depressive-like behaviour in mice via interactions with monoaminergic neurotransmission²⁹. In accordance with these results, we observed an increasing number of enriched pathways linked to depressive disorders (including depression, apathy and anxiety, among others) and disease-associated gene sets at 3 and 6 months old, before the period of formation of β -amyloid plaques in this model³⁰. These results therefore support the notion that depressive symptoms are part of the prodromal phase of the AD in this rodent model, just as they are hypothesised to be in human disease.

Overall, the APP/PSEN1-Tg mutant mice had a general decline in memory with ageing, as previously described in AD models^{15,31} but these phenomenon was demonstrated before the

onset of pathology, although became more extensive at about the time pathology was expected. Despite a subtle imbalance of memory impairment pathways at 3 months old, transgenic mice showed higher latencies to acquire the criterion in the left-right discrimination test. These memory deficits could be promoted by the observed dysregulation of *Cdh23*, *Ptx4* and *Mc4r* genes in hippocampus, as they are known to participate in the endocytosis of glutamatergic ionotropic AMPA receptors, hippocampal synaptic plasticity and mood-like disorders in mice, respectively³²⁻³⁵. At 6 months old, APP/PSEN1-Tg mutant mice show deeper deficits in memory in all the evaluated tasks. They display longer latencies in left-right discrimination task, and deficits in working and long-term memories. These memory impairments run in parallel with an increasing number enriched pathways in PFC and hippocampus (abnormal long-term spatial reference and spatial memories, among others), involved in working^{36,37} and spatial learning^{38,39}, respectively, and with dysregulation of gene sets related to memory impairment and learning disabilities (Supplementary Figure 3).

Our results show that the APP/PSEN1-Tg, at 3 months old mice spent the same time than the control mice investigating the cotton-swabs, which have been impregnated with limonene. However, at 6 months old the exploration of both odours was increased in transgenic mice compared to the control group, independently whether water and limonene were presented. Overall, APP/PSEN1-Tg animals seem not to present a complete anosmia, although it seems that they display a loss of discrimination between odours, so this possible hyposmia together with working memory^{36,37} impairments could explain the indiscriminate investigation that transgenic mice display. These olfactory alterations could be due to pathology in the olfactory bulb at 6 months-old⁴⁰, that might be promoting changes in the sense of smell of APP/PSEN1-Tg mice. Thus, our mice model could reflect the progressive anosmia that AD patients show at early stages of the disease¹⁹. Indeed, a recent study shows that late-depression patients show similar olfactory impairments that those in AD⁴¹. In this sense, early olfactory deficits could lead to the identification of depression patients with high risk of developing AD⁴¹, as also occurs in our APP/PSEN1-Tg animals by showing early depression-like behaviour with later hyposmia traits.

MD and AD are both associated with neuroinflammation and oxidative stress¹¹ and evidence for the activation of both processes was observed in the differential expression analysis. This show a dysregulation of inflammatory-related response genes, such as *Maml3*, *Zap70*, *Itgax* and *App*⁴²⁻⁴⁵ at both ages in APP/PSEN1-Tg mice. In addition, gene sets related to electron transport chain are, in general, downregulated in APP/PSEN1-Tg animals at 6 months in PFC, striatum and hippocampus, reflecting a possible abnormal function of mitochondrial metabolism, as previously observed in AD⁴⁶ and MD⁴⁷.

One of the most striking observations is that majority of the negatively enriched gene sets are associated with control of circadian rhythms, and these are observed in all brain areas of interest (Figure 6B). In particular, we observe the downregulation of *Ciart* and *Dbp* in amygdala, striatum and PFC at 3 and 6 months old (Figure 5 for more details). The expression of both genes in anterior cingulate cortex modulates the circadian rhythms and mood^{23,48}, through the MERK/ERK signalling pathway. Although disturbances in the circadian rhythms are associated with both MD and AD⁴⁹, this is the first study in which both circadian transcripts are linked to AD. A close relationship has been found between *Dbp* and AD, given that TGF- β 2, present in the cerebrospinal fluid of AD patients, inhibits the expression of some clock genes, including *Dbp*, in *in vitro* assays. We also note that the predominant tau-kinase, reported to be downstream of β -amyloid production⁵⁰⁻⁵², GSK3 β , is a regulator of Per2 phosphorylation and hence a master-regulator of the mammalian clock⁵³. Our results suggest that there is a decline in the functional control of circadian rhythms in APP/PSEN1-Tg mice that should be further studied in detail.

In summary, we suggest that MD could be an indicator of the early onset of AD. The APP/PSEN1-Tg model of AD could recreate the early-depressive symptoms before developing AD, as a prodromal stage of the neurodegenerative disease. In fact, this model provides *App*, *Prnp*, *Ciart* and *Dbp* as possible shared biomarkers of AD and MD, despite the implications of *App* and *Prnp* in MD remaining unclear⁵⁴⁻⁵⁶. In this sense, further studies combining post-mortem human tissues of PFC, striatum, hippocampus and amygdala from AD patients with and without an early history of depression, and transcriptomic analysis could help to provide additional evidence on the combined biological signature of both diseases.

MATERIAL AND METHODS

See Supplementary material and methods for additional details.

Animals and rearing conditions

For the present study, we used 30 hemizygous double transgenic male mice (B6C3-Tg (APP^{swe}, PSEN1^{dD9})85Dbo/MmJax) model of AD (APP/PSEN1-Tg) and 30 male Non-Transgenic control mice (004462, The Jackson Laboratory, USA). These transgenic mice express a chimeric mouse/human APP (Mo/HuAPP695swe) and a mutant human presenilin-1 (PS1-dD9), each controlled by independent mouse prion protein promoter elements³⁰. The mice were assigned to two different groups: APP/PSEN1-Tg and Non-Transgenic (n=16 per group) at 3 months-old, and APP/PSEN1-Tg and Non-Transgenic (n=14 per group) at 6 month-old, before developing the β -amyloid plaques and right at onset³⁰. All procedures were conducted in accordance with national (BOE-2013-1337) and EU (Directive 2010-63EU) guidelines regulating animal research and were approved by the local ethics committee (CEEA-PRBB).

Behavioural Evaluation

Elevated plus maze (EPM) (Panlab s.l.u, Barcelona, Spain) was performed using a black maze elevated 30 cm above the ground⁵⁷. Each mouse was placed in the centre of the maze, and was allowed to freely explore for 5 min. The software SMART (Panlab s.l.u., Spain) automatically recorded the number of entries and the time spent in the arms.

Novel object recognition (NOR). Single trial NOR was performed in an open black arena (32 × 28 cm) using 3 object types at opposite corners of the open field, 50 mm from the walls, similar to those previously described⁵⁸. Object exploration was defined as intentional contact between the mouse's nose and the objects. The recognition index was defined as $[t_{\text{Novel}} / (t_{\text{Novel}} + t_{\text{Familiar}})] \times 100$ for animals exploring novel objects in the acquisition trial.

Left-right discrimination learning. This test was performed using a T-maze apparatus, as previously described³¹. This T-maze was filled with water (23 ± 1 °C). During the first two trials, two identical platforms were submerged on the end of both arms to test possible side preferences. A mouse was considered to have achieved criterion after 5 consecutive errorless trials. The reversal-learning phase was then conducted 48h later, applying the same protocol except that mice were trained to reach the escape platform of the opposite arm. Escape latencies and number of trials to reach the criterion were manually recorded. A maximum of 20 trials were needed to complete the experiment.

Tail suspension test (TST). Each mouse was suspended individually 50 cm above a bench top for 6 min⁵⁷. Mice were individually video-recorded and an observer, blind to the experimental conditions, evaluated the percentage of time the animal was immobile during the test.

Exposure to stress. The stressful procedure consisted in the exposition to two mild stressful situations each day during four consecutive days: animals were placed for 10 min in the open field apparatus, and then they were placed in glass cylinders filled with water during 6 min. Animals were subsequently evaluated for TST.

Habituation-dishabituation test. The test was performed as described⁵⁹. After five minutes of habituation to the cage, six consecutive one-minute presentations of a cotton swab with distilled water were followed by one presentation of limonene (Sigma-Aldrich) solution 1:1000 in distilled water. After that, five consecutive one-minute applications of distilled water were presented. Tests were video-recorded and a blinded observer measured the time that mice spent sniffing the cotton tip rearing on its hind limbs.

Animal sacrifice and sample preparation for RNA extraction

After behavioural analysis, animals were sacrificed by cervical dislocation and brains were immediately removed from the skull. Brain samples were dissected at both ages: 3 and 6 months old from Non-Transgenic and APP/PSEN1-Tg mice (n=6 per group). PFC (Figure 4I), striatum, amygdala and hippocampus were dissected following an anatomical atlas⁶⁰. Brain samples were immediately stored at -80°C until the RNA extraction. Then, each tissue sample was homogenized in 1ml of QIAzol Lysis Reagent using a rotor-stator homogenizer (Polytron PT 2500 E; Kinematica AG, Switzerland) during 20–40 seconds. After homogenization, the RNA was extracted using RNeasy Lipid Tissue Mini Kit (Qiagen)⁶¹.

RNA sequencing

Library preparation and sequencing

RNA samples (50-100 ng) with RIN scores from 7.6 to 9 (Agilent 4200 TapeStation) were reverse transcribed to cDNA. Poly-A tail selection was done using Total Dual RNA-Seq PolyA. cDNA was sequenced (HiSeq3000/4000) at the Oxford Wellcome Trust facility obtaining 75 bp per read. On average, 33M reads were obtained per sample and a mapping rate of ~85%.

RNAseq DE analysis

Raw sequencing reads in the 1710 paired fastq files were mapped with STAR version 2.5.3a⁶² to the Gencode release 17 based on the GRCm38.p6 reference genome and using the corresponding GTF file. The 885 bam files corresponding to 9 different lanes were merged for each sample using Samtools 1.5, ending up with 95 bam files. The table of read counts was obtained with featureCounts tool in subread package, version 1.5.1.

Further analyses were performed in R, version 3.4.3. Genes having less than 10 counts in at least 10 samples were excluded from the analysis. Raw library size differences between samples were treated with the weighted “trimmed mean method” TMM⁶³ implemented in the edgeR package⁶⁴. These normalized counts were used in order to make the unsupervised analysis, heatmaps and clusters. For the differential expression (DE) analysis, read counts were converted to log2-counts-per-million (logCPM), the mean-variance relationship was modelled with precision weights using the voom approach and linear models were subsequently applied with limma package, version 3.30.13⁶⁵. p-values (p) were adjusted for multiple comparisons using the Benjamini-Hochberg false discovery rate (FDR) approach. Genes were considered to be differentially expressed if $|\logFC| > 0.585$ and adjusted $p < 0.05$.

qPCR validation

Data were obtained from the qPCR platform using Taqman Low Density array (TLDA; qPCR 7900HT, Life Technologies), where thirteen genes of interest were studied together with the following endogenous controls: *Gapdh*, *Tbp* and *18S*. The gene *18S* was used to check overall expression whereas *Gapdh* and *Tbp* were geometric averaged and included in posterior analyses as the $C_i(\text{endogenous})$. For each gene, DC_i was computed, comparing these values between conditions. $DC_i = C_i(\text{gene}) - C_i(\text{endogenous})$. Comparisons between studied conditions were performed using a t-Student's t-test. Results were adjusted for multiple comparisons using the FDR. The comparisons performed in each area are APP/PSEN1-Tg and Non-Transgenic at both ages (validated genes in Supplementary Table 1).

Functional and Pathway analysis

Pre-ranked GSEA was used in order to retrieve enriched gene sets corresponding to functional pathways⁶⁶. The list of genes was ranked using the $-\log(p.\text{val}) * \text{signFC}$ value for each gene from the statistics obtained in the DE analysis with limma.

For the gene set collection we used a database described previously⁶⁷ and available in <http://ge-lab.org/gs/>. The gene sets in this database are harvested from different pathway data sources and published studies all related to mice.

MGI genes IDs were converted to mouse symbol ID using the annotation files in (<http://www.informatics.jax.org/>). As there were a high number of redundant gene sets in the collection, a filtering strategy was applied to select the most representative ones. The filtering steps were: i) pairwise Jaccard coefficients were computed between the gene sets from the following data sources: Published articles, MPO, HPO, Reactome, MsigDB, GO_BP, KEGG, PID, WikiPathways, INOH, PANTHER, NetPath, Biocarta, EHMN, MouseCyc and HumanCyc; ii) for gene sets with a Jaccard = 1 (gene sets constituted by the same genes), only one was considered, and iii) from gene sets with a Jaccard > 0.8, the gene set with the highest number of genes was considered and the other gene sets were excluded from the gene set collection.

DisGeNET database analysis

We performed a GSEA to retrieve enriched gene sets associated with human diseases. For this, we ranked the genes using the $-\log(p.\text{val}) * \text{signFC}$ value from the DE analysis. The gene sets associated with human diseases, symptoms, and traits were retrieved from the DisGeNET database (<https://www.disgenet.org/>, v7)⁶⁸. DisGeNET integrates gene-disease associations collected from curated repositories, from genome-wide association studies (GWAS) catalogues, from animal models, and data obtained from the scientific literature using text mining approaches⁶⁸. For this analysis, we used only the curated gene sets in DisGeNET, that include information from repositories such as UniProt, PsyGeNET, Clingen, and the Genomics England

Panel app. The mouse genes were converted to human gene IDs using the annotation files in (<http://www.informatics.jax.org/>).

STATISTICAL ANALYSIS

For animal model experiments, analysis was performed using software SPSS 23.0 (SPSS Inc., USA). Statistical differences were investigated by Student's t-test and ANOVA with repeated measurement analysis. *Post-hoc* analysis was calculated with Bonferroni's correction when applicable. Since habituation-dishabituation data were not normally distributed, Wilcoxon matched-pairs rank test and Kruskal-Wallis test were calculated. Fisher's exact test was used to evaluate differences in the percentage of animals that made an error in the Y-maze. For the GSEA we only included those gene sets with a FDR q value < 0.05 and |NES| > 1.4.

DATA AVAILABILITY

The data that support the findings of this study are available from the corresponding author upon reasonable request.

REFERENCES

1. World Health Organization. *Depression and Other Common Mental Disorders*. (2017).
2. Alexopoulos, G. S. *et al.* Executive dysfunction and long-term outcomes of geriatric depression. *Arch. Gen. Psychiatry* **57**, 285–290 (2000).
3. Potter, G. G., Kittinger, J. D., Wagner, H. R., Steffens, D. C. & Krishnan, K. R. R. Prefrontal neuropsychological predictors of treatment remission in late-life depression. *Neuropsychopharmacology* **29**, 2266–2271 (2004).
4. Ownby, R. L., Crocco, E., Acevedo, A., John, V. & Loewenstein, D. Depression and risk for Alzheimer disease: systematic review, meta-analysis, and metaregression analysis. *Arch. Gen. Psychiatry* **63**, 530–8 (2006).
5. Kaup, A. R. *et al.* Trajectories of Depressive Symptoms in Older Adults and Risk of Dementia. *JAMA psychiatry* **73**, 525–31 (2016).
6. Holmquist, S., Nordström, A. & Nordström, P. The association of depression with subsequent dementia diagnosis: A Swedish nationwide cohort study from 1964 to 2016. *PLOS Med.* **17**, e1003016 (2020).
7. van der Linde, R. M. *et al.* Longitudinal course of behavioural and psychological symptoms of dementia: systematic review. *Br. J. Psychiatry* **209**, 366–377 (2016).
8. Dorey, J. M. *et al.* Behavioral and psychological symptoms of dementia and bipolar spectrum disorders: Review of the evidence of a relationship and treatment implications. *CNS Spectrums* **13**, 796–803 (2008).
9. Dowlati, Y. *et al.* A Meta-Analysis of Cytokines in Major Depression. *Biol. Psychiatry* **67**, 446–457 (2010).
10. White, C. S., Lawrence, C. B., Brough, D. & Rivers-Auty, J. Inflammasomes as therapeutic targets for Alzheimer’s disease. *Brain Pathol.* **27**, 223–234 (2017).
11. Rodrigues, R., Petersen, R. B. & Perry, G. Parallels between major depressive disorder and Alzheimer’s disease: role of oxidative stress and genetic vulnerability. *Cell. Mol. Neurobiol.* **34**, 925–49 (2014).
12. Song, W. *et al.* Alzheimer’s disease-associated TREM2 variants exhibit either decreased or increased ligand-dependent activation. *Alzheimer’s Dement.* **13**, 381–387 (2017).
13. Pereira, A. C. *et al.* Age and Alzheimer’s disease gene expression profiles reversed by the glutamate modulator riluzole. *Mol. Psychiatry* **22**, 296–305 (2017).
14. Klaassens, B. L., van Gerven, J. M. A., Klaassen, E. S., van der Grond, J. & Rombouts, S. A. R. B. Cholinergic and serotonergic modulation of resting state functional brain connectivity in Alzheimer’s disease. *Neuroimage* **199**, 143–152 (2019).
15. Webster, S. J., Bachstetter, A. D., Nelson, P. T., Schmitt, F. A. & Van Eldik, L. J. Using mice to model Alzheimer’s dementia: an overview of the clinical disease and the preclinical behavioral changes in 10 mouse models. *Front. Genet.* **5**, (2014).

- 485 16. Du, Y. *et al.* MKP-1 reduces A β generation and alleviates cognitive impairments in
486 Alzheimer's disease models. *Signal Transduct. Target. Ther.* **4**, 58 (2019).
- 487 17. Langa, K. M. & Levine, D. A. The diagnosis and management of mild cognitive
488 impairment: A clinical review. *JAMA - Journal of the American Medical Association*
489 **312**, 2551–2561 (2014).
- 490 18. Correa, M. S. *et al.* Psychophysiological correlates of cognitive deficits in family
491 caregivers of patients with Alzheimer Disease. *Neuroscience* **286**, 371–382 (2015).
- 492 19. Attems, J., Walker, L. & Jellinger, K. A. Olfactory bulb involvement in
493 neurodegenerative diseases. *Acta Neuropathol.* **127**, 459–75 (2014).
- 494 20. Burrage, E., Marshall, K., Santanam, N. & Chantler, P. Cerebrovascular dysfunction
495 with stress and depression. *Brain Circ.* **4**, 43 (2018).
- 496 21. Taylor, W. D., Aizenstein, H. J. & Alexopoulos, G. S. The vascular depression
497 hypothesis: Mechanisms linking vascular disease with depression. *Molecular Psychiatry*
498 **18**, 963–974 (2013).
- 499 22. Satyanarayanan, S. K. *et al.* Melatonergic agonist regulates circadian clock genes and
500 peripheral inflammatory and neuroplasticity markers in patients with depression and
501 anxiety. *Brain. Behav. Immun.* **85**, 142–151 (2020).
- 502 23. Li, J. Z. *et al.* Circadian patterns of gene expression in the human brain and disruption in
503 major depressive disorder. *Proc. Natl. Acad. Sci. U. S. A.* **110**, 9950–9955 (2013).
- 504 24. Cao, X. *et al.* Astrocyte-derived ATP modulates depressive-like behaviors. *Nat. Med.* **19**,
505 773–777 (2013).
- 506 25. Ganea, K. *et al.* Convergent animal and human evidence suggests the activin/inhibin
507 pathway to be involved in antidepressant response. *Transl. Psychiatry* **2**, e177 (2012).
- 508 26. Chaki, S. & Okuyama, S. Involvement of melanocortin-4 receptor in anxiety and
509 depression. *Peptides* **26**, 1952–1964 (2005).
- 510 27. Dean, B., Tsatsanis, A., Lam, L. Q., Scarr, E. & Duce, J. A. Changes in cortical protein
511 markers of iron transport with gender, major depressive disorder and suicide. *World J.*
512 *Biol. Psychiatry* 1–8 (2019). doi:10.1080/15622975.2018.1555377
- 513 28. Watanabe, S. *et al.* Biological tests for major depressive disorder that involve leukocyte
514 gene expression assays. *J. Psychiatr. Res.* **66–67**, 1–6 (2015).
- 515 29. Beckman, D. *et al.* Prion protein modulates monoaminergic systems and depressive-like
516 behavior in mice. *J. Biol. Chem.* **290**, 20488–20498 (2015).
- 517 30. Jankowsky, J. L. *et al.* APP processing and amyloid deposition in mice haplo-
518 insufficient for presenilin 1. *Neurobiol. Aging* **25**, 885–892 (2004).
- 519 31. Filali, M., Lalonde, R. & Rivest, S. Cognitive and non-cognitive behaviors in an
520 APPswe/PS1 bigenic model of Alzheimer's disease. *Genes, Brain Behav.* **8**, 143–148
521 (2009).

- 522 32. Mills, F. *et al.* Cognitive flexibility and long-term depression (LTD) are impaired
523 following β -catenin stabilization in vivo. *Proc. Natl. Acad. Sci. U. S. A.* **111**, 8631–6
524 (2014).
- 525 33. Bjartmar, L. *et al.* Long-term treatment with antidepressants, but not environmental
526 stimulation, induces expression of NP2 mRNA in hippocampus and medial habenula.
527 *Brain Res.* **1328**, 25–33 (2010).
- 528 34. Shen, Y. *et al.* Stimulation of the Hippocampal POMC/MC4R Circuit Alleviates
529 Synaptic Plasticity Impairment in an Alzheimer's Disease Model. *Cell Rep.* **17**, 1819–
530 1831 (2016).
- 531 35. Serova, L. I., Laukova, M., Alaluf, L. G. & Sabban, E. L. Blockage of melanocortin-4
532 receptors by intranasal HS014 attenuates single prolonged stress-triggered changes in
533 several brain regions. *J. Neurochem.* **131**, 825–835 (2014).
- 534 36. Goldman-Rakic, P. Cellular basis of working memory. *Neuron* **14**, 477–485 (1995).
- 535 37. Zhong, P. *et al.* Impaired Modulation of GABAergic Transmission by Muscarinic
536 Receptors in a Mouse Transgenic Model of Alzheimer's Disease. *J. Biol. Chem.* **278**,
537 26888–26896 (2003).
- 538 38. Chapman, P. F. *et al.* Impaired synaptic plasticity and learning in aged amyloid
539 precursor protein transgenic mice. *Nat. Neurosci.* **2**, 271–276 (1999).
- 540 39. Hsiao, K. *et al.* Correlative Memory Deficits, A β Elevation, and Amyloid Plaques in
541 Transgenic Mice. *Science* (80-.). **274**, 99–103 (1996).
- 542 40. Finnie, G. S. *et al.* Characterization of an 'Amyloid Only' Transgenic (B6C3-
543 Tg(APPswe,PSEN1dE9)85Dbo/Mmjax) Mouse Model of Alzheimer's Disease. *J.*
544 *Comp. Pathol.* **156**, 389–399 (2017).
- 545 41. Chen, B. *et al.* Cognitive Impairment and Structural Abnormalities in Late Life
546 Depression with Olfactory Identification Impairment: an Alzheimer's Disease-Like
547 Pattern. *Int. J. Neuropsychopharmacol.* **21**, 640–648 (2018).
- 548 42. Barger, S. W. & Harmon, A. D. Microglial activation by Alzheimer amyloid precursor
549 protein and modulation by apolipoprotein E. *Nature* **388**, 878–881 (1997).
- 550 43. Ho Kim, J. *et al.* Proteome-wide characterization of signalling interactions in the
551 hippocampal CA4/DG subfield of patients with Alzheimer's disease. *Sci. Rep.* **5**, 11138
552 (2015).
- 553 44. Nanus, D. E. *et al.* Regulation of the Inflammatory Synovial Fibroblast Phenotype by
554 Metastasis-Associated Lung Adenocarcinoma Transcript 1 Long Noncoding RNA in
555 Obese Patients With Osteoarthritis. *Arthritis Rheumatol.* **72**, 609–619 (2020).
- 556 45. He, W., Yuan, T. & Maedler, K. Macrophage-associated pro-inflammatory state in
557 human islets from obese individuals. *Nutr. Diabetes* **9**, 36 (2019).
- 558 46. Holper, L., Ben-Shachar, D. & Mann, J. Multivariate meta-analyses of mitochondrial
559 complex I and IV in major depressive disorder, bipolar disorder, schizophrenia,
560 Alzheimer disease, and Parkinson disease. *Neuropsychopharmacology* **44**, 837–849

- 561 (2019).
- 562 47. Czarny, P., Wigner, P., Galecki, P. & Sliwinski, T. The interplay between inflammation,
563 oxidative stress, DNA damage, DNA repair and mitochondrial dysfunction in
564 depression. *Progress in Neuro-Psychopharmacology and Biological Psychiatry* **80**, 309–
565 321 (2018).
- 566 48. Orozco-Solis, R. *et al.* A Circadian Genomic Signature Common to Ketamine and Sleep
567 Deprivation in the Anterior Cingulate Cortex. *Biol. Psychiatry* **82**, 351–360 (2017).
- 568 49. Irwin, M. R. Sleep and inflammation: partners in sickness and in health. *Nat. Rev.*
569 *Immunol.* 1–14 (2019). doi:10.1038/s41577-019-0190-z
- 570 50. Takashima, A. *et al.* Presenilin 1 associates with glycogen synthase kinase-3 β and its
571 substrate tau. *Proc. Natl. Acad. Sci. U. S. A.* **95**, 9637–9641 (1998).
- 572 51. Lovestone, S. *et al.* Alzheimer’s disease-like phosphorylation of the microtubule-
573 associated protein tau by glycogen synthase kinase-3 in transfected mammalian cells.
574 *Curr. Biol.* **4**, 1077–1086 (1994).
- 575 52. Hooper, C., Killick, R. & Lovestone, S. The GSK3 hypothesis of Alzheimer’s disease.
576 *Journal of Neurochemistry* **104**, 1433–1439 (2008).
- 577 53. Iitaka, C., Miyazaki, K., Akaike, T. & Ishida, N. A role for glycogen synthase kinase-3 β
578 in the mammalian circadian clock. *J. Biol. Chem.* **280**, 29397–29402 (2005).
- 579 54. Inoue, M. *et al.* Serum Levels of Albumin– β -Amyloid Complex in Patients with
580 Depression. *Am. J. Geriatr. Psychiatry* **24**, 764–772 (2016).
- 581 55. Harrington, K. D., Lim, Y. Y., Gould, E. & Maruff, P. Amyloid-beta and depression in
582 healthy older adults: A systematic review. *Australian and New Zealand Journal of*
583 *Psychiatry* **49**, 36–46 (2015).
- 584 56. Watanabe, S. Y. *et al.* Biological tests for major depressive disorder that involve
585 leukocyte gene expression assays. *J. Psychiatr. Res.* **66–67**, 1–6 (2015).
- 586 57. Gracia-Rubio, I. *et al.* Maternal separation induces neuroinflammation and long-lasting
587 emotional alterations in mice. *Prog. Neuro-Psychopharmacology Biol. Psychiatry* **65**,
588 104–117 (2016).
- 589 58. Montagud-Romero, S. *et al.* The novelty-seeking phenotype modulates the long-lasting
590 effects of intermittent ethanol administration during adolescence. *PLoS One* **9**, e92576
591 (2014).
- 592 59. Agustín-Pavón, C., Martínez-Ricós, J., Martínez-García, F. & Lanuza, E. Role of nitric
593 oxide in pheromone-mediated intraspecific communication in mice. *Physiol. Behav.* **98**,
594 608–13 (2009).
- 595 60. Paxinos, G. & Franklin, K. B. J. *The mouse brain in stereotaxic coordinates. Academic*
596 *Press* **2nd**, (2004).
- 597 61. Lacinova, Z., Dolinkova, M., Haluzikova, D., Krajickova, J. & Haluzik, M. Comparison
598 of manual and automatic (MagNA Pure) isolation methods of total RNA from adipose

599 tissue. *Mol. Biotechnol.* **38**, 195–201 (2008).

600 62. Dobin, A. *et al.* STAR: ultrafast universal RNA-seq aligner. *Bioinformatics* **29**, 15–21
601 (2013).

602 63. Robinson, M. D. & Oshlack, A. A scaling normalization method for differential
603 expression analysis of RNA-seq data. *Genome Biol.* **11**, R25 (2010).

604 64. Robinson, M. D., McCarthy, D. J. & Smyth, G. K. edgeR: a Bioconductor package for
605 differential expression analysis of digital gene expression data. *Bioinformatics* **26**, 139–
606 40 (2010).

607 65. Smyth, G. K. limma: Linear Models for Microarray Data. in *Bioinformatics and*
608 *Computational Biology Solutions Using R and Bioconductor* 397–420 (Springer-Verlag,
609 2005). doi:10.1007/0-387-29362-0_23

610 66. Subramanian, A. *et al.* Gene set enrichment analysis: a knowledge-based approach for
611 interpreting genome-wide expression profiles. *Proc. Natl. Acad. Sci. U. S. A.* **102**,
612 15545–50 (2005).

613 67. Lai, L. *et al.* GSKB: A gene set database for pathway analysis in mouse. *bioRxiv* 082511
614 (2016). doi:10.1101/082511

615 68. Piñero, J. *et al.* The DisGeNET knowledge platform for disease genomics: 2019 update.
616 *Nucleic Acids Res.* **48**, D845–D855 (2020).

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AUTHOR CONTRIBUTIONS

A.M-S, L.N, L.I.F., F.S. and O.V. were responsible for the study concept and design. A.M-S. performed behavioural studies. A.M-S, E.M.R., A.H.N. and S.L. contributed to transcriptomic analysis. J.P., M.A., L.N., F.S. and L.I. F. carried out the bioinformatics analysis. All the authors participated in the interpretation of findings. A.M-S., F.S., and O.V. drafted the manuscript. All authors critically reviewed the content and approved the final version for publication.

CONFLICTS OF INTEREST

The authors declare no conflicts of interest regarding the work presented here.

FIGURES

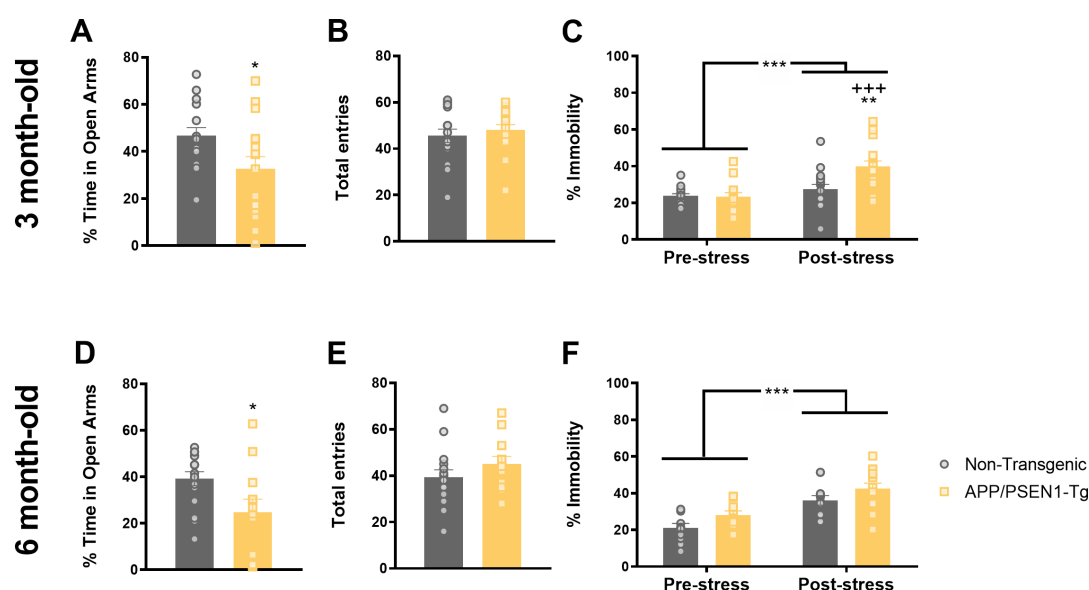


Figure 1. APP/PSEN1-Tg animals show early anxiety-like and despair-like behaviours induced by stress.

Panels A,B,D and E represent the EPM results, and panels C and F correspond to the TST results. Grey (Non-Transgenic) and yellow (APP/PSEN1-Tg) bars represent the percentage of time spent in open arms (A, D) and total number of entries (B,E) at 3 (n=16 per group) and 6 months (n=14 per group). (*p < 0.05, Student's t-test Non-Transgenic vs APP/PSEN1-Tg). Grey (Non-Transgenic) and yellow (APP/PSEN1-Tg) bars represent the percentage of time that animals are immobile in TST at 3 (n=16 per group) (C) and 6 months-old (Non-Transgenic n=12, APP/PSEN1-Tg n=14) (F) in pre-stress and post-stress conditions. Data are presented as mean $\pm$ SEM. ***p<0.001 Pre-stress vs post-stress condition; +++ p<0.001 comparison APP/PSEN1-Tg pre-stress vs post-stress, **p<0.01 comparison APP/PSEN1-Tg vs Non-Transgenic post-stress condition. (two-way ANOVA).

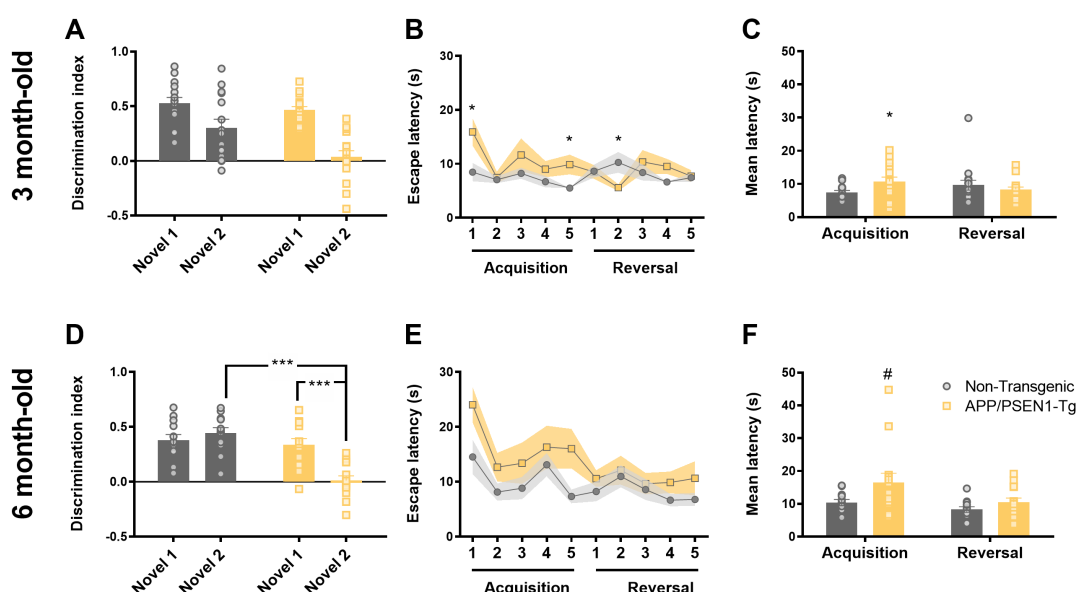


Figure 2. The onset of memory impairments in APP/PSEN1-Tg occurs at 3months-old.

Novel object recognition test: Grey (Non-Transgenic) and yellow (APP/PSEN1-Tg) bars represent the novel object 1 and 2 discrimination index (%) at 3 (A) (Non-Transgenic n=15, APP/PSEN1-Tg n=16) and 6 months old (D) (Non-Transgenic n=12, APP/PSEN1-Tg n=14). Data are presented as mean $\pm$ SEM. * p <0.05, ** p <0.01 (two-way ANOVA). T-maze left-right discrimination learning: (B, E) Solid (Non-Transgenic) and dotted line (APP/PSEN1-Tg) represent the escape latencies of both groups at two different ages. (ANOVA of repeated measurements * p <0.05; + p <0.05 comparison APP/PSEN1-Tg vs the 1st trial; * p <0.05 comparison APP/PSEN1-Tg vs Non-Transgenic). (C, F) Grey (Non-Transgenic) and yellow (APP/PSEN1-Tg) bars represent the mean $\pm$ SEM trials to criterion during acquisition and reversal phases latencies at 3 (n=16 per group) and 6 months-old (Non-Transgenic, n=12, APP/PSEN1-Tg n=14). (F) At 6 months-old, transgenic mice tend to reach the criterion later than control groups during acquisition. (Student's t-test, Non-Transgenic vs APP/PSEN1-Tg, * p <0.05; # p =0.068).

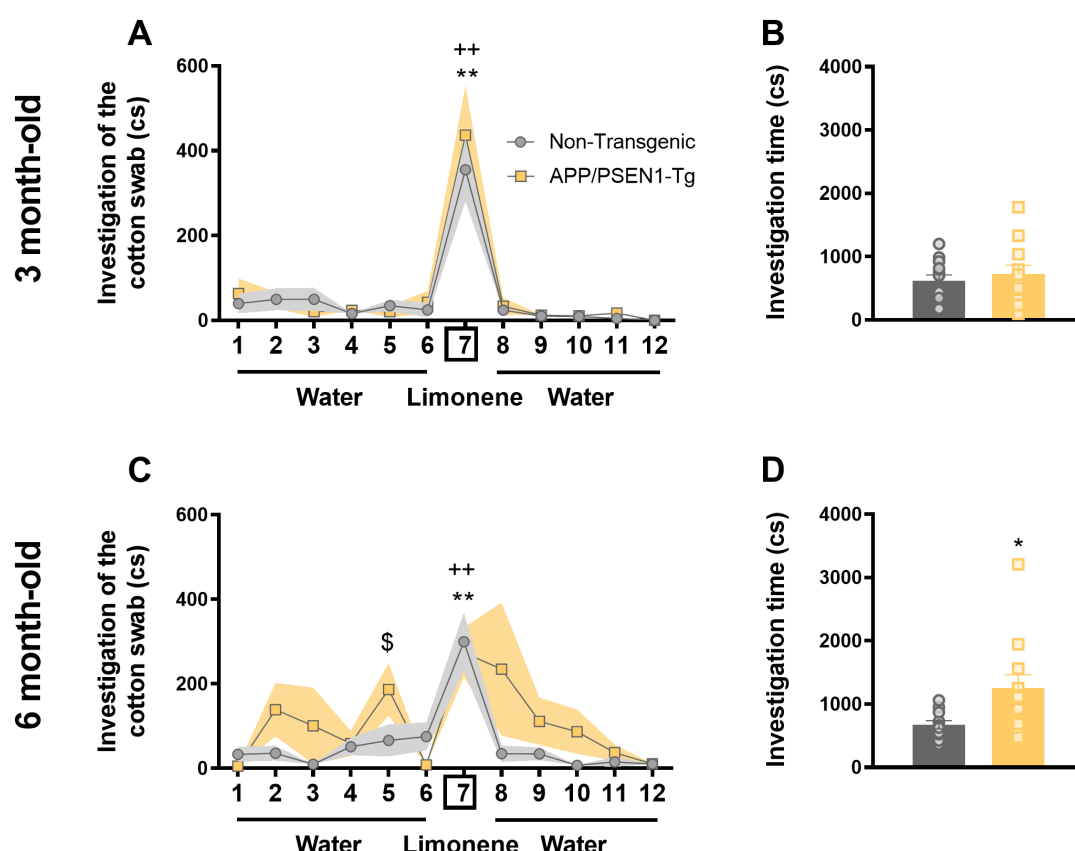


Figure 3. APP/PSEN1-Tg mice show olfaction disruptions at 6 months old.

Graphs show the time (centiseconds, cs) that APP/PSEN1-Tg and Non-Transgenic animals spent investigating a cotton swab through consecutive one-minute presentations (mean $\pm$ SEM) of distilled water (presentations 1-6 and 8-12) and limonene (presentation 7) at 3 (A) and 6 months (C). The exploration time during the first presentation of the cotton swab with water [1] was compared with that of the first presentation of limonene [7] in each group. (Wilcoxon test, ** p <0.01 comparison APP/PSEN1-Tg water vs limonene presentations; ++ p <0.01 comparison Non-Transgenic water vs limonene presentations; Kruskal-Wallis test \$ p <0.05 comparison APP/PSEN1-Tg vs Non-Transgenic). Grey (Non-Transgenic) and yellow (APP/PSEN1-Tg) bars represent the total investigation time at (B) 3 (n=12 per group) and 6 (D) months old (Non-Transgenic n=11, APP/PSEN1-Tg n=12) (Student's t-test * p <0.05). Data are presented as mean $\pm$ SEM.

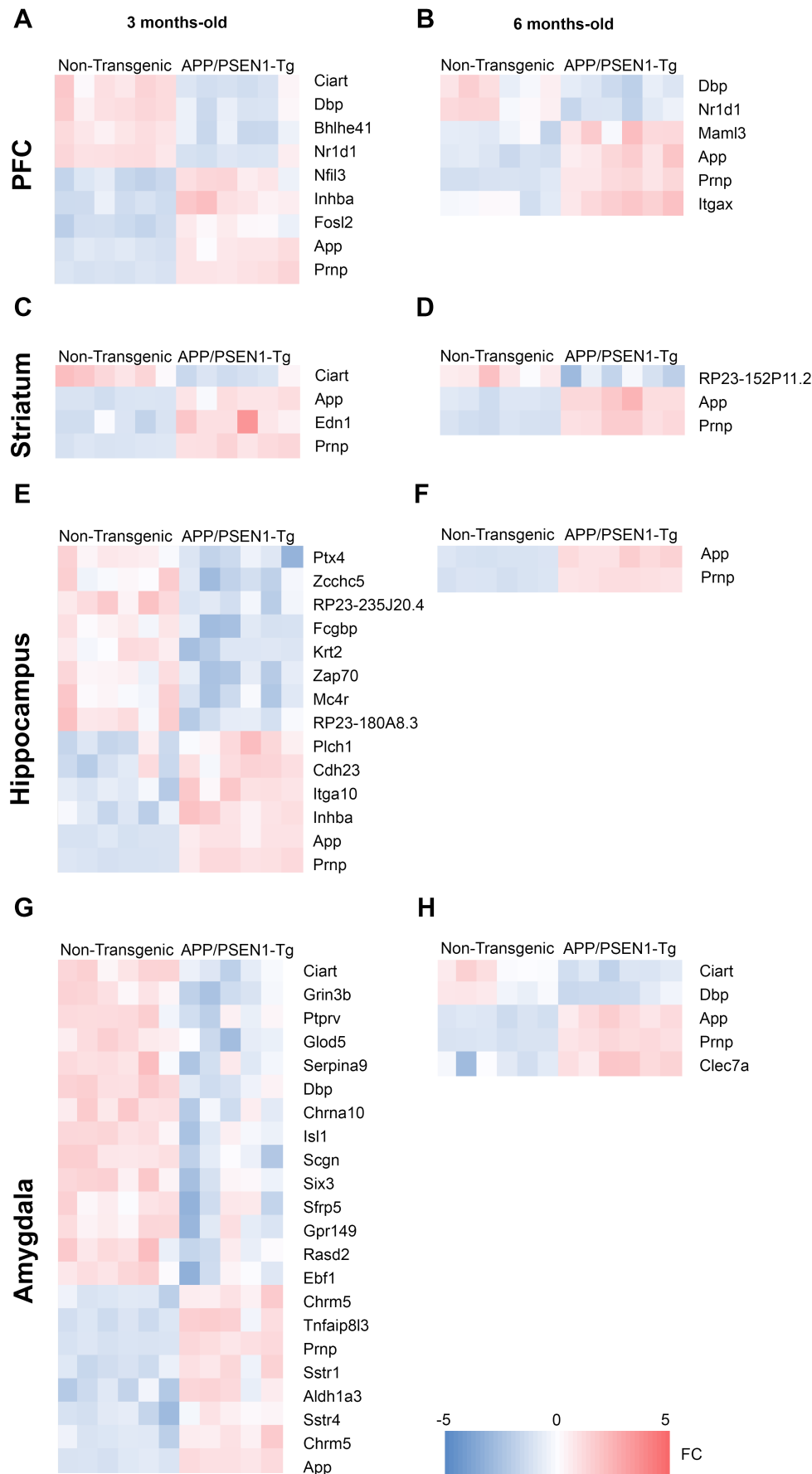


Figure 4. Differentially expressed genes in the PFC, striatum, hippocampus and amygdala from APP/PSEN1-Tg mice at 3 and 6 months-old.
Heatmaps representing the degree of change for the differentially expressed genes at 3 (A,C,E,G) and 6 (B,D,F,H) months between control and APP/PSEN1-Tg (5-6 independent brain samples per area). (G) The heatmap from amygdala at 3 month-old is a reduced representation from >100 up and downregulated genes ($p < 0.05$; $|\log FC| > 0.59$). Legend (bottom) indicates the color-coded fold-change scale ($-5 < FC < 5$) where negative values represent downregulation in blue, and positive upregulation in red.

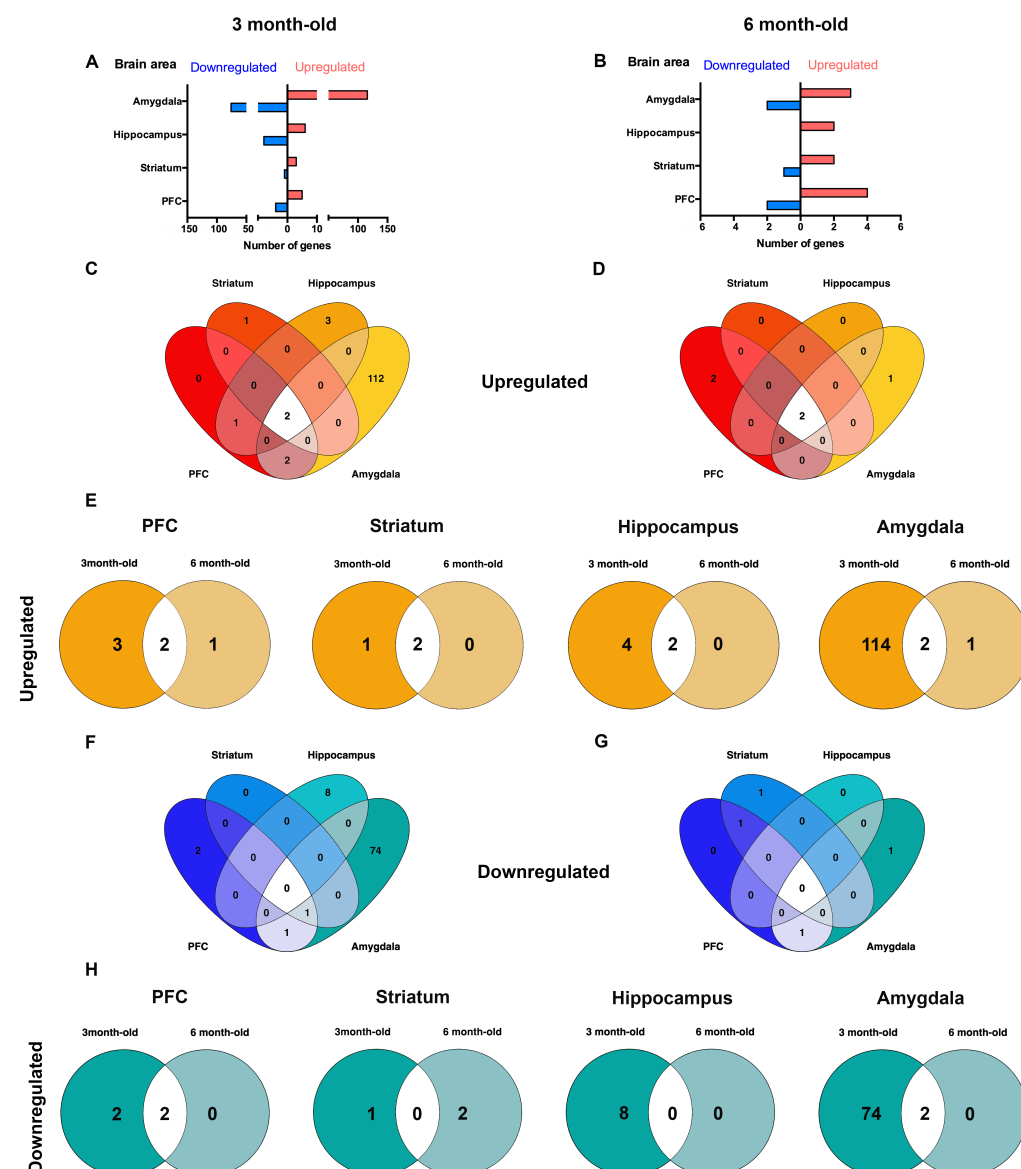


Figure 5. Distribution pattern of differentially expressed genes from APP/PSEN1-Tg mice model.
Total number of up (red bars) and downregulated (blue bars) genes within amygdala, hippocampus, striatum and PFC at (A) 3 months and (B) 6 months. Venn diagrams show the number of differentially expressed genes among areas, in an upregulated (C,D) and downregulated (F,G) way. Venn diagrams show the number of upregulated (E) and downregulated (H) shared genes between 3 and 6 months old of age APP/PSEN1-Tg (n=6 per group) vs Non-Transgenic mice (n=6 per group).

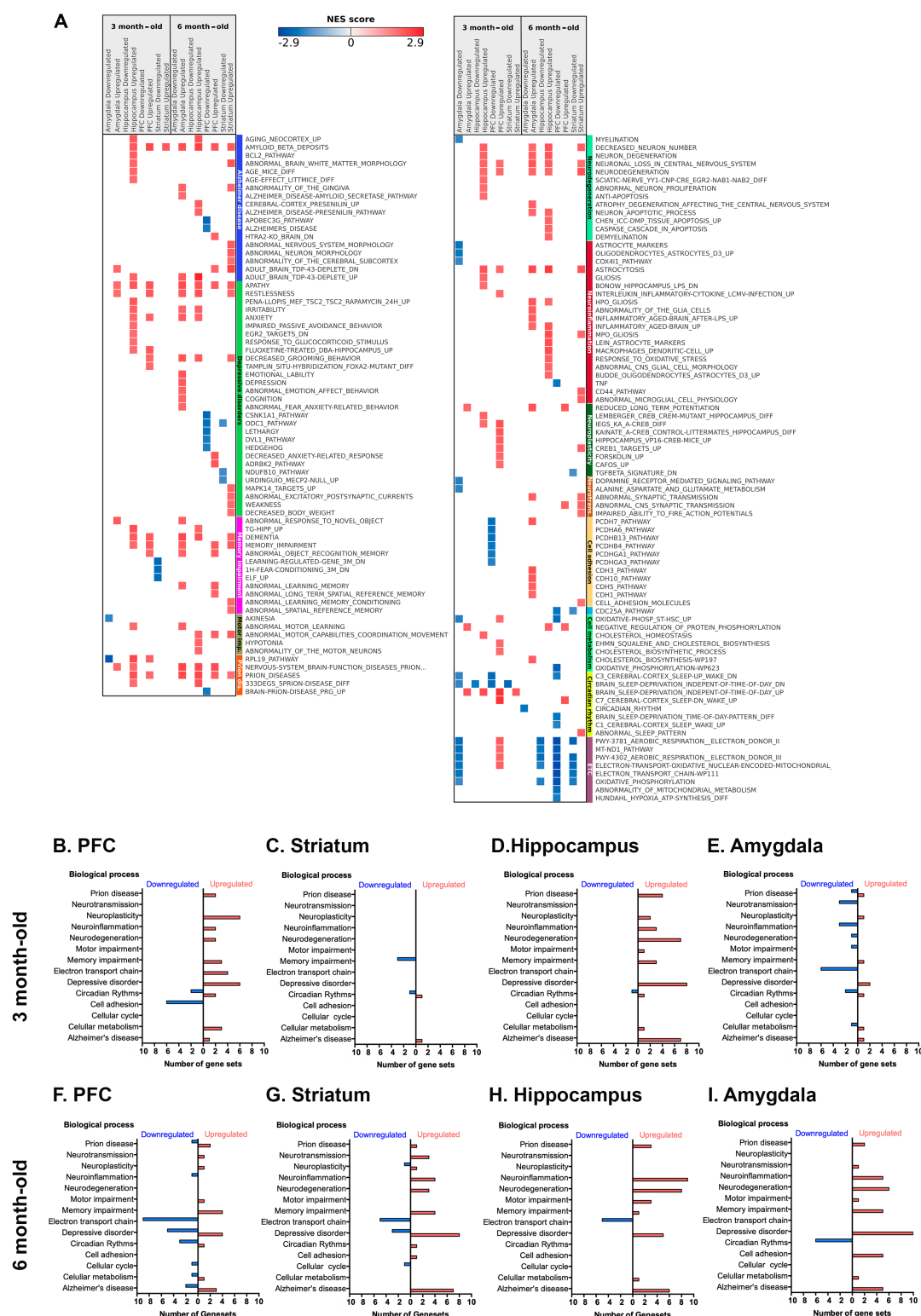


Figure 6. Comparison of differentially expressed gene sets in *APP/PSEN1-Tg* mice in PFC, striatum, hippocampus and amygdala.

(A) The heatmap represents some selected up and downregulated gene sets at 3 and 6 month-old included in different biological processes: Alzheimer disease, depressive disorders, memory impairment, prion disease, motor impairment (Motor imp.), neurodegeneration, neuroinflammation, neuroplasticity, neurotransmission (Neurotrans.), cell adhesion, circadian rhythm, electronic transport chain (ETC). (FDR q value < 0.05 ; $|NES| > 1.4$). List of the total number of differentially expressed gene sets ordered by biological processes found in PFC (B,F), striatum (C,G), hippocampus (D,G) and amygdala (E,J) at 3 and 6 months old, respectively. Red bars (positive) represent the upregulated expressed

703 gene sets and the blue bars (negative) show downregulated gene sets in each area. For the GSEA we only included
704 those gene sets with FDR q value <0.05 and $|NES| > 1.4$.
705