

## Transcriptome analysis of LRRK2 knock-out microglia cells reveals alterations of inflammatory- and oxidative stress-related pathways upon treatment with $\alpha$ -synuclein fibrils

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### ABSTRACT

Several previous studies have linked the Parkinson's disease (PD) gene LRRK2 to the biology of microglia cells. However, the precise ways in which LRRK2 affects microglial function have not been fully resolved. Here, we used the RNA-Sequencing to obtain transcriptomic profiles of LRRK2 wild-type (WT) and knock-out (KO) microglia cells treated with  $\alpha$ -synuclein pre-formed fibrils (PFFs) or lipopolysaccharide (LPS) as a general inflammatory insult. We observed that, although  $\alpha$ -synuclein PFFs and LPS mediate overlapping gene expression profiles in microglia, there are also distinct responses to each stimulus.  $\alpha$ -Synuclein PFFs trigger alterations of oxidative stress-related pathways with the mitochondrial dismutase *Sod2* as a strongly differentially regulated gene. We validated SOD2 at mRNA and protein levels. Furthermore, we found that LRRK2 KO microglia cells reported attenuated induction of mitochondrial SOD2 in response to  $\alpha$ -synuclein PFFs, indicating a potential contribution of LRRK2 to oxidative stress-related pathways. We validate several genes in vivo using single-cell RNA-Seq from acutely isolated microglia after striatal injection of LPS into the mouse brain. Overall, these results suggest that microglial LRRK2 may contribute to the pathogenesis of PD via altered oxidative stress signaling.

### 1. Introduction

Mutations in the gene encoding Leucine-rich repeat kinase-2 (*LRRK2*) cause a dominantly inherited form of Parkinson's disease (PD) (Paisán-Ruiz et al., 2004; Zimprich et al., 2004). In addition, common variations in the *LRRK2* locus act as risk factors for the development of PD (Simón-Sánchez et al., 2009). Due to the similarities in the clinical and neuropathological phenotypes of LRRK2-related and sporadic PD (Aasly et al., 2005; Haugarvoll et al., 2008), understanding the mechanisms behind mutant LRRK2 neurodegeneration may offer new

insights into the pathological mechanisms underlying sporadic PD.

LRRK2 is expressed in the brain although it shows higher expression in organs such as lungs and kidneys (Biskup et al., 2007). At the cellular level, LRRK2 is expressed in both neuronal and non-neuronal cells including in microglia (Moehle et al., 2012). Microglia cells, the resident macrophages of the brain, are known to play important roles in neuroinflammation [reviewed in (Perry and Holmes, 2014)]. In response to a pathological stimulus, microglia switch from a resting state to an activated phenotype and release pro-inflammatory and reactive oxygen species (ROS) components to mediate the inflammatory response aimed

**Abbreviations:** WT, wild-type; KO, knock-out; PFFs, pre-formed fibrils; LPS, lipopolysaccharide; LRRK2, Leucine-rich repeat kinase-2; PD, Parkinson's disease; ROS, reactive oxygen species; RNA-Seq, RNA sequencing; SOD2, superoxide dismutase-2; RT, room temperature; Txnip, Thioredoxin Interacting Protein; TLR4, Toll-like receptor 4; scRNA-Seq, single-cell RNA Sequencing

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at removing foreign materials or pathogens by phagocytosis (Garden and Möller, 2006). Although a well-regulated inflammatory process is essential for tissue repair and brain integrity, excessive and prolonged inflammation can lead to significant tissue and cellular damage (Gao and Hong, 2008). Increased numbers of reactive microglia have been observed in the vicinity of dopaminergic neurons in the *substantia nigra pars compacta* of PD *post-mortem* brains (McGeer et al., 1988; Mogi et al., 1994), suggesting that activated microglia cells contribute to neurodegeneration in PD. Given that LRRK2 is expressed in microglia, it is likely that this gene contributes to the PD pathogenesis via altered neuroinflammatory signaling [reviewed in (Russo et al., 2014; Tansey and Goldberg, 2010)].

Multiple lines of evidence suggest that a key trigger for neuroinflammation in PD is  $\alpha$ -synuclein, which is also encoded by a gene for PD, *SNCA*. While  $\alpha$ -synuclein is normally a synaptic protein, activation of microglia can be triggered by aggregated forms of  $\alpha$ -synuclein released by degenerating neurons or actively secreted through exosomes by stressed neurons [reviewed in (Kim et al., 2013; Russo et al., 2012; Zhang et al., 2005)]. Several *in vitro* (Blieberhaeuser et al., 2016; Hoenen et al., 2016; Hoffmann et al., 2016; Russo et al., 2015) and *in vivo* (Sacino et al., 2014; Theodore et al., 2008) studies have demonstrated that extracellular pathological forms of  $\alpha$ -synuclein can activate microglia cells and initiate the inflammatory process. However, the molecular pathways by which  $\alpha$ -synuclein induces microglial activation remain poorly defined.

In an attempt to dissect novel LRRK2-related molecular pathways in microglia, we performed an RNA sequencing (RNA-Seq) analysis of LRRK2 wild-type (WT) and knock-out (KO) cells under basal conditions or after stimulation with  $\alpha$ -synuclein pre-formed fibrils (PFFs) or with the more general inflammagen lipopolysaccharide (LPS). We found that, although LPS and  $\alpha$ -synuclein PFFs have overlapping effects on gene expression,  $\alpha$ -synuclein PFFs additionally induce a specific microglial response associated with oxidative stress. Specifically, we found that treatment with  $\alpha$ -synuclein PFFs causes a significant induction of the antioxidant superoxide dismutase-2 (SOD2) enzyme in WT cells, which effect is attenuated in LRRK2 KO microglia cells. Thus, starting from an unbiased RNA-Seq approach, we reveal that  $\alpha$ -synuclein PFFs activate oxidative stress-associated signaling and that LRRK2 positively contributes to this microglial process.

## 2. Materials and methods

### 2.1. Animals and primary microglia cultures

All animal procedures were carried out in strict accordance with the recommendations issued in the guidelines for the Care and Use of Laboratory Animals of the National Institutes of Health (NIH) for animals housed at NIH and for the European Community Council Directive 2010/63/UE for animals housed at University of Padova. The protocols were approved by the Institutional Animal Care and Use Committees of the US National Institute on Aging (Approval number 463-LNG-2018) and by Ethics Committee of the University of Padova (Project ID: 1041/2016-PR), respectively. Primary microglia were derived from postnatal days 1–4 (P1–4) LRRK2 WT and KO mice as recently described (Russo et al., 2015). We used two different LRRK2 KO mice, both bred to be congenic on a C57Bl6/J background. LRRK2 exon-2 KO mice (Parisiadou et al., 2009) were used for the initial RNA-Seq experiment, for technical validation experiments and to confirm time course data at the mRNA level. Additionally, LRRK2 exon-41 KO mice (Hinkle et al., 2012) were used to further validate time course data at protein level and differences between genotypes.

### 2.2. Inflammatory stimuli and cell treatments

Human  $\alpha$ -synuclein PFFs were generated from recombinant  $\alpha$ -synuclein produced by a lipid A mutant of *Escherichia coli*, BL21(DE3)

with decreased endotoxin production as described (Russo et al., 2015). After purification,  $\alpha$ -synuclein was incubated for 15 days to induce aggregation.  $\alpha$ -Synuclein fibrils were then quantified in terms of monomer concentration. Specifically, the equivalent monomer concentration in the fibrils preparation was calculated by the difference between the starting monomer concentration and the residual supernatant monomer concentration after fibrillation. Successively, microglia were treated with 25  $\mu$ M  $\alpha$ -synuclein PFFs or LPS from *Escherichia coli* O111:B4 at 100 ng/ml (Sigma-Aldrich, L4391), both resuspended in phosphate-buffered saline (PBS). During treatments, primary microglia cells were cultured in medium containing 1% FBS.

To perform RNA-Seq, microglia cells were maintained for 8 h with  $\alpha$ -synuclein PFFs or 1 h with LPS treatment. This difference of timing is based on the different ability of the two stimuli to induce inflammation, as prior data shows that microglia treated with  $\alpha$ -synuclein PFFs exhibited a delayed inflammatory response compared with cells treated with LPS priming (Russo et al., 2015). Treatments and genotypes were randomized across batches of primary cell preparations. For additional validation, time course experiments were performed where cells were treated for 0, 1, 4, 8 and 16 h (for mRNA analysis) and 0, 8 and 16 h (for protein analysis) with  $\alpha$ -synuclein PFFs or LPS.

### 2.3. RNA extraction and sequencing

RNA extraction was performed as described (Russo et al., 2015). RNA quality was measured using a Agilent 2100 Bioanalyzer RNA 6000 Nano Chip (Agilent) and samples had a mean RNA integrity number of 9.0 (Supplementary Table 1). We purified rRNA depleted RNA starting from 1  $\mu$ g total RNA, then synthesized cDNA libraries using TruSeq stranded Total RNA library prep kit (Illumina, RS-122-9008) following manufacturer's instructions ([https://support.illumina.com/content/dam/illumina-support/documents/documentation/chemistry\\_documentation/samplepreps\\_truseq/truseqstrandedtotalrna/truseq-stranded-total-rna-sample-prep-ls-euc-ltf-15031060-e.pdf](https://support.illumina.com/content/dam/illumina-support/documents/documentation/chemistry_documentation/samplepreps_truseq/truseqstrandedtotalrna/truseq-stranded-total-rna-sample-prep-ls-euc-ltf-15031060-e.pdf)). Before sequencing, cDNA libraries were quantified by digital-PCR using a ddPCR Library quantification kit (Biorad). Subsequently, cDNA libraries were multiplexed with 4 samples per pool and 7pM of each pool hybridized to a flow cell following cluster generation using an Illumina cluster station. Libraries were sequenced on Illumina HiSeq2500 (Illumina) to generate ~35 million of 100-bp single end reads per library (Supplementary Table 1).

### 2.4. Statistical analysis of gene expression

RNA-Seq reads were aligned to the mouse reference genome (mm10) using STAR (Dobin et al., 2013) and expression counts per transcript quantified using eXpress (Roberts and Pachter, 2013). Preliminary inspection of the data identified expression of the astrocyte marker GFAP, likely due to small numbers of contaminating astrocytes in the microglial preparations. We therefore used population specific expression analysis [PSEA - (Kuhn et al., 2012)] to estimate the proportions of astrocytes per sample. From the raw counts per transcript, we used DESEQ2 (Love et al., 2014) to normalize data and estimate differential expression between groups using the generalized linear model:

$$\text{Transcript Expression} \sim \text{group} + \text{shake} + \text{Pday} + \text{Astrocyte}$$

where group represent the combined experimental variables of genotype and treatment while the remaining terms are technical variables describing the batch of cells used (shake), postnatal day of the animals in that batch (Pday) and the proportion of contaminating astrocytes from the PSEA analysis. We generated a table containing contrasts for all levels of group, ie for each treatment in each genotype, then filtered out any genes that showed significant (uncorrected  $p < .05$ ) association with Astrocytes.

## 2.5. Gene expression validation by qRT-PCR

We synthesized cDNA from Trizol-extracted RNA using the SuperScript III First-Strand Synthesis System (Invitrogen). To analyze cDNA expression of the RNA-Seq top hits, we used the Applied Biosystems 7900HT Real-time PCR system with TaqMan probes and fast advanced master mix (Applied Biosystems) following the manufacturer's instructions. We used the following probes: *Lrrk2* (ID: Mm01304127\_g1), *Il-1 $\beta$*  (ID: Mm00434228\_m1), *Sod2* (ID: Mm01313000\_m1), *C5ar2* (ID: Mm01267981\_s1), *H2-M2* (ID: Mm01279077\_g1), *Irg1* (ID: Mm01224532\_m1), *Txnip* (ID: Mm01265659\_g1) and *NFKB1* (ID: Mm00600522\_m1). We used *Ppid* (ID: Mm00835365\_g1) as a reference gene for genes with low expression and *Gapdh* (ID: 99999915\_g1) as a reference for genes with high expression.

## 2.6. Protein validation using immunoblotting

Cells were washed with PBS and solubilized with lysis buffer (20 mM Tris-HCl pH 7.5, 150 mM NaCl, 1 mM EDTA, 2.5 mM sodium pyrophosphate, 1 mM  $\beta$ -glycerophosphate, 1 mM  $\text{Na}_3\text{VO}_4$ ) supplemented with 1% triton X-100 (Sigma Aldrich) and protease inhibitor cocktail (Sigma Aldrich), and then cleared at 14000 g at 4 °C for 30 min. Protein concentrations were determined using the BCA protein concentration assay as manufacturer's instructions (Thermo Scientific). Subsequently, proteins were separated by electrophoresis onto 4–20% SDS-PAGE gels and then transferred onto Immobilon-P membrane. Membranes were incubated 1 h at room temperature (RT) with the following antibodies: rabbit anti-SOD2 (1:20000, Prestige Sigma Aldrich), goat anti-IL-1 $\beta$  (1:2000, R&D system), rabbit anti-phospho Ser935 LRRK2 (1:300, Abcam), rabbit-anti total LRRK2 (1:300, Abcam) and mouse anti-GAPDH (1:20000, Prestige Sigma Aldrich). Subsequently, membranes were incubated 1 h at RT with HRP-conjugated secondary antibodies (Sigma Aldrich) and finally incubated with ECL western blot substrate (GE Healthcare).

## 2.7. Mouse cytokine screen (16-plex)

Cytokines released into the supernatant of primary microglia were analyzed according to manufacturer's instructions by Q-Plex Mouse Cytokine screen (Quansys), measuring IL-1 $\alpha$ , IL-1 $\beta$ , IL-2, IL-3, IL-4, IL-5, IL-6, IL-10, IL-12p70, IL-17, MCP-1, IFN $\gamma$ , TNF $\alpha$ , MIP-1 $\alpha$ , GM-CSF, RANTES by quantitative ELISA-based chemiluminescent assay.

## 2.8. Statistical analysis of validation data

All quantitative data are expressed as mean  $\pm$  SEM and represent at least three independent sets of experiments. Statistical significance was assessed using two-way ANOVA followed by Bonferroni's post-hoc test for the comparison of the two variables (genotype and treatment) and by one-way ANOVA followed Tukey's post-hoc test for comparison of multiple groups in the time course experiments. Data were analyzed using Prism (GraphPad) and the statistical significance was taken at  $p < .05$ .

## 2.9. Stereotaxic surgery for LPS stimulation in vivo

All experimental procedures performed were approved by the NIH/NIA Animal Care & Use Committee. Cx3r-GFP mice [<https://www.ncbi.nlm.nih.gov/pubmed/10805752>] on a C57BL6/J background were housed in standardized conditions at 2–5 animals per cage and with ad libitum access to food and water on a 12h light-dark cycle. For LPS stimulation by stereotaxic injection, 6-month old mice were initially anesthetized by 5% isoflurane and kept under anesthesia using 1–2% isoflurane. The tooth bar was adjusted to  $-5.0$  mm. Mice were placed into a stereotaxic frame and eyes were covered with ointment. The top

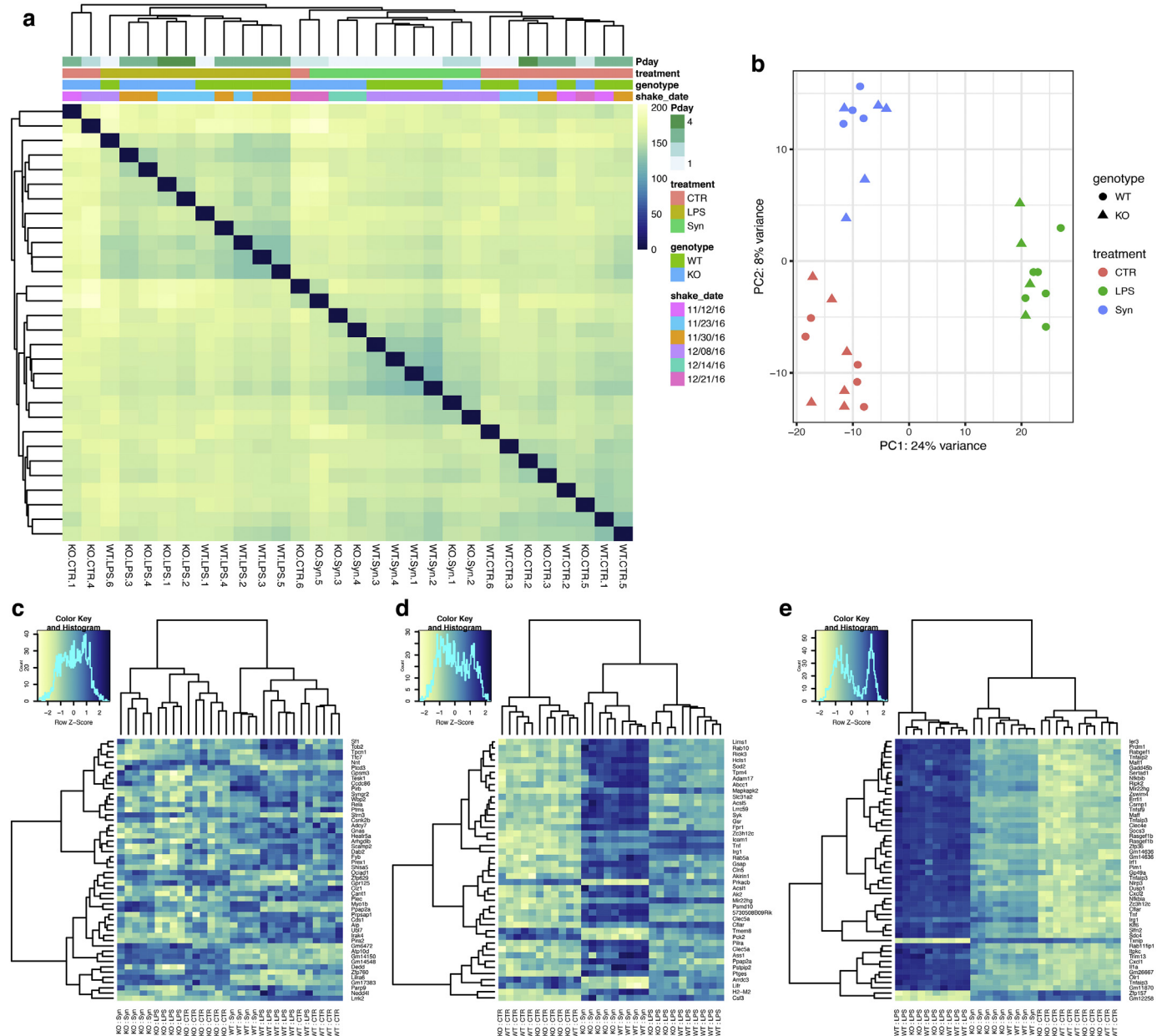
of the head was shaved and sterilized using 70% Ethanol. An incision was made above the midline and skull was exposed using cotton tips. At anteroposterior  $+0.2$  mm, mediolateral  $\pm 2.0$  mm from bregma (bilateral injection), a hole was drilled into the skull and the last thin layer was removed using a forceps to not damage the dura. A pulled glass capillary (blunt) attached to a 5  $\mu$ l Hamilton syringe was used for injection. First, an air bubble of 1  $\mu$ l was pulled in followed by 1  $\mu$ l of either PBS or 5 mg/ml LPS solution. The capillary was lowered to dorsoventral  $-3.2$  mm from bregma into the dorsal striatum. The solution was delivered at a rate of 0.1  $\mu$ l per 10sec. After the injection, the capillary was held in place for 2 min, retracted 0.1  $\mu$ m and another 1 min was waited before it was slowly withdrawn from the brain. The head wound was closed using surgical staples. Ketoprofen solution at 5 mg/kg was administered subcutaneously as analgesic treatment for the following 3 days.

## 3. Histology

Animals were sacrificed 3 days after surgery. Mice were deeply anesthetized with an intraperitoneal injection of 200  $\mu$ l of 10% ketamine and the thoracic cavity was opened to expose the heart. Blood was flushed out using 10 ml of 0.9% NaCl for 2 min. Brains were removed, the left hemisphere was used for single-cell RNA-Seq (scRNA-Seq) and the right hemisphere was fixed in 4% PFA for 48 h. After 2 days, brains were transferred to 30% sucrose solution for cryoprotection and sectioning was started once brains had sunk to the bottom. The brains were then cut into 30  $\mu$ m thick coronal sections - 6 series - and stored in antifreeze solution (0.5 M phosphate buffer, 30% glycerol, 30% ethylene glycol) at  $-20$  °C until further processed. Sections were washed with PBS, mounted on glass slides and coverslips applied using Prolong Gold Antifade mounting media (Invitrogen). GFP expressing microglia were imaged using a Zeiss microscope.

### 3.1. Acutely isolated adult brain microglia and single cell RNA-sequencing

Immediately following perfusion, brains were quickly dissected and placed in ice-cold Hank's balanced salt solution (HBSS) then dissociated using the Adult Brain Dissociation kit (Miltenyi Biotech, Cat#130-107-677), which combines gentle mechanical and enzymatic degradation, following by demyelination with Debris Removal Solution according to manufacturer's recommendation. The cell suspensions were labelled with CD11b microbeads (Miltenyi Biotech, Cat#130-093-634) and loaded onto MACS columns (cat#130-042-201). CD11b $^+$  were enriched and eluted as the positively selected cell fraction using MACS separator. Single cell suspension generated from the half-brain sample were then subjected to scRNA-Seq using a 10 $\times$  genomics Chromium analyzer at the NCI single cell analysis facility, Bethesda MD. The standard 10 $\times$  genomics pipeline was used to align reads to the *Mus musculus* Genome Reference Consortium Build 38 (mm10). Output from the 10 $\times$  genomics platform was analyzed using the R package Seurat (version 3, PMIDS: [26000488](https://pubmed.ncbi.nlm.nih.gov/26000488/), [29608179](https://pubmed.ncbi.nlm.nih.gov/29608179/)). Briefly, single cell data from PBS or LPS treated animals were combined into a single Seurat object and filtered for cells that had  $> 800$  but  $< 6000$  features and had  $< 0.1\%$  of reads mapped to the mitochondrial genome. After log-normalization and scaling, data were reduced using the first 50 principal components then cells were mapped to two-dimensional space using t-distributed stochastic neighbor embedding (tSNE). We removed any cells that were positive for Mrc1 (macrophages; approximately 9.6% of all cells), Cldn5 (endothelial cells;  $\sim 1.2\%$  of all cells) or Aqp4 (astrocytes;  $\sim 1.2\%$  of all cells). We then re-clustered the remaining presumptive microglia and identified seven clusters of cells, with 705 cells from PBS-treated animals and 3005 cells from LPS stimulated animals. We used levels of the pro-inflammatory cytokine gene IL-1 $\beta$  to assign clusters to different levels of activation and visualized gene expression within Seurat.



**Fig. 1.** RNA-Seq profiling of WT and LRRK2 KO microglia after inflammatory stimulation. (a) Hierarchical clustering and heatmap of all samples used in this study. Colors in the heatmap represent the Euclidean distance between samples in a pairwise manner, scaled as shown on the upper right yellow-blue scale. Above the heatmap is a color representation of the model variables, which included two technical variables (Pday, for postnatal day of the pups and shake-Date for the date when the microglia were isolated from initial mixed glia cultures), and two biological variables, treatment and genotype. Note that samples separate largely by treatment and to a lesser extent by genotype. CTR = control, untreated cells. (b) First two principal components of the same data as in (a) confirms separation of the three treatment groups (colors) but less efficient separation by genotype (shapes). (c-e) Heatmaps for the top 50 most statistically significant genes associated with genotype (c) or treatments with  $\alpha$ -synuclein PFFs (d) or LPS (e). Each gene on the right side of each heatmap is colored by Z (normalized standard deviations from the mean) for expression relative to the overall mean expression for that gene and samples are listed below each heatmap. (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

## 4. Results

### 4.1. Differential gene expression after inflammatory treatments

To dissect LRRK2 related molecular pathways in microglia, we used RNA-Seq to generate a high-resolution transcriptome profile of LRRK2 WT and KO microglia cells that were either untreated or treated with  $\alpha$ -synuclein PFFs. Additionally, to determine whether such responses were specific to  $\alpha$ -synuclein, we used LPS as a more general inflammatory stimulus. We confirmed that fibrils preparation was free of bacteria endotoxin contamination derived from  $\alpha$ -synuclein

purification by analysis of IL-1 $\beta$  protein in primary microglia treated with vehicle PBS,  $\alpha$ -synuclein monomer and PFFs at 25  $\mu$ M for 24 h (Supplementary Fig. 1).

We obtained a high-quality RNA-Seq dataset, with an average of 30,902,421 uniquely mapped reads (range 22,388,606-44,910,295) per sample (Supplementary Table 1). Hierarchical clustering of the aligned and normalized read counts indicated that the three treatments (control, LPS and  $\alpha$ -synuclein PFFs) separated the samples whereas genotype had a subtler effect on overall gene expression (Fig. 1a). Similarly, the first principal component of the overall gene expression profile separated LPS from the other two treatment groups while the second



principal component separated  $\alpha$ -synuclein PFFs from controls (Fig. 1b). These results demonstrate that both  $\alpha$ -synuclein PFFs and LPS induce gene expression responses but that these differ from each other.

We therefore looked next at differential gene expression that would reflect the three major experimental manipulations in the model, namely genotype (Fig. 1c) and treatments with  $\alpha$ -synuclein PFFs (Fig. 1d) or LPS (Fig. 1e). While the latter two groupings provided clear separation between all three treatment groups, the effect of genotype was subtle, although, as expected, LRRK2 was recovered as differentially expressed. However, we noted that within treatment groups, gene expression separated out by genotype (Fig. 1d, e). This data suggests that while *Lrrk2* genetic deletion has only a subtle influence on basal gene expression, it might have measurable effects on inflammatory responses.

#### 4.2. Gene ontology analysis of differentially expressed genes between *Lrrk2* genotype and inflammagen treatments

To gain insights into the molecular mechanisms and pathways associated with gene expression responses we performed gene ontology enrichment for genes that were significantly differentially expressed (adjusted  $p < .05$  and 2-fold difference) for each factor in the model (Fig. 2). For genotype (Fig. 2a), the most enriched categories included GO:0031982 for the GO term “vesicle” ( $p = 2.96 \times 10^{-5}$ ). Other terms in this enrichment included extracellular exosomes (GO:0070062,  $p = 3.7 \times 10^{-4}$ ) and regulation of response to stimulus (GO:0048583,  $p = 5.5 \times 10^{-4}$ ). The enrichment of this set of genes demonstrates that while *Lrrk2* deficiency overall has generally modest effects on gene expression, there are subtle differences between genotypes that likely reflect the known biology of LRRK2 in relation to the endo-lysosomal system [reviewed in (Roosen and Cookson, 2016)].

Similar analyses for  $\alpha$ -synuclein PFFs (Fig. 2b) or LPS (Fig. 2c) in WT cells showed, as expected, a number of responses related to inflammation. Intriguingly, although the responses to each inflammagen overlapped, each set had unique elements, with LPS having many more identified GO categories (Fig. 2d). Specifically, LPS exposure resulted in alterations of categories including GO:0051171 “regulation of nitrogen compound metabolic process” ( $p = 3.56 \times 10^{-16}$ ) that contained the Thioredoxin Interacting Protein (Txnip), which is known to regulate metabolism and ER stress. Conversely, the GO:200037 category “regulation of reactive oxygen species metabolic process” was present in the  $\alpha$ -synuclein PFFs-exposed cells ( $p = .000359$ ) but not in the LPS-exposed cells and included the mitochondrial dismutase *Sod2*. The separation of GO categories between LPS and  $\alpha$ -synuclein PFFs (Fig. 2b-d) combined with the overall separation of gene expression between treatments (Fig. 1), suggest that exposure to LPS or  $\alpha$ -synuclein PFFs induce distinct and specific effects on gene expression.

We also examined how genotype affected pathways of gene expression identified by GO profiling. Plotting the number of significant GO terms by genotype showed that KO cells, had a greater number of identified GO terms than WT after exposure to  $\alpha$ -synuclein PFFs (Fig. 2e) but that LPS evoked similar pathways in both genotypes (Fig. 2f). To understand what might drive the differences in GO categorization, we plotted the density of overlap size (ie the number of differentially expressed genes in the dataset assigned to each GO category) for shared GO terms vs GO terms recovered only in WT or KO cells. We found that distribution of overlap size for differentially expressed genes after  $\alpha$ -synuclein exposure showed a peak at lower overlap size in KO cells compared to WT (Supplementary Fig. 2a, b), indicating that although KO cells have more GO categories they tend to have fewer genes in each category. To explore possible reasons for this difference, we looked at subsets of GO terms in the WT and KO cells. We noted that genes regulated by the transcription factors c-Rel and NF $\kappa$ B, both associated with inflammation, were enriched in WT cells but not in KO cells (Supplementary Fig. 2c). This data suggests that regulation of transcription may be influenced by LRRK2 upstream of NF- $\kappa$ B and other

transcription factors.

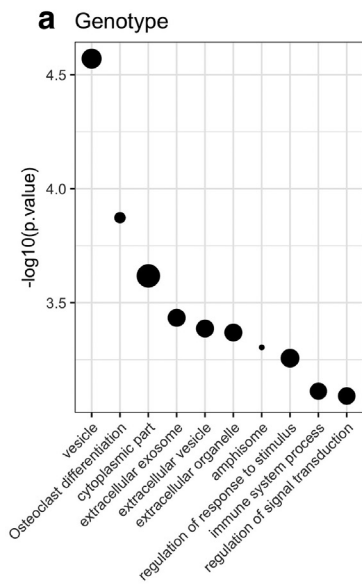
#### 4.3. Validation of differential gene expression

We next performed technical validation of our RNA-Seq data set using qRT-PCR. First, we confirmed that LRRK2 expression was, as expected, significantly lower in the KO animals compared to WT (Fig. 3a). Moreover, we measured the expression levels of *IL-1 $\beta$* , a pro-inflammatory cytokine, whose expression we recently reported to be increased after 90 min of LPS treatment and attenuated in LRRK2 KO microglia cells isolated from *Lrrk2* exon-41 KO mice (Russo et al., 2015). In agreement with our previous work, we confirmed that *IL-1 $\beta$*  was also increased by LPS treatment and lower in microglia from exon-2 KO animals as used in the current study (Fig. 3b). These data validate the cells used here and suggest that responses to LPS are conserved across two different KO models and, therefore, are due to *Lrrk2* deficiency.

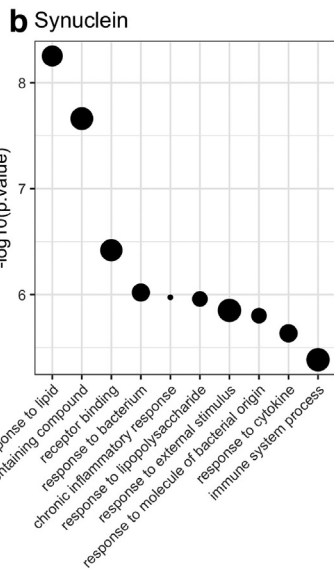
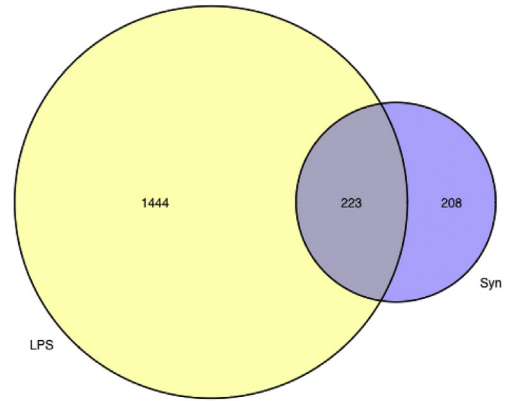
We next attempted to validate a set of genes that showed a range of expression levels with an enrichment for genotype or the two inflammatory stimuli with  $> 2$ -fold differential expression and adjusted  $p$  value  $< .05$  in the RNA-Seq dataset. For high expression genes, we selected *Txnip* (downregulated by LPS;  $p$  adjusted =  $3.6 \times 10^{-26}$  in WT cells and  $1.0 \times 10^{-26}$  in KO cells), *Sod2* (upregulated by LPS,  $p$  adjusted =  $1.64 \times 10^{-13}$ , and by  $\alpha$ -synuclein PFFs,  $p$  adjusted =  $4.35 \times 10^{-51}$ ), *Irg1* (upregulated by LPS,  $p$  adjusted =  $2.64 \times 10^{-24}$ , and by  $\alpha$ -synuclein PFFs,  $p$  adjusted =  $1.38 \times 10^{-15}$ ), and *NFKB1* (upregulated after LPS treatment,  $p$  adjusted =  $2.05 \times 10^{-41}$ ). We also selected a moderately expressed gene *Thbs1* (upregulated by LPS,  $p$  adjusted =  $2.66 \times 10^{-6}$ ) and two low expression genes, *C5ar2* (lower in *Lrrk2* KO cells after  $\alpha$ -synuclein treatment,  $p = .0262$ ) and *H2-M2* (upregulated by  $\alpha$ -synuclein PFFs,  $p$  adjusted =  $3.0 \times 10^{-12}$ ). We selected two reference genes that displayed low variance and were not differentially expressed between groups, *Ppid* for low and moderately expressed genes and *Gapdh* for highly expressed genes. Six out of the seven genes we assayed (*Sod2*, *C5ar2*, *H2-M2*, *Irg1*, *Txnip* and *NFKB1*) were detected by qRT-PCR in the identical pattern as determined by RNA-Seq (Fig. 3c-h). However, although we replicated that the mean expression of *Thbs1* was higher after LPS exposure, consistent with the direction of effect in the RNA-Seq experiment, the differences were not statistically significant (Fig. 3i), resulting in an overall validation rate of 86%.

#### 4.4. Biological validation and timecourse of microglial responses to $\alpha$ -synuclein PFFs

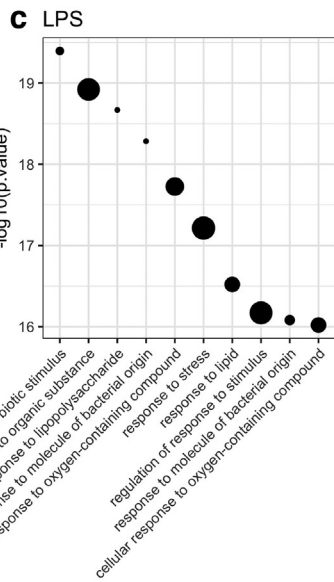
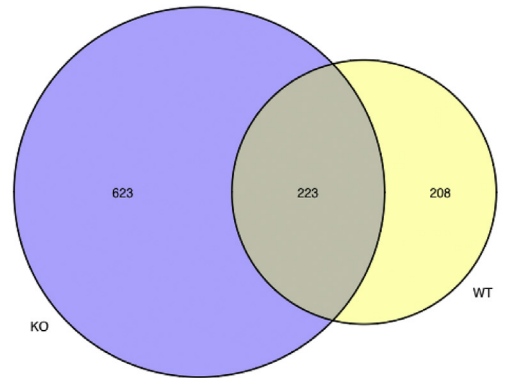
As discussed above, LPS and  $\alpha$ -synuclein PFFs induce overlapping as well as distinct effects on gene expression profile of WT microglia cells. However, in order to maximize the responses to each inflammagen, we used different timepoints for LPS and  $\alpha$ -synuclein PFFs. To establish whether the observed differences in gene expression between LPS and  $\alpha$ -synuclein PFFs were dependent on the differential time of treatments used for the RNA-Seq experiment (LPS 1 h and  $\alpha$ -synuclein PFFs 8 h), we performed a timecourse experiment where microglia cells were treated for 0, 1, 4, 8 and 16 h with  $\alpha$ -synuclein PFFs or LPS. Complementary ELISA experiments confirmed that LPS and  $\alpha$ -synuclein PFFs mediate a differential and specific inflammatory response as shown by the profile of activated cytokines secreted after treatment with the two inflammagens (Supplementary Fig. 3). We then analyzed mitochondrial antioxidant SOD2, one of the most differentially expressed genes in WT cells in response to  $\alpha$ -synuclein PFFs (2.5-fold, adjusted  $p = 4.3 \times 10^{-51}$ ). We found that  $\alpha$ -synuclein PFFs trigger a robust induction of SOD2 mRNA starting at 1 h, which continues to significantly increase at 8 h and 16 h of treatment compared with untreated cells (Fig. 4a; 35-fold at 8 h vs. control,  $***p < 0,001$ , to 60-fold at 16 h vs. control,  $***p < 0,001$ ; 1,7-fold 8 h vs. 16 h,  $\#p < 0,05$ ). As expected, LPS also induce an increase in SOD2 mRNA



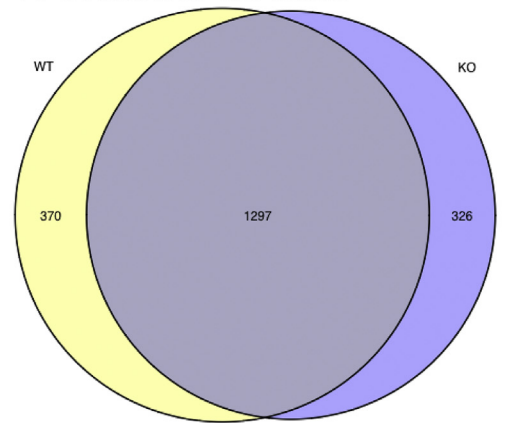
**d WT cells: number GO terms**



**e Synuclein: number GO terms**

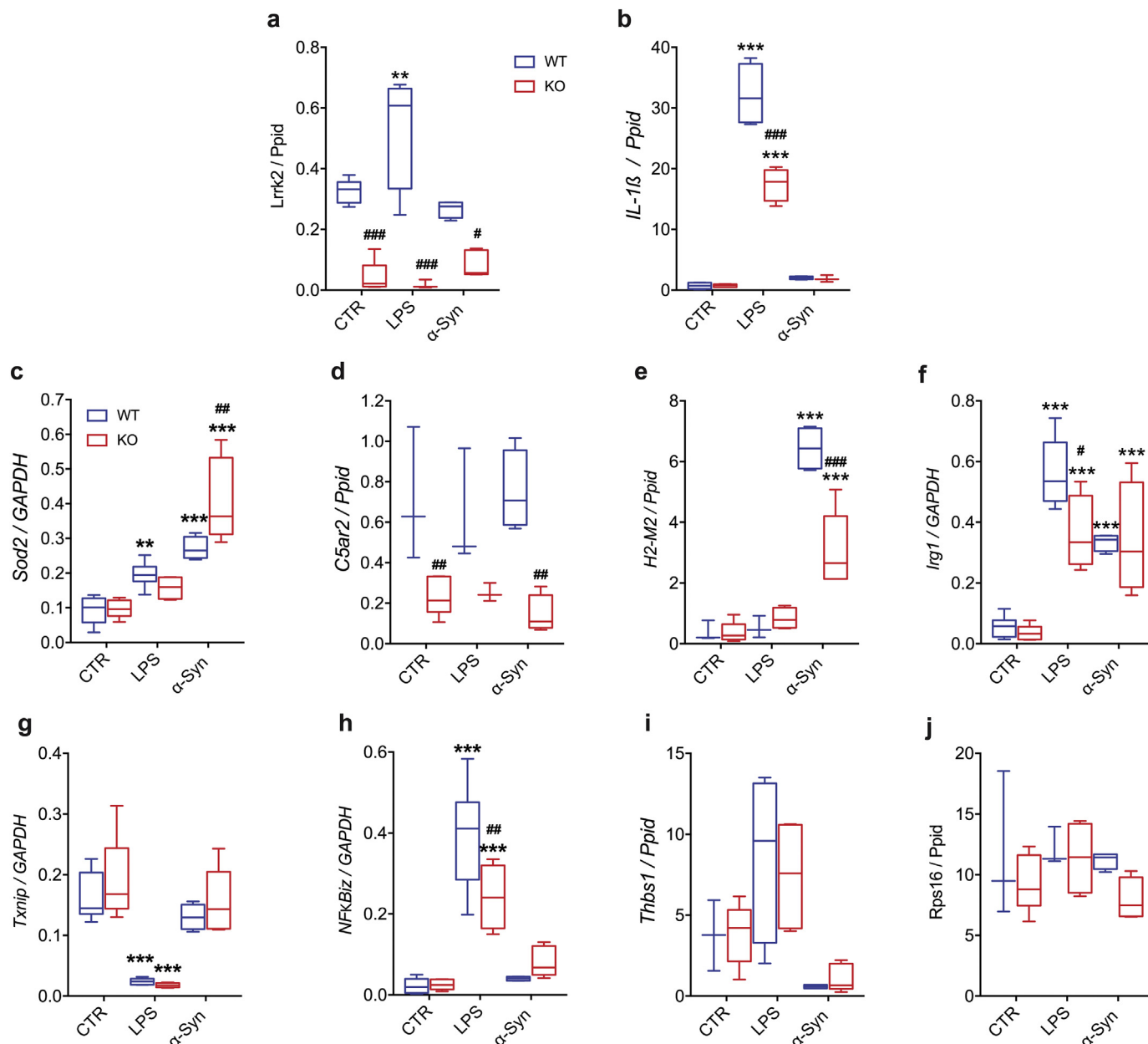


**f LPS: number GO terms**



(caption on next page)

**Fig. 2.** Gene ontology (GO) categorization of differentially expressed genes between LRRK2 genotype and inflammagen treatments. (a-c) Plots of significant GO terms associated with LRRK2 genotype in untreated cells (a) or after exposure to  $\alpha$ -synuclein PFFs (b) or LPS (c) in wild type cells. For each plot, the top 10 GO categories by  $p$ -value are shown with  $-\log_{10}$  adjusted  $p$  on the y axes and GO term.id on the x axes. Each point is scaled to overlap size, ie the number of genes in the dataset also found in a given GO category. (d-f) Euler diagrams showing numbers of significant ( $p$  adjusted < 0.05) GO terms in comparing the two treatments in WT cells (d) or treatments with  $\alpha$ -synuclein PFFs (e) or LPS (f) in the two genotypes.

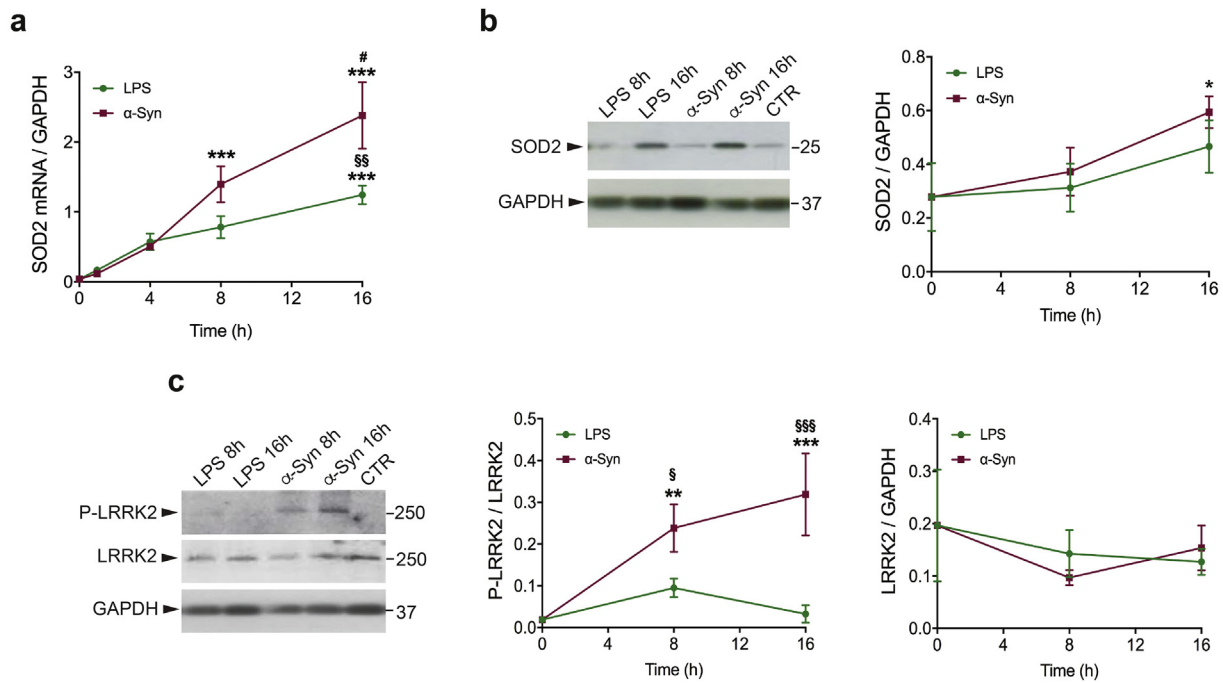


**Fig. 3.** Technical validation of RNA-Seq top hits. Quantification of relative gene expression of the RNA-Seq top hits in LRRK2 WT and KO microglia cells (generated from *Lrrk2*-exon 2 KO mice) unstimulated and stimulated with  $\alpha$ -synuclein PFFs or LPS priming. *Ppid* was used as reference gene for lowly and moderately- expressed genes, while *GAPDH* for highly expressed genes. The results are expressed as the mean  $\pm$  SE (WT-CTR  $n = 4$ , WT-LPS  $n = 5$ , WT- $\alpha$ -synuclein  $n = 4$ , KO-CTR  $n = 5$ , KO-LPS  $n = 4$  and KO- $\alpha$ -synuclein  $n = 5$ ). Data were analyzed using two-way ANOVA followed by Bonferroni's post-hoc test.  $**p < .01$  and  $***p < .001$ , LPS or  $\alpha$ -synuclein treated vs. untreated cells (for both genotypes);  $*p < .05$ ,  $**p < .01$  and  $***p < .001$ , WT vs. *Lrrk2* KO cells (for untreated, LPS and  $\alpha$ -synuclein treated cells).

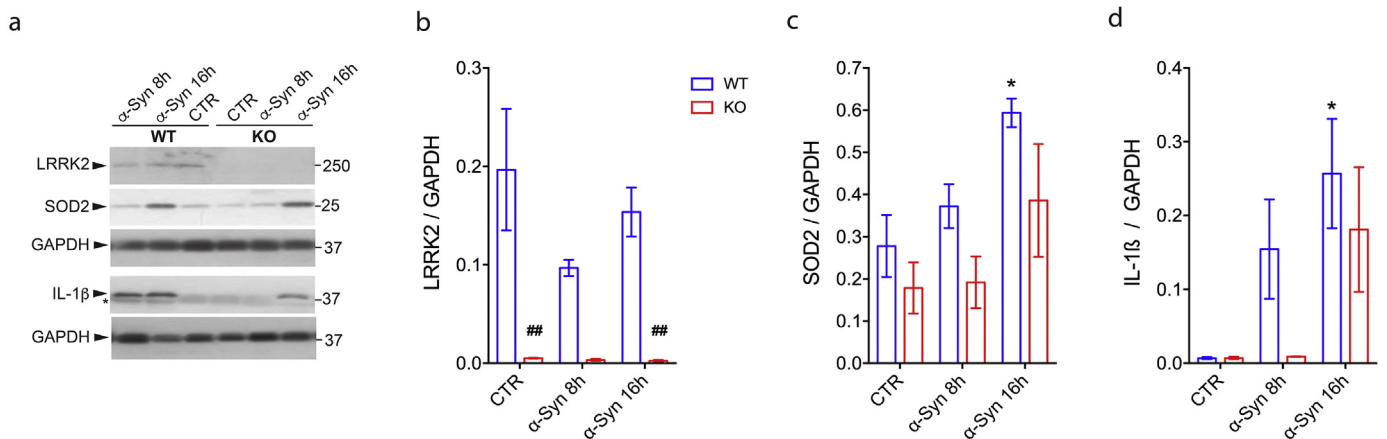
at 16 h of treatment (31-fold at 16 h vs. control,  $***p < 0,001$ ), however, its levels are half of the amount expressed by microglia in response to  $\alpha$ -synuclein PFFs ( $\sim 2$ -fold  $\alpha$ -synuclein PFFs vs. LPS at 16 h,  $^{ss}p < 0,01$ ). These data therefore confirm that there are quantitative differences in gene expression between cells exposed to LPS or  $\alpha$ -synuclein PFFs.

To further validate  $\alpha$ -synuclein PFFs -mediated SOD2 induction, we

investigated whether the changes in SOD2 mRNA expression had an impact also on protein levels. To this end, we performed a timecourse experiment where microglia were treated for 0, 8 and 16 h with  $\alpha$ -synuclein PFFs or LPS (Fig. 4b). We found that although both inflammatory insults induce an increase in SOD2 at the protein level, the increase was higher with  $\alpha$ -synuclein PFFs ( $\sim 2$ -fold  $\alpha$ -synuclein PFFs 16 h vs. control,  $*p < .05$ ).



**Fig. 4.** Timecourse of microglial responses to  $\alpha$ -synuclein PFFs. (a) *SOD2* mRNA analysis of WT microglia cells treated for 0, 1, 4, 8 and 16 h with  $\alpha$ -synuclein PFFs or LPS priming using qRT-PCR. *GAPDH* was used as reference gene. The results are expressed as the mean  $\pm$  SE (0 h  $n = 8$ , LPS 1 h  $n = 5$ , LPS 4 h  $n = 5$ , LPS 8 h  $n = 5$ , LPS 16 h  $n = 4$ ,  $\alpha$ -synuclein 1 h  $n = 5$ ,  $\alpha$ -synuclein 4 h  $n = 5$ ,  $\alpha$ -synuclein 8 h  $n = 5$ ,  $\alpha$ -synuclein 16 h  $n = 4$ ). Data were analyzed using one-way ANOVA followed by Tukey's post-hoc test.  $***p < .001$ , LPS or  $\alpha$ -synuclein treated (8 h, 16 h) vs. untreated cells (0 h).  $\#p < .05$ ,  $\alpha$ -synuclein 16 h vs.  $\alpha$ -synuclein 8 h;  $^{ss}p < .01$ , LPS treated vs.  $\alpha$ -synuclein treated cells. (b) *SOD2* protein expression of WT microglia cells treated for 0, 8 and 16 h with  $\alpha$ -synuclein PFFs or LPS priming. *GAPDH* was used as reference gene. The results are expressed as the mean  $\pm$  SE ( $n = 3$  per each group). Data were analyzed using one-way ANOVA followed by Tukey's post-hoc test.  $*p < .05$ ,  $\alpha$ -synuclein 16 h vs. untreated cells (0 h). (c) P-LRRK2 and LRRK2 protein expression of WT microglia cells treated for 0, 8 and 16 h with  $\alpha$ -synuclein or LPS priming. *GAPDH* was used as reference gene for LRRK2 expression. The results are expressed as the mean  $\pm$  SE ( $n = 3$  per each group). Data were analyzed using one-way ANOVA followed by Tukey's post-hoc test.  $**p < .01$  and  $***p < .001$ ,  $\alpha$ -synuclein treated vs. untreated cells (0 h).  $^sp < .05$  and  $^{sss}p < .001$ ,  $\alpha$ -synuclein treated vs. LPS treated cells.



**Fig. 5.** LRRK2 controls  $\alpha$ -synuclein PFFs-mediated *SOD2* induction. (a) LRRK2 WT and KO microglial lysates (generated from *Lrrk2*-exon 41 KO mice) treated for 0, 8 and 16 h with  $\alpha$ -synuclein PFFs were subjected to LRRK2, *SOD2*, IL-1 $\beta$  and *GAPDH* immunoblotting. Quantification of LRRK2 (b), *SOD2* (c) or IL-1 $\beta$  (d) is normalized for *GAPDH* protein. The results are expressed as the mean  $\pm$  SEM ( $n = 3$  per genotype/timepoint). Data were analyzed using two-way ANOVA followed by Bonferroni's post-hoc test.  $*p < .05$ ,  $\alpha$ -synuclein treated vs. untreated cells (0 h).  $^{##}p < .01$ , LRRK2 WT vs. KO cells (for untreated and  $\alpha$ -synuclein treated cells).

Since multiple studies showed that inflammatory stimuli result in increased LRRK2 Ser935 phosphorylation in microglia (Marker et al., 2012; Puccini et al., 2015; Schapansky et al., 2014), we investigated the effect of LPS and  $\alpha$ -synuclein PFFs on stimulating LRRK2 phosphorylation after 8 and 16 h of  $\alpha$ -synuclein PFFs or LPS treatment (Fig. 4c). Interestingly,  $\alpha$ -synuclein PFFs trigger a robust increase of pS935-LRRK2 at 8 h (12-fold, 8 h vs. control,  $**p < 0.01$ ) and 16 h of treatment compared to untreated cells (16-fold, 16 h vs. control,  $***p < 0.001$ ). Although LPS priming caused a mild increase of pS935-

LRRK2 after 8 h of treatment, the increase was not statistically significant. Moreover, LPS and  $\alpha$ -synuclein PFFs do not induce significant changes in LRRK2 total levels up to 16 h of treatment, (Fig. 4c), confirming our previous findings (Russo et al., 2015) although we note that other studies have seen an effect on total LRRK2 (Cook et al., 2017; Moehle et al., 2012). Overall, these results confirm the RNA-Seq data that  $\alpha$ -synuclein PFFs trigger a microglial response that is distinct from that induced by LPS.



#### 4.5. $\alpha$ -synuclein PFFs-mediated SOD2 induction is attenuated in LRRK2 KO microglia

Multiple studies using different experimental approaches and models support the hypothesis that LRRK2 is a key modulator of microglial-associated inflammation, although the detailed molecular mechanisms are unresolved (Kim et al., 2012; Ma et al., 2016; Marker et al., 2012; Moehle et al., 2012; Russo et al., 2018, 2015). Inflammation is strongly correlated with an oxidative stress response. Activated microglia secrete multiple toxic factors including IL-1 $\beta$ , tumor necrosis factor- $\alpha$  as well as ROS (Lull and Block, 2010). In our RNA-Seq data, we noted upregulation of the mitochondrial antioxidant SOD2. To validate this observation, we treated LRRK2 WT and KO microglia with  $\alpha$ -synuclein PFFs at 0, 8 and 16 h (Fig. 5). After confirmation of *Lrrk2* genetic deletion by immunoblotting in LRRK2 KO microglia cells (Fig. 5a, b), we analyzed SOD2 expression. While  $\alpha$ -synuclein PFFs induce a significant increase of SOD2 protein after 16 h treatment in WT cells (~2-fold at 16 h vs. control, \* $p$  < .05), the increment of SOD2 expression after 16 h of treatment in KO cells was not statistically significant, suggesting an attenuated response under *Lrrk2* deficiency (Fig. 5a, c). In the same experiment, we measured IL-1 $\beta$  levels and found that  $\alpha$ -synuclein PFFs cause an increment of IL-1 $\beta$  in WT cells (~38-fold, 16 h vs. control, \* $p$  < .05) but not in KO cells up to 16 h of treatment (Fig. 5a, d).

Taken together these data indicate a diminished responsiveness or might suggest a delayed response of LRRK2 KO microglia after an inflammatory stimulus compared to WT cells and reveal that LRRK2 contribute to  $\alpha$ -synuclein PFFs-mediated SOD2 induction.

#### 4.6. Additional validation of LPS-induced gene expression in microglia in vivo using scRNA-Seq

These results nominate several genes that are regulated by exposure to LPS or PFFs in cell culture, of which we were able to validate several at the protein level. However, it is uncertain as to whether gene expression changes seen in cell culture are also representative of similar effects in vivo. Given the highly heterogeneous cellular composition of the brain, we decided that we should use scRNA-Seq to examine some of the candidate genes found from cell culture, noting that some of these genes including *Sod2* are expressed in both microglia and many other cell types and might not be seen to be regulated by inflammatory stimuli in bulk tissue.

We chose to perform single intrastriatal injections of LPS, or PBS as a vehicle control, which after three days induced widespread activation of microglia including in the cerebral cortex, striatum and midbrain (Fig. 6a). After single step immunoseparation of cells using Cd11b and bioinformatic removal of cell profiles from non-microglial cells (see Materials and methods), tSNE embedding identified seven clusters of microglia (Fig. 6b), of which six were predominantly from LPS treated animals and one from PBS treated animals (Fig. 6c). We interpret the uneven number of cells in the two groups to be due to microglial proliferation in response to inflammagen stimulation. Using this dataset, we were able to validate the proposed increase in *Sod2* expression (Fig. 6d) and decrease in *Txnip* (Fig. 6e) in LPS-stimulated cells. Furthermore, examining IL-1 $\beta$  expression suggested that clustering of scRNA-Seq data represents levels of activation of microglia and using these categorizations, we were able to demonstrate that several additional genes nominated from the cell culture experiments including *Irg1*, *NFKB1z*, *Saa3* and *Cd83* also correlated with activation state (Fig. 6f). Collectively, these data suggest that we can validate at least a subset of gene expression changes with LPS nominated from cell culture experiments in vivo.

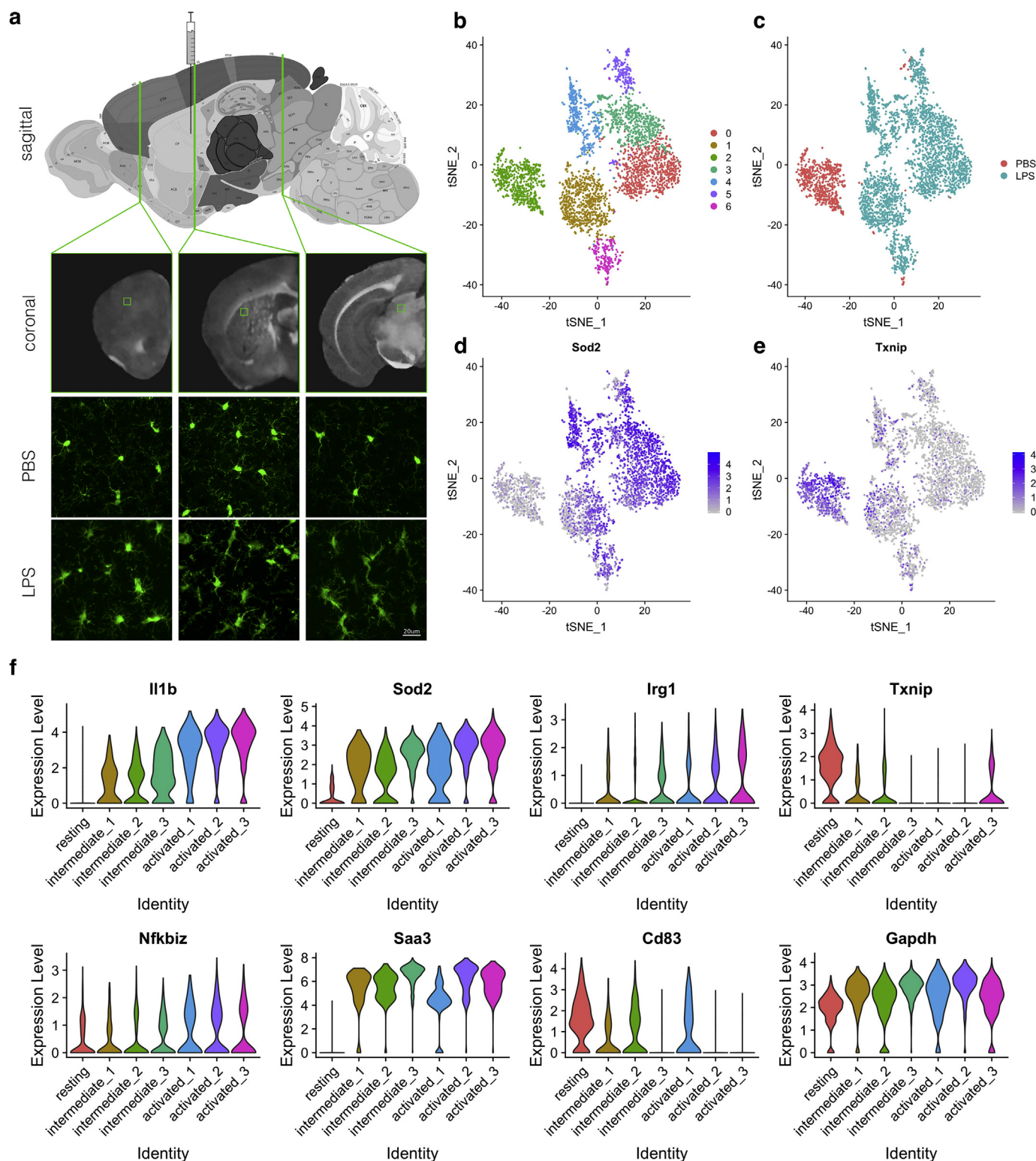
## 5. Discussion

Prior studies have emphasized a connection between LRRK2 activity

and the biology of microglia [reviewed in (Dzamko, 2017; Russo et al., 2014)]. Dissecting the LRRK2 role(s) in brain immune cells, both under resting and inflammatory conditions, is crucial to understand whether deregulated LRRK2 activity in these cells has an indirect and harmful impact on neuronal functions. Here, we analyzed the transcriptome profiles of LRRK2 WT and KO microglia either under basal conditions or after treatments with PD-related  $\alpha$ -synuclein PFFs or with LPS. We found that, although exposure to  $\alpha$ -synuclein PFFs or LPS mediate overlapping gene expression profiles in WT microglia, the microglial responses are also distinct. These observations are likely explained by the recruitment of specific receptors in response to the different inflammatory insults. While it is well-established that LPS activates microglia through the engagement of Toll-like receptor 4 (TLR4) (Lien et al., 2000), the receptors and/or mechanisms involved in responding to  $\alpha$ -synuclein aggregated forms are largely unknown. It is unclear whether there is a single specific receptor or multiple receptors with different functions and responses, and whether there are receptors specific for modified or aggregated forms of  $\alpha$ -synuclein. Multiple lines of evidence suggest that  $\alpha$ -synuclein might induce microglial-associated inflammation through phagocytosis (Hoffmann et al., 2016), receptor-mediated endocytosis (Lee et al., 2008) and/or ligand-receptor interaction including TLRs or scavenger receptors (Béraud and Maguire-Zeiss, 2012; Daniele et al., 2015). TLR1, 2 and 4 have been all proposed to mediate responses to  $\alpha$ -synuclein pathological forms both in vitro (Fellner et al., 2013; Kim et al., 2013; Roodveldt et al., 2013) and in vivo (Kim et al., 2013; Watson et al., 2012) as well as in *post-mortem* PD brains (Dzamko et al., 2017). In addition, Kim and colleagues proposed that TLR-ligand activity of  $\alpha$ -synuclein may be conformation-sensitive, showing that only oligomeric species can interact and activate microglial TLR2 (Kim et al., 2013). Mac-1 (Zhang et al., 2007) and CD36 (Su et al., 2008) scavenger receptors have also been proposed to be involved in  $\alpha$ -synuclein-mediated microglial activation, making the scenario even more complex. In this study, we found that, in addition to modulate the expression of a set of inflammatory genes also activated by LPS priming,  $\alpha$ -synuclein PFFs trigger specific molecular pathways that include complex and heterogeneous response that microglial cells undergo in response to this specific inflammagen. Of interest, analyses of GO pathways associated to microglial responses reveal that  $\alpha$ -synuclein PFFs alter specifically the “regulation of reactive oxygen species metabolic process” category, which includes the mitochondrial dismutase *Sod2*. We technically and biologically validated  $\alpha$ -synuclein PFFs-mediated SOD2 induction. We showed that SOD2 transcript and protein is increased after both  $\alpha$ -synuclein PFFs and LPS priming, but that levels are enhanced upon  $\alpha$ -synuclein PFFs, indicating that  $\alpha$ -synuclein PFFs mediate a microglial response with an higher oxidative stress component compared to LPS.

SOD2 plays a crucial role in clearing mitochondrial ROS and protecting cells against oxidative stress and damage. Mitochondrial SOD2 transforms toxic superoxide anion into hydrogen peroxide, which both at low doses are indispensable in many intracellular signaling, however, at high doses, especially superoxide anion, result in oxidative stress and cellular damage [reviewed in (Fukai and Ushio-Fukai, 2011)]. In this context, multiple studies highlight that pathological species of  $\alpha$ -synuclein are associated to increased oxidative stress [reviewed in (Dias et al., 2013; Roberts and Brown, 2015)]. It has been reported that  $\alpha$ -synuclein toxic species may disturb mitochondrial respiration and/or uncouple oxidative phosphorylation leading to accumulation of ROS [reviewed in (Nakamura, 2013)]. In addition to mitochondrial stress,  $\alpha$ -synuclein aggregates have been correlated even to cytosolic ROS generated by NADPH enzyme (Cremades et al., 2012). Overall, these observations suggest that microglia cells in response to  $\alpha$ -synuclein PFFs exhibit an alteration of ROS-related pathways and may recruit antioxidant enzymes including SOD2 to protect the cell against oxidative stress and damage.

Intriguingly, we found that LRRK2 KO microglia cells displayed attenuated induction of mitochondrial SOD2 in response to  $\alpha$ -synuclein



**Fig. 6.** Validation of cell culture gene expression changes in vivo. (a) Schematic of the experimental paradigm. Upper panel shows a map of the adult mouse brain (<http://atlas.brain-map.org/atlas?atlas=2#atlas=2&plate=100883770&structure=343&x=7800.011737530048&y=4023.96733210637&zoom=-3&resolution=16.11&z=5>) with the position of the needle used to inject PBS or LPS into the striatum indicated. Lower panels show fluorescent images from coronal sections of Cx3Cr1-GFP mice at the indicated levels of the brain which are, from left to right, the frontal portion of the cerebral cortex, the striatum and the midbrain. In PBS-treated animals, microglia had a fine branched morphology whereas after LPS injection, ramified microglia with thicker processes were seen throughout the brain. There was also an apparent increase in the number of Cx3Cr1-GFP positive cells. Scale bar indicates 20  $\mu$ m. (b-e) t-Distributed stochastic neighbor embedded (tSNE) visualization of scRNA-Seq analysis from mouse brain. In each plot, each point is a single cell plotted in two tSNE dimensions and colored by clusters ordered by cells in each cluster (b) or by whether each cell came from a PBS or LPS-treated animal (c). Additionally, scaled expression for two nominated differentially expressed genes, *Sod2* (d) and *Txnip* (e) that were up- and down- regulated respectively. Scales on the right of each graph are log2 normalized and scaled gene expression. (f) Violin plots of gene expression in clusters ordered by expression of IL-1 $\beta$  (top left) for nominated differentially expressed genes *Sod2*, *Irg1*, *Txnip*, *NFKB1z*, *Saa3* and *Cd83*. For comparison, the reference gene *Gapdh* is shown in the bottom right corner.

PFFs. This observation might indicate that the response of LRRK2 KO microglia after  $\alpha$ -synuclein PFFs insult is either delayed or reduced in amplitude compared to WT cells. In this regard, several studies have associated LRRK2 with oxidative stress (Heo et al., 2010; Liou et al., 2008; Pereira et al., 2014). Interestingly, in agreement with our results, it has been showed that microglia with LRRK2 knock-down (Kim et al., 2012) or kinase inhibition (Moehle et al., 2012) expressed lower ROS components, including inducible nitric oxide synthase, after LPS priming. Taken together, these results indicate that LRRK2 confers a greater susceptibility to some inflammatory insults. Supporting a key role of LRRK2 in microglial biology, we also found that upon  $\alpha$ -synuclein PFFs microglia reported a robust increased of LRRK2 phosphorylation at S935 compared with untreated cells, further confirming that LRRK2 is influenced by intracellular signaling of microglia after a PD-related insult.

A concern with studies using cultured microglia is that the process of isolation and culture might induce baseline activation that could mask gene expression changes that would be seen in vivo. To examine this, we used single LPS injections and scRNA-Seq to determine that at least a subset of the key changes validated in our in vitro studies can be confirmed in vivo. For example, we were able to confirm a substantial upregulation of *Sod2* in this model. Of note, it is unlikely that this could have been detected from bulk RNA-Seq in brain samples as many cells other than microglia express this antioxidant gene. Future studies will extend this model to include multiple genotypes so that we can assess the contribution of *Lrrk2* to microglial gene expression under inflammatory conditions in vivo.

In conclusion, in this study by using RNA-Seq technology we showed that although LPS and  $\alpha$ -synuclein PFFs have overlapping effects on gene expression,  $\alpha$ -synuclein PFFs additionally trigger a microglial response with a specific entity and elements. We reveal that microglia cells exhibited alterations of oxidative stress-related pathways and an enhanced induction of anti-oxidant SOD2 enzyme upon  $\alpha$ -synuclein PFFs. Furthermore, we found that LRRK2 KO microglia cells reported attenuated induction of mitochondrial SOD2 in response to  $\alpha$ -synuclein PFFs, indicative of a reduced susceptibility to the insult compared to WT cells and of an active contribution of LRRK2 to oxidative stress-related pathways. Overall, these results suggest that LRRK2 may widely contribute to pathogenesis of PD via altered neuroinflammatory signaling in microglia cells.

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.nbd.2019.05.012>.

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