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1 Single-Soma Deep RNA Sequencing of Human Dorsal Root Ganglion Neurons Reveals

2 Novel Molecular and Cellular Mechanisms Underlying Somatosensation

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47 Abstract:

The versatility of somatosensation arises from heterogeneous dorsal root ganglion (DRG) neu-48 rons. However, soma transcriptomes of individual human DRG (hDRG) neurons - critical in-49 50 formation to decipher their functions - are lacking due to technical difficulties. Here, we developed a novel approach to isolate individual hDRG neuron somas for deep RNA sequencing 51 (RNA-seq). On average, >9,000 unique genes per neuron were detected, and 16 neuronal types 52 were identified. Cross-species analyses revealed remarkable divergence among pain-sensing neu-53 rons and the existence of human-specific nociceptor types. Our deep RNA-seq dataset was espe-54 cially powerful for providing insight into the molecular mechanisms underlying human 55 somatosensation and identifying high potential novel drug targets. Our dataset also guided the 56 selection of molecular markers to visualize different types of human afferents and the discovery 57 58 of novel functional properties using single-cell in vivo electrophysiological recordings. In sum-59 mary, by employing a novel soma sequencing method, we generated an unprecedented hDRG neuron atlas, providing new insights into human somatosensation, establishing a critical founda-60 61 tion for translational work, and clarifying human species-specific properties.

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70 Introduction:

The somatosensory system conveys senses, such as temperature, touch, vibration, and body posi-71 tion¹. Primary somatosensory neurons, which convert stimuli to electrical signals, are located in 72 the dorsal root ganglia (DRG) and trigeminal ganglia $(TG)^2$. They are greatly heterogeneous. 73 composed of many different molecularly and functionally distinct populations³. Somatosensation 74 is fundamental to our daily lives, but becomes a devastating human health problem when mal-75 functioning, such as during chronic pain and itch. Safe and effective drug options for chronic 76 pain and itch are still limited⁴⁻⁶, and the development of novel treatment strategies is greatly 77 needed. 78

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Most of our current knowledge about the mammalian somatosensory system has been obtained 80 81 from model organisms, mainly rodents. However, the success rate of translating treatment strategies working in model organisms such as rodents to humans has been low^{7,8}. There may be mul-82 tiple reasons for the lack of success, but a noticeable one is species differences of the genetic, 83 84 molecular and potentially even cellular makeup of somatosensory neurons between rodents and humans. Some significant differences between rodent and human DRG (hDRG) neurons have 85 been noticed in previous studies, with neuropeptides, ion channels, and other markers not always 86 matching between the species^{9,10}. For an example, MRGPRX4, a bile acid receptor for human 87 cholestatic itch, does not have a molecular ortholog in mice¹¹. In contrast, TGR5, a receptor 88 identified in mouse DRG neurons for bile acid-induced itch¹², is not expressed in hDRG neurons 89 but instead in the surrounding satellite glial cells¹¹. Thus, it is critical to elucidate molecular pro-90 files and cell types of hDRG neurons for understanding human somatosensory mechanisms as 91 92 well as for translational purposes.

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Single-cell RNA sequencing (RNA-seq) is a powerful tool to qualitatively and quantitatively 94 study transcripts of individual cells (soma and/or nuclei)¹³. Based on the transcriptome, including 95 96 both transcript identities and expression levels, heterogenous cells can be classified into different types¹⁴. This approach has been successfully used in varying degrees to study DRG and TG neu-97 rons in mouse, macaque and other model organisms¹⁵⁻¹⁸, providing comprehensive molecular and 98 99 cellular atlases for understanding somatosensory neurons and their differentiation. However, there are some unique technical challenges for conducting single-cell RNA-seq of human DRG 100 or TG neurons: 1) Human tissues are more difficult to obtain compared to model organisms, and 101 the quality of human tissues (RNA integrity) is much more variable; 2) In human DRG/TG tis-102 sues, non-neuronal cells, including satellite glial cells, fibroblasts, and other cell types, greatly 103 outnumber the neuronal cells^{9,19}; 3) Satellite glial cells tightly wrap around neuronal somas^{9,19}, 104 105 making their physical separation difficult; 4) Human DRG/TG neuronal somas are much larger than those of mouse DRG/TG neuronal somas, so they are prone to damage by enzyme digestion 106 107 and mechanical forces during single-cell isolation and not compatible with many current sequencing platforms. In addition, transcriptome changes caused by enzymatic and mechanical 108 dissociation may also affect cell clustering and cell type identification²⁰. Due to these difficulties, 109 110 single-nucleus RNA-seq and 10x Visium spatial transcriptomics have been employed for human DRG/TG neurons²¹⁻²⁴. Despite novel insights from these studies, the quantity of transcripts in the 111 nucleus is much lower than those in the soma, and the nuclear transcripts may not represent the 112 full transcriptome profile of the whole cell²⁵, while the 10x Visium spatial transcriptomics lack 113 single-neuron resolution (Fig. 1A). Thus, it is necessary to develop a new method that enables 114 soma RNA-seq of hDRG neurons while preserving the single-cell resolution. 115

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To meet this challenge, we developed a novel approach by combining laser capture 117 microdissection (LCM) for isolating individual neuronal somas and the Smart-seq2¹⁸ for generat-118 119 ing full length RNA-seq libraries (Fig. 1A). We sequenced 1066 hDRG neurons with minimum satellite glial cell contamination from six lower thoracic and lumbar DRGs of three donors, de-120 tecting an average of >9,000 unique genes per neuron (~ 3-5 times or more than the previous 121 single-nucleus RNA-seq results) and identifying 16 molecularly distinctive neuron types. Cross-122 123 species analysis revealed both similarities but considerable differences among human, macaque, and mouse DRG neurons. In addition, we uncovered a set of novel marker genes that can help to 124 distinguish different types of sensory neurons and afferents in hDRG and skin tissues. Based on 125 the molecular profiles, we also predicted novel response properties of human sensory afferents, 126 127 which were tested and confirmed by single-cell *in vivo* recordings. These results support a close 128 relationship between the molecular profiles uncovered by single-soma RNA-seq, histology, and 129 functional properties of human sensory afferents, highlighting the precision and unique utility of 130 this dataset in guiding functional studies of human somatosensory neurons. In short, we have established a novel approach to conduct single-soma deep RNA-seq of hDRG neurons, which 131 revealed previously unknown neuronal types and functional properties. Given the high number 132 133 of unique transcripts recovered from each neuron, our dataset is especially powerful for molecular discovery, such as identifying potential high value novel drug targets. We believe that this 134 high-fidelity single-soma RNA-seq dataset will serve as a ground reference for homogenizing 135 RNA-seq data of human DRG/TG neurons using different approaches and for translating animal 136 studies into therapeutic applications. 137

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139 Results

Development of an LCM-based approach for conducting single-soma deep RNA-seq of human DRG neurons

142 Adult human DRG neurons present considerable technical challenges for high-quality single-cell RNA-seq study. To overcome these hurdles, we developed a novel method that utilizes the laser 143 capture microdissection to isolate individual neuronal soma and combine with Smart-seq2 full 144 length RNA-seq library generation method for single-soma high-depth transcriptomic analysis 145 (Fig. 1A). Six hDRGs at the low thoracic (T11-T12) and lumbar (L2-L5) levels from three post-146 mortem donors (donor information and screening criteria are summarized in the supplementary 147 tables 1 & 2) were procured through NDRI (National Disease Research Interchange). DRGs 148 were extracted and immediately frozen in OCT (within ~ 6 hours after death) at the NDRI pro-149 150 curement sites to minimize RNA degradation. Fresh frozen DRGs were cryo-sectioned, mounted onto LCM slides, and briefly stained with a HistoGeneTM dye for cell visualization (Fig. S1A-C). 151 Individual neuronal somas were discernable under microscope and dissected by a laser (Fig. 1A). 152 153 Each detached soma dropped into a tube cap containing cell lysis buffer for library preparation (Fig. 1A). Dissected neuronal somas exhibited a similar size distribution as the whole DRG neu-154 ron population (Fig. S1D-E), suggesting no obvious sampling bias. Sequencing libraries were 155 generated following the Smart-seq2 protocol²⁶. In total, 1136 neuronal somas were dissected and 156 passed through the final quality control for sequencing. During preliminary bioinformatic analy-157 sis, 70 samples with obvious glial cell contamination (dominant expression of APEO, FABP7, 158 and other glia cell markers) were removed, and the remaining 1066 neurons were used for analy-159 sis in this study. 16 transcriptomic clusters of hDRG neurons were identified by Seurat²⁷ (Fig. 160 1B), with an average of 9486 genes detected per cell (Fig. 1C). No obvious batch effects or do-161

nor differences were observed in the clusters (Fig. S2A-E). All these cells expressed high levels
of known peripheral sensory neuronal markers, *SLC17A6 (VGLUT2)*, *SYP* (Synaptophysin), and *UCHL1 (PGP9.5)* (Fig. 1D, S2F-G).

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167 Anatomical and molecular features of hDRG neuron clusters

Mammalian DRG neurons have some well-known physiological, anatomical, and molecular fea-168 tures. DRG somatosensory afferents can be identified as A- or C- afferent fibers according to 169 axon conduction velocities²⁸. A-fiber DRG neurons usually have large-diameter somas and 170 myelinated axons, while C-fiber DRG neurons have small-diameter somas and non-myelinated 171 axons. The A- and C- afferents can be further divided into peptidergic and non-peptidergic types, 172 based on the expression of one neuropeptide, calcitonin related polypeptide alpha 173 (CALCA(CGRP))²⁹. To determine the broad types of the 16 hDRG neuron clusters, we analyzed 174 their soma sizes and expression of some key molecular markers (Fig. 1E). Clusters 1-16 were 175 176 arranged from small to large soma sizes. In addition, expression of neurofilament intermediate filament (INA), which was enriched in small-diameter DRG neurons, and heavy chain (NEFH), 177 which was highly expressed in large-diameter DRG neurons, showed a clear complementary 178 179 pattern. The combined morphological and molecular features suggested that clusters 1-7 were likely to be unmyelinated, small diameter C-fiber DRG neurons, whereas clusters 8-16 were 180 myelinated, large diameter A-fiber DRG neurons (Fig. 1E). The two groups could be further di-181 vided based on the expression of CALCA (clusters 5-12). Moreover, the PR domain zinc finger 182 protein 12 (PRDM12), a transcriptional regulator critical for development of human pain-sensing 183 afferents (nociceptors) and C fibers³⁰, was expressed in clusters 1-12, further distinguishing be-184

tween C- and A-fiber nociceptors versus A-fiber low-threshold mechanoreceptors (Fig. 1E).
Taken all information into consideration, clusters 1-4 were classified as non-peptidergic C-fibers,
clusters 5-7 as peptidergic C-fibers, clusters 8-12 as peptidergic A-fibers, clusters 13-15 as lowthreshold mechanoreceptors A-fibers (A-LTMRs), and cluster 16 as an unknown A-fiber type
(Fig. 1E).

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191 Based on the expression profiles of top molecular markers, which had either unique expression pattern or well-known functions (Fig. 1F, S2H), we named these 16 hDRG neuron clusters using 192 a nomenclature system with the following format (Fig. 1G): 1) The "h" at the beginning of each 193 cluster name indicated "human"; 2) mouse nomenclature was used for conserved subtypes (i.e. 194 most non-peptidergic neurons and A-LTMRs); 3) human peptidergic neuron types were desig-195 196 nated as hPEP.(marker gene). Briefly, for non-peptidergic C-fiber neurons, cluster 1 was named 197 hTRPM8, cluster 2 was C-fiber low-threshold mechanoreceptors (hC.LTMR), cluster 3 was type I non-peptidergic nociceptors (hNP1), and cluster 4 was type II non-peptidergic nociceptor 198 199 (hNP2). For peptidergic C-fiber neurons, cluster 5 was named hPEP.SST, cluster 6 hPEP.TRPV1/A1.1, and cluster 7 hPEP.TRPV1/A1.2. For peptidergic A-fiber neurons, cluster 8 200 was named hPEP.PIEZO^h (the superscript 'h' means 'high'), cluster 9 hPEP.KIT, cluster 10 201 202 hPEP.CHRNA7, cluster 11 hPEP.NTRK3, and cluster 12 hPEP.0 (no distinctive molecular marker). For A-LTMRs, cluster 13 was named A δ low-threshold mechanoreceptors 203 (hA\delta.LTMR), cluster 14 Aβ low-threshold mechanoreceptors (hAβ.LTMR), and cluster 15 pro-204 prioceptors (hPropr). Cluster 16 was named hATF3. 205

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To validate the clusters identified by Seurat analysis, we independently analyzed our data using 207 the graph-based clustering Conos³¹ package. Cluster structure revealed by Conos analysis repro-208 duced the Seurat results (Fig. S3A). As a third method to validate identified clusters, we em-209 ployed a neural network-based probabilistic scoring module^{15,18} that learned human cell type 210 features based on their molecular profiles (Fig. S3B-D). Namely, the accuracy score of our Seu-211 rat clustering assignment by the learning module was near 90% (Fig. S3B), which meant that 212 most cells were accurately assigned to their corresponding clusters, confirming the accuracy of 213 clustering (Fig. S3C). Moreover, the cell type consistency was validated by probabilistic simi-214 larity (Fig. S3D). Thus, three independent analysis methods confirmed the robustness of the clus-215 tering and strongly supported the cell type assignment. 216

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218 Using Conos we also performed co-clustering and label propagation with a recently published single-nucleus RNA-seq dataset of hDRG neurons by Nguyen et al²³ (Fig. S4). This analysis 219 showed that while some clusters displayed a one-to-one match between the two datasets, such as 220 221 hTRPM8, hPEP.SST, hPEP.KIT, and hAd.LTMR, most did not have one-to-one match. This mismatch could be caused by biological variations such as nucleus vs cytoplasm RNA species 222 and quantity²⁵ and technical differences (the increased resolution obtained by deep sequencing in 223 the present study or variability caused by the different technology platforms^{26,32}). This mismatch 224 also indicated that our dataset generated novel molecular profiles and cell types different from 225 the single-nucleus RNA-seq results. 226

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229 Cross-species comparison of DRG neuron types

230 Comparison of hDRG neuron types to those in model organisms helps to uncover the evolutional conservation and divergence of DRG neuron populations, provides clues about functions of 231 hDRG neuron populations, and identifies potential species-specific hDRG neuron populations. 232 233 Here we performed a cross-species comparison between our human dataset, a mouse dataset (Sharma)¹⁶, and a macaque dataset (Kupari, SmartSeq2 dataset)¹⁸. To identify corresponding 234 clusters between human and previously published mouse and macaque datasets, we used three 235 236 different strategies: Conos pairwise co-clustering followed by label propagation (Fig. 2A-B & 237 S5A-B), probabilistic neural network learning (Fig. S5C-D), and machine-learning based hierarchical clustering of an integrated dataset of human and macaque (Fig. S5E). For characteristics 238 and details of different approaches, see Method section. In all these analyses, human non-PEP 239 DRG neuron cell types showed high correlation to those of mouse and macaque, including 240 241 hC.LTMR, hNP1, hNP2, hPEP.SST (called NP3 in mouse and monkey), hTRPM8, hA6.LTMR, 242 hAB.LTMR, and hProprioceptor neurons (Fig. 2A-B & S5). hPEP.TRPV1/A1.1 and 243 hPEP.TRPV1/A1.2 corresponded to macaque PEP1 (Usoskin nomenclature) and mouse subclass 244 PEP1.4/CGRP-ɛ. This conclusion was supported by both Conos label propagation analysis (Fig. 2A-B) and probabilistic neural network analysis (Fig. S5C-D), suggesting that these clusters to 245 represent C-fiber thermoreceptors and nociceptors. Notably, four types of mouse C-fiber PEP 246 (CGRP) nociceptors have been evidenced^{18,33} (nomenclature from Emory & Ernfors/Sharma), 247 but our analysis indicated that mouse clusters PEP1.1/CGRP- α , PEP1.2/CGRP- β , and 248 PEP1.3/CGRP- γ might not be evolutionarily conserved, as they did not have equivalent types in 249 the human datasets (Fig. 2A & S5C). hPEP.CHRNA7 showed high correlation to mouse 250 251 PEP2/CGRP-ζ and macaque PEP2, while hPEP.KIT corresponded to mouse PEP3/CGRP-η and macaque PEP3, suggesting these clusters functionally belong to A-fiber nociceptors (Fig. 2A-B 252

& S5C-D). Interestingly, hPEP.NTRK3, hPEP.PIEZO^h, and hPEP.0, which made about half of 253 human PEP nociceptors that we sequenced, did not have a one-to-one corresponding cell types in 254 either mouse or macaque (Fig. 2A-B & S5C-D). Since macaque PEP2 cluster in the high-quality 255 256 Smart-Seg2 macaque dataset contained only three neurons, we focused our interpretation on analyses on mouse homologs for this cell type. hPEP.NTRK3 showed the greatest similarity to 257 mouse PEP2 (CGRP-ζ) by Conos propagation analysis (Fig. 2A). Probabilistic neural network 258 259 learning revealed similar scores to both mouse PEP2 (CGRP- ζ) and PEP3 (CGRP- η) (Fig. S5C). 260 Overall, it therefore seems that hPEP.NTRK3 represents a convergent mouse PEP2/3-like cell type. hPEP.PIEZO^h showed some similarity to mouse PEP3 (CGRP-η) and macaque PEP1 and 261 PEP3 in co-clustering (Fig. 2A-B). Neural network learning, and hierarchical clustering, indicat-262 ing this cell type to represent an A-fiber mechanosensory nociceptor (Fig. S5C-E). Thus, 263 hPEP.NTRK3 and hPEP.PIEZO^h represents diverged PEP2- and PEP3-like A-fiber nociceptors, 264 265 which likely have emerged as human species-specific sensory neuron types. hPEP.0, a type of human PEP A-afferents, showed no similarity to any mouse DRG neurons but some relationship 266 267 to macaque PEP1 and PEP3 (Fig. 2A-B), suggesting that they might be primate specific PEP nociceptors. A schematic overview of our conclusions based on the above analyses regarding the 268 cell-type homologs across mouse-macaque-human is illustrated in Fig. 2C. 269

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Transcription factors play critical role in DRG neuron development and differentiation³⁴. Thus, we performed a transcription factor associated gene regulatory network analysis (TF-GRNs) using machine learning to identify shared and species-specific TF-GRNs contributing to the similarities and differences between sensory neuron subtypes and species (Fig. 2D). Evolutionarily conserved TF-GRNs defining C-fiber nociceptors, A-fiber nociceptors, A-LTMRs, TRPM8, C-

fiber pruriceptors/nociceptors (hNP1, hNP2, hPEP.SST), and C-LTMRs were observed (vellow 276 277 boxes in Fig. 2D) as well as species-specific networks, such as for C-fiber nociceptors, hTRPM8, hNP1, hNP2, hPEP.SST and hC.LTMR (green boxes in Fig. 2D). Among cross-species con-278 279 served transcriptional regulators, some were previously known to drive sensory neuron diversification in mouse, including ZEB2 in C-fiber nociceptors³⁵, SHOX2 in A-LTMRs^{36,37}, RUNX3 in 280 proprioceptors³⁸, FOXP2 in TRPM8, RUNX1 in NP1³⁹, ZNF52 and POU4F2 in C-LTMRs^{16,40}. 281 These transcription factors may contribute to the formation of different DRG neuron cell types 282 and regulate the conserved and species-specific gene expression in each cell population. 283

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286 Similarities and differences of top marker genes across species

287 To reveal molecular differences among the corresponding cell types in human, macaque (Kupari)¹⁸, and mouse (Sharma)¹⁶, we selected the top 10 marker genes from each hDRG neuron 288 population and compared them across species (Fig. S6). In general, the expression patterns of 289 290 these genes were more similar between human and macaque than between human and mouse, reflecting the evolutionary distances between rodent, non-human primate, and human. Some 291 genes were expressed in the corresponding populations across all three species. For example, 292 293 TRPM8 was expressed in C-fiber cold-sensing neurons, and IL31RA was expressed in nociceptive/pruriceptive population (NP3) as well as its corresponding human population hPEP.SST. 294 Some genes, such as KCNVI, a voltage-gated potassium channel, were specific for primate 295 A\delta.LTMR but had low or no expression in the corresponding mouse DRG neurons (Fig. S6). 296 Moreover, some marker genes were specific only for hDRG neuron types. For example, 297 Mechanosensory Transduction Mediator Homolog (STUM) was specifically expressed in 298

hTRPM8, and calsequestrin 2 (*CASQ2*) was specifically expressed in hC.LTMR (Fig. S6). Genes
specifically enriched in hDRG neurons may confer unique physiological and functional properties of the human somatosensory system. The observed differences from the top 10 marker genes
represent only the iceberg tip of the overall molecular differences between human and model
organism DRG neurons, highlighting the necessity of validating molecular targets in hDRG neurons for translational studies.

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307 Molecular marker expression and validation of C-fiber pruriceptors, thermoreceptors and 308 nociceptors

Based on the sequencing results, we established specific marker genes or their combination to identify each type of hDRG neurons (Fig. S7A) and validated their expression using RNASCOPE multiplex fluorescent *in situ* hybridization (FISH) (Fig. S8). We also deduced potential functions of each hDRG neuron type based on the cross-species cell type comparison and expression of molecules with known sensory functions.

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hNP1 and hNP2 exclusively expressed MRGPRX1 (Fig. 3A), a Mas-related GPCR family member that could be activated by various pruritogens⁴¹. Similarly, primate specific bile acid receptor MRGPRX4 for mediating human cholestatic itch^{11,42} were detected by our single-soma dataset. Enrichment of MRGPRX4 and MRGPRX3 (an orphan GPCR in the same family) in hNP2 but not hNP1 helped to separate these two clusters (Fig. S7A). Other itch-related receptors, such as HRH1 and IL31RA (Fig. 3A-B), were also expressed in both hNP1 and hNP2, suggesting that these two populations function to detect various pruritogens and transmit the sensation of itch.

The co-expression of MRGPRX1 and HRH1 was validated by multiplex FISH (Fig. 3A). PIEZO2 322 was expressed at a higher level in hNP1 than in hNP2 neurons (Fig. S7B), suggesting that hNP1 323 neurons could be more mechanosensitive. Consistent with this molecular feature, recordings 324 325 from human afferents have revealed that some human histaminergic itch-sensing fibers are mechanosensitive⁴³. In mice, NP1 and NP2 afferents are well-characterized by specific expres-326 sion of two different Mrgpr members: NP1 neurons (~20% of total DRG neurons) highly express 327 Mrgprd⁴⁴, while NP2 neurons (~5% of total DRG neurons) express MrgprA3¹⁵. In humans, how-328 ever, MRGPRD was only expressed in a few NP1 neurons (Fig. S9A), so it was less useful for 329 marking human NP1 population, and MRGPRA3 gene does not have an orthologue in the human 330 genome. In short, NP1 and NP2 populations likely have conserved physiological functions in 331 mediating itch sensation in both mice and humans. However, some key molecular receptors for 332 detecting pruritogens are different between the species, which may reflect evolutionary adapta-333 334 tion to distinctive pruritogens encountered by human and mice in their living environments.

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The hPEP.SST population displayed specific expression of the neuropeptide, somatostatin (SST), 336 and an enriched expression of GFRA3, a co-receptor of tyrosine kinase RET (Fig. 3B, S7A). We 337 also found another neuropeptide cholecystokinin (*CCK*)⁴⁵ enriched in this population (Fig. S7A). 338 339 The hPEP.SST cluster corresponded to mouse and macaque NP3 population (Fig. 2), which are also marked by the expression of $SST^{15,16}$. Given the previously established role of mouse NP3 340 neurons in itch sensation⁴⁶ and the high expression of itch-sensing receptors, such as *HRH1*, 341 IL31RA (Fig. 3A-B), hPEP.SST afferents could also mediate itch sensation, especially under 342 inflammatory conditions¹⁵. Neither *PIEZO1* nor *PIEZO2* (Fig. S9A) was detected in hPEP.SST 343 neurons, indicating that these afferents might not be mechanosensitive. Indeed, some human 344

histaminergic itch-sensing fibers are insensitive to mechanical forces⁴³. A human feature of
hPEP.SST neurons was the co-expression of the peptidergic neuron marker, CGRP, which was
barely detected in the corresponding mouse NP3 neurons (Fig. S9B)^{16,18}.

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The hTRPM8 population was distinguished from other cell types by the specific expression of a 349 novel molecular marker, STUM, and high-level expression of TRPM8 (Fig. 3C). Almost all 350 351 STUM⁺ neurons expressed TRPM8, which was validated by multiplex FISH (Fig. 3C). Since TRPM8 is a receptor for cold temperature and cooling chemicals (such as menthol)⁴⁷⁻⁵⁰, the 352 hTRPM8 population likely functions as cold- and menthol-sensing afferents. Notably, this newly 353 identified maker gene STUM was not detected in mouse $TRPM8^+$ neurons^{16,33}. In macaque, 354 STUM was more broadly expressed in several clusters (Fig. S9C)¹⁸. Nevertheless, other molecu-355 lar markers, such as FOXP2 and GPR26, were shared among mouse^{16,33}, macaque¹⁸, and human 356 357 TRPM8 cold-sensing neurons (Fig. S9A-C). Intriguingly, some hTRPM8 neurons also expressed a low level of heat-sensing receptor TRPV1 (Fig. 3D), suggesting that these neurons might also 358 359 be activated by heat stimuli. Consistently, human physiological recordings have identified coldsensitive C-fibers that also respond to heat⁵¹. Thus, some of the neurons in the hTRPM8 popula-360 tion are likely to be polymodal cold-sensing afferents. 361

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Two peptidergic C-fiber clusters displayed overlapping high expression of *TRPV1* and *TRPA1* (Fig. 3D), which were therefore named as hPEP.TRPV1/A1.1 and hPEP.TRPV1/A1.2. Since *TRPV1* is activated by noxious heat and capsaicin, and *TRPA1* can be activated by noxious cold and various noxious chemicals^{52,53}, they are likely to be C-fiber peptidergic thermoreceptors and nociceptors, sensing noxious thermal and chemical stimuli and transmitting pain signals. From

the cross-species comparison, hPEP.TRPV1/A1.1 and hPEP.TRPV1/A1.2 were mostly similar to 368 369 macaque PEP1 and mouse subclass PEP1.4/CGRP-E (Fig. 2A-C). The exact functional differences between these two quite similar populations are yet to be established, but it is tempting to 370 371 hypothesize that hPEP.TRPV1/A1.1 innervates the skin while hPEP.TRPV1/A1.2 innervates deep tissues and visceral organs, because CGRP⁺/TRPV1⁺ afferents were observed in both the 372 human skin and deep tissues⁵⁴. In contrast to the hPEP.TRPV1/A1.1 population, 373 hPEP.TRPV1/A1.2 neurons expressed PROKR2, and higher level of PTGER3, and prostaglan-374 din I2 receptor (PTGIR) (Fig. S7E & S9A). These molecular markers have been found to be en-375 riched in mouse viscera-innervating DRG neurons^{55,56}. 376

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379 Molecular marker expression and validation of A-fiber peptidergic nociceptors

Five clusters of peptidergic A-fiber nociceptors were identified in our dataset. When compared to
mouse and macaque peptidergic populations, some clusters showed the greatest divergence (Fig.
2A-C), indicating that they might contain human specific sensory neuron types.

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The hPEP.PIEZO^h cluster was named because they expressed the highest number of *PIEZO2* transcripts among all PEP clusters (Fig. 4A), an expression level comparable to the most mechanosensitive afferents, hC.LTMR and hA δ .LTMR. The hPEP.PIEZO^h neurons also expressed a relatively high levels of *PIEZO1* transcripts, though the overall expression of *PIEZO1* in hDRG neurons was low (Fig. S9A). This cluster could be identified by its high expression of *PTGER3* but not *TRPA1* (Fig. 4A & 3D). No mouse DRG neuron population was highly matched for the hPEP.PIEZO^h cluster. Nevertheless, the expression of a few unique marker

genes in this cluster could provide clues into its functions. The adrenoreceptor, ADRA2C, a spe-391 cific molecular marker found in human sensory fibers innervating blood vessels⁵⁷⁻⁶⁰, was mainly 392 detected in this cluster (Fig. S9A). In addition, the hPEP.PIEZO^h population expressed GPR68, a 393 membrane receptor sensing flow and shear forces in the vascular endothelia cells⁶¹ (Fig. S9A). 394 Given the well-established functions of PIEZO1 and PIEZO2 in mediating neuronal sensing of 395 blood pressure and the baroreceptor reflex⁶² and the expression of known function of *ADRA2C* 396 and GPR68, we proposed that some hPEP.PIEZO^h afferents innervate blood vessels and sense 397 the blood pressure or flow. This cluster also expressed a high level of PTGIR (Fig. S9A). Mouse 398 PTGIR⁺ DRG neurons innervate the bladder⁵⁵, and PIEZO2 expressed in these neurons is re-399 quired for sensing the bladder pressure to coordinate urination⁶³. Thus, some hPEP.PIEZO^h af-400 ferents might also innervate bladder and play a similar role. Take all into consideration, 401 hPEP.PIEZO^h neurons might function in sensing mechanical forces from blood vessels and in-402 ternal organs. Given that there was not a clear mouse DRG CGRP⁺ population with high *PIEZO2* 403 expression from single-cell RNA-seq datasets, we speculated that hPEP.PIEZO^h neurons are 404 405 either human specific or greatly expanded in humans. A fundamental difference between human and mouse is their body sizes (humans are more than 2000 times larger than mice⁶⁴). This addi-406 tion or expansion of hPEP.PIEZO^h neurons is likely to meet the challenge of mediating sensation 407 408 from internal organs and blood vessels in much larger human bodies.

409

The hPEP.KIT cluster had the specific expression of a receptor tyrosine kinase, *KIT*, and a medium to low expression level of *PIEZO2* (Fig. 4B). In mouse DRG neurons, *Kit* is more broadly expressed and found in four peptidergic clusters¹⁶ (Fig. S9B). Cross-species analysis suggest that this cluster mainly corresponded to the mouse PEP3/CGRP- η and macaque PEP3 population (Fig. 2A-C), which are A-fiber high threshold mechanoreceptors (HTMRs), forming circumferential endings around hair follicles and mediating hair pulling pain^{65,66}. A more recent study suggests that mouse CGRP-η neurons mediates mechanosensation from the distal colon⁶⁷. Thus, the
hPEP.KIT cluster likely functions as a population of fast-conducting mechano-nociceptors.

The third peptidergic A-fiber cluster, hPEP.CHRNA7, featured abundant expression of CHRNA7 419 420 but almost no expression of PIEZO2 (Fig. 4C). Cross-species analysis revealed that this cluster corresponds to mouse PEP2/CGRP- ζ and macaque PEP2 populations (Fig. 2A-C), which are also 421 marked by the unique expression of $CHRNA7^{16,18}$. Interestingly, this cluster also expressed 422 *PVALB* (Fig. 1F), a molecular marker commonly used for proprioceptors in mouse and human. 423 Retrograde tracing from the mouse gastrocnemius muscle labeled CHRNA7⁺ DRG neurons⁵⁵, 424 425 suggesting that hPEP.CHRNA7 may contain muscle-innervating A-fiber nociceptive sensory 426 afferents.

427

428 hPEP.NTRK3 is a population of peptidergic A-fibers with high expression of *NTRK3* and 429 *S100A4* (Fig. 4D). Neurons in this cluster expressed a low level of *PIEZO2* (Fig. 4B). Finally, 430 hPEP0 is a population of peptidergic A-fibers that expressed *CALCA* and a moderate level of 431 *PIEZO2* but lack of other specific marker genes. Potential function of hPEP.NTRK3 and hPEP0 432 are currently unclear. They could be some types of A-fiber mechano-nociceptor⁶⁸.

433

434 Molecular marker expression and validation of C-LTMRs, A-LTMRs and an ATF3 popu435 lation

hC.LTMR is the putative human C-tactile nerve fibers. All cross-species neuron cluster compari-436 son methods unequivocally identified C-LTMRs as conserved across all three species. Neverthe-437 less, the specific marker gene CASQ2 for hC.LTM (Fig. 5A) is not detected in either mouse or 438 macaque C-LTMRs^{15,18}. Converselv, mouse C.LTMR cells are characterized by exclusive ex-439 pression of tyrosine hydroxylase (TH) and *SLC17A8* (*VGLUT3*)¹⁵ (Fig. S9B), which are barely 440 expressed in hDRG neurons (Fig. S9A). Thus, the molecular markers to identify C.LTMRs are 441 different between human and mouse. On the other hand, human, mouse, and macaque C.LTMRs 442 all had conserved expression of GFRA2, another co-receptor of RET, and a zinc finger transcrip-443 tion factor ZNF521 (Fig. S9A-C). Multiplex FISH confirmed that CASQ2⁺ cells expressed high 444 levels of *PIEZO2* (Fig. 5A). hC.LTMRs likely mediate innocuous affective touch sensation⁷⁰⁻⁷². 445

446

A-LTMRs were featured by large diameter somas and high expression of NTRK2 and NTRK3 447 (Fig. 5B-C) but a lack of expressions of SCN10A and PRDM12 (Fig. 4C & 1E), two genes highly 448 associated with human nociception 30,73,74 . We identified 4 clusters in this category. hA δ .LTMR 449 450 was named based on its high expression level of NTRK2 and PIEZO2, but low level of NTRK3 (Fig. 5A-C), a molecular feature similar to the mouse Aδ-LTMRs (Fig. S9B). KCNV1 was en-451 riched in this cluster and could serve as a novel molecular marker for identifying this population 452 453 in hDRG neurons (Fig. 5B). hAB.LTMR, for tactile touch, expressed higher level of NTRK3 but a lower level of NTRK2 compared to hA\delta.LTMRs (Fig. 5C). hPropr, for limb position sensing, 454 expressed a high level of a proprioceptor marker PVALB and REEP5 (Fig. 5D). 455

456

457 We also identified a cluster named as hATF3 (Fig. 5E), which contained mainly large diameter 458 neurons and strongly corresponded the "unknown" cluster first identified in normal male mice by

the Sharma RNA-seq dataset¹⁶. This cluster in both human and mouse datasets showed a very 459 conserved molecular profile (Fig. S7A). One of the markers it expressed, ATF3, is a transcrip-460 tional factor associated with sensory afferent injury, indicating that these cells may represent 461 neurons that are undergoing (or previously underwent) stress/damage/insult (Fig. 5E). ATF3⁺ 462 neurons also expressed high level of neuropeptide ADCYAP1 (Fig. 5E). Since there were no 463 medical records indicating obvious nerve injuries in our human donors, and since the mouse data 464 came from naïve mice, we speculate that these neurons might reflect a very low level of sporadic 465 sensory afferent injury accumulated from daily lives. On the other hand, we cannot exclude the 466 possibility that *ATF3*⁺ cluster represent a population of normal DRG neurons. 467

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The single-soma deep RNA-seq dataset provides novel insights into the molecular and cellular mechanisms underlying human sensation of itch and pain

Given the high number of unique transcripts per neuronal soma, our dataset is uniquely powerful for molecular discovery. We identified a much higher number of membrane proteins, such as GCPRs, ion channels, chemokine receptors, as well as neuropeptides, compared to 10x Visium Spatial RNA-seq or single-nucleus RNA-seq datasets (Fig. 6A). These discoveries provided novel insights into understanding molecular and cellular bases of physiological recording and psychological experiment results regarding human itch and pain sensation.

478

Physiological recordings have identified at least two groups of C-fibers responding to different pruritogens. One group responds to cowhage, a plant triggering intense itch in human⁷⁵, and comprises mechano-sensitive polymodal units⁴³. The other group responds to histamine with

sustained discharges but is mechanically insensitive⁴³. However, the molecular and cellular bases 482 for these observations remain unclear. To understand these physiological properties, we analyzed 483 the expression of histamine and cowhage receptors, and the mechanoreceptor PIEZO2 in the 484 485 three potential itch populations, hNP1, hNP2 and hPEP.SST. PIEZO2 was highly expressed in hNP1, with low expression in hNP2 and almost no detectable expression in hPEP.SST (Fig. 5A). 486 Protease-activated receptor F2RL1, the receptor mediating cowhage induced itch in humans⁷⁵, 487 was exclusively expressed in hNP1 (Fig. 6B). Thus, the hNP1 population likely contained C-488 489 fiber pruriceptive afferents sensitive to both cowhage and mechanical stimuli. For histamine receptors, HRH1 was expressed in all three itch populations, HRH2 was expressed in hNP2 and 490 hPEP.SST but not in hNP1, HRH3 had low expression in hNP1 and hPEP.SST, while HRH4 was 491 not detected (Fig. 6B-C). Thus, hNP2 and hPEP.SST clusters are good candidates for histamine-492 493 sensitive but mechano-insensitive itch-sensing C-fibers.

494

When intracutaneously applicated into human skin, some chemicals tend to trigger itch, such as 495 496 histamine and prostaglandin E2 (PGE2), while others preferentially induce pain, such as serotonin and bradykinin⁷⁶. To explore the potential underlying mechanisms, we examined the expres-497 sion of all known receptors for these chemicals in our dataset. We found that the receptors of 498 499 itch-inducing chemicals are enriched in itch sensing populations. For example, histamine recep-500 tors HRH1 and HRH2, and PGE2 receptor PTGER2 were enriched in hNP1, hNP2 and hPEP.SST putative itch-sensing neurons (Fig. S10A1). In contrast, serotonin receptors, HTR1B 501 and HTR1F, and bradykinin receptor BDKRB2 were enriched in putative nociceptive populations 502 (Fig. S10A2). The differential expression patterns of these receptors might explain the different 503 504 sensory experience induced by these chemicals.

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507 Utility of single-soma deep RNA-seq dataset for discovering novel drug targets and for ob-508 taining insights into molecular targets of existing drugs

Our deep sequencing dataset can also provide novel insights into the mechanisms of existing 509 clinical drugs or for identifying potential novel drug targets. The expression patterns of promis-510 ing drug targets, such as GPCRs, ion channels, chemokine and cytokine receptors, and neuropep-511 tides, were analyzed (Fig. S11-S14). Here we analyzed itch-related receptors and molecules as an 512 example. A series of itch-sensing receptors have been identified in model organisms^{3,46,79}, but 513 which of these targets can be translated remains to be determined. A subset of these itch recep-514 tors were indeed enriched in hNP1, hNP2 and hPEP.SST populations, such as the chloroquine 515 516 receptor MRGPRX1, bile acid receptor MRGPRX4, histamine receptor HRH1, leukotriene receptor CYSLTR2, and interleukin receptors IL31RA and OSMR (Fig. 6B)^{16,18}. However, some sus-517 pected itch receptors did not exhibit expression enrichment in human itch populations. For ex-518 ample, HRH4 was reported to mediate histamine-dependent itch in mice⁸⁰, but expression of 519 HRH4 was barely detected in human itch-sensing populations (Fig. 6C), suggesting that HRH4 520 might not be directly involved in human histaminergic itch. The same was found true for IL7R 521 and TLR7⁷⁹, which were proposed to mediate non-histaminergic itch in mice (Fig. 6C). In addi-522 tion to these known players, we identified other membrane receptors and signaling molecules in 523 human itch populations (Fig. 6D), including MRGPRX3, EDNRA, PTGDR, HTR3A, CHRNA3, 524 KCNG4, and PLCB3, which could represent novel anti-itch targets. 525

Gabapentin was originally developed for treating epilepsy and more recently used in the treatment of neuropathic pain and chronic itch⁸¹. It inhibits neurotransmitter release by acting on $\alpha 2\delta$ -1 and $\alpha 2\delta$ -2 voltage-dependent calcium channels *CACNA2D1* and *CACNA2D2*⁸¹. We found that both receptors were broadly expressed in hDRG neurons (Fig. S10B), suggesting that one potential mechanism by which gabapentin could provide clinical benefit is through inhibiting synaptic transmission of primary afferents, as has been shown in mice⁸².

533

Opioids and derivatives activate opioid receptors to modulate pain and itch. Agonists of the µ-534 opioid receptor (OPRM1) alleviate pain but elicit itch in humans and model organisms, whereas 535 agonists of the κ -opioid receptor (*OPRK1*) inhibit itch in humans^{83,84}. Unlike mouse DRG neu-536 rons, which did not5 display cell-type enriched expression patterns of opioid receptors (Fig. 537 538 S10C), we found that opioid receptors in hDRG neurons were present in some but not other neu-539 ron populations. Transcripts of δ -opioid receptor (*OPRD1*) were preferentially expressed in itch populations hNP1 and hNP2, while OPRM1 was enriched in all hPEP clusters (Fig. S10C). Since 540 541 opioid receptors are inhibitory GPCRs, our results suggest that activation of OPRM1 could directly inhibit human nociceptive afferents, while OPRD1 could be a molecular target for inhibit-542 ing itch transmission. On the other hand, *OPRK1* was barely detected in our dataset, suggesting 543 544 that *OPRK1* agonists may relieve itch through indirect or central mechanisms (Fig. S10C).

545

546

547 Immunostaining of sensory fibers in the human skin using molecular markers identified by
 548 single-soma deep RNA-seq dataset

Although human peripheral sensory afferents can be identified and visualized using the pan neu-549 ronal marker antibody against PGP9.5, different types of human sensory afferents cannot be dis-550 tinguished due to a lack of specific molecular markers. Developing an antibody panel to label 551 552 different types of human sensory afferents would be invaluable for basic research, translational studies, and diagnostics. To start this direction and to test whether some molecular markers iden-553 tified by the single-soma RNA-seq are useful for labeling specific types of human sensory fibers, 554 555 we conducted immunostaining of sensory afferents with leg skin biopsies from three normal 556 adult donors (see Methods for detailed donor information).

557

SST is specifically expressed in hPEP.SST neurons (Fig. 3B). Consistent with this molecular 558 prediction, we found SST⁺ sensory fibers in the human skin sections in the dermis, the epider-559 mis-dermis junction, entering the epidermis (Fig. S15A-C), and near the hair follicle (Fig. S15D-560 F). In addition, double immunostaining revealed that SST⁺ sensory fibers were CGRP⁺ and made 561 up a subset of CGPR⁺ sensory fibers (Fig. S15A-F). These results confirmed that human SST⁺ 562 563 sensory afferents had CGRP proteins and belonged to the PEP but not NP afferents. Since CGRP involves in neuro-immune interactions and other physiological functions⁸⁵, addition of this neu-564 ropeptide in human SST⁺ afferents suggests a potential gain of new functions during evolution. 565

566

hPEP.KIT neurons specifically express *KIT* transcripts. Strong KIT signals were observed in continuous regenerative cells at the basal layers of the skin, sweat ducts, and hair follicles, serving as a positive control. A few KIT⁺ and PGP9.5⁺ sensory fibers were observed around hair follicles (Fig. S15G-I). Consistent with our RNA-seq results, KIT⁺ sensory fibers were also positive for CGRP and NEFH (Fig. S15J-O), suggesting that they were peptidergic A fibers. In short, 572 these results support that our high-fidelity hDRG neuron single-soma transcriptome dataset is 573 useful for selecting specific molecular markers to label and visualize different types of peripheral 574 somatosensory afferents.

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- 576

577 A novel strategy to study functions of human somatosensory afferents using single-soma 578 deep RNA-seq dataset-informed microneurography recordings

579 Molecules profiles and physiological properties of hDRG neurons are intrinsically linked: the expressed molecules form the physical basis for physiological properties. Physiological record-580 ings of human somatosensory afferents have been conducted for more than half a century, which 581 generated important parts of our knowledge on the human somatosensory system. Physiological 582 583 properties of somatosensory afferents generate an important foundation for informing molecular cloning of critical receptors, such as TRPV1 and PIEZO2. Due to a lack of clear molecular com-584 positions of human somatosensory afferents, the reverse experimental direction, from molecular 585 586 profiles of human sensory afferents to inform physiological recordings, has not been possible. With the single-soma deep RNA-seq dataset, we were finally in a position to do so. Here we fo-587 cused on two populations of human sensory afferents to demonstrate the feasibility and power of 588 589 using single-soma deep RNA-seq informed microneurography recordings to study the function 590 of human afferent subtypes.

591

As mentioned previously, the hPEP.KIT population was highly correlated to the mouse
 PEP3/CGRP-η cluster^{15,18} (Fig. 2A-C), a population of TRPV1-negative A-fiber fast-conducting
 hair pull-sensitive mechano-nociceptors⁸⁶. Our single-soma deep RNA-seq data revealed that

hPEP.KIT neurons express NEFH and PIEZO2, but not TRPV1 (Fig. 7A), suggesting that they 595 596 were A-fiber mechano-nociceptors without heat/capsaicin sensitivity. Interestingly, our dataset also revealed that hPEP.KIT neurons expressed a low level of TRPM8 (Fig. 7A), a feature that 597 598 has not been reported in mice. Multiplex FISH validated the co-expression of KIT, PIEZO2 and TRPM8 in hDRG neurons (Fig. S16A). Altogether, these molecular profiles suggest that 599 hPEP.KIT neurons may be A-fiber HTMRs, responsive to cooling but not heating. Thus, we hy-600 pothesized that there exist some previously uncharacterized fast-conducting A-fiber HTMRs in 601 602 the human skin, which can be activated by cooling but not heating stimuli.

603

To test this idea, using the *in vivo* electrophysiological technique of microneurography, single-604 unit axonal recordings were performed from the radial, antebrachial, and peroneal nerves of 605 606 healthy participants (Fig. 7B-D). The A-HTMRs (n=10) were identified by their insensitivity to soft-brush stroking while responding to a rough brush and displaying high indentation thresholds 607 608 $(\geq 4 \text{ mN})$; further, they had A β -range conduction velocities (>30 m/s, Fig. 7B-F). Remarkably, a subtype of these heat-insensitive A-HTMRs (n=5) units responded to cooling (Fig. 7G-H). Com-609 pared to mechanically evoked responses, those evoked by cooling although relatively modest but 610 reproducible with tested in triplicates for each recording (Fig. S16B). Furthermore, these cool-611 612 ing-evoked responses persisted during the sustained phase (Fig. S16B). These observations confirmed our prediction that some human cutaneous A-HTMRs are cold-sensitive but heat-613 insensitive. Based on the transcriptome dataset and current knowledge about molecular receptors 614 for heat and cold, hPEP.KIT seems to be the only population that has the molecular basis for this 615 616 distinct combination of physiological properties. Thus, we propose that the molecularly defined

hPEP.KIT population is correlated to the physiologically defined A-HTMRs with cold but notheat sensitivity (Fig. 7I).

619

620 Human C-LTMRs are readily found during microneurography recordings from the upper limb including the distal regions⁸⁷, but they seem to sparsely innervate the distal lower limb⁸⁸. This is 621 consistent with our sequencing results wherein the hC.LTMRs constituted a small population of 622 623 neurons in lower thoracic and lumbar level DRGs (Fig. 1G). Unexpectedly, our sequencing data revealed that human hC.LTMRs had almost no expression of the cold and menthol receptor 624 TRPM8 (Fig. 8A) though C.LTMRs display sensitivity to cooling in both humans and mice^{89,90}. 625 Another unexpected finding was that hC.LTMRs expressed TRPV1 (Fig. 8A). Multiplex FISH 626 confirmed that CASO2⁺ hC.LTMRs were TRPM8⁻ but TRPV1⁺ (Fig. S17A). This expression 627 628 pattern suggested that hC.LTMRs might respond to heating and capsaicin, a novel physiological 629 property that has not been discovered in rodent or non-human primate models, but is predicted not to respond to menthol. In human microneurography, the C-LTMRs (n=11) were identified by 630 their soft-brush sensitivity, low indentation threshold (in this case, ≤ 0.7 mN), and slow conduc-631 tion velocity (~1 m/s, n=11, Fig. 7B-C, 8B-D). Consistent with mouse C-LTMRs, these human 632 633 counterparts responded to hair movement (Fig. 8D) and dynamic cooling (Fig. 8E). In two of 634 them, after having confirmed the cooling response, we applied menthol to their individual receptive fields resulting in a cold sensation, but the recorded C-LTMRs, while still responsive to me-635 chanical and thermal stimuli, were not activated by menthol (Fig. 8F). Remarkably, 636 microneurography recordings showed that a subset of human C-LTMRs responded to dynamic 637 638 heating (5 out of 11 units or 45%, example shown in Fig. 8G). This proportion of heat-sensitive C-LTMRs aligns with findings in the rabbit (8 out of 18 units or 44%)⁹¹. In three C-LTMRs, 639

640 after having confirmed the heating response, we applied capsaicin to their receptive fields. Con-641 sistent with the sequencing results, all three were activated by capsaicin (Fig. 8H). Relative to mechanical stimulation, the C-LTMR responses to dynamic temperature changes were compara-642 643 tively modest. However, these responses were reproducible, having been tested in triplicates for each modality and recording (Fig. S16B-C). Interestingly, the C-LTMR has different cooling 644 response properties compared to A-HTMR cooling+ fibers. The cooling-evoked responses rapid-645 ly diminished in C-TLMR but persisted during the sustained phase in A-HTMR cooling+ fibers. 646 The existence of a polymodal (mechano-heat-cold) C-LTMR type is novel and confirms the se-647 648 quencing predictions. Furthermore, the cooling response must be mediated through a non-TRPM8 mechanism. 649

650

651 For comparison, our recordings also identified C-HTMRs (n=11) that did not respond to softbrush stroking and hair movement (they responded to a rough brush), had high indentation 652 653 thresholds (in this case, ≥ 10 mN), and slow conduction velocities (~1 m/s, Fig. 7B-D & S17B-E). 654 Based on their temperature responses (tested in 9 units), a mix of C-fiber mechano-heat (n=6), Cfiber mechano-cold (n=2), and C-fiber polymodal (mechano-heat-cold, n=1) subtypes were iden-655 tified. An example of heating and capsaicin responses of a C-fiber mechano-heat nociceptor is 656 657 shown in Fig. S17F-G. Collectively, these results highlight the accuracy and utility of our singlesoma deep RNA-seq dataset of hDRG neurons in guiding and informing the functional character-658 ization of human somatosensory afferents and the power of combining the two approaches. We 659 believe that this signifies a promising new research direction to link molecular and physiological 660 661 types and to discover novel functional properties of human somatosensory afferents.

663

664 Discussion

Despite the high relevance to human health, molecular and cellular mechanisms underlying nor-665 666 mal and pathological human somatosensation remain largely elusive. In this study, we developed a novel LCM-based approach for single-soma deep RNA-seq and recovered more than 9000 667 unique transcripts per neuron over 1000 adult hDRG neurons. The sequenced hDRG neurons 668 were clustered into 16 molecular groups, displaying similarities to and remarkable differences 669 670 from macaque and mouse DRG neurons. As exemplified in the study, our dataset provides important and novel insights into human pain and itch sensory phenomena, explains mechanisms of 671 drug effects, and represents a rich resource to identify new molecular targets for modulating the 672 activity of itch- and pain-sensing primary afferents. Moreover, our dataset successfully guided 673 674 histological labeling (Fig. S15) and physiological recording (Fig. 7, 8 & S17) of different types of human sensory afferents, leading to discovery of their new anatomical features and physiolog-675 676 ical properties, and serving as a common ground to connect them all together (Fig. 7I).

677

Single-cell RNA-seq of human DRG/TG neurons has been technically challenging. One main 678 hurdle is to isolate sensory neurons from a large population of non-neuronal cells. The traditional 679 enzymatic and mechanical dissociation method is incompatible with human DRG/TG neurons. 680 Strategies, including spatial transcriptomics and single-nucleus RNA-seq^{22,23,92}, have generated 681 some pioneering datasets characterizing the molecular profiles of human DRG and TG neurons. 682 Nevertheless, the number of transcripts, sequencing depth, or single-cell resolution of the previ-683 ous studies needs to be improved. Importantly, though nuclear and soma transcripts are intrinsi-684 685 cally linked and overlapping to some extent, the soma contains much more transcripts both quan686 titatively and qualitatively. Some transcripts are also one step closer than nuclear transcripts for functions. Thus, soma transcripts are preferable, if available, for cell type clustering and func-687 tional interpretation. In this study, we developed a new strategy by combining fresh frozen 688 689 hDRG tissues, cryo-section, laser capture microdissection of individual neuronal soma, and Smart-seq2 deep sequencing. Fresh frozen tissue and cryosection techniques minimized 690 transcriptomic changes during the tissue transportation and single-cell isolation process. LCM 691 692 allowed isolation of DRG neuronal soma with minimal contamination from surrounding nonneuronal cells, while preserving information about cellular morphology, and the Smart-seq2 pro-693 tocol enabled a high recovery rate of mRNA molecules. Although LCM has been used for isolat-694 ing a group of neurons for RNA-seq^{6,7} or single TG neurons for genomic DNA analysis⁹³, the 695 successful application of LCM for single-cell transcriptomic analysis has not been achieved be-696 697 fore. Thus, we have established a new method for single-cell RNA-seq of adult hDRG neurons. Our approach should be readily applicable to other human neurons with large soma sizes, such as 698 699 other peripheral ganglia neurons, motor neurons, etc.

700

Different single-cell RNA-seq approaches, including single-nucleus RNA-seq^{21,23,92}, spatial 701 transcriptomics²², and our LCM-based single-soma RNA-seq, have generated four datasets of 702 703 transcriptome profiles and cell type clusters of hDRG neurons. These datasets and results overlap to some extent but also exhibit some significant differences (an example shown in Fig. S4). The 704 observed differences are likely caused by both biological and technical features associated with 705 each method. Given the high sequencing depth of transcripts from the neuronal soma, our ap-706 proach is powerful for molecular discovery, especially for functional molecules expressed at a 707 low level. For example, our approach detected the specific expression of MRGPRX1 and 708

MRGPRX4, two important pruritogen-sensing GPCRs, in hNP1 and/or hNP2 neurons, while the
 previous datasets barely or not detected these transcripts^{22,23}. Our analysis of the expression of
 receptors, ion channels, and neuropeptides, in human itch-sensing DRG neurons have also identi fied a set of potential new targets for modulating activities of these sensory afferents (Fig. 6).

713

In addition, our sequencing and microneurography results raise many interesting questions re-714 garding the molecular receptors and afferent types involved in human cold and mechanical pain 715 sensation. For example, human hC.LTMRs rely on a non-TRPM8 cold receptor or another 716 mechanism for their cooling sensitivity⁸⁸. We noticed a low expression level of *TRPA1*, which 717 also has cold sensitivity^{94,95}, within this population (Fig. S7E). Whether *TRPA1* or some current-718 ly unknown cold receptors mediate cooling sensitivity in this population will be of interest for 719 720 future research. The discovery of the hPEP.KIT population indicated a potential role for PIEZO2 721 in human mechano-nociception. This population also responded to cooling, which is a curious 722 property of a large-diameter myelinated nociceptor. Our discovery of TRPM8 expression in the-723 se neurons provides a molecular explanation for this unique property. In addition, a likely molecular type for C-HTMRs, which display a mixture of responsiveness to mechanical forces and 724 temperature, is the hPEP.TRPV1/A1.1 population. Since hPEP.TRPV1/A1.1 neurons have no 725 726 expression of PIEZO2 or PIEZO1 (Fig. S9A), a non-PIEZO mechanoreceptor may exist in these 727 neurons for mediating mechanical pain sensation. This is consistent with reports that patients with PIEZO2 loss-of-function mutations still have normal mechanical pain threshold and sensi-728 tivity^{68,96}. One suggested mechanical pain channel, TMEM120A (TACAN), is broadly expressed 729 in all types of hDRG neurons (Fig. S9A). This expression pattern does not support its purported 730 role as a mechanical pain receptor in humans. Both C-LTMRs and A-HTMRs responded to cool-731

732 ing in human microneurography. While the responses were comparatively modest in contrast to 733 mechanically evoked responses, they were consistent on a trial-to-trial basis. This suggests that the requisite circuity may already be in place, which could potentially have implications for un-734 735 derstanding thermal hypersensitivities in pathological states. Indeed, there is indirect evidence from human psychophysics and targeted pharmacology, pointing to the role of C-LTMRs in me-736 diating acute cold allodynia⁹⁷ and the role of A fibers in signaling chronic cold allodynia⁹⁸. In 737 738 short, our dataset serves as an important atlas for understanding sensory properties of hDRG af-739 ferents and somatosensation more generally.

740

Insights into the relationship of the neuronal types between the mouse and human are essential, 741 742 as such knowledge is important for translation of pre-clinical discoveries and for inferring func-743 tions of human sensory afferents. The three different analysis strategies used in this study com-744 plement each other as they have different strength and weakness (see Methods for details). To 745 our satisfaction, despite the different advantages and disadvantages, results from these methods 746 were highly consistent with each other (Fig. 2 & S5). Our results suggested that many broader functional groups of DRG sensory afferents are conserved across species, despite noticeably mo-747 lecular differences (Fig. 2 & S6). The greatest divergence between mouse and hDRG neurons 748 749 was observed among C- and A-fiber nociceptors. Mice contain four C-fiber nociceptors (PEP1 750 neuron subtypes), two expressing TRPV1 but not TRPA1 or PIEZO2 (PEP1.1 and PEP1.2) and another two which expresses all three channels (PEP1.3 and PEP1.4) (Fig. 2A & 2C). While not 751 much is known about mouse PEP1.2/CGRP beta, PEP1.1 represents a noxious heat sensory type, 752 terminating with free nerve endings in epidermis of hairy skin⁹⁹. PEP1.3/CGRP gamma neurons 753 innervate mainly internal organs and are a silent nociceptor type, becoming active during in-754

flammation¹⁰⁰. No functional studies have been performed on PEP1.4 in the mouse. These neu-755 rons are speculated to represent C-HTMRs which are functionally known to exist in the mouse¹⁰¹. 756 In humans, it seems that this diversity of C-fiber nociceptors has conflated into two types, the 757 758 hPEP.TRPV1/A1.1 and hPEP.TRPV1/A1.2 (Fig. 2A & 2C), expressing both TRPV1/TRPA1 759 with or without PIEZO2, respectively. If similar to mice, different neuronal populations in hu-760 man are somewhat specialized according localization of peripheral target, one of these types may represent deeply innervating silent nociceptors, known to be present in human¹⁰², and the other 761 involved in slow noxious thermal and burning cutaneous sensation and perhaps joint pain. One 762 thing to note is that our dataset contains transcriptomes of hDRG neurons from the lower thorac-763 ic and lumbar levels, which mainly convey sensations from the leg and lower back. Thus, it re-764 mains an open question whether humans have a population of internal organ-specific C-765 766 nociceptors, like the mouse PEP1.3 cluster. This question will be resolved when sequencing 767 more hDRG neurons from the thoracic level.

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769 For A-fiber nociceptors, only two types have been identified in mice. The PEP2/CGRP-zeta mechano-heat nociceptive population expresses PIEZO2 and low levels of TRPV1^{16,33}, con-770 sistent with heat activation only at very high temperatures⁹⁹, and the PEP3/CGRP-eta mechano-771 nociceptive conveying fast and sharp pain, including hair pulling^{44,103}. In this study, we identified 772 773 five types A-fiber nociceptors in hDRG neurons (Fig. 1G, 2A & 2C). Two populations have clearly conserved features to mouse: hPEP.CHRNA7 showed molecular similarities to mouse 774 and macaque PEP2/CGRP-ζ, and hPEP.KIT to mouse and macaque PEP3/CGRP-η. The other 775 three populations displayed much greater divergence (i.e. hPEP.NTRK3, hPEP.PIEZO^h, and 776 hPEP.0). The hPEP.PIEZO^h cluster is particularly interesting since these neurons express very 777

high levels of *PIEZO2* and *PIEZO1*, unlike any neuron types in the mouse. Our results suggest
that fast pain and interoception might have been an evolutionary preference in humans as compared to rodents, an effect that may relate to significantly increased human body sizes.

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Finally, in this study, we sequenced over 1000 DRG neurons from 6 DRGs at the thoracic (T11-782 T12) and lumbar (L2-L5) levels of three Caucasian human donors with no obvious somatosenso-783 ry or systematic diseases and substance uses (Supplementary tables 1 & 2). It is about ~ 150 to 784 785 200 neurons per DRG, which represent 1-2% of the total neurons within a hDRG. Thus, sequencing more neurons might give an improved representation. The existence of different types of RA 786 and SA Aβ-LTMRs and different types of proprioceptors in humans is well known, but our cur-787 rent dataset did not have the resolution yet to separate them (Fig. 1G). With increased number of 788 789 neurons sequenced, we anticipate discovering an even greater heterogeneity among hDRG neurons. In addition, DRGs at different spinal levels innervate different peripheral target tissues²⁹. 790 791 Sequencing DRG neurons from different spinal levels will help to uncover molecular and cellu-792 lar mechanisms underlying physiological functions. Moreover, increased sampling from additional donors representing different demographics would also be critical for investigating sex, 793 race, and age-related differences. Last but not the least, pathological conditions greatly alter the 794 transcriptomic landscape^{104,105}. Systematic comparison of molecular and cellular changes be-795 796 tween donors at the baseline condition (like the screening criteria of this study) and those with chronic itch or chronic pain would be of great value, if samples are available, for understanding 797 pathological mechanisms and for identifying molecular targets for effective treatments. 798

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1105	Nagi is supported by the Swedish Research Council (2021-03054), Swedish Medical Society
1106	(SLS), and ALF Grants, Region Östergötland.
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1113 Materials and Methods:

1114 Human tissues and subjects

Human DRG tissues were procured from National Disease Research Interchange (NDRI). The 1115 research application was approved by the NDRI Feasibility Committee (RLUW1 01). Six DRGs 1116 1117 between T11 to L5 of three human donors aged from 23-61 years were used in this study. The 1118 dissected DRG tissues from human donors were immediately imbedded in OCT, shipped to the Luo lab on dry ice and stored in -80 \square until use. The information of DRGs and dis-identified 1119 donors and screening criteria are summarized in the Supplementary Tables 1 & 2. As determined 1120 1121 by the University of Pennsylvania IRB, this study was exempted from the human subject re-1122 quirements for the Luo lab.

1123

1124 The human skin biopsies were extracted from three healthy donors at the college of medicine, University of Florida. This tissue procurement was approved by the university IRB (protocols 1125 1126 IRB201500232 and IRB202300291). The information of human skin biopsies and dis-identified donors is summarized in the Supplementary Table 3. These three donors are members of one 1127 family and have no noticeable abnormal somatosensation or peripheral neuropathy. All partici-1128 pants were provided written informed consent and signed the document. 1129 1130 In vivo recordings of peripheral sensory afferents of healthy human subjects were performed at 1131 Linköping University, Sweden. These subjects were recruited through social media. All partici-1132 pants were provided written informed consent before the start of the experiment. The study was 1133

approved by the ethics committee of Linköping University (dnr 2020-04426) and complied withthe revised Declaration of Helsinki.

1136

1137 Laser capture microdissection of hDRG neurons

1138 The hDRGs imbedded in OCT were cryosectioned (Cryostat Leica Cm1950) into 20 μ m sections 1139 and mounted onto Arcturus PEN Membrane Frame Slides (Applied biosystems, LCM0521). One 1140 of every five consecutive sections was collected for laser capture microdissection to avoid re-1141 peated dissection of the soma from the same neuron in different sections. The slides were stored 1142 in -80 \Box until further use.

1143

1144 On the day of laser capture microdissection, the slides were transferred to the SBDRC laser cap-1145 ture microdissection (LCM) core on dry ice. Before dissection, the section was briefly stained

with RNase free Arcturus[™] Histogene[™] staining solution (Applied biosystems, 12241-05) for 1146 better visualization of neuronal soma: 70% cold EtOH for 30s; HistogeneTM staining for 10s; 70% 1147 cold EtOH for 30s; 95% cold EtOH for 30s; 100% cold EtOH for 30s and air dry for 2min. Then, 1148 1149 the slide was put onto laser capture microdissection microscope system (Leica LMD6) for the neuronal soma dissection. The laser was calibrated, and the laser intensity was adjusted to 1150 achieve best dissection efficiency. The dissected individual neuronal soma was collected in the 1151 cap of a 200 µl PCR tube containing 4 µl lysis buffer²⁶. The sequencing library was generated 1152 following Smart-seq2 workflow²⁶. The libraries passing through all quality controls were select-1153 ed for the final sequencing. 1154

1155

1156 Sequencing and sequence alignment

The libraries were pooled together (384 samples for one batch) and sequenced on NovaSeq 6000 platform by the Children's Hospital of Philadelphia (CHOP) Center for Applied Genomics (CAG). Raw sequencing data was demultiplexed with bcl2fastq2 v.2.20 (Illumina) followed by Tn5 transposon adapter sequences trimming with Cutadapt¹⁰⁶. The processed reads were then aligned to human genome (GRCh38 GENCODE as the reference genome, and GRCh38.104. GTF as the annotation) using STAR v.2.7.9a49¹⁰⁷. STAR quantMode GeneCounts was used to quantify unique mapped reads to gene counts.

1164

1165 Analysis of single-soma RNA-seq data of hDRG neurons using Seurat and R

R (version 4.1.2) and Seurat (version 4.0.5) were used for the single-cell RNA-seq analysis. Six
objects were created from the individual biological replicates. The data were normalized
(NormalizeData) after which 4500 most variable features were selected (FindVariableFeatures).

1169 To mitigate batch effects between replicates, we used Seurat's integrated analysis approach that transforms datasets into a shared space using pairwise correspondences (or "anchors")¹⁹. An-1170 chors were first defined using FindIntegrationAnchors (dims $\Box = \Box 1:30$) and the data were then 1171 1172 integrated (IntegrateData) and scaled (ScaleData), followed by principal component analysis (PCA) (RunPCA, npcs $\square = \square 50$). For clustering, the final parameters were: RunUMAP, reduc-1173 tion = pca, dims = 1:25; FindNeighbors, reduction = pca, dims = 1:25; FindClusters, 1174 resolution $\Box = \Box 3.4$. Highly similar clusters without clearly distinguishable markers were merged 1175 1176 to produce the final 16 clusters.

1177

1178 Analysis of single-soma RNA-seq data of hDRG neurons using Conos

For Conos³¹ analysis, single-soma hDRG data were integrated using CCA space 1179 1180 buildGraph(k = 0, k.self=3, space = 0"CCA", ncomps=30, n.odgenes=2000,verbose=TRUE, snn=T, snn.k $\Box = \Box 10$). For human single-soma and human single-nucleus dataset, 1181 buildGraph(k = 0, k.self=3, space = 0"CCA",1182 co-integration was performed as 1183 n.odgenes=2000, verbose=TRUE, snn=T, snn.k \square = \square 10). For Conos co-clustering mouse (Sharms) dataset was downsampled to max 300 cells per cluster, co-integration was performed as 1184 buildGraph(k = 8,k.self=3, space $\square = \square$ "CCA", n.odgenes=2000, 1185 verbose=TRUE. 1186 $snn=T, snn.k \square = \square 10$). Macaque (Kupari, SmartSeq2 dataset) was used for interspecies analysis. For Conos co-clustering macaque/human graph was built as buildGraph(k = 4, k.self=3, k.self=3,1187 space $\square = \square$ "CCA", ncomps = 30, n.odgenes=2000, snn=F, snn.k $\square = \square 10$). For all UMAP plots in 1188 Conos graphs were embedded as: \qquad embedGraph(method $\square = \square$ "UMAP", spread=15, seed = 3). 1189 Label propagation (\$propagateLabels) was run using method "diffusion". 1190

1191

1192 Methods used to elucidate cross-species cluster relationships

1193 We used four different interspecies analysis approaches. First, Conos, which uses graph-based 1194 dataset integration and was developed to co-cluster and compare datasets originating from differ-1195 ent RNA-seq platforms and species (Fig. 2A-B, S5A-B). Second, probabilistic neural network 1196 analysis which is a variant of machine learning in which learning module is trained with one dataset and then testing other datasets for pattern recognition and probability output¹⁸ (Fig. S5C-D). 1197 Third, neural network based hierarchical clustering analysis (Fig. S5E). In the hierarchical clus-1198 1199 tering analysis, each query neuron types, either human or macaque, is assigned weights of the sensory-type associated patterns by a neural network, which was trained with gene patterns in-1200 cluding both species specific and shared cross-species features in the different sensory neuron 1201 types. The weighted gene patterns were then used for dimensional reduction and nearest neigh-1202 1203 bor analysis to infer the hierarchical relationship. Finally, we performed transcription factor as-1204 sociated gene regulatory network analysis across all three species using genes network modules 1205 presumably driven by individual transcription factors (Fig.2D). These three methods have differ-1206 ent strengths and weaknesses. Conos finds shared principal components between integrated datasets, but some species-specific features may be lost and lead to impaired statistical sufficiency 1207 during integration and furthermore can be affected by the number of principal components and 1208 1209 nearest neighbor distance. Machine learning is based on gene expression and is not supervised by shared latent space (i.e. common principal components). Each single reference dataset is used to 1210 train the machine learning module and then tested by the other dataset. Thus, an advantage of 1211 this method is that at the stage of machine learning, datasets are not integrated, and hence, prob-1212 ability calculations are not affected by principal components or nearest distance. Conversely, its 1213 1214 disadvantage is that since it emphasizes the features of each cell type, the learning accuracy and

reliability depend on the robustness of the reference or training dataset. For the third approach, machine learning-based hierarchical clustering, we extracted the weight of cell type-specific features to construct the latent space covering all cell types across species, whether shared or not. With this strategy, we tried to obtain sufficient latent space, as compared to Conos, by training and predicting every dataset independently and furthermore, parameterization was used to find the most robust hierarchical clustering.

1221

1222 Cell type probabilistic similarity estimation across cell types and the data integration across

1223 species

1224 The assessment of cell type purity, the probabilistic similarity, and cell-type integration across 1225 species are performed using packages in a machine learning based single-cell analysis toolkit-1226 scCAMEL, released separately at <u>https://sccamel.readthedocs.io/</u>.

1227

1228 Probabilistic similarity estimation across cell types

The calculation of cell-type probabilistic score has been described in SWAPLINE package¹⁰⁸. 1229 Briefly, a vanilla neural network model was built for cell-type classification. To train the model, 1230 we removed the cell cycle-related genes and then computed the most variable features. In addi-1231 1232 tion, we ranked the marker genes for each cell type by two heuristics for the cell-type specificity of both fold change and enrichment score change. Subsequently, the ranked marker genes and 1233 the most variable genes were merged, log-transformed, and scaled by min-max normalization for 1234 learning models. The frame of the neural network model and the parameters have been described 1235 in the SWAPLINE package. The learning accuracy of the neural-network classifier was inspect-1236 1237 ed against epoch numbers and was estimated by k-fold cross-validation (k = 3). The learning rate

and learning epochs were selected according to the maximum point of the learning curve reaching the accuracy plateaus. The probabilistic scores from mouse and macaque species against human reference were visualized in violin plot.

1241

1242 Data integration across species

For the integration task, we applied interpretable neural-network learning. First, we took one 1243 dataset from the dataset pool. We trained a neural-network classifier by learning the transcrip-1244 1245 tional features of each cell-types in this dataset and then calculated the trained cells' probabilistic scores against all cell-types. Subsequently, we used all other datasets as query datasets and calcu-1246 lated the probabilistic score of every cell in each query dataset via the trained classifier. Then, we 1247 took another dataset from the dataset pool and repeated the training and prediction. We repeat the 1248 1249 training and prediction till every dataset has been used as a training reference for the predictions. Here, we consider that the probabilistic score of each cell reflects the weighted gene patterns 1250 1251 representing each trained cell-type. Thus, we merged the probabilistic scores of all cells from all trained and predicted datasets for the principal component analysis. The most significant princi-1252 pal components were determined by the elbow method and subsequently used as the latent space 1253 for further downstream analysis. The tree plot was constructed with the parameter of 11 principal 1254 1255 components, 90 nearest neighbors, and correlation metric. The trained cell-type similarity was calculated with the correlation distance and the average/UPGMA linkage and visualized in the 1256 1257 hierarchical heatmap.

1258

1259 In parallel, we normalized the gene expression by interpretable learning. We transformed the 1260 gene symbols of each species into the nomenclature in Homo sapiens. We estimated the features'

weights in each reference cell-type by using the DeepLift algorithm¹⁰⁹. The gene expression of 1261 each cell that has been learned or predicted in one trained reference dataset, was inferred by the 1262 matrix multiplication between the features' weights and the cell-type probabilistic scores. And 1263 1264 the final gene*cell expression matrix was calculated by the average of non-empty values across all datasets. Using this normalized expression matrix, we enriched the mostly co-expressed genes 1265 via spearman correlation. These co-expressed genes were used for inferring the TF associated 1266 gene patterns via a modified GENIE3, as described in^{110,111}. The result was visualized as a hier-1267 1268 archical heatmap.

1269

1270 Multiplex FISH, confocal microscopy imaging, and quantification

OCT embedded freshly dissected human lumbar or thoracic DRG tissues were cryosectioned at 1271 1272 $20 \Box \mu m$ thickness and mounted on glass slides. The slides were stored in $-80 \Box \circ C$ to preserve 1273 RNA integrity until use. RNAscope Fluorescent Multiplex Reagent Kit and RNASCOPE probes 1274 for the targeted genes (Advanced Cell Diagnostics Inc.) were used for *multiplex FISH*. 1275 RNAscope in situ hybridization was performed in accordance with the manufacturer's instructions. In brief, fresh frozen hDRG sections were fixed, dehydrated, and treated with protease. 1276 The sections were then hybridized with the respective target probe for 2 hr at 40°C, followed by 1277 1278 two to three rounds of signal amplification. The sections were then mounted under coverslips, sealed with nail polish, and stored in the dark at 4°C until imaged. A Leica SP5 confocal micro-1279 scope was used to capture images and ImageJ was used for image analysis. In some DRG neu-1280 rons, accumulation of lipofuscin in part of cells caused strong autofluorescence in all channels. 1281 These signals were considered as non-specific background (labeled by asterisk) were excluded 1282 1283 for analysis. (See Fig. S9 for examples). The percentage of each cluster over all DRG neurons

could be a little bit overestimated due to the following two reasons: 1) Some marker genes or
marker gene combination may also label a small subset of other cell types; 2) An underestimation in quantification of total neuronal numbers because some cells have neither multiple FISH
signals nor DAPI (4',6-diamidino-2-phenylindole) nucleus staining signals.

1288

1289 Human skin biopsy extraction, processing, and immunostaining

Dermal skin punch biopsies were performed as described herein. Briefly, 1 cc of lidocaine was 1290 1291 injected subdermally at each biopsy location (Supplementary table 3). A total of six, 3 mm dermal skin punch biopsies were performed on each patient. Excised skin was immediately placed 1292 in 1.5 mL eppendorf tubes containing 4 degree Celsius 4% paraformaldehyde (PFA) solution that 1293 was freshly prepared on the same day of the skin biopsy procedure. Biopsy tissue was fixed in 4% 1294 1295 PFA (dissolved in PBS) for exactly four hours at 4 degrees, followed by 2 X 30 minutes washes 1296 in phosphate buffered saline (PBS) solution, and then cryoprotected using 1XPBS, 30% sucrose at 4 degrees. These tissues in cold 1XPBS, 30% sucrose were overnight shipped to the lab of 1297 1298 Integrated Tissue Dynamics LLC.

1299

The skin biopsies were mounted in OCT and cryosectioned into 14 μm sections. Adjacent sections were collected by continuous slides. Immunofluorescence in this study was performed using combinations of mouse monoclional anti-human PGP9.5 (Protein Gene Product, CedarLane, Burlington, Canada, 31A3, [source UltraClone Ltd, Isle of Wight, UK]; 1:200), sheep polyclonal anti-human CGRP, mouse monoclonal anti-human NEFH (Sigma [ab142]; 1:400), rabbit antihuman SST (ImmunoStar 20067, Hudson, WI, USA), and anti-human KIT. Slides were preincubated in 1% bovine serum albumin and 0.3% Triton X-100 in PBS (PBS-TB) for 30 1307 minutes and then incubated with primary antibodies diluted in PBS-TB overnight in a humid 1308 atmosphere at 4°C. Slides were then rinsed in excess PBS for 30 minutes and incubated for 2 1309 hours at room temperature with the appropriate secondary antibodies diluted in PBS-TB. Follow-1310 ing secondary antibody incubation, the sections were rinsed for 30 minutes in PBS and coverslipped under 90% glycerol in PBS. Images were collected using a 20X objective on an 1311 Olympus BX51-WI microscope equipped with conventional fluorescence filters (Cy3:528-553 1312 nm excitation, 590-650 nm emission; Cy2/Alexa 488: 460-500 nm excitation, 510-560 nm 1313 1314 emission), a Hamamatsu ER, DVC high-speed camera, linear focus encoder, and a 3-axis motor-1315 ized stage system interfaced with Neurolucida software (MBF Bioscience, Essex, VT, USA).

1316

1317 In vivo electrophysiological recording of human peripheral sensory fibers

Single-unit axonal recordings (microneurography) were performed from the right posterior antebrachial cutaneous, radial, or superficial peroneal nerve of 41 healthy participants (19 males and 22 females; 19 to 41 years). Participants were comfortably seated in an adjustable chair with legs and arms stretched out (and hand pronated), supported by vacuum pillows, and covered in a blanket if they reported as feeling cold.

1323

Under real-time ultrasound guidance (LOGIQ P9, GE Healthcare, Chicago, IL, USA), the target nerve was impaled with an insulated tungsten recording electrode (FHC Inc., Bowdoin, ME, USA). Adjacent to that, an uninsulated reference electrode was inserted just under the skin. A high-impedance preamplifier (MLT185 headstage) was attached to the skin near the recording electrode and used together with a low-noise high-gain amplifier (FE185 Neuro Amp EX, ADInstruments, Oxford, UK). Once the electrode tip was intrafascicular, single LTMRs were searched for by soft-brush stroking, and single HTMRs were searched for by coarse-brush stroking, pinching, and hair tugging in the fascicular innervation zone while making minute electrode
adjustments.

1333

All recorded afferents were mechanically responsive and divided into subtypes based on estab-1334 lished criteria^{68,112,113}. Mechanical threshold and receptive field size were determined using 1335 Semmes-Weinstein monofilaments (nylon fiber; Aesthesio, Bioseb, Pinellas Park, FL, USA). 1336 1337 Mechanical threshold was defined as the weakest monofilament to which the unit responded to in at least 50% of trials. Hair deflection was tested with a small pair of forceps, carefully avoiding 1338 skin contact while manipulating the hair. Further, force measurements were performed to ensure 1339 that no skin/hair pulling occurred. Conduction velocity of the recorded afferent was estimated 1340 1341 from latency responses to surface electrical stimulation of the receptive field (FE180 Stimulus Isolator, ADInstruments, Oxford, UK). Electrically and mechanically evoked spikes were com-1342 pared on an expanded time scale to confirm they originated from the same unit. Thermal respon-1343 1344 siveness was tested by placing a Peltier probe (7.4 x 12.2 mm, T09, QST.Lab, Strasbourg, France) 1345 onto the receptive field. After recording baseline activity for at least 30 s (with the thermode in 1346 contact with the receptive field) at a neutral temperature of 30°C, a series of cooling (down to 0°C) and warming (up to 50°C) stimuli were delivered at 30-s intervals. If needed, the thermode 1347 was mounted on a stand for better stability. 1348

1349

To test *TRPV1* expression, capsaicin (Capsina 0.075%, Bioglan AB, Malmö, Sweden) was topically applied to the receptive field. After 1 minute, the skin was wiped clean, and the emergence of any spontaneous spiking activity from the recorded afferent was monitored. *TRPM8* expression was tested by placing an ethanol-soaked gauze pad (90% ethanol as control) onto the receptive field followed by menthol solution (400 mg of 40% L-menthol dissolved in 90% ethanol, Sigma-Aldrich, Inc., Schnelldorf, Germany¹¹⁴). The gauze pad was covered with an adhesive film to prevent the evaporation of ethanol. After 5 minutes, the skin was wiped clean and the emergence of any spontaneous spiking activity from the recorded afferent was monitored. During these procedures, we documented the participants' verbal descriptions of what they felt, and if there was no obvious sensation, the procedure was repeated.

1360

Neural activity was sampled at 20 kHz and recorded using the ADInstruments data acquisition 1361 1362 system (LabChart software v8.1.24 and PowerLab 16/35 hardware PL3516/P, Oxford, UK), then exported to Spike2 (v10.13, Cambridge Electronic Design Ltd., Cambridge, UK). Recorded ac-1363 1364 tion potentials were carefully examined offline on an expanded time scale. Threshold crossing was used to distinguish action potentials from noise with a signal-to-noise ratio of at least 2:1, 1365 1366 and spike morphology was confirmed by template matching. Recordings were discarded if mul-1367 tiple units were present or if spike amplitudes were not distinct from the noise, preventing secure action potential identification. 1368

1369

1370 Figure Generation Software

Figures were generated in Powerpoint (Microsoft Office) and GraphPad Prism (v9, GraphPad
Software Inc. La Jolla, CA, USA). Some cartoons were made partially in BioRender (BioRender,
2022, RRID:SCR_018361).

1374

1375 Data availability

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1376	The raw and	processed	datasets	for the	single-s	oma sea	uencing	of hDRG	neurons re	ported	in t	his
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- 1377 study will be deposited into Broad Institute Single cell portal
- 1378 (<u>https://singlecell.broadinstitute.org/single_cell</u>) once the manuscript is accepted for publication.
- 1379 Macaque (Kupari) data is available at
- 1380 <u>https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE165569</u>
- 1381 Mouse (Zeisel) DRG data is available at
- 1382 <u>http://loom.linnarssonlab.org/clone/Mousebrain.org.level6/L6 Peripheral sensory neurons.loom.</u>
- 1383 Mouse (Sharma) DRG data is available at
- 1384 <u>https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE139088</u>
- 1385

1386 Code availability

- 1387 Any custom code will be deposited to Github once the manuscript is accepted for publication.
- 1388 All analyses are based on previously published code and software.
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1409	Figure 1. Developing a novel laser capture microdissection (LCM) based approach for sin-
1410	gle-soma deep RNA-seq of hDRG neurons
1411	(A) A diagram shows the overall workflow of this study. (left) A cartoon illustrates features as

sociated with different strategies for single-cell RNA-seq of hDRG neurons. (Middle) One real 1412 1413 example of the laser dissection of a hDRG neuron soma is shown. (Right) Analyses and experiments conducted in this study are summarized. Scale bar, 50 µm (cell) and 500 µm (cap) 1414 (B) UMAP plot showing the clusters of 1066 hDRG neurons. (C-D) Violin plots showing total 1415 number of detected genes (C) and the expression of neuronal marker SLC17A6 (D). (E) The 1416 1417 grouping clusters based on the soma size, and the expression of INA, NEFH, PRDM12, and CALCA. (F) UMAPs showing some canonical marker gene expression in each cluster. (G) 1418 UMAP plot with names of each cluster. 1419

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1421 Fig. 2 Cross-species analysis of DRG neurons in human, macaque, and mouse

(A, B) Conos label propagation from mouse (Sharma) (A, combined Sharma & Usoskin nomen-1422 1423 clature) and macaque (B) to hDRG neuron clusters showing the cell type correlation. For UMAPs for correspondent co-integration, from which these results were inferred, see Fig. S5A-1424 1425 B. (C) Summary of correspondence of DRG neuron clusters among three species. Solid lines 1426 depict clear match, and dashed lines represent partial similarity. (D) Heatmap visualization of cross-species-conserved and species-specific transcription factor associated gene patterns across 1427 1428 mouse, macaque, and human. Species are color coded in the right column. Yellow boxes, conserved, green boxes, species-specific gene regulatory networks. 1429

1430

Figure 3. Marker gene expression and validation in C-fiber pruriceptors, thermoreceptors, and nociceptors

1433 (A-D) Marker genes for specific labeling of each cluster and validation by multiplex FISH for 1434 and hNP2 (A), hPEP.SST(B), hTRPM8 (C), and hPEP.TRPV1/A1.1 hNP1 and hPEP.TRPV1/A1.2 (D). The fluorescent images show detected transcripts in one example hDRG 1435 1436 neuron (cell body outlined by the white dashed line. Circle charts next to images show quantification: the arcs indicate the percentage of neurons positive for the given marker gene over all 1437 sampled DRG neurons. The sector shaded areas indicate the approximate percentage of each cell 1438 1439 type over the total quantified hDRG neurons. N=2, A (199 neurons total), B (220 neurons total), C (156 neurons total), D (202 neurons total). Scale bar, 50 µm. 1440

1441

1442 Figure 4. Marker gene expression and validation in A-fiber nociceptors

(A-D) Marker genes for specific labeling of each cluster and validation by multiplex FISH for
 hPEP.PIEZO2^h(A), hPEP.KIT (B), hPEP.CHRNA7 (C), and hPEP.NTRK3 (D). The fluorescent

images show the detected transcripts in one example hDRG neuron (cell body outlined by the
white dashed line). Circle charts next to images show quantification: the arcs indicate the percentage of neurons positive for the given marker gene over all sampled DRG neurons. The sector
shaded areas indicate the approximate percentage of each cell type over the total quantified
hDRG neurons. N=2, A (165 neurons total), B (173 neurons total), C (196 neurons total), D (191
neurons total). Scale bar, 50 μm.

1451

1452 Figure 5. Marker gene expression and validation in C- and A-LTMRs

1453 (A- D) Marker genes for specific labeling of each cluster and validation by multiplex FISH for hC.LTMR (A), hA\delta.LTMR (B), hAB.LTMR (C), hPropr (D) and hATF3 (E). The fluorescent 1454 images show the detected transcripts in one example hDRG neuron (cell body outlined by the 1455 1456 white dashed line). Circle charts next to images show quantification: the arcs indicate the percentage of neurons positive for the given marker gene over all sampled DRG neurons. The sector 1457 1458 shaded areas indicate the approximate percentage of each cell type over the total quantified 1459 hDRG neurons. N=2, A (205 neurons total), B (183 neurons total), C (188 neurons total), D (198 1460 neurons total), E (202 neurons total). Scale bar, 50 µm.

1461

1462 Figure 6. Single-soma deep RNA-seq dataset is powerful for molecular discovery

(A) Comparison of the total detected number of GPCRs, ion channels, chemokine receptors, and
neuropeptides in single-soma, spatial, and single-nucleus RNA-seq datasets. (B-C) Expression of
putative itch receptors in hDRG neurons. Some receptors are highly enriched (B), while some
receptors are barely detected (C) in human itch populations. (D) Novel GPCRs, ion channels,
and other genes enriched in human itch populations.

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Figure 7. Molecular profile-informed single-unit microneurography recordings revealed novel physiological properties of a population of human A-HTMRs.

1471 (A) Predicted physiological properties of hPEP.KIT sensory afferents based on single-soma deep RNA-seq data. (B) Receptive field locations of recorded single afferents from superficial per-1472 oneal (S. peroneal), posterior antebrachial cutaneous (PABCN), and radial nerve recordings (n =1473 47). (C) Distribution of mechanical (monofilament) thresholds for HTMRs and LTMRs in the 1474 1475 recorded samples. (**D**) Individual and mean (±SEM) conduction velocities of different HTMR 1476 and LTMR types in response to surface electrical stimulation from upper and lower limbs (Field-1477 LTMR: 40.3 ± 4.2 m/s, n=2; SA1-LTMR: 44.9 ± 2.6 m/s, n=3; SA2-LTMR: 44.9 ± 1.2 m/s, n=3; A-HTMR cooling-: 50.6 ± 4.8 m/s, n=5; A-HTMR cooling+: 48.9 ± 5.0 m/s, n=3; C-LTMR: 1.0 1478 1479 \pm 0.05 m/s, n=8; C-HTMR: 0.7 \pm 0.08 m/s, n=5). (E) Spike activities of a putative hPEP.KIT 1480 unit (A-HTMR cooling+) in response to repeated stimulations of the receptive field, superim-1481 posed on an expanded time scale. (F-H) Responses of an A-HTMR cooling+ unit to soft and 1482 coarse brushing (F), heating (G) and cooling (H). (I) Schematic showing the link between the histologically identified KIT⁺/CGRP⁺/NEFH⁺ sensory afferents and the molecularly defined 1483 hPEP.KIT population, likely representing a type of heat/capsaicin-insensitive but cold-sensitive 1484 1485 A-HTMRs.

1486

Figure 8. Molecular profile-informed single-unit microneurography recordings revealed novel physiological properties of a population of human C-LTMRs.

(A) Novel physiological properties of hC.LTMR sensory fibers predicted based on gene expression obtained from the single-soma deep sequencing. (B) Spike activity of a hC.LTMR unit in

1491	response to repeated stimulations of the receptive field, superimposed on an expanded time scale.
1492	(C) Individual and mean (±SEM) conduction velocities of different HTMR and LTMR types in
1493	response to surface electrical stimulation from upper and lower limbs (the same plot from Fig.
1494	7D) (D-H) Responses of a hC.LTMR unit to soft brushing and hair movement (D), cooling (E),
1495	menthol (F), heating (G) and capsaicin (H). Spike activity of that hC.LTMR before and after
1496	capsaicin application, overlaid on an expanded timescale (H). Conduction delay was adjusted
1497	based on the latency of electrically triggered spiking for that recorded afferent. Note, different
1498	scaling.

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This study		Nguyen		
	hTRPM8		-H8	
	hC.LTMR	: : : : :	~ H10	
	hNP1			
	hNP2		H4	
	hPEP.SST		-H11	
	hPEP.TRPV1/A1.1		- H1	
	hPEP.TRPV1/A1.2		- H2	
	hPEP.CHRNA7		H5	
	hPEP.PIEZO ^h	·····	H3	
	hPEP.KIT		-H9	
	hPEP.NTRK3		H6	
	hPEP.0		H7	
	hAδ.LTMR		-H13	
	hAβ.LTMR		- H14	
	hPropr		H12	
	hATF3		H15	

























0 0.2 0.4 0.6 0.8 1.0



0 0.2 0.4 0.6 0.8 1.0



B

Δ

hPEP.SST

epi





