

# Transcriptome Analysis of Rheumatoid Arthritis Uncovers Genes Linked to Inflammation-Induced Pain

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#### Article

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### **Abstract**

Autoimmune diseases such as rheumatoid arthritis (RA) can promote states of chronic inflammation with accompanying tissue destruction and pain. RA can cause inflammatory synovitis in peripheral joints, particularly within the hands and feet, but can also sometimes trigger temporomandibular joint (TMJ) arthralgia. To better understand the effects of ongoing inflammation-induced pain signaling, dorsal root ganglia (DRGs) were acquired from individuals with RA for transcriptomic study. We conducted RNA sequencing from the L5 DRGs because it contains the soma of the sensory neurons that innervate the affected joints in the foot. DRGs from 5 RA patients were compared with 9 non-arthritic controls. RNA-seq of L5 DRGs identified 128 differentially expressed genes (DEGs) that were dysregulated in the RA subjects as compared to the non-arthritic controls. The DRG resides outside the blood brain barrier and, as such, our initial transcriptome analysis detected signs of an autoimmune disorder including the upregulated expression of immunoglobulins and other immunologically related genes within the DRGs of the RA donors. Additionally, we saw the upregulation in genes implicated in neurogenesis that could promote pain hypersensitivity. Overall, our DRG analysis suggests that there are upregulated inflammatory and pain signaling pathways that can contribute to chronic pain in RA.

## Introduction

Chronic pain affects about 20.5% of Americans<sup>1</sup>, where hyperalgesia and allodynia are often triggered by prolonged inflammatory responses. Inflammation is generally needed as part of the normal repair process to clear any cellular debris resulting from tissue injury, but aberrant immune responses can occur that produce chronic inflammation. Unresolved inflammatory signaling can promote adaptive changes in nociceptive neurons that lead to increased pain sensitivity. Chronic inflammatory disorders can include autoimmune diseases such as systemic lupus erythematosus, inflammatory bowel disease, and rheumatoid arthritis (RA), with pain being considered as a shared symptom amongst these conditions<sup>2</sup>. RA, in particular, is characterized as a prototype autoimmune disease with an overall prevalence in about 0.5-1% of Americans<sup>3,4</sup>.

In general, synovial tissues are richly innervated by sensory neurons, yet, despite the mechanical forces regularly encountered by our joints, normal movement is not perceived as painful unless there is injury<sup>5,6</sup>. The autoimmune character of RA, however, causes synovitis that leads to pain and swelling in the joints of the hands, wrists, feet, and knees<sup>4</sup>. The release of inflammatory cytokines along with acidification of the synovial fluid can then promote both peripheral sensitization of sensory neurons as well as the activation of mechanosensitive silent nociceptors<sup>6,7,8</sup>. The resulting joint pain affects not only mobility but can have an impact on quality of life as individuals with RA often experience depression and fatigue<sup>9,10</sup>. Interestingly, RA patients display increased pain hypersensitivity not only around the inflamed joints but also show hyperalgesia in non-inflamed tissues as well<sup>11</sup>. RA is mainly known to cause inflammation and pain in the small joints of the hands and feet but can also lead to TMJ arthralgia and higher orofacial pain intensity in some patients<sup>12,13</sup>. Pain can also occur despite the control of

inflammation and joint damage using disease-modifying antirheumatic drugs (DMARDs)<sup>14,15</sup>. Along with typical reports of mechanical hypersensitivity, some RA patients additionally report symptoms akin to neuropathic pain including descriptions like burning, tingling, and electric shocks<sup>10</sup>.

To identify possible pain-related gene expression changes in the dorsal root ganglia (DRG) that occur with RA, we conducted RNA sequencing using the DRG of subjects with RA. The activity of nociceptors in the DRG play a key role in triggering pain, where the silencing of TRPV1<sup>+</sup> neurons with resiniferatoxin in dogs and in patients with severe osteoarthritis (OA) has been shown to provide long-term analgesia, regardless of developing central sensitization 16,17. Around 80-90% of RA patients report foot problems, so the L5 DRG was chosen for RNA-seq analysis as it contains the soma of the sensory neurons that innervate the joints in the ankle, and foot 18. Overall, the DRG is a heterogeneous tissue comprised of not only sensory neurons, but also glial cells, perivascular cells, and resident macrophages. Bulk sequencing of the DRG was performed to identify gene expression changes in the primary afferent sensory neurons and non-neuronal cells that can influence pain sensitivity as well. In our RNA-seg analysis, we identified a total of 128 differentially expressed genes (DEGs) in the RA individuals versus the non-arthritic controls. We found changes in genes linked to immune activity that may reflect the autoimmune character of RA as well as pro-algesic neuroimmune signaling within the DRG. No signs of neuronal loss were histologically detected, while, instead, our transcriptome analysis uncovered the upregulation of genes linked to synaptic signaling and neurogenesis. Our RNA-seg analysis thereby looked specifically into the gene expression changes within the DRG of individuals with RA in order to provide initial insights into the mechanisms that can lead to pain hypersensitivity in sensory neurons.

## **Results**

# **Neuroanatomical and Metabolomic Analysis of DRGs**

Joint pain is a common symptom stemming from the inflammation and the autoimmune reactions that occur in RA patients, where arthralgia is typically an early indicator of RA and can often persist even with antirheumatic drug treatment that is used to prevent further joint destruction<sup>14</sup>. To examine the mechanisms involved in RA pain, we acquired DRGs from 5 individuals with RA along with 9 non-arthritic controls (Supplemental Tables 1 and 2). The DRG contains the soma of nociceptive neurons that relay pain from the periphery to the central nervous system (CNS). Until recently, there has been scarce availability of human DRGs for research, but now organ-donor networks can provide human DRGs for research<sup>19,20</sup>. Through these organ-donor networks, it is currently possible to acquire enough DRGs to statistically compare the gene expression changes between individuals with RA and non-arthritis controls.

We examined the L4 DRGs histologically to check for any signs of neuronal pathology while performing transcriptomic analysis on L5 DRGs to identify gene expression changes that could lead to neuroplastic pain hypersensitivity (Fig. 1).

Histological analysis of RA DRGs shows no discernable neuronal loss: Representative H&E images of A) control and B) RA L4 DRGs. No major pathological differences were identified between the controls and RA samples in terms of ganglionic cells nor inflammation (Supplemental Table 3). C) No statistical differences were seen in DRG neuronal densities between the donors.

Unlike our analysis of diabetic painful neuropathy (DPN), we did not see any indication of neuronal loss related to chronic joint pain (Supplemental Table S3)<sup>21</sup>. Overall, there were no significant differences in the average neuronal density between the RA subjects and the non-arthritic controls (Fig. 1).

Along with the histological evaluation of the DRGs, we had a portion of the S1 DRG sent for metabolic analysis<sup>22</sup> (Supplemental Table S4-6). DRGs from the donors were collected within 3 hours post-mortem, and, as such, there were no clear indications of any tissue degradation such as autolysis in any of the DRG samples. Although control 1 and 9 did show the most variation amongst each detected metabolite (data not shown), none of the flagged metabolites were indicative of oxidation, degradation, or cell lysis. Our metabolomic analysis did, however, indicate that there may be increases in uric acid and 3-Aminoisobutyric acid (BAIBA). Increased uric acid has been associated with inflammation, metabolic disorders, and cardiovascular disease, yet a clear link between uric acid and these maladies is still considered debatable<sup>23</sup>. The increased BAIBA in the RA individuals, on the other hand, seemed counter to aspects of RA pathology as it is generally considered as an exercise-induced osteocyte survival factor<sup>24</sup>.

# Comparative Transcriptomic Analysis of DRGs from RA Subjects and Control

For our transcriptome analysis, we purified RNA from bilateral L5 DRGs from the RA subjects to account for possible asymmetry in the presentation of symptoms<sup>25</sup>, while we only examined one of the L5 DRGs from the non-arthritic controls as no notable phenotypic dissymmetry in the DRG would be expected in those individuals. Bulk RNA-seq of the L5 DRGs identified 128 differentially expressed genes (DEGs); 67 genes upregulated in the RA subjects while 61 genes were downregulated compared to the non-arthritic controls (Fig. 2A and B; Supplemental Tables S7-11).

RNA-seq analysis identified 128 DEGs between RA and non-arthritic controls: A) As seen in the heatmap (Z-score), 67 of these genes were upregulated while 61 were downregulated in the RA donors compared to the non-arthritic controls. B) Scatterplot depicts base mean versus fold difference. C) Our analysis showed that cell signaling seems most affected with RA, so ligand-receptor interactome data was used to depict possible changes in cellular communication.

Of the DEGs, 41% (52/128) were protein-coding genes, 16% (20/128) were RNA genes (mostly long noncoding RNAs; Supplemental Fig. 1A), while the rest were either pseudogenes or have not been characterized.

Of the 52 protein-coding DEGs, almost half encode for either a secreted protein (n = 14) or a protein with a transmembrane helix (n = 10). Consequently, components of cell signaling (receptors and intracellular molecules) in the DRGs appear to be prominently impacted by RA, especially with the dysregulated expression of 9 cell surface receptors (Supplemental Fig. 1B-D). Cell signaling is vital for nociceptors in detecting tissue damage and/or cell stress. As such, we wanted to further explore ligand-receptor interactions within our data set. In Fig. 2C, we used ligand-receptor interactome data to map out potential changes in cellular communication<sup>26</sup>. Amongst the ligand-receptor interactions, the upregulation of *EFNB3* and *NTRK1* is noteworthy in that both have a role in axonogenesis, particularly as axonal degeneration has been seen in sural nerve biopsies of some RA patients<sup>27,28</sup>. Despite the overall increased expression in immune response genes in the RA donors (Supplemental Table S5), our interactome analysis additionally does show downregulation of *FLT3*, which is important for leukocyte homeostasis. Downstream of cell signaling, we identified 4 transcriptional regulators within our list of DEGs: *PAX3*, *DLX5*, *TP63*, and *VSX1*. *PAX3* and *DLX5* are both upregulated and are known to be involved in early neural crest cell specification, with *PAX3* implicated as a top transcription factor for at the least 3 of our DEGs (*SEC62*, *CLUL1*, and *HTR3B*; all downregulated)<sup>29,30</sup>.

# Upregulated neuronal genes in RA

Next, we were able to break down our list of DEGs to identify signature genes related to the peripheral nervous system (PNS), glia (oligodendrocytes), and peripheral blood cells (Fig. 3)<sup>31</sup>.

DEGs from bulk RNA-seq was analyzed using the ARCHS4 dataset to characterize the impact of RA on different DRG cell types: Heatmaps were generated of genes associated with A) peripheral neurons and B) glial cells. Of note, there is some overlap in genes within each of these two cell types. C) Signature genes for peripheral blood cells were also detected in our transcriptomic analysis, which is probably indicative of immune cells within the DRG.

Unlike DPN, where neuronal loss consequently caused the decreased expression in neuronal markers<sup>21</sup>, most neuronal signature genes in the RA donors appear instead to be upregulated (Supplemental Fig. 2A). For example, three genes related to neurogenesis were upregulated: *EFNB3*, *PAX3*, and *NTRK1*<sup>32</sup>. In addition, the glycine transporter *SLC6A9* was upregulated along with the neuronal gene for *HAP1*. *HAP1*, *SLC6A9*, *EFNB3*, and *NTRK1* are all linked with synaptic signaling, which again, differs from DPN where genes involved in synaptic function were predominantly downregulated. Lastly, we detected the upregulation of an uncharacterized protein-coding gene, *C20orf203* (FLJ33706), that is thought to be human specific and, more importantly, could be involved in neuronal functions<sup>33</sup>. Beyond these signs of altered neuronal activity, we also wanted to examine which specific neuronal subtypes could be impacted by RA using the harmonized cell atlas for the DRG (Fig. 4A)<sup>34</sup>.

Several neuronal genes are dysregulated between RA donors and controls: A) A harmonized crossspecies DRG cell atlas was used to map out which neuronal subtypes could be most impacted with RA. RNAscope was performed on sections of B) control and C) RA DRGs to label NTRK1<sup>+</sup> (White) and SLC17A7<sup>+</sup> (Green) neurons (DAPI – Blue). *NTRK1* was upregulated in the DRGs of the RA donor and is generally expressed in unmyelinated C-fibers. *SLC17A7* was alternatively used as a marker for large, myelinated fibers. D) While there was no significant difference in the proportion of either neuronal population, E) semi-quantitative scoring shows that the percent of strongly expressing *NTRK1* cells (> 15 dots/neuron) is higher in the RA donors than the controls, which correlates with the RNA-seq data.

The harmonized cell atlas dataset shows that RA-mediated joint pain would likely affect DRG neurons akin to the mouse non-peptidergic 2 (NP2) neuronal cluster. NP2 neurons are positive for both the chloroquine receptor Mrgpra3 (MRGPRX1 in humans) and TRPV1 and relay pain and itch, but Mrgpra3<sup>+</sup> neurons are considered a rarer DRG subtype<sup>35</sup>.

The upregulated gene *NTRK1* codes for TrkA, the receptor for nerve growth factor (NGF) that is known to promote hyperalgesia<sup>36</sup>. Because of its clear role in nociception, we used RNAscope in situ hybridization to further characterize the expression of *NTRK1* in the DRG of individuals with RA. *NTRK1* is known to be mainly expressed in unmyelinated C-fibers<sup>37</sup>. As a contrast to *NTRK1*, we also wanted to label large diameter sensory neurons in the DRG using *SLC17A7*, mainly to serve as a control<sup>21</sup> (Fig. 4B and C). There was no change in the actual number of NTRK1<sup>+</sup> neurons, but semi-quantitative scoring shows that the percent of strongly expressing *NTRK1* cells (> 15 dots/neuron) was higher in RA, which is in line with its upregulated expression in the RNA-seq data (Fig. 4D and E). SLC17A7<sup>+</sup> neuronal numbers were unchanged (Fig. 4D), while semi-quantitative counting shows possibly a slight difference in the percent of highly expressing *SLC17A7* neurons, (Supplemental Fig. 2B).

# Immune response genes altered with RA

Sural nerve biopsies from some RA patients have shown indications of perivascular lymphomononuclear cell infiltrates and vasculitis<sup>27</sup>, so we decided to examine the DRGs from RA donors for any pathological signs of inflammation. While initial H&E staining showed lymphocytic foci within both the RA and control donors (Supplemental Table S3), we still stained for T cells and macrophages in the DRGs to test for any abnormal immune pathology. No differences were seen with immunostaining for CD3<sup>+</sup>, a pan T cell marker, between both groups. For macrophages, we performed immunohistochemistry for the scavenger receptor CD163. We focused on this receptor because CD163 labels a subset of peripheral macrophages known to reside in close proximity to sensory neurons, soluble CD163 is elevated in the sera of patients with RA, and synovial CD163 mRNA expression is linked to resting pain in patients with hip osteoarthritis<sup>38,39,40</sup>. With the CD163 staining, there is a trend toward increase numbers of CD163<sup>+</sup> macrophages (Fig. 5A and B: 3 out of 5 RA donors have > 50 CD163<sup>+</sup> cells/high-power field [HPF; 40X] compared with just 2 out of 7 controls, although the number of donors tested is too limited to be conclusive).

Signs of increased inflammation in the DRGs of the RA donors: CD163 immunostaining of A) control and B) RA DRGs. 3 out of 5 RA donors have > 50 CD163<sup>+</sup> cells/high-power field (HPF; 40X) compared with just 2 out of 7 controls (Supplemental Table S3). Network analysis on deregulated genes using Ingenuity

Pathway Analysis (IPA) identified that organismal abnormality related, immune response related, and connective tissue related networks are perturbed. C) IPA generated network of immune related genes, where IL-15 producing kinases such as MST1R and NTRK1 were upregulated. D) Heatmap of DEGs involved in immune system processes (G0:0002376).

This increase may possibly be echoed by the upregulated expression of the *MST1R* (Recepteur d'Origine Nantais/Macrophage-Stimulating Protein Receptor) in the RA donors, which promotes M2 macrophage polarization<sup>41</sup>. Importantly, DRG macrophages are known to respond to damage-associated molecular patterns (DAMPs) and are linked with promoting neuropathic pain<sup>42</sup>. Additionally, there was also moderate fibrosis, possibly related to inflammation, in 2 RA individuals that concomitantly had higher numbers of CD163<sup>+</sup> cells, but, again, our sample size is too small to determine if the fibrosis is linked with the increase in macrophages.

Due to the autoimmune nature of RA, we unsurprisingly identified genes related to immune responses in our transcriptomic analysis (Fig. 5C and D). For example, a total of 5 immunoglobin genes were detected to be upregulated in the DRGs of patients with RA. 4 of these 5 immunoglobulin genes, (*IGHG2*, *IGHG3*, *IGLC2*, and *IGKV1-33*) also showed increased expression in DPN as well<sup>21</sup>. Sensory neurons lack the machinery to secrete antibodies, which suggests that there could be activated B-cells within the DRG, yet only faint staining for CD20 and CD79a was seen<sup>43</sup> (data not shown).

Other immune features detected in our transcriptome analysis include the upregulation of *C2CD4A*, which plays a role in vascular permeability during inflammation, and the glial gene *GPR17*, which may be indicative of damage to the myelin sheath <sup>44,45,46</sup>. Also of note, there was upregulation of *MEGF6*, a gene that has been associated with SAPHO syndrome (Synovitis, Acne, Pustulosis, Hyperostosis, and Osteitis) <sup>47</sup>. Lastly, *IL-20RB* was downregulated in the RA subjects even though IL-20R cytokines are typically upregulated in the synovial fluid of RA patients <sup>48</sup>. IL-20RB knock down in T-cells can lead to increased expression of IL-2 and IFN- $\gamma^{48}$ . IL-20RB (IL20RB) forms a heterodimer signaling complex with IL-20RQ (*IL20RA*), which is interestingly downregulated with DPN<sup>21</sup>.

The DRG is densely vascularized with capillaries that are fenestrated <sup>49,50</sup>. As seen in Fig. 3C, we detected signature genes indicative of peripheral blood cells that are likely derived from DRG immune cells. For example, single cell sequencing in mice has identified macrophage, neutrophil, and B cell clusters within the DRG <sup>51,38</sup>. Other genes identified in our RNA-seq analysis can also be expressed by multiple cell types like immune cells <sup>52</sup>. We thereby wanted to clarify which DEGs identified in our bulk sequencing were localized to the DRG and which may originate from circulating immune cells. Unfortunately, blood samples were not collected during organ retrieval, so, we resorted to running a small bulk RNA-seq analysis using peripheral blood mononuclear cells (PBMCs) from a separate cohort of RA patients and healthy controls (6 individuals per group) and looked for any overlap in the DEG datasets (Supplemental Tables S12-14, Supplemental Figs. 3 & 4). We decided to run this small bulk RNA-seq experiment as most reported transcriptomic data of PBMCs from RA patients were either generated using microarrays

or used FACS analysis to look at specific immune cell subsets  $^{53}$ . Only 8 genes were common to both datasets, even with a total of 1,468 DEGs uncovered in the PBMC RNA-seq analysis. Of the overlapping genes, only 3 out of 8 were dysregulated in the same direction, which suggests that the DEGs identified in the DRG of RA patients mostly likely reflect gene expression changes occurring within the resident DRG cell populations rather than from circulating immune cells. Although there was increased expression of immunoglobulin genes in both datasets, only *IGLV1-40*, which encodes a  $\lambda$  light variable region, was upregulated in both PBMCs and DRGs of RA subjects. The expression of *SNX15* was upregulated in both the DRG and PBMC data sets as well, which may be symptomatic of disrupted protein trafficking to recycling endosomes  $^{54}$ . Lastly, Sec62, an ER-phagy receptor, was downregulated in both the DRG and PBMC data sets, where decreased expression may cause reduced ER stress tolerance  $^{55}$ .

## **Discussion**

RA is considered an archetypal autoimmune disorder with pain often rated as one of the top therapeutic priorities by patients <sup>56,57</sup>. As such, we decided to perform transcriptomic analysis using DRGs from 5 RA donors and 9 non-arthritic controls in order to better understand the mechanisms that promote pain hypersensitivity. A key objective to our transcriptomic study was to identify potential disease mechanisms that promote peripheral sensitization of DRG neurons in autoimmune disorders, particularly since pain can persist in RA patients even while joint damage is being treated by DMARDS<sup>2,57</sup>. In our analysis of RA-mediated inflammatory pain, the upregulation of *NTRK1*, which encodes TrkA, is notable as NGF is known to promote hyperalgesia<sup>36</sup>. Inhibition of TrkA is also known to alleviate pain in rodent models of carrageenan and collagen-induced arthritis<sup>58</sup>, but clinical trials to treat osteoarthritis pain with tanezumab, a monoclonal antibody against NGF, were discontinued because of a higher risk of joint damage despite reduced pain<sup>59</sup>.

The overexpression of immunoglobulins seen in our transcriptomic analysis could impact pain hypersensitivity. Anticitrullinated protein antibodies (ACPA) are common in most patients with RA, and Wigerblad et al.  $^{14}$  showed that the injection of ACPA into mice causes mechanical and thermal hypersensitivity. ACPA did not act directly on sensory neurons to increase their excitability, rather, it caused hyperalgesia by prompting osteoclasts to release chemokines. Wang et al.  $^{60}$  also reported that Fc $\gamma$ RI, a receptor for IgG immune complex (IgG-IC), was expressed on a subset of joint-innervating sensory neurons and that IgG-IC activated these sensory neurons via Fc $\gamma$ RI signaling. These and many other reports  $^{61,62}$  suggest that autoantibodies can promote pain even despite controlling for joint damage using DMARDs.

Besides the immunoglobulin genes that are shared between RA and DPN, we identified 4 additional key genes that are dysregulated in the same direction in these chronic pain disorders as well (Supplemental Fig. 4). Of these, *G6PC2* of the glucose-6-phosphatase (G6Pase) catalytic enzyme system is downregulated and is interestingly a major target for cell-mediated autoimmunity in diabetes<sup>63</sup>, yet

G6PC2 is mostly known to be expressed in pancreatic islets and its role in the DRG needs to be further studied. The three remaining shared genes between RA and DPN are all upregulated. This includes KCNJ8, which codes for the potassium inwardly rectifying channel Kir6.1. Kir6.1 is one of two KATP channels considered to act as metabolic sensors to regulate responses to hyperglycemia, hypoglycemia, ischemia, and hypoxia<sup>64,65</sup>. KCNJ8 is expressed in contractile cells including pericytes within the DRG<sup>34</sup>. KNCJ8 may have a role as a "molecular rheostat", possibly controlling blood flow to the DRG<sup>66,67</sup>. Increased expression of TRIM17 is also of interest as it is considered a putative stress sensor<sup>68</sup>. Generally, TRIM17 is expressed at low levels but it can be induced during cellular stress. Most studies on TRIM17 have shown that it can initiate neuronal apoptosis<sup>69</sup>. This somewhat contrasts with some of our other findings, though, as we see upregulation in genes implicated in neurogenesis in the RA donors and a lack of any visible neuronal loss. Lastly, the gene for HAP1 is upregulated, which codes for the Huntington-associated protein 1. HAP1 is found to be expressed in small and medium diameter DRG neurons and can be upregulated in the DRG of rodent models of neuropathic pain<sup>70</sup>. HAP1 deficiency (HAP1+/- mice) reduces mechanical allodynia and heat hyperalgesia while also attenuating the hyperexcitability of DRG neurons in these neuropathic pain models.

In conclusion, here we provide a first of its kind study examining gene expression changes within the DRGs of humans with RA. We identified dysregulated genes in the RA subjects related to immune processes and neurological functions. Progress has been made in defining the human "nociceptome"<sup>71</sup>, but further research is also needed to identify and potentially target maladaptive transcriptomic changes that arise from inflammatory pain. While some of the gene expression changes in our RA study could be expected, we have still uniquely identified dysregulated genes of interest that warrant further investigation.

### **Methods**

# **Human Dorsal Root Ganglia Preparation:**

DRGs from 5 individuals experiencing RA and 12 non-arthritis controls were acquired from Anabios (San Diego, CA), all obtained with the informed consent from all the participants (Table 1).

Table 1 Demographics on the DRG donors used in this study. BMI = Body Mass Index, COD = Cause of Death.

Approval for carrying out these studies was obtained from the National Institutes of Health (NIH) Office of Human Subjects Research Protection (OHSRP). All methods were performed in accordance with the guidelines and regulations approved by NIH Biosafety Committee, Bethesda, MD, USA. L4, L5, and S1 DRGs were chosen as these ganglia contain the soma of the primary afferent neurons innervating the joints within the foot (L5 DRGS were used for RNA sequencing, L4 DRGs were used for immunohistochemistry, and  $\sim 50$  mg of the S1 DRGs were used for metabolomic analysis [see

supplemental methods]). DRGs were collected under cold ischemic conditions, generally 3 hours post cross-clamp of the aorta. DRGs were either snap frozen or stored in RNAlater (Ambion, Austin, TX).

# **RNA-seq Analysis:**

L5 DRGs from 5 RA patients were compared with 9 non-arthritis controls. The 5 RA donors include 4 females and 1 male (Age: 57 ± 3.1 SEM; BMI: 39.4 ± 3.4 SEM). RA is generally considered to cause symmetrical joint damage but can be asymmetrical early in the course of the disease 25. We therefore opted to sequence both L5 DRGs from the RA donors to compensate for this probability. A single DRG, however, was judged to be adequate for the 9 non-arthritis controls, as typically no major gene expression differences would be anticipated between adjacent L5 DRGs in the non-arthritic individuals. For the controls, there were 5 males and 4 females in total (Age: 47 ± 3.1 SEM; BMI: 21.1 ± 1.9 SEM). The controls were donors with no known history of chronic pain such as osteoarthritis, back pain, knee pain, etc. Since the incidence of chronic pain can often increase with age, the donors without pain were statistically younger than the RA donors, with about a 10-year age difference (unpaired t-test, p = 0.01). To account for this difference, we factored for age along with sex as a covariate during gene expression analysis with DESEQ2 (see below). The control donors were generally listed as either having a stroke (CVA) or head trauma. As organ donors, only a limited patient history was available. The medical history about the donors is obtained from the next of kin through an extensive interview with family members by a trained interviewer (Supplemental Table S1). RNA from the L5 DRGs was extracted using a RNeasy Midi Kit (Qiagen, Valencia, CA) as previously described<sup>21</sup>. RNA quality was scored using a Bioanalyzer (Agilent, Santa Clara, CA) and RINs between 7-9 were obtained (Supplemental Table S4), indicating some moderate degradation.

Libraries were prepared and samples were sequenced at the NIH Intramural Sequencing Center (Rockville, MD) as previously described<sup>21</sup>. Briefly, libraries were generated using Illumina TruSeq mRNA Sample Prep Kit (polyA + method) (San Diego, CA) and sequenced with an Illumina NovaSeq-6000. For the human DRG RNA-seq, paired-end sequencing was performed with read length of the 151 bp. Read quality was checked using FASTQC version 0.11.6. Trimming was performed using BBTools version 38.42 to trim 20 bp off from 5'-end and 30 bp off from 3'-end. The alignments were performed using STAR version 2.7.2a to the hg38 reference human genome and Gencode release 27 for transcriptome annotation. Read counts per gene per sample were quantified using HTSeq version 0.9.1. Supplementary Table S11 shows alignment statistics and the total number of reads mapped to genes per sample. A list of differentially expressed genes (DEGs) between the RA and the control samples was generated using DESEQ2 version 1.24.0<sup>72</sup>. Sex and age were treated as covariates when building the generalized linear model for DESEQ2 analysis, hence, removing unwanted variation due to these factors. With an adjusted p-value cutoff of 0.05 by Benjamini Hochberg's False Discovery Rate (FDR), differential expression analysis returned 67 upregulated genes and 61 downregulated genes in the RA subjects compared to the non-arthritic controls.

Functional data of the DEGs was analyzed using GeneCards<sup>30</sup>, and ToppGene<sup>32</sup>. Cell type expression data was determined using the harmonized cell atlas for the DRG<sup>34</sup> and with the All RNA-seq and ChIP-seq sample and signature search (ARCHS4) dataset within Enrichr<sup>31</sup>. All 128 dysregulated genes were also entered into Ingenuity Pathway Analysis (IPA) (Qiagen, Valencia, CA) to identify enriched pathways and potential upstream regulators. Heatmaps were generated with the R package Pretty Heatmaps and show the Z-Score of normalized DESEQ2 gene counts. The interactome analysis was generated from data in Wangzhou et al.<sup>26</sup> using SankeyMATIC.

# Histology, Immunohistochemistry, and RNAscope Analysis:

For histological analysis, frozen L4 DRGs were temporarily held at -20°C for cutting purposes, sliced in half, and immediately placed in fixative (10% buffered formalin). The DRGs were then paraffin embedded and 6µm sections were cut. Slides were stained with H&E for general histological evaluation. Immunohistochemistry was conducted by Histoserv (Germantown, MD). Immunostaining for T cells using CD3 was performed as previously described<sup>21</sup>, while DRG macrophages were labeled with CD163 (MRQ-26; Millipore Sigma, St. Louis, MO) according to the manufacturer's protocol. Formalin fixed paraffin embedded (FFPE) sections from the L4 DRG were used for in situ hybridization (5 controls and 5 RA donors). SLC17A7 and NTRK1 were labelled with RNAscope® technology by Advanced Cell Diagnostics, Inc. (ACD, Newark CA) as previously described<sup>73,21</sup>. Paired double-Z oligonucleotide probes were designed against Hs-NTRK1 (cat no. 402638) and Hs-SLC17A7 (cat no. 415618). Visual, semi-quantitative scoring of both NTRK1 and SLC17A was performed by ACD. Briefly, dots correlate to the number of individual RNA molecules and neurons were visually scored on a 0–4 scale (0 being no staining while 4 represents cells with > 15 dots).

### **Declarations**

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### Contributions

B.E.H. and A.B.K. conceived the project, designed the experiments, interpreted data, and supervised the study. E.M., M.C., M.D., A.T., and C.J. performed most experiments. S.Y. performed the data analysis. B.E.H. analyzed data with the assistance of K.M. and S.T. B.E.H. wrote the original draft manuscript.

A.B.K., T.J.P., M.D.B., and S.Y. reviewed, and revised of the manuscript. All authors had the opportunity to discuss the results and comment on the manuscript.

### Conflict of Interest

All authors have declared that no conflict of interest exists. TJP is a co-founder of Doloromics, a company developing novel pain therapeutics. Doloromics played no role in this study.

### Data availability

All datasets are available through the dbGaP with accession code - phs002548.v1.p1

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# **Tables**

Table 1 is available in the Supplementary Files section.

# **Figures**

Figure 1

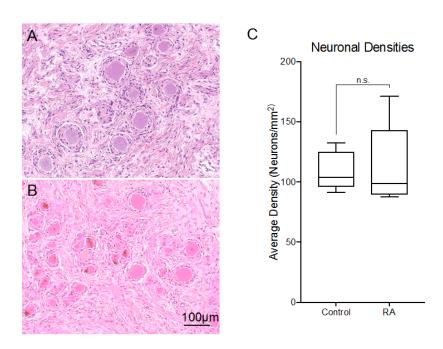


Figure 1

Histological analysis of RA DRGs shows no discernable neuronal loss: Representative H&E images of A) control and B) RA L4 DRGs. No major pathological differences were identified between the controls and RA samples in terms of ganglionic cells nor inflammation (Supplemental Table 3). C) No statistical differences were seen in DRG neuronal densities between the donors.

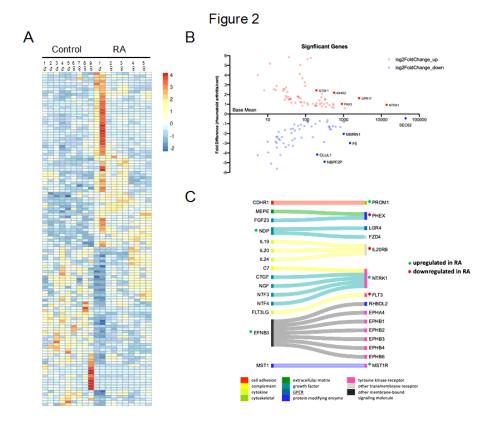


Figure 2

RNA-seq analysis identified 128 DEGs between RA and non-arthritic controls: A) As seen in the heatmap (Z-score), 67 of these genes were upregulated while 61 were downregulated in the RA donors compared to the non-arthritic controls. B) Scatterplot depicts base mean versus fold difference. C) Our analysis showed that cell signaling seems most affected with RA, so ligand-receptor interactome data was used to depict possible changes in cellular communication.

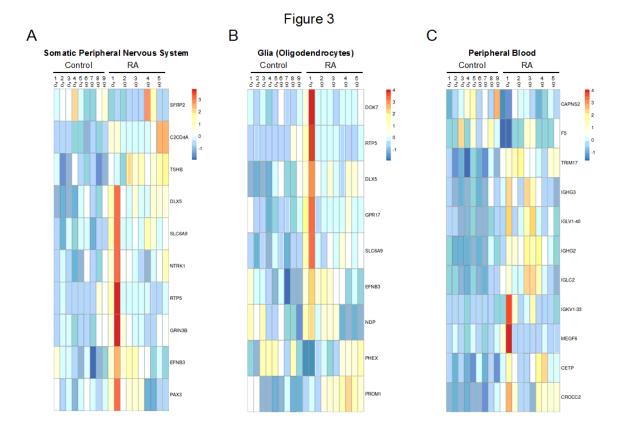


Figure 3

DEGs from bulk RNA-seq was analyzed using the ARCHS4 dataset to characterize the impact of RA on different DRG cell types: Heatmaps were generated of genes associated with A) peripheral neurons and B) glial cells. Of note, there is some overlap in genes within each of these two cell types. C) Signature genes for peripheral blood cells were also detected in our transcriptomic analysis, which is probably indicative of immune cells within the DRG.

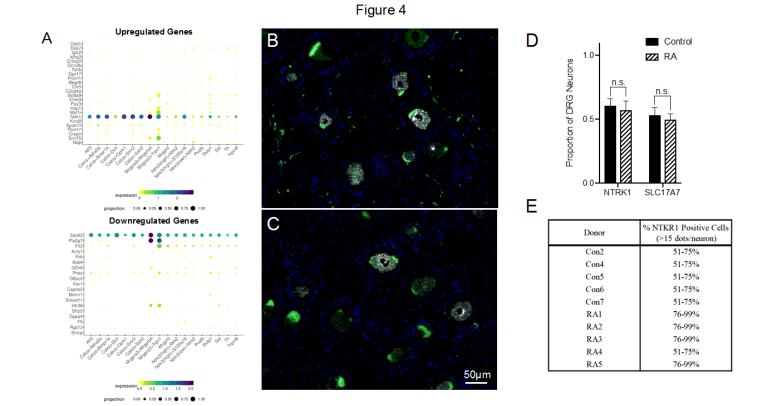
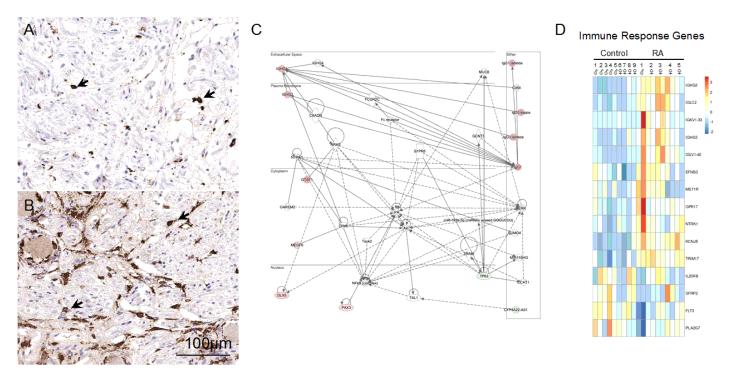


Figure 4

Several neuronal genes are dysregulated between RA donors and controls: A) A harmonized cross-species DRG cell atlas was used to map out which neuronal subtypes could be most impacted with RA. RNAscope was performed on sections of B) control and C) RA DRGs to label NTRK1<sup>+</sup> (White) and SLC17A7<sup>+</sup> (Green) neurons (DAPI – Blue). *NTRK1* was upregulated in the DRGs of the RA donor and is generally expressed in unmyelinated C-fibers. *SLC17A7* was alternatively used as a marker for large, myelinated fibers. D) While there was no significant difference in the proportion of either neuronal population, E) semi-quantitative scoring shows that the percent of strongly expressing *NTRK1* cells (>15 dots/neuron) is higher in the RA donors than the controls, which correlates with the RNA-seq data.

Figure 5



### Figure 5

Signs of increased inflammation in the DRGs of the RA donors: CD163 immunostaining of A) control and B) RA DRGs. 3 out of 5 RA donors have >50 CD163<sup>+</sup> cells/high-power field (HPF; 40X) compared with just 2 out of 7 controls (Supplemental Table S3). Network analysis on deregulated genes using Ingenuity Pathway Analysis (IPA) identified that organismal abnormality related, immune response related, and connective tissue related networks are perturbed. C) IPA generated network of immune related genes, where IL-15 producing kinases such as MST1R and NTRK1 were upregulated. D) Heatmap of DEGs involved in immune system processes (G0:0002376).

# **Supplementary Files**

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- floatimage6.png
- HalletalRASupplementalMaterial03222024.docx