

# Transcriptomic signature of Alzheimer's disease tau seed-induced pathology

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**Abstract.** Spreading of tau pathology to anatomical distinct regions in Alzheimer's disease (AD) is associated with progression of the disease. Studies in recent decade have strived to understand the processes involved in this characteristic spread. We recently showed that AD-derived insoluble tau seeds are able to initiate neurofibrillary pathology in transgenic rodent model of tauopathy. In the present study, we pursued to identify the molecular changes that govern the induction and propagation of tau pathology on the transcriptomic level. We first show that microglia in vicinity to AD-Tau-induced pathology has phagocytic morphology when compared to PBS-injected group. On transcriptomic level, we observed deregulation of 15 genes 3-month post AD-Tau seeds inoculation. Integrated bioinformatic analysis identified 31 significantly enriched pathways. Amongst these, the inflammatory signalling pathway mediated by cytokine and chemokine networks, along with, toll-like receptor and JAK-STAT signalling were the most dominant. Furthermore, the enriched signalling also involved the regulation of autophagy, mitophagy and endoplasmic reticulum stress pathways. To our best of knowledge, the study is the first to investigate the transcriptomic profile of AD-Tau seed-induced pathology in hippocampus of transgenic model of tauopathy.

**Key words:** Alzheimer's disease — Tau spreading — Misfolded tau — Gene expression — Microglia

## Introduction

Alzheimer's disease (AD) is a progressive age-associated neurodegenerative tauopathy characterized by neurodegeneration and dementia. For decades, studies have attempted to understand the properties that initiate and drive the

disease progression, mainly in AD without any known genetic predisposition (late-onset or sporadic form). Besides environmental and immune risk factors, studies implicate genetic susceptibility and metabolic modifications in manifestation of AD (Miech et al. 2002; Cacabelos et al. 2005). In addition, genome-wide meta-analysis studies (GWAS)

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implicate a number of genes involved in immune system and tau metabolism as potential risk factors for sporadic late-onset AD (Ridge et al. 2016; Jansen et al. 2019). Moreover, we recently demonstrated the importance of genetic background in immune-system modulation, *via* microglia, as a crucial factor on the propagation of tau pathology (Smolek et al. 2019a).

In AD and few other tauopathies there is the distinct spread of tau pathology in the brain (Braak and Braak 1991; Delacourte et al. 1999). The pathology manifests in the hippocampus and spread to anatomically connected regions. Several studies in recent years have strived to mimic the characteristic spread in transgenic rodent models of AD or tauopathy, using inoculates of insoluble tau from AD brain (Smolek et al. 2019a, 2019b), protein isolates from transgenic rodent models of tauopathy (Levarska et al. 2013), or recombinant forms of tau (Iba et al. 2013; Reyes et al. 2013). Interestingly, tau species from different tauopathies induce pathology idiosyncratic to the specific disease (Clavaguera et al. 2013; Boluda et al. 2015), exhibiting a strain-dependent role of tau protein in disease manifestation (Levarska et al. 2013). Moreover, different tau forms, such as oligomers or fibrils, also differ in their seeding potency. In addition, the mode of transmission such as secretion, mechanism of uptake is progressively unearthed (Saman et al. 2012; Yamada et al. 2014; Tang et al. 2015; Kang et al. 2019; Morozova et al. 2019; Brunello et al. 2020).

Studies have shown the differential expression of genes in rodent model of AD, in late stages of the disease (Annese et al. 2018; Rothman et al. 2018; Lau et al. 2020). However, very little information is known about the early molecular changes in brain microenvironment following initiation and propagation of tau pathology *in-vivo*. Therefore, in this study, we performed intracerebral injections of human AD-derived tau seeds to identify primary changes in the hippocampus of sporadic rat model of tauopathy. Our transcriptomic analysis revealed deregulation of 15 genes linked to different pathways involved in neurons and glial cells. To our best of knowledge, the study is the first to investigate the transcriptomic profile of tau seed-induced pathology in hippocampus of transgenic model of tauopathy.

## Materials and Methods

### *Transgenic model*

Transgenic rat model (TG) expressing human truncated tau aa151-391,4Repeat was used in the study. The line has been previously characterized (Koson et al. 2008), and used for analysis of tau-induced spreading and propagation of pathology *via* intracranial application of insoluble tau from AD brain (Smolek et al. 2019b). All animals were housed

under specific pathogen free facility with access to water and food *ad libitum*, and were kept under diurnal lighting conditions. Experiments were performed with the approval of the Institute's Ethical Committee, and the study was approved by the State Veterinary and Food Administration of the Slovak Republic (approval #Ro-3748/2020-220).

### *Isolation of sarkosyl insoluble tau from human brain*

Braak stage 5 AD brain was purchased from the University of Geneva brain collection, Switzerland, in accordance with the material transfer agreement. Isolation of sarkosyl insoluble tau was performed as previously described (Jadhav et al. 2015). Briefly, Parietal cortex was homogenized in a buffer containing 20 mM Tris, 0.8 M NaCl, 1 mM EGTA, 1 mM EDTA, and 10% sucrose, supplemented with protease and phosphatase inhibitors. After centrifugation at 20,000 × *g* for 20 min, the supernatant (S1) was collected, and a small fraction was saved as the total protein fraction. N-lauroylsarcosine (sarkosyl) in concentration of 40% w/v in water was added to the S1 to a final concentration of 1% and stirred for 1 h at room temperature. The sample was then centrifuged at 100,000 × *g* for 1 h at 25°C and resulting pellet (P2) was washed and re-suspended in phosphate-buffered saline (PBS) to 1/50 volume of the S1 fraction, and sonicated briefly. 20 µg w/v of the P2 fraction (AD-Tau) corresponding to the S1 fraction, was used for the SDS-PAGE analysis. Blots were developed using pan-tau antibody DC25 (Axon Neuroscience R&D Services, Bratislava, Slovakia). Intensity of bands were quantified using AIDA Biopackage (Advanced Image Data Analyzer software; Raytest, Germany), and concentration of insoluble tau fraction was estimated using a standard curve with reference intensities of known concentrations of recombinant human tau 2N4R (Tau40) as previously described (Smolek et al. 2019b).

### *Stereotaxic surgery*

Male transgenic rats (age 3 months) were anesthetized *via* intraperitoneal injection of a cocktail containing Zoletil (30 mg/kg) and Xylarium (10 mg/kg). Animals were fixed to a stereotaxic apparatus and an UltraMicroPump III Micro-syringe injector and Micro4 Controller (World Precision Instruments, FL, United States) were used for intracranial applications. Stereotaxic coordinates for the injection were A/P: -3.6 mm, L: ± 2.0 mm, D/V: 3.3 from bregma (Paxinos and Watson 1996). Animals received bilateral injections of 1500 ng (concentration 500 ng/µl) of sarkosyl-insoluble tau (*n* = 6) or PBS (*n* = 5) at a rate of 1.25 µl/min, and the needle was positioned for 5 min before slow withdrawal to prevent leakage of the infused liquid. After 3 months, animals were anesthetized, perfused transcardially with 1×PBS-Heparin

1 and sacrificed. Hippocampi from left hemispheres were fro- 54  
 2 zen for transcriptomic analysis, and whole right hemispheres 55  
 3 were used for histological assessment. 56

#### 4 *Immunohistochemistry* 57

5 The right hemispheres were fixed in sucrose solutions (15, 58  
 6 25, and 30% for 24 h each) followed by freezing in 2-methyl 59  
 7 butane. Frozen tissues were serially cut into 40- $\mu$ m-thick 60  
 8 sagittal sections using a cryomicrotome (Leica CM1850, 61  
 9 Leica Biosystems). The sections were blocked with Aptum 62  
 10 Section block (Aptum Biologics Ltd., Oxford, UK) followed 63  
 11 by incubation with antibodies AT8 (Mouse monoclonal, 64  
 12 Thermo-Scientific, IL, USA), GFAP (Rabbit polyclonal, 65  
 13 Abcam, Bratislava, Slovakia), or Iba-1 (Rabbit polyclonal, 66  
 14 Wako, Japan) overnight at 4°C. After washing, the sections 67  
 15 were incubated for 1 h with respective Alexa conjugated 68  
 16 secondary antibodies (Invitrogen, Eugene, Oregon, USA). 69  
 17 After washing, the sections were mounted onto slides using 70  
 18 Vectashield mounting medium (Vector laboratories, USA), 71  
 19 and examined with laser scanning confocal microscope LSM 72  
 20 710 (Carl Zeiss, Jena, Germany). 73  
 21  
 22  
 23

#### 24 *Gene expression profiling by real-time PCR* 74

25 Left hemispheres were used for transcriptomic analysis from 75  
 26 PBS- and AD-Tau-injected transgenic rats. Total RNA was 76  
 27 extracted using the TRI Reagent according to manufacturer's 77  
 28 instructions (Sigma-Aldrich, USA, Cat#. T9424). Resulting 78  
 29 RNA was briefly air-dried and suspended in 100  $\mu$ l of RNase- 79  
 30 free water (Qiagen, Germany, Cat#. 129112). The integrity 80  
 31 of isolated RNA samples was determined using Agilent 81  
 32 2100 Bioanalyzer (Agilent Technologies, Germany, Cat #. 82  
 33 5067-1511). For transcriptomic analysis, only high-quality 83  
 34 RNA samples were used, RNA integrity number for PBS- or 84  
 35 AD-Tau-injected groups were  $8.7 \pm 0.14$  standard deviation 85  
 36 (SD) and  $8.8 \pm 0.15$  SD, respectively. 86  
 37

38 Profiling of gene expression was performed using the Rat 87  
 39 Inflammatory Cytokines and Receptors PCR array (Qiagen, 88  
 40 Germany, Cat #. PARN-011Z), Rat Phagocytosis PCR array 89  
 41 (Qiagen, Germany, Cat #. PARN-173Z) and Rat Autophagy 90  
 42 PCR array (Qiagen, Germany, Cat #. PARN-084Z), evaluat- 91  
 43 ing a total of 238 genes. 92

44 Total RNA was reversely transcribed into cDNA by RT2 93  
 45 first strand kit (Qiagen, Germany, Cat #. 330401), and 100 94  
 46 ng of resulting cDNA was used as a template for each qPCR 95  
 47 reaction. Components of 25  $\mu$ l qPCR reaction were as fol- 96  
 48 lows: 12.5  $\mu$ l 2 $\times$ RT2 SYBRGreen/ROX mastermix; 12  $\mu$ l 97  
 49 RNase-free water and 0.5  $\mu$ l of cDNA (200 ng/ $\mu$ l). Cycling 98  
 50 conditions included an initial denaturation at 95°C for 10 99  
 51 min, and 42 cycles of 95°C for 15 s cycle denaturation, to- 100  
 52 gether with amplification at 60°C for 1 min. PCR specificity 101  
 53 was checked by melting curve analysis. 102  
 103  
 104  
 105  
 106  
 107

54 Fold change of target genes expression in each PBS- and 55  
 56 AD-Tau-injected animal was compared to the average of 57  
 58 control PBS-injected group using  $2^{-\Delta\Delta CT}$  method with 59  
 60 Ribosomal protein lateral stalk subunit P1 (Rplp1) as en- 61  
 62 dogenous reference. The Rplp1 was identified as the most 63  
 64 stable gene across all samples, evaluated with the Endog- 65  
 66 enous control pipeline using ExpressionSuite software v.1.1 67  
 68 (Applied Biosystems, Foster City, USA). Comprehensive 69  
 70 list of analysed genes together with calculated fold change 71  
 72 and statistical evaluation is included in the Supplementary 73  
 74 Material (Table S1–S4). 75  
 76

#### 66 *Statistical evaluation of gene expression* 67

68 Statistical analysis was performed using software R, version 69  
 70 4.0.3. The hypotheses were tested at a significance level 71  
 72 of 0.05. Gene expression measures in PBS- and AD-Tau- 73  
 74 injected groups were tested for outliers, and observations that 75  
 75 were more than three times the interquartile range from the 76  
 76 first and third quartile were eliminated. Then, for each gene, 77  
 77 the null hypothesis  $H_0: \mu_{controls} - \mu_{Tau} = 0$  was tested against 78  
 78  $H_1: \mu_{controls} - \mu_{Tau} \neq 0$ , where  $\mu_{controls}$  is mean of control PBS 79  
 79 group and  $\mu_{tau}$  is mean of AD-Tau group. 80  
 81

82 The analysis was performed using a bootstrap version of 83  
 83 two-sample Student *t*-test with Welch degrees of freedom 84  
 84 with 1000 replications using the *boot.t.test* from the *simple-* 85  
 85 *boot* library. 86  
 86

87 The complete results from statistical analysis including 88  
 88 sample size, means and SD of both groups, means difference, 89  
 89 95% confidence intervals of a mean difference and *p*-values 90  
 90 are reported in Supplementary Material (Table S1–S4). The 91  
 91 direction describes the sign of the difference between the 92  
 92 means  $\mu_{controls} - \mu_{Tau}$ . 93  
 93

#### 89 *Pathway enrichment analysis* 90

91 To enable the pathway enrichment analysis (PEA), we em- 92  
 92 ployed PathDIP. PathDIP is an annotated database of signaling 93  
 93 cascades that integrates pathways with physical protein-protein 94  
 94 interactions to predict significant physical associations be- 95  
 95 tween proteins and curated pathways (<http://ophid.utoronto.ca/pathDIP>). In this study, the identified rat genes were an- 96  
 96 notated for their human orthologs. Human orthologs for all 97  
 97 15 dysregulated rat genes were used to query pathDIP version 98  
 98 4.0.21.4 (Database version 4.0.7.0) (Rahmati et al. 2020) to 99  
 99 identify significantly enriched pathways, with *q*-value <0.05 100  
 100 (false discovery rate: Benjamini-Hochberg method). We used 101  
 101 all pathway sources, and only literature curated (core) pathway 102  
 102 memberships. Pathway annotations from 22 different pathway 103  
 103 sources were tested for enrichment and gene-pathway matrix 104  
 104 was generated to highlight dysregulated genes in enriched 105  
 105 pathways. Raw data, search results, and evaluation are included 106  
 106 in Supplementary Material (Table S1–S4). 107  
 107

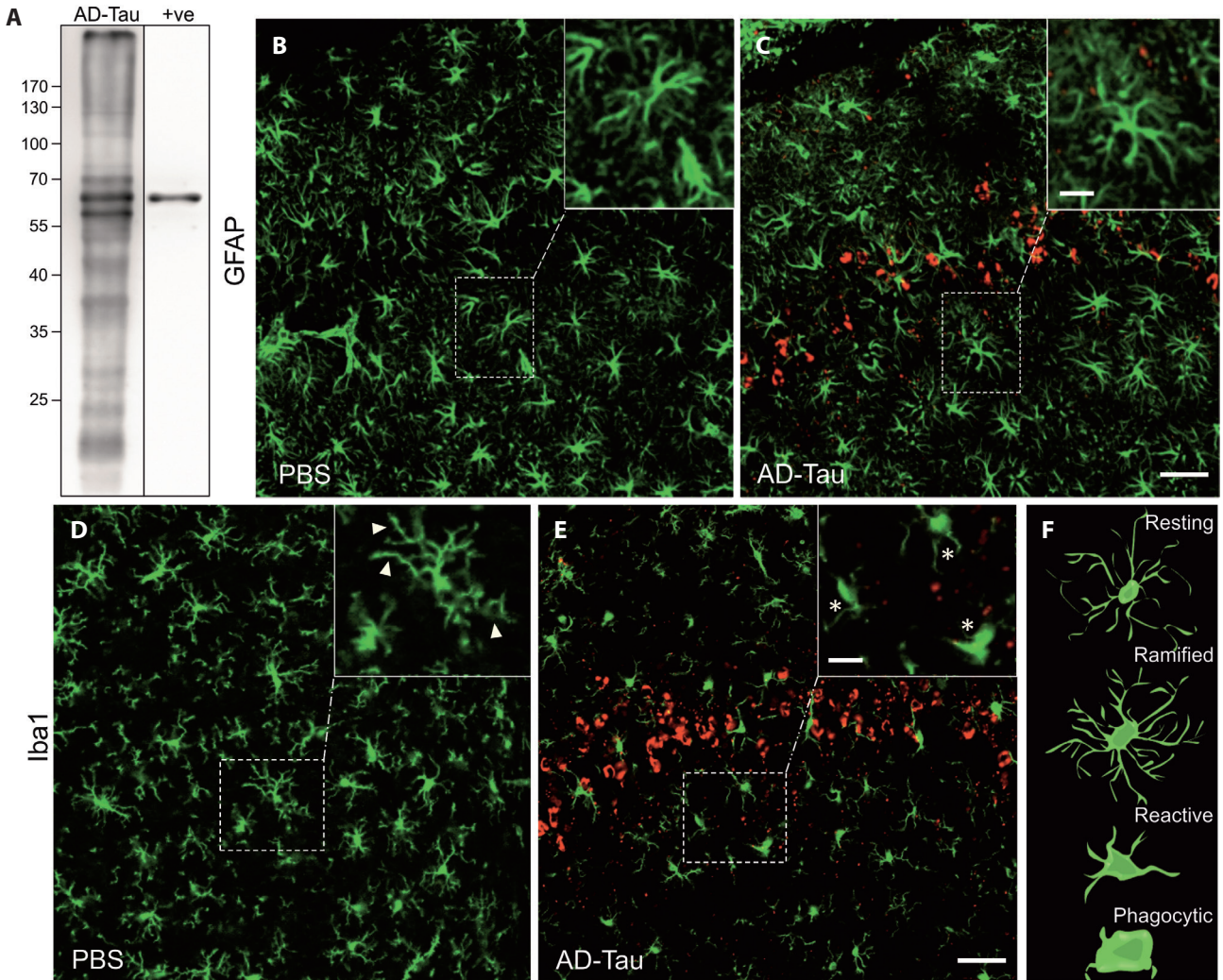


## Results

### *Insoluble tau from AD-induced morphological changes on microglia in hippocampus of transgenic rodent model*

In the present study, we performed bilateral injections of insoluble tau isolated from human AD brain (AD-Tau; 900 ng) (Fig. 1A) or PBS in the hippocampus of 3 months old TG

rodent model of tauopathy. Using immunohistochemistry, we observed the presence of tau pathology in the hippocampus of AD-tau-injected rodents but not in PBS-injected groups, as previously reported (Smolek et al. 2019a). We were interested to know whether AD-Tau-induced pathology activates glial cells, specifically microglia and astrocytes. Therefore, we performed co-immunostaining using phospho-tau antibody AT8 (pathological tau marker) with either Iba-1 (microglia



**Figure 1.** Histological assessment of hippocampus of PBS- and AD-Tau-injected rodents. **A.** Immunoblot using pan-tau antibody DC25 shows the presence of insoluble tau from AD brain. Recombinant human Tau 40 was used as positive control (+ve). Representative confocal images showing co-immunostaining using astrocyte marker-GFAP (green) and tau marker-AT8 (red) in PBS-injected (**B**) and AD-Tau-injected (**C**) groups. Insets showing higher magnification of the area highlighted in **B** and **C**, respectively. No prominent difference in astrocyte morphology between the two groups was observed. Representative confocal images showing co-staining using microglia marker Iba1 (green) and AT8 (red) in PBS-injected (**D**) and AD-Tau-injected (**E**) groups. The microglia in PBS injected groups have numerous processes (arrow heads in inset of **D**); whereas, in AD-Tau-injected group the microglia show increased cell body size with deramification of the processes (phagocytic morphology) (asterisks in inset of **E**). Scale bar: 50  $\mu$ m (inset 20  $\mu$ m). **F.** Illustration depicting the stages involved in activation of microglia in response to stimuli. In brief, resting microglia becomes ramified with more processes. In later stages, it becomes reactive with increased body size but with reduced number of processes. The microglia finally attain phagocytic morphology with few or no processes. AD, Alzheimer's disease; PBS, phosphate-buffered saline.

marker) or GFAP (astrocyte marker). Interestingly, we did not observe any significant morphological changes in astroglia between the two groups (Fig. 1B,C). However, we observed changes in morphology of microglia in vicinity to AT8 positive neurofibrillary structures in hippocampus of AD-Tau-injected rodents (Fig. 1E). Activation of microglia is characterized by progressive transformation of cells from reactive (small cell body and numerous processes) to phagocytic morphology, i.e. with larger cell body and few to no processes (Fig. 1F). Interestingly, microglia (~97%) in vicinity to AT8 positive structures, in AD-Tau-injected rodents were phagocytic (\*in inset Fig. 1E). In contrast, the microglia in the PBS-injected group were either resting or ramified with numerous processes (arrowheads in inset Fig. 1D).

#### *Insoluble tau from human AD induced differential expression of genes associated with inflammation*

We were then interested to identify the molecular changes associated with insoluble tau-induced pathology in transgenic rodent model of tauopathy. We performed transcriptomic profiling of 238 different genes in the hippocampus of PBS- and AD-Tau-injected TG rodents using three different PCR arrays kits (Supplementary Material, Table S1-S4). Using quantitative PCR, we detected an altered expression of 15 genes after 3 months following the AD-Tau injection. In the identified group, 11 genes were up-regulated (*Mbl2*, *Il17f*, *Cxcl11*, *Ccl4*, *Osm*, *Tnfa*, *Ccl7*, *Tgm2*, *Ccr10*, *Wnt5* and *Gabarap*), and 4 genes displayed reduced expression (*Bnip3*, *Hprt1*, *Il5r* and *Tnfsf13b*) (Table 1).

To reveal functional annotation of signalling pathways associated with spreading of tau pathology we performed

integrated bioinformatic analysis. Human orthologs of dysregulated genes from the rat model were further analysed using pathDIP portal to identify specific pathways associated with involved genes and to highlight the significantly enriched pathways. We identified 31 significantly enriched pathways with the inflammatory signalling mediated by cytokine and chemokine network, along with TLRs and JAK-STAT signalling were the most dominant. Moreover, the enriched signalling also involved the regulation of autophagy, mitophagy and endoplasmic reticulum stress pathways (Table 2). Evaluation of the gene pathway matrix revealed that *Ccl4* and *Tnfa* represent the top most abundant genes shared among the significantly enriched pathways suggesting their important role in the molecular response mechanisms involved in the spreading of pathological tau aggregates in the brain Supplementary Material (Table S1-S4).

## Discussion

The mechanism/s involved in initiation and propagation of tau pathology *in-vivo* has gained wider attention in recent years. Several research groups, including us, have identified and documented processes involved in the characteristic spread of tau (Clavaguera et al. 2013; Boluda et al. 2015; Smolek et al. 2019a, 2019b). In the present study, we extend our previous observation and explore the changes on molecular level in brain microenvironment post inoculation of insoluble tau seeds. We employed a sporadic rat model expressing human truncated tau aa151-391 that develops robust neurofibrillary pathology, akin to tauopathies. Despite retaining the expression of misfolded tau aa151-391,

Table 1. Differentially expressed genes in rats injected with AD-Tau compared to animals injected with PBS (control)

| Gene symbol     | Gene name                                | Fold change | p-value |
|-----------------|--|-------------|---------|
| <i>Mbl2</i>     | Mannose binding lectin 2                 | 33.15       | 0.016   |
| <i>Il17f</i>    | Interleukin 17F                          | 3.37        | 0.044   |
| <i>Cxcl11</i>   | C-X-C motif chemokine ligand 11          | 1.95        | 0.048   |
| <i>Ccl4</i>     | C-C motif chemokine ligand 4             | 1.93        | 0.01    |
| <i>Osm</i>      | Oncostatin M                             | 1.79        | 0.002   |
| <i>Tnf</i>      | Tumor necrosis factor                    | 1.59        | 0.012   |
| <i>Ccl7</i>     | C-C motif chemokine ligand 7             | 1.55        | 0.038   |
| <i>Tgm2</i>     | Transglutaminase 2                       | 1.5         | 0.006   |
| <i>Ccr10</i>    | C-C motif chemokine receptor 10          | 1.35        | 0.026   |
| <i>Wnt5</i>     | Wnt family member 5A                     | 1.26        | 0.032   |
| <i>Gabarap</i>  | GABA type A receptor-associated protein  | 1.05        | 0.016   |
| <i>Hprt1</i>    | Hypoxanthine phosphoribosyltransferase 1 | -1.18       | 0.02    |
| <i>Bnip3</i>    | BCL2 interacting protein 3               | -1.25       | 0.032   |
| <i>Tnfsf13b</i> | TNF superfamily member 13b               | -1.32       | 0.004   |
| <i>Il5ra</i>    | Interleukin 5 receptor subunit alpha     | -2.78       | 0.042   |

**Table 2.** Enriched pathways associated with spreading of AD-Tau aggregates

| Signaling                     | Pathway name  | Pathway source  | <i>q</i> -value* |
|-------------------------------|---|-----------------|------------------|
| Cytokines                     | Cytokine Signaling in immune system                       | REACTOME        | 3.50609E-03      |
|                               | Cytokine-cytokine receptor interaction                    | KEGG            | 2.35584E-09      |
|                               | Signaling by interleukins                                 | REACTOME        | 5.56810E-03      |
|                               | Interleukin-4 and Interleukin-13 Signaling                | REACTOME        | 6.78072E-03      |
|                               | Interleukin-10 Signaling                                  | REACTOME        | 2.37526E-02      |
|                               | IL-17 Signaling   | KEGG            | 6.02465E-03      |
| Chemokines                    | IL23-mediated Signaling events                            | PID             | 2.01809E-02      |
|                               | Chemokine Signaling                                       | WikiPathways    | 2.95941E-03      |
|                               | Chemokine Signaling                                       | KEGG            | 3.43831E-03      |
|                               | Chemokine receptors bind chemokines                       | REACTOME        | 2.26209E-02      |
| Immune cells and inflammation | Cytokines chemokines production                           | ACSN2           | 1.08907E-03      |
|                               | Inflammatory Signaling                                    | ACSN2           | 2.01809E-02      |
|                               | Recruitment of immune cells                               | ACSN2           | 1.98639E-02      |
|                               | Inflammation mediated by chemokine and cytokine Signaling | Panther Pathway | 2.32315E-02      |
|                               | miRNAs involvement in the immune response in sepsis       | WikiPathways    | 2.01809E-02      |
|                               | NF-kappa B Signaling                                      | KEGG            | 5.65365E-03      |
|                               | Intestinal immune network for IgA production              | KEGG            | 2.36651E-02      |
|                               | Inflammatory bowel disease (IBD)                          | KEGG            | 3.41348E-02      |
|                               | Thioguanine metabolism pathway                            | SMPDB           | 2.31433E-02      |
|                               | Legionellosis   | KEGG            | 2.84571E-02      |
| Toll-like receptor signaling  | Lung fibrosis   | WikiPathways    | 3.44696E-02      |
|                               | Toll-like receptor Signaling                              | WikiPathways    | 6.16538E-03      |
|                               | Toll-like receptor Signaling                              | KEGG            | 6.45435E-03      |
| JAK-STAT signaling            | Regulation of toll-like receptor Signaling                | WikiPathways    | 2.05721E-03      |
|                               | JAK STAT pathway in postconditioning ischemia             | IPAVS           | 3.87602E-03      |
| Purine nucleotide salvage     | GP130_JAK_STAT  | IPAVS           | 5.40987E-03      |
|                               | Guanine and guanosine salvage                             | HumanCyc        | 3.55866E-02      |
| Mitophagy                     | Adenine and adenosine salvage III                         | HumanCyc        | 4.47457E-02      |
|                               | Mitophagy - animal  | KEGG            | 3.41348E-02      |
| Autophagy                     | Autophagy   | Spike           | 3.42884E-02      |
| ER stress                     | ER Stress Map   | IPAVS           | 6.07290E-03      |

\*false discovery rate: Benjamini-Hochberg method (FDR: BH-method). ER, endoplasmic reticulum.

the transgenic rodents do not develop pathology in the hippocampus. However, using intracerebral injections of AD-derived insoluble tau seeds we were able to induce tau pathology in hippocampus of these animals (Smolek et al. 2019a, 2019b). Moreover, the AT8 positive structures were also observed in synaptically connecting regions adjacent to the site of inoculation. In addition, the exogenous AD-Tau seeds recruited endogenous rat tau in the neurofibrillary inclusions. Therefore, we used a similar approach to investigate tau-induced changes in hippocampal microenvironment employing PCR array profiling.

Neuroinflammation is cardinal hallmark of AD characterized by activation of the innate immune system, the trigger for which is yet uncertain. GWAS suggest that genes associated with inflammation are a risk factor in onset and

progression of AD (Castanho et al. 2020; Li and De Muynck 2021). In line, differential expression of genes associated with inflammation is observed in AD (Wang et al. 2018; Chew and Petretto 2019; Kim et al. 2019). Moreover, a recent study also implicates the deregulation of genes associated with microglia in AD (Li and De Muynck 2021; Sobue et al. 2021). Therefore, we investigated the transcriptomic profile associated with the seeding and initiation of tau pathology in rodent model of tauopathy using three different PCR arrays, which extensively covers genes involved in key aspects of neuroinflammation (cytokines and their receptors, autophagy (ER stress, oxidative stress), and phagocytosis). We identified 15 genes that are differentially expressed in response to exogenous AD-derived tau seeds. Integrated bioinformatic analysis revealed significant enrichment of



1 pathways associated with neuroinflammation, recruitment  
2 of immune cells, regulation of autophagy, and cell organelles  
3 stress signalling. At the molecular level, our data suggest  
4 the initiation of signalling cascades, mainly in microglia, in  
5 response to tau-induced pathology. In particular, elevated  
6 expression of *Tnfa*, *Ccl4* and *Ccl7*, factors that are chemot-  
7 actic to phagocytic cells, indicate activation and recruitment  
8 of these cells during tau seeding and propagation. Likewise,  
9 the notable upregulation of *Cxcl11* may relate to the effector  
10 function of microglia, mediated *via* receptor protein Cxcr3,  
11 which is crucial for their recruitment (Rappert et al. 2004;  
12 Koper et al. 2018). This correlates well with the phagocytic  
13 morphology of microglia in proximity to AT8 positive struc-  
14 tures in the hippocampus of tau-seeded rodents.

15 Furthermore, the gene *Mbl2*, which is highly upregulated  
16 following the seeding of tau aggregates is a member of lectin  
17 pathway of complement system. It acts as opsonin and is in-  
18 volved in the regulation of innate immunity and removal of  
19 senescent and apoptotic cells by macrophages (Turner 1998).

20 Among other genes, we observed upregulation of oncos-  
21 tatin M, a pleiotropic cytokine of the IL-6 family involved in  
22 cell communication and signalling in the immune system,  
23 and exerts a direct neuroprotective activity in the CNS  
24 (Houben et al. 2019).

25 In addition to the inflammatory signalling by cytokines,  
26 chemokines and TLRs, we identified the enrichment of  
27 autophagy, mitophagy and endoplasmic reticulum path-  
28 ways associated genes in hippocampus of AD-Tau-seeded  
29 rodents. This molecular association indicates the clearance  
30 of tau aggregates through lysosomal pathway and chaperone-  
31 mediated autophagy (Wang et al. 2009; Abisambra et al.  
32 2013). Furthermore, it highlights the degradation pathways  
33 associated with neurodegeneration directing towards es-  
34 tablishment of neuro-proteostasis in the brain (Opattova  
35 et al. 2015).

36 Neuroinflammation is inevitably associated with activa-  
37 tion of microglia (Zotova et al. 2010). It is reported that tau  
38 oligomers and fibrils induce activation of microglia and evoke  
39 their morphological alterations (Morales et al. 2013). How-  
40 ever, it is also shown that neutralization of AD-Tau seeds by  
41 microglia is compromised since the cells released inefficiently  
42 degraded tau back to extracellular space, thereby contributing  
43 to spreading of tau pathology (Hopp et al. 2018). Moreover,  
44 tau hyperphosphorylation affects microglia-dependent tau  
45 degradation (Perea et al. 2018). These phenomena more likely  
46 relates to dual activity of microglia in tau spreading cascades,  
47 and can be explained by diverse molecular pathways linked  
48 to tau-induced neurodegeneration.

49 One of the limitations, in the study, is that we employed  
50 male rodents in order to avoid heterogeneity; therefore, sex  
51 specific response to tau-induced pathology in females may  
52 vary. Secondly, we used bulk hippocampal tissues for tran-  
53 scriptomic analysis, and microglial activation was observed

54 only in the vicinity of the AT8 positive structures. Despite  
55 this limitation, we observed transcriptional changes; how-  
56 ever, the actual number of deregulated genes may be greater  
57 than observed.

58 Overall, for the first time, our results suggests, that exog-  
59 enous tau seeding in transgenic rodent model of tauopathy  
60 induce specific activation of pro-inflammatory signalling and  
61 participation of phagocytic cells, including microglia, that  
62 are involved in the manifestation of tau-induced pathology  
63 and spreading.

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72

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## Supplementary Material

# Transcriptomic signature of Alzheimer's disease tau seed-induced pathology

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**Table S1.** “Genes” spreadsheet: List of 238 profiled genes using the PCR arrays including the calculated Fold change and bootstrap statistics (*p* value)

**Table S2.** “Pathway annotations” spreadsheet: Pathway annotations for the dysregulated genes via pathDIP: Annotated database of signaling cascades (<http://ophid.utoronto.ca/pathDIP/>)

**Table S3.** “PEA” spreadsheet: Pathway enrichment analysis of identified known pathways via pathDIP: Annotated database of signaling cascades (<http://ophid.utoronto.ca/pathDIP/>)

**Table S4.** “Genes pathway matrix” spreadsheet: Membership of dysregulated genes in significant pathways as analyzed *via* pathDIP

[Table S1-S4.xlsx](#)