American Journal of Geriatric Psychiatry Post-mortem cortical transcriptomics of Lewy body dementia reveal mitochondrial dysfunction and lack of neuroinflammation

--Manuscript Draft--

Highlights

What is the primary question addressed by this study?

What are the differentially expressed genes and dysfunctional molecular networks in post-mortem brains of people with Lewy body dementia (LBD)?

What is the main finding of this study?

This study has identified and verified 12 novel differentially expressed genes in LBD brains. Downregulation of several inflammatory markers revealed the absence of chronic neuroinflammation in LBD.

What is the meaning of the finding?

The findings advance molecular level mechanistic understanding and indicate potential biomarkers for LBD that warrant further investigation.

Article type: Regular research article

Title: Post-mortem cortical transcriptomics of Lewy body dementia reveal mitochondrial dysfunction and lack of neuroinflammation

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Abstract:

Objectives: Prevalence of Lewy body dementias (LBD) is second only to Alzheimer's disease (AD) among people with neurodegenerative dementia. LBD cause earlier mortality, more intense neuropsychiatric symptoms, more caregivers' burden, and higher costs than AD. The molecular mechanisms underlying LBD are largely unknown. As advancing molecular level mechanistic understanding is essential for identifying reliable peripheral biomarkers and novel therapeutic targets for LBD, we aimed to identify differentially expressed genes (DEG), and dysfunctional molecular networks in post-mortem LBD brains.

Methods: We investigated the transcriptomics of post-mortem anterior cingulate and dorsolateral prefrontal cortices of people with pathology-verified LBD using next-generation RNA-sequencing. We verified the identified DEG using high-throughput quantitative polymerase chain reactions. Functional implications of identified DEG, and the consequent metabolic reprogramming were evaluated by Ingenuity pathway analyses, genome-scale metabolic modelling, reporter metabolite analyses, and *in-silico* gene silencing.

Results: We identified and verified 12 novel DEGs (*MPO*, *SELE*, *CTSG*, *ALPI*, *ABCA13*, *GALNT6*, *SST*, *RBM3*, *CSF3*, *SLC4A1*, *OXTR*, and *RAB44*) in LBD brains with genome-wide statistical significance. We documented statistically significant downregulation of several cytokine genes. Identified dysfunctional molecular networks highlighted the contributions of mitochondrial dysfunction, oxidative stress, and immunosenescence towards neurodegeneration in LBD.

Conclusion: Our findings support that chronic microglial activation and neuroinflammation, well-documented in AD, are notably absent in LBD. The lack of neuroinflammation in LBD brains were corroborated by statistically significant downregulation of several inflammatory markers. Identified DEGs, especially downregulated inflammatory markers, may aid distinguishing LBD from AD, and their biomarker potential warrant further investigation.

Key words: Lewy body dementia; High-Throughput RNA sequencing; Systems biology; Parkinson disease; Mitochondria

Introduction:

Lewy body dementia (LBD) is a major public health problem worldwide. Prevalence of Lewy body dementia (LBD) is second only to Alzheimer's disease (AD) among people with neurodegenerative dementia (1). LBD cause earlier mortality (2), earlier nursing home admissions, poorer quality-of-life, higher costs (3), more frequent falls, and more caregivers' burden than AD. LBD include two overlapping clinical syndromes, dementia with Lewy bodies (DLB) and Parkinson's disease (PD) dementia (PDD). They cause more frequent and more intense neuropsychiatric symptoms including visual hallucinations, delusions, agitation, and depression than AD (4). Antipsychotic medications should be avoided in all people with dementia whenever possible, and there is an urgent clinical need for diagnosing LBD early, because treating neuropsychiatric symptoms, common in LBD, with any antipsychotic medication risks potentially fatal adverse effects in people with LBD (5). However, the molecular mechanisms underlying neurodegeneration in LBD remain largely unknown, and prior research that focused mainly on known AD and PD biomarkers have not identified any reliable genetic markers for LBD (6). Moreover, there are no disease-modifying treatment for LBD (7). Hence, advancing molecular level mechanistic understanding is urgently needed for facilitating discovery of multimodal biomarkers and novel therapeutic targets for LBD (7,8).

A few candidate-gene association studies and a genome-wide association study (GWAS) have associated LBD with polymorphisms in *APOE*, *SNCA*, *GBA*, *STX1B*, *GABRB3*, *CNTN1*, and *SCARB2* (9-11), but they could not ascertain functional implications of identified genetic associations. As a definite DLB diagnosis can be confirmed only by post-mortem (12),

genetic studies investigating people living with LBD are prone for misclassification bias. Hence, transcriptomic studies that identify differentially expressed ribonucleic acids (RNA) in post-mortem LBD brains are essential for understanding functionally relevant gene expression changes, and their dysfunctional molecular networks (13-15). Moreover, further research on the transcriptomics of LBD brains is needed for clarifying their neuroimmunology. Chronic microglial activation and neuroinflammation contribute to neurodegeneration in AD (16), but recent immunohistochemical studies have documented absence of neuroinflammation in LBD (17,18). Immunosenescence and consequent impaired neuronal survival are hypothesized to contribute to LBD pathology (17,18). Hence, we aimed to identify differentially expressed genes (DEG), dysfunctional molecular networks, and metabolic reprogramming in postmortem anterior cingulate (ACC), and dorsolateral prefrontal (DLPFC) cortices of people with pathology-verified LBD.

Methods:

Post-mortem brain tissue:

The Brains for Dementia Research (BDR) network of brain banks (19), UK, provided necessary post-mortem brain tissue, and ethical approval for this study. We obtained frozen sections of ACC (Brodmann area 24), and DLPFC (Brodmann area 9) of people with pathology-verified DLB (n=7), PDD (n=7), and of older people without dementia or PD (NDC) $(n=7)$. The groups did not differ significantly on their age $(F=0.88; df=2, 18; p=0.43)$, and on their post-mortem intervals $(F=0.04; df=2.18; p=0.96)$. We could not get ACC tissue of one person with DLB, and DLPFC tissue of one NDC person was not available (Supplemental digital content (SDC)-1). ACC is known to have high levels of Lewy body pathology in LBD (15), and Lewy body densities in ACC can predict cognitive impairment in PD (20). People with DLB have greater impairment of executive functions, regulated by DLPFC, than people with AD (21). Hence, we investigated the transcriptomics of these two cortical regions.

RNA extraction:

50mg of brain tissue per sample were excised on dry ice. Excised tissue was homogenized using the T10-basic ultra-turrax, and disposable dispersing element S10D-7G-KS-110 (Ika works, Wilmington, USA). Total RNA was extracted using the RNeasy plus universal mini kit (Qiagen, Hilden, Germany). Quantity and quality of RNA were assessed using the NanoDrop ND-1000 (Thermo Fisher Scientific, Waltham, USA). Mean 260/280 and 260/230 spectrophotometer absorbance ratios of purified RNA were 2.06 (95%CI 2.05-2.07), and 1.56 (95%CI 1.48-1.64), respectively.

Next-generation RNA-sequencing (RNA-Seq):

cDNA libraries were prepared from RNA samples using TruSeq RNA sample preparation kit (Illumina, San Diego, USA). The cDNA libraries underwent paired-end sequencing (75 base pairs/read) using the Illumina HiSeq-4000 (Illumina, San Diego, USA) in the Wellcome Centre for Human Genetics (WHG), Oxford, UK. We obtained a minimum of 30 million clean reads/sample.

RNA-Seq data analyses:

RNA-Seq reads passed quality control, if they did not include any ambiguous bases, and if more than 90% of bases had less than 1% sequencing error. Such reads were aligned to the human genome (Homo_sapiens.GRCh38) with corresponding gene model annotation (Homo_sapiens.GRCh38.88.gtf) using the *HISAT2* (22). Aligned reads were counted using the *featureCounts* (23) (SDC-2; SDC-3). DEGs were identified by a previously experimentally validated (24) *edgeR* 3.18.1 algorithm employing tag-wise dispersion (25), and Benjamini-Hochberg genome-wide false discovery rate (FDR) correction (5%). The *edgeR* algorithm calculated p-values by employing exact tests (no df) after fitting gene-specific quasi-negative binominal models and estimating dispersion using the quantile adjusted conditional maximum likelihood method. The LBD group including both DLB and PDD groups (n=14) was compared with the NDC group for identifying DEGs in LBD brains. Later, pairwise subgroup analyses were conducted with FDR correction.

Verification of identified DEGs:

Differential expression of 78 selected genes (SDC-4) including all protein coding FDRadjusted DEGs and 10 randomly selected DEGs (*edgeR p<*0.05; no df) in DLPFC of LBD brains were evaluated using high-throughput quantitative polymerase chain reactions (qPCR). One μ g of RNA per sample from the aliquots of RNA that had been sequenced (N=40) were reverse transcribed using the iScript™ advanced cDNA synthesis kit (Bio-Rad, Hercules, USA). After 14 cycles of specific target amplification with the PreAmp master-mix (Fluidigm, San Francisco, USA), high-throughput qPCR was performed using the BioMark HD, GE 96.96 dynamic arrays (Fluidigm, San Francisco, USA), and SsoFast EvaGreen low ROX kit (Bio-Rad, Hercules, USA) (SDC-5). Verification of differential expression of a gene was defined by the following criteria (26), (i) Both RNA-seq and qPCR showed same direction of differential expression, (ii) Differential expression fold change, estimated by qPCR, was either above 1.25 or below 0.80 (logarithmic cut-off was \pm 0.3219).

Ingenuity Pathway Analysis (IPA):

Functional implications of identified DEGs (*edgeR p<*0.05; no df) were analyzed by the IPA using the Ingenuity knowledge base (Ingenuity, Redwood City, USA). The IPA helps identifying potential biomarkers within the context of biological systems. Our analysis settings included stringent filters with only experimentally observed relationships, and we identified dysfunctional molecular networks in LBD brains.

Comparison with AD gene expression data:

We gathered all AD related gene expression data publicly available in the NCBI GEO database (27). A DEG was deemed to be specific to LBD, if the gene either was not altered in the AD gene expression profiles, or if it was reportedly altered in the opposite direction.

Brain-specific genome-scale metabolic model (GEM):

We used a previously generated brain-specific GEM (28). The GEM includes 630 metabolic reactions, controlled by 570 genes, within and between astrocytes and neurons, and the metabolites that exchange or transport through the blood-brain barrier. We have modified the lactate release from neurons, glycogen accumulation in astrocytes, glutamate cycling, GABA transfer direction, and pentose phosphate pathway, and have included the reaction of astrocyte lactate shuttle to the GEM based on our transcriptomic data. Glutamate/glutamine cycle and ATP demand were considered as objective functions. In order to generate tissuespecific GEMs, we employed Metabolic Adjustment by Differential Expression (MADE) (29) and Toolbox for Integrating Genome scale metabolism, Expression, and Regulation (TIGER) (30) using logarithmic fold changes and p-values, obtained from the *edgeR* (25) analyses, as input. Flux balance analysis (FBA) was used as a mathematical constraint-based modelling approach for analyzing the flow of metabolites through a metabolic network, and it investigated the metabolic reprogramming in LBD brains.

Reporter metabolite analyses:

We further investigated the metabolic reprogramming in LBD brains by reporter metabolite analyses using an updated human metabolic reactions model (31), the Platform for Integrated Analysis of Omics data (PIANO) (32), and gene-level logarithmic fold changes and the p-values, obtained from the *edgeR* analyses, with the Stouffer's test (no df) employing a permutation (1000) approach.

*In-silico gene silencing***:**

The effects of silencing each of the 570 metabolic genes was simulated using the generated GEMs by removing reaction(s) associated with the gene. The reactions were retained, if another gene catalyzing the same reaction(s) is present. Then, FBA was performed for checking the effects of *in-silico* gene silencing on the functionality of models. When the gene silencing decreased the flux of objective function, it was considered as an essential gene for that condition.

Results:

DEGs in LBD brains:

The LBD (DLB and PDD) and NDC groups did not differ significantly on their spectrophotometer mean absorbance ratios in both ACC $(260/280)$ (t=0.74;df=18;p=0.47); 260/230 (t=-2.02;df=18;p=0.06)) and DLPFC (260/280 (t=0.21;df=18;p=0.84); 260/230 $(t=1.48; df=18; p=0.16)$. We identified 1464 upregulated, and 1652 downregulated DEGs (*edgeR p<*0.05; no df) in ACC (SDC-6), and 1233 upregulated and 1414 downregulated DEGs (*edgeR p<*0.05; no df) in DLPFC (SDC-7) of LBD brains, compared to NDC brains. After genome-wide FDR correction, we identified 12 protein coding DEGs in LBD brains (Table-1). *MPO*, *SELE*, *CTSG*, *ALPI*, and *ABCA13* were significantly downregulated in both ACC and DLPFC. *GALNT6* was significantly upregulated in DLPFC. *RBM3*, *CSF3*, *SLC4A1*, *OXTR*, and *RAB44* were significantly downregulated in ACC, and *SST* was significantly downregulated in DLPFC of LBD brains. Differential expression levels of these 12 DEGs could be verified (26) by high-throughput qPCR (Table-1). Moreover, differential expression levels of 62.3% (38/61; 95%CI 50.1-74.5%) of other DEGs (*edgeR p<*0.05; no df) could be verified (26) by high-throughput qPCR (SDC-8). Cytokine gene *IL1B*, chemokine gene *CXCL11*, and neutrophil defensin genes, *DEFA3* and *DEFA4*, were significantly downregulated (*edgeR p<*0.05; no df) in both ACC and DLPFC of LBD brains, and their differential expression levels could be verified by qPCR in both cortical regions. The statistically significant (*edgeR p<*0.05; no df) downregulated DEGs in LBD brains, verified by high-throughput qPCR, included *VGF* encoding a nerve growth factor, *VCAM1* encoding a vascular cell adhesion molecule, and *STX11* encoding a syntaxin (Table-2).

DEGs in DLB and PDD brains:

The subgroup analyses identified 735 upregulated, and 979 downregulated DEGs (*edgeR p<*0.05; no df) in ACC, and 973 upregulated and 1330 downregulated DEGs (*edgeR p<*0.05; no df) in DLPFC of DLB brains, compared to NDC brains (SDC-9). After FDR correction, *CTSG*, and *SELE* were significantly downregulated, and *GIPR*, and *PSPHP1* were significantly upregulated in DLPFC of DLB brains. There was not any FDR-adjusted DEG in ACC of DLB brains. When we compared PDD brains with NDC brains, we identified 1764 upregulated, and 2066 downregulated DEGs (*edgeR p<*0.05; no df) in ACC, and 1293 upregulated and 1114 downregulated DEGs (*edgeR p<*0.05; no df) in DLPFC of PDD brains (SDC-10). *ADAMTS2* was significantly upregulated, and *MPO*, and *OXTR*, were significantly downregulated in ACC, as well as *GALNT6* was significantly upregulated, and *CTSG*, *SST*, and *OR11H4* were significantly downregulated in DLPFC of PDD brains, compared to NDC, after FDR correction (SDC-10). While comparing with PDD brains, there were 1236 downregulated and 1043 upregulated DEGs (*edgeR p<*0.05; no df) in ACC of DLB brains, but none of them was significant after FDR correction. We identified 607 upregulated and 987 downregulated DEGs (*edgeR p<*0.05; no df) in DLPFC of DLB brains, compared to PDD brains. DLB could be differentiated from PDD by the downregulation of nine FDR-adjusted DEGs including *PTGER3*, and *CRABP1* in their DLPFC (SDC-11) (SDC-12).

Dysfunctional molecular networks:

The genes, associated with the agranulocytes adhesion and diapedesis, granulocytes adhesion and diapedesis, atherosclerosis signaling, and differential regulation of cytokine production in macrophages and T-helper cells by IL-17A and IL-17F pathways, were significantly enriched among the DEGs (*edgeR p<*0.05; no df) in both cortical regions of LBD brains after Benjamini-Hochberg FDR correction (Figure-1A&1B). Immune system related canonical pathways including IL-6 signaling, systemic lupus erythematosus signaling, communication between innate and adaptive immune cells, and role of cytokines in mediating communication between immune cells were significantly enriched among the DEGs in DLPFC of LBD brains after FDR correction (Figure-1A). Downregulation of genome-wide significant DEGs, *CSF3* and *SST*, and of qPCR-verified DEGs, *IL1B* and *VGF*, and their interactions with other identified DEGs (*edgeR p<*0.05; no df) form a molecular network that can impair neuronal development, maintenance, survival, and function in DLPFC of LBD brains (Figure-1C). Furthermore, differential expression of *CSF3*, and of qPCR-verified DEGs, *IL1B*, *NOS3*, *VCAM1*, and *SPP1,* and their interactions with other identified DEGs form a molecular network that can lead to cell-to-cell signaling, and cellular movement impairment, immune system dysfunction, and neurodegeneration in ACC of LBD brains (Figure-1D).

Comparing with AD gene expression data:

We investigated whether the identified DEGs are specific to LBD or they represent a non-specific dementia phenotype by reviewing the AD-related gene expression data available in the NCBI GEO database (27). Downregulation of *RBM3* and *SST*, and upregulation of *GALNT6* in LBD were consistent with their differential expression levels, reported by prior AD studies. Differential expression levels of at least seven genome-wide significant DEGs (*SELE*, *CTSG*, *ALPI*, *ABCA13*, *CSF3*, *OXTR*, and *RAB44*) in LBD brains were distinct from their reported levels in AD brains (SDC-13).

Metabolic reprogramming in LBD brains:

The metabolic changes in the generated constraint-based flux balance LBD models (SDC-14) highlighted decreased mitochondrial respiratory chain activity by showing lower flux of tricarboxylic acid (TCA) cycle and oxidative phosphorylation for ATP-synthesis than those in NDC models. Reactive oxygen species (ROS), associated with neurodegeneration, were excessively produced in LBD reprogramed models. The glutathione peroxidase activity for scavenging ROS also was increased in the LBD reprogramed models, and the increased flux for redox responses in LBD was dependent on NADPH-dependent hydrogen peroxide scavenging, catalyzed by isocitrate dehydrogenase (IDH) (Figure-2). IDH deficiency induces sensitivity to oxidative stress that leads to neurodegeneration (33), and the LBD reprogramed models showed high sensitivity to *in-silico* gene silencing of *IDH1* and *IDH2*. Moreover, the GEM demonstrated the importance of astrocytes releasing glutathione precursors. When we blocked astrocytes dependent reactions in the LBD models, the neurons could not handle the oxidative stress. Furthermore, we identified 84 reporter metabolites that displayed FDRadjusted statistically significant changes in LBD brains (SDC-15). The downregulated reporter metabolites included those related to TCA cycle, such as malate, α-ketoglutarate, acetyl-CoA, NAD(H), acetate, glutamate, ubiquinone, estradiols, isobutyryl-CoA, and homocysteine, and several metabolites involved in fatty acids and lipid metabolism (SDC-14). These findings corroborated the lower flux of TCA cycle, and mitochondrial dysfunction in LBD brains (Figure-2).

Discussion:

Notwithstanding its small sample size, this is the hitherto largest RNA-Seq study investigating transcriptomics of LBD brains (13-15). Moreover, this is the first study evaluating the transcriptomic differences between DLB and PDD, and integrating LBD transcriptomic data into genome-scale metabolic modelling. We have identified 12 novel genome-wide significant DEGs, distinct from known genetic markers of AD and PD, in LBD brains, and have verified them using high-throughput qPCR. We identified specific dysfunctional molecular networks in LBD brains, and have added evidence for mitochondrial dysfunction and immunosenescence in LBD. The identified DEG, and their dysfunctional molecular networks advance molecular level mechanistic understanding of neurodegeneration in LBD, and they can facilitate identifying potential diagnostic biomarkers for LBD. Nevertheless, the limitations of this study include its small sample size comprising mostly men, the lack of AD and PD comparison groups, not investigating cerebellum that does not typically have substantial α -synuclein pathology, and the lack of data on the use of dopaminergic medications.

Our GEM analyses have demonstrated how mitochondrial dysfunction and oxidative stress contribute towards neurodegeneration in LBD. Mitochondrial dysfunction can set off a vicious cycle by producing more ROS that lead to more mitochondrial oxidative damage (34). Consequent oxidative stress may lead to α -synuclein oligomerization worsening the vicious cycle by damaging more mitochondria (34). Oxidative stress has bidirectional causal relationship with hypoxia, and sustained hypoxia can lead to anti-inflammatory response in LBD brains (35). Moreover, the GEM demonstrated how astrocytes help neurons to cope with oxidative stress by releasing glutathione precursors. Hence, astrocytes dysfunction may contribute to neurodegeneration in LBD. Additionally, our findings indicate the need for further studies investigating IDH that catalyzes NADPH-dependent hydrogen peroxide scavenging as a potential therapeutic target that may modify the vicious cycle and the disease process.

Our results showed that the neuroimmunological profile of LBD brains differ widely from chronic neuroinflammation in AD (16). Prior evidence indicating neuroinflammation in LBD are weak, and they were principally derived from increased CD68 immunostaining that can be explained by impaired proteostasis and microglial dystrophy (17,18,36). Immunohistochemical staining with IBA1 and CD68 antibodies has demonstrated low microglia density, and increased microglial dystrophy in LBD brains (18). A recent transcriptomic and proteomic study has reported lack of evidence for microglia mediated neuroinflammation in post-mortem pulvinar of people with LBD (36). We have documented statistically significant downregulation of several cytokine and chemokine genes including *IL1B*, *IL2*, *IL6*, *CXCL2*, *CXCL3*, *CXCL8*, *CXCL10*, and *CXCL11*. Downregulation of *MPO*, and of vascular cell adhesion molecules encoding *SELE* and *VCAM1* add evidence for the absence of neuroinflammation in LBD brains. Optimal microglial activation is essential for neuronal survival, and the importance of neuroprotective and synaptic modulatory functions of microglia in adult brain is increasingly recognized (37). Hence, immune dysfunction leading to impaired neuronal protection and survival rather than chronic neuroinflammation may explain neuronal loss in LBD. The differential expression levels of these inflammatory markers and of the associated molecules may distinguish LBD from AD, and further research investigating their biomarker potential are warranted.

Neutrophil extravasation has been associated with AD pathology (38), but little is known about its role in LBD. We have verified downregulation of neutrophil defensin genes, and have highlighted the dysfunctional granulocyte adhesion and diapedesis pathway in LBD brains. *CTSG* encoding a neutrophil serine protease, Cathepsin G, was significantly downregulated in both cortical regions of LBD brains. Cathepsin G influences the permeability of blood brain barrier, and its downregulation can contribute to impaired proteostasis and neurodegeneration in LBD (39). Moreover, Granulocyte colony stimulating factor (GCSF), coded by *CSF3*, stimulates the proliferation and survival of neutrophils and it is a neurotrophic factor (40). GCSF may facilitate neuroplasticity, and can inhibit apoptosis (41). We have documented *CSF3* downregulation in LBD brains, and have highlighted the importance of *CSF3* associated molecular networks hindering neuronal survival, and leading to immune dysfunction, and neurodegeneration in LBD. Serum GCSF levels were significantly less in people with AD than cognitively-intact controls (41), and a pilot study has demonstrated the safety of GCSF in people with AD (42). However, the biomarker and therapeutic potential of GCSF has not been systematically evaluated in LBD so far.

MPO polymorphisms have been associated with sporadic and familial forms of AD. Myeloperoxidase co-localizes with β-amyloid deposits in AD brains (43), and increased plasma myeloperoxidase levels have been reported in people with AD (44). As we documented significantly reduced *MPO* expression in LBD, peripheral biomarker potential of myeloperoxidase and its mRNA in people with LBD warrant further investigation. Moreover, synaptic loss leads to neurodegeneration, and downregulation of *RBM3* reportedly leads to synaptic loss in mice (45). RBM3 modulates synaptic plasticity, and it can be a potential therapeutic target for LBD. Besides, our results rekindle the interest on somatostatinergic systems. Loss of somatostatin expressing interneurons (46), and consequent impairment of microglial migration and their target-specific phagocytosis (47) may contribute to cognitive impairment in LBD. Furthermore, downregulation of *VGF* may compromise neuronal survival and energy homeostasis in LBD brains. Increased expression of VGF in cerebrospinal fluid and peripheral lymphocytes has been detected in AD (48), but the biomarker potential of *VGF* has not been investigated in LBD.

As advanced stages of DLB and PDD are often clinically indistinguishable, the nosological validity and diagnostic boundaries of these disorders are continuously debated (49). We have documented the molecular differences between DLB and PDD, and more pronounced transcriptomic differences at earlier clinical stages can be hypothesized. Predicting early stage transcriptomic differences and their longitudinal changes from the findings of postmortem brain studies are difficult. However, circulating exosomes transporting RNA between brain and peripheral systems provide an opportunity for studying the molecular changes in living human brain (50). Hence, we are currently investigating serum and cerebrospinal fluid exosomal RNA profiles for understanding the molecular changes in LBD over its disease course, and for evaluating the biomarker potential of identified DEGs.

Figure-legends:

Figure-1: Functional analyses of identified differentially expressed genes in post-mortem brains of people with Lewy body dementias

A: Canonical pathways that were enriched among the statistically significant (*edgeR p<*0.05; no df) differentially expressed genes (DEGs) in dorsolateral prefrontal cortices (DLPFC) of people with Lewy body dementias (LBD); B: Canonical pathways that were enriched among the statistically significant (*edgeR p<*0.05; no df) DEGs in anterior cingulate cortices (ACC) of people with LBD; (A&B) Green represents downregulated genes, and red represents upregulated genes. Yellow line presents the p-values after Benjamini-Hochberg false discovery rate (5%) correction.

C: A network of DEGs in DLPFC of people with LBD may impair neuronal development, maintenance, and survival; D: A network of DEGs in ACC of people with LBD may lead to cell-to-cell signaling impairment, and immune system dysfunction; (C&D) Green represents downregulated genes, and red represents upregulated genes. Solid lines represent direct interactions and dotted lines represent indirect interactions.

Figure-2: Flux balance analysis, performed on brain-specific genome scale metabolic models, highlighted the metabolic changes in LBD brains

The flux of reactions related to oxidative stress response increase in LBD. Scavenging of hydrogen peroxide (H_2O_2) is done by glutathione peroxidase. Astrocytes release the precursors of Glutathione (GSH). The increased flux for Redox responses to hypoxia in LBD is related to NADPH-dependent H_2O_2 scavenging, catalyzed by isocitrate dehydrogenase (IDH), supporting the system through the NADPH production. Additionally, the activity of tricarboxylic acid cycle and mitochondrial respiratory chain are reduced in LBD. aKG: alpha ketoglutarate, GSH: Reduced Glutathione and GSSG: Oxidized Glutathione.

Supplemental digital content (SDC):

- 1. SDC-1 presents the diagnosis, age, gender, post-mortem interval, and co-existent AD pathology of the brains that have been included in this study (.docx file).
- 2. SDC-2 presents the expression count matrix of RNA-seq data from post-mortem anterior cingulate cortices (.xlsx file).
- 3. SDC-3 presents the expression count matrix of RNA-seq data from post-mortem dorsolateral prefrontal cortices (.xlsx file).
- 4. SDC-4 presents forward and reverse primer sequences that have been used for highthroughput qPCR replication of 78 selected genes (first worksheet) and 7 reference (second worksheet) genes. It has two worksheets. (.xlsx file).
- 5. SDC-5 presents an overview of RNA extraction, cDNA synthesis, specific target amplification and high-throughput qPCR replication procedures (.docx file)
- 6. SDC-6 presents differential expression analyses of RNA-seq data from post-mortem anterior cingulate cortices of 13 Lewy body dementias, and 7 control brains without dementia and Parkinson's disease (.xlsx file).
- 7. SDC-7 presents differential expression analyses of RNA-seq data from post-mortem dorsolateral prefrontal cortices of 14 Lewy body dementias, and 6 control brains without dementia and Parkinson's disease (.xlsx file).
- 8. SDC-8 presents the results of high-throughput qPCR verification. It has two worksheets. First worksheet presents the results from anterior cingulate cortices, and the second worksheet presents the results from dorsolateral prefrontal cortices (.xlsx file).
- 9. SDC-9 presents differential expression analyses comparing post-mortem dementia with Lewy bodies and control brains without dementia and Parkinson's disease. It has two worksheets. First worksheet presents the results from anterior cingulate cortices, and the second worksheet presents the results from dorsolateral prefrontal cortices (.xlsx file).
- 10. SDC-10 presents differential expression analyses comparing post-mortem Parkinson's disease dementia and control brains without dementia and Parkinson's disease. It has two worksheets. First worksheet presents the results from anterior cingulate cortices, and the second worksheet presents the results from dorsolateral prefrontal cortices (.xlsx file).
- 11. SDC-11 presents differential expression analyses comparing post-mortem Parkinson's disease dementia and dementia with Lewy bodies brains. It has two worksheets. First worksheet presents the results from anterior cingulate cortices, and the second worksheet presents the results from dorsolateral prefrontal cortices (.xlsx file).
- 12. SDC-12 presents differential expression analyses comparing Lewy body dementia brains with minimal or no co-existing Alzheimer's disease pathology (All ABC scores \leq 1) and Lewy body dementia brains with more co-existing Alzheimer's disease pathology (at least one of the ABC scores \geq 2). It has two worksheets. First worksheet presents the results from anterior cingulate cortices, and the second worksheet presents the results from dorsolateral prefrontal cortices (.xlsx file).
- 13. SDC-13 presents differential expression fold changes, estimated by meta-analyses of prior gene expression studies investigating post-mortem Alzheimer's disease brains, of 26 selected differentially expressed genes in LBD (.xlsx file).
- 14. SDC-14 presents the flux balance analysis investigating the metabolic reprogramming in brains of people with Lewy body dementias. First worksheet presents the results from anterior cingulate cortices, and the second worksheet presents the results from dorsolateral prefrontal cortices (.xlsx file).
- 15. SDC-15 presents the reporter metabolite analysis investigating the metabolic reprogramming in brains of people with Lewy body dementias. It has six worksheets. The first three worksheets present the results from anterior cingulate cortices, and the next three worksheets present the results from dorsolateral prefrontal cortices (.xlsx file).

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Author contributions:

APR, EC, AH, CB, PF, and DA were involved in the conception and the design of this research. APR, EC and PF obtained the post-mortem brain tissues, and extracted the RNA samples. APR, and GW analyzed the RNA-seq data, and completed subsequent functional analyses. GB, SS and AM analyzed the data using systems biology methods. APR, HM, and AH performed high-throughput qPCR replication and analyzed the data. APR, GB and SS drafted the initial manuscript. All authors were involved in the critical revisions and final approval of the manuscript.

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Table 1

Gene	Gene name	LFC ^b	qPCR LFC	\mathbf{p}^{c}	q ^d
MPO	myeloperoxidase	-4.49	-3.58	5.43E-11	3.07E-06
SELE	selectin E	-3.64	-2.47	2.90E-09	8.19E-05
ABCA13	ATP binding cassette subfamily A member 13	-3.63	-2.36	8.85E-08	0.0017
ALPI	alkaline phosphatase, intestinal	-6.69	-1.17	4.36E-07	0.0054
SLC4A1	solute carrier family 4 member 1	-2.61	-1.55	4.80E-07	0.0054
<i>OXTR</i>	oxytocin receptor	-1.08	-0.94	6.93E-07	0.0065
CSF3	colony stimulating factor 3	-4.14	-5.57	9.06E-07	0.0073
CTSG	cathepsin G	-6.75	-7.61	4.56E-06	0.0286
RAB44	RAB44, member RAS oncogene family	-3.88	-1.92	4.26E-06	0.0286
RBM3	RNA binding motif protein 3	-1.03	-2.17	5.74E-06	0.0303
GALNT6	polypeptide N-acetylgalactosaminyltransferase 6	1.35 ^e	0.95^e	4.33E-07	0.0049
SST	somatostatin	-2.27^e	-1.61^e	8.89E-07	0.0072

Table 1: 12 genome-wide significant differentially expressed genes^a in post-mortem brains of people with Lewy body dementias

^a Differentially expressed genes that were identified by RNA-seq and were verified by high-throughput quantitative polymerase chain reaction (qPCR); ^b Logarithmic (base 2) fold change, measured by RNA-seq; ^c RNA-seq p value that was estimated using the edgeR algorithm. The *edgeR* algorithm employed exact tests (no df) for calculating p-values after fitting gene-specific quasi-negative binominal models and estimating dispersion using the quantile adjusted conditional maximum likelihood method; ^dRNA-seq q value after Benjamini-Hochberg false discovery rate (5%) correction; e in dorsolateral prefrontal cortex.

Anterior Cingulate Cortex				Dorsolateral Prefrontal Cortex					
Gene	LFC ^b	qPCR LFC	\mathbf{p}^{c}	q^{d}	Gene	LFC ^b	qPCR LFC	\mathbf{p}^{c}	q^{d}
ADAMTS2	1.05	1.23	1.15E-05	0.0521	CXCL11	-3.72	-2.35	1.14E-05	0.0682
UTF1	-3.73	-1.53	1.22E-05	0.0521	VGF	-1.79	-0.79	4.73E-05	0.2058
DEFA4	-6.15	-2.37	2.91E-05	0.0897	ADAMTS2	1.02	2.15	0.0001	0.3372
CXCL11	-3.19	-1.91	7.43E-05	0.1399	LDHC	4.16	5.49	0.0002	0.4165
XIST	8.56	1.43	0.0002	0.2581	GIPR	2.30	1.18	0.0004	0.4165
DEFA3	-5.34	-2.64	0.0004	0.3266	XIST	8.75	1.83	0.0006	0.4652
GBP6	-1.18	-2.52	0.0013	0.4438	ADRA2B	1.48	-0.86	0.0009	0.5467
STX11	-1.24	-1.03	0.0015	0.4701	DEFA4	-4.95	-3.91	0.0010	0.5467
GRK7	1.64	2.01	0.0015	0.4725	GBP6	-1.42	-1.30	0.0015	0.6017
GIPR	1.60	0.84	0.0020	0.4911	REG4	-4.15	-1.19	0.0019	0.6017
ABCD2	-0.59	-0.70	0.0020	0.4911	SBSN	1.84	0.39	0.0036	0.7670
ILIB	-1.68	-1.49	0.0050	0.6213	DEFA3	-3.77	-2.62	0.0076	0.8123
SPP1	1.40	0.95	0.0053	0.6213	SPP1	0.96	0.80	0.0102	0.8329
VCAM1	-1.18	-1.32	0.0124	0.7229	ILIB	-1.41	-1.01	0.0103	0.8335
VGF	-0.91	-2.64	0.0230	0.7684	CPA3	-3.77	-2.17	0.0142	0.8849
$\mathbb{C}P$	-0.93	-1.12	0.0257	0.7764	GRK7	1.24	1.97	0.0201	0.9649
CRABP1	1.57	0.78	0.0265	0.7767	WISP1	1.11	1.11	0.0275	1.0000
LDHC	2.37	2.78	0.0395	0.8274	$\mathcal{C}P$	-0.91	-1.34	0.0277	1.0000
NOS3	-1.08	-1.20	0.0454	0.8274	GPR50	-2.04	-1.93	0.0412	1.0000
OR11H4	-1.26	-1.35	0.0471	0.8274	ABCD2	-0.43	-0.57	0.0463	1.0000

Table 2: Other verified differentially expressed genes ^a in post-mortem brains of people with Lewy body dementias

^a Differentially expressed genes that were identified by RNA-seq and were verified by high-throughput qPCR; ^b Logarithmic (base 2) fold change, measured by RNA-seq; ^c RNA-seq p value that was estimated using *edgeR* algorithm. The *edgeR* algorithm employed exact tests (no df) for calculating p-values after fitting gene-specific quasi-negative binominal models and estimating dispersion using the quantile adjusted conditional maximum likelihood method; ^dRNA-seq q value after Benjamini-Hochberg false discovery rate (5%) correction.