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RESEARCH ARTICLE

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Characterization of Human iPSC-derived Spinal Motor Neurons by Single-cell RNA Sequencing

- Louise Thiry, a,c Regan Hamel, b Stefano Pluchino, Thomas Durcan a,c and Stefano Stifani a*
- ^a Department of Neurology and Neurosurgery, Montreal Neurological Institute-Hospital, McGill University, 3801, rue University, Montreal
 (Quebec) H3A 2B4. Canada
- B Department of Clinical Neurosciences, Clifford Allbutt Building Cambridge Biosciences Campus and NIHR Biomedical Research
- 9 Centre, University of Cambridge, Hills Road, CB2 0HA Cambridge, UK
- 10 ° Early Drug Discovery Unit, Montreal Neurological Institute-Hospital, Canada
 - Abstract—Human induced pluripotent stem cells (iPSCs) offer the opportunity to generate specific cell types from healthy and diseased individuals, allowing the study of mechanisms of early human development, modelling a variety of human diseases, and facilitating the development of new therapeutics. Human iPSC-based applications are often limited by the variability among iPSC lines originating from a single donor, as well as the heterogeneity among specific cell types that can be derived from iPSCs. The ability to deeply phenotype different iPSC-derived cell types is therefore of primary importance to the successful and informative application of this technology. Here we describe a combination of motor neuron (MN) derivation and single-cell RNA sequencing approaches to generate and characterize specific MN subtypes obtained from human iPSCs. Our studies provide evidence for rapid and robust generation of MN progenitor cells that can give rise to a heterogenous population of MNs. Approximately 58% of human iPSC-derived MNs display molecular characteristics of lateral motor column MNs, with a number of molecularly distinct subpopulations present within this MN group. Roughly 19% of induced MNs resemble hypaxial motor column MNs, while ~6% of induced MNs have features of median motor column MNs. The present study has the potential to improve our understanding of iPSC-derived MN subtype function and dysfunction, possibly leading to improved iPSC-based applications for the study of human MN biology and disease.

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Key words: human iPSCs, spinal motor neurons, single cell RNA sequencing.

INTRODUCTION

Human induced pluripotent stem cells (h-iPSCs) have emerged as a powerful model system to investigate the mechanisms of cell differentiation, function and dysfunction (reviewed in Haston and Finkbeiner, 2016; Ardhanareeswaran et al., 2017; Amin et al., 2019). Moreover, they offer potential as a physiologically-relevant experimental system for disease modelling and discovery of new therapeutics. A key requirement for fulfilling the full potential of h-iPSCs is the ability to reliably generate specific cell types with defined phenotypic traits. It is often the case that functionally specialized subtypes of cells hold the most promise for fundamental biological studies,

disease modelling or drug discover efforts. Thus, it is of the utmost importance to establish protocols for the differentiation and deep phenotyping of h-iPSC-derived cells that may represent only a small fraction of cells *in vivo*.

Spinal motor neurons (MNs) are a highly specialized group of neurons that reside in the spinal cord and project axons to muscle fibers to control their contraction. The precise coordination of muscle contractions is essential to generate complex motor behaviors such as walking, grasping or breathing. To ensure such refined coordination, spinal MNs must acquire specific identities matching the muscle types they will innervate. During MN development, all spinal MNs emerge from progenitor cells in the MN progenitor (pMN) domain. The pMN domain is located in the medial portion of the ventral neural tube, just ventral to the progenitor domain 2 (p2) and dorsal to the p3 domain, which give rise to V2 and V3 interneurons (INs), respectively (Alaynick et al., 2011; Stifani, 2014). After the formation of distinct progenitor domains, pMN progenitor cells initially acquire a general MN fate in

E-mail address: stefano.stifani@mcgill.ca (S. Stifani).

Abbreviations: ALS, amyotrophic lateral sclerosis; HMC, hypaxial motor column; iPSCs, induced pluripotent stem cells; LMC, lateral motor column; MMC, median motor column; MN, motor neuron; MNPCs, motor neuron progenitor cells; NPCs, neural progenitor cells; PMC, phrenic motor column; SMA, spinal muscular atrophy.

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^{*}Corresponding author.

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response to the expression of specific transcription factors including PAIRED BOX 6 (PAX6) and OLIGODEN-DROCYTE TRANSCRIPTION FACTOR 2 (OLIG2) (Ericson et al., 1997; Novitch et al., 2001; Vallstedt et al., 2001). As the spinal cord continues to develop, inductive signals along the rostro-caudal axis further specify developing MNs, leading to the formation of anatomically defined motor columns, each containing phenotypically distinct MNs with specific axonal projections to different muscle targets (Prasad and Hollyday, 1991; Tsuchida et al., 1994; Jessell, 2000; Alaynick et al., 2011; Francius and Clotman, 2014; Stifani, 2014).

Loss of MN function is associated with several devastating neurological diseases including muscular atrophy (SMA) and amyotrophic sclerosis (ALS) (Kanning et al., 2010; Nijssen et al., 2017), and it is also a pathological feature of a number of spinal cord injury cases (Alizadeh et al., 2019). Patient-derived iPSCs have been generated from ALS and SMA patients (e.g., Ebert et al., 2009; Egawa et al., 2012; Chen et al., 2014; Kiskinis et al., 2014) and a number of differentiation protocols have been developed to obtain patient-derived MNs for disease modelling (e.g., Li et al., 2005; Qu et al., 2014; Amoroso et al., 2013; Du et al., 2015). Although some of these protocols facilitate the generation of highly pure MN populations (Du et al., 2015), the molecular characterization of these cells is often limited to the use of pan-MN markers through immunostaining approaches (Amoroso et al., 2013: Chen et al., 2014; Maury et al., 2015; Du et al., 2015). Given the heterogeneity of spinal MNs, our limited understanding of the biological properties of different h-iPSCderived MNs, and the possibility that not all types of h-MN subtypes may provide disease-relevant experimental models, there is a critical need to improve our understanding of h-iPSC-derived MN biology and function. Here we describe the results of studies applying single-cell RNA sequencing (sc-RNAseq) to characterize the different cell subtypes obtained after subjecting h-iPSCs to a MN differentiation protocol and we describe the implications of these findings for MN disease modeling and drug discovery efforts.

EXPERIMENTAL PROCEDURES

Generation of motor neurons from human iPSCs

Human iPSC line NCRM-1 (male) was obtained from the National Institutes of Health Stem Cell Resource (Bethesda, MD, USA). Cells at low passage number were cultured in mTeSR medium (STEMCELL Technologies; Vancouver, BC, Canada; Cat. No. 85850) in 6-cm culture dishes (Thermo-Fisher Scientific; Waltham, MA, USA; Cat. No.130181) coated with Matrigel (Thermo-Fisher Scientific; Cat. No. 08-774-552) until they reached 70–80% confluence. To generate neural progenitor cells (NPCs), iPSCs were dissociated with Gentle Cell Dissociation Reagent (STEMCELL Technologies; Cat. No. 07174) and split 1:5 using T25 flasks (Thermo-Fisher Scientific; Cat. No. 12-556-009) coated with poly-L-ornithine (PLO; Sigma-Aldrich; Oakville, ON, Canada; Cat. No. P3655) and laminin

(Sigma-Aldrich; Cat. No. L2020). The mTeSR medium was replaced with a chemically defined neural medium including DMEM/F12 supplemented with GlutaMAX (1/1; Thermo-Fisher Scientific: Cat. No. 35050-061), Neurobasal medium (1/1; Thermo-Fisher Scientific; Cat. No. 21103-049), N2 (0.5X; Thermo-Fisher Scientific; Cat. No. 17504-044), B27 (0.5X; Thermo-Fisher Scientific: Cat. No. 17502-048), ascorbic acid (100 uM: Sigma-Aldrich; Cat. No. A5960), and antibioticantimycotic (1X; Thermo-Fisher Scientific; Cat. No. 15240-062). This medium was supplemented with $3 \mu M$ CHIR99021 (STEMCELL Technologies; Cat. 72054), 2 µM DMH1 (Sigma-Aldrich; Cat. No. D8946) and 2 µM SB431542 (Tocris Bioscience: Bristol, UK: Cat. No. 1614). The culture medium was changed every other day for 6 days and the resulting NPCs were then differentiated into motor neuron progenitor (MNPCs), and subsequently MNs, as described previously (Du et al., 2015), with minor modifications. Briefly, on day 6 NPCs were dissociated with Gentle Cell Dissociation Reagent and split 1:5 with the same medium described above, supplemented with retinoic acid (RA) (0.1 μM; Sigma-Aldrich; Cat. No. R2625) and purmorphamine (0.5 µM; Sigma-Aldrich; Cat. No. SML-0868) in combination with $1 \mu M$ CHIR99021, $2 \mu M$ DMH1 and 2 μM SB431542 reagents. The culture medium was changed every other day for 6 days and the resulting MNPCs were characterized by immunocytochemistry. MNPCs were expanded for 6 days with the same medium containing 3 μM CHIR99021, 2 μM DMH1, 2 μM SB431542, 0.1 μM RA, 0.5 μM purmorphamine and 500 μM valproic acid (VPA; Sigma-Aldrich; Cat. No. P4543). To generate MNs, MNPCs were dissociated and plated at 50,000 cells per well on Matrigel coated coverslips and cultured with the same neural medium supplemented with 0.5 µM RA and 0.1 µM purmorphamine. Culture medium was replaced every other day for 6 days and the resulting MNs were characterized by immunocytochemistry. For sc-RNAseq, MNs were dissociated, plated on Matrigelcoated T25 flasks, and cultured with the same neural medium supplemented with 0.5 µM RA, 0.1 µM purmorphamine, 0.1 μM Compound E (Calbiochem; Cat. No. 565790), insulin-like growth factor 1 (10 ng/mL; R&D Systems; Minneapolis, MN; Cat. No. 291-G1-200), brainderived neurotrophic factor (10 ng/mL; Thermo-Fisher Scientific; Cat. No. PHC7074) and ciliary neurotrophic factor (10 ng/mL; R&D Systems; Cat. No. 257-NT-050) for 6 days before single cell suspension preparation.

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Characterization of human iPSC-derived cells by immunocytochemistry

Induced MNPCs and MNs were analyzed by immunocytochemistry, which was performed as described previously (Methot et al., 2018). The following primary antibodies were used: mouse anti-OLIG2 (1/100; Millipore Corp.; Billerica, MA, USA; Cat. No. MABN50); rabbit anti-PAX6 (1/500; Covance; Emeryville, CA, USA; Cat. No. PRB-278P); rabbit anti-HOMEOBOX C4 (HOXC4) (1/150; kindly provided by Dr. Jeremy Dasen, New York University School of Medicine, New York, NY); goat anti-SRY-BOX 1 (SOX1) (1/500; R&D Systems; Cat. No. AF3369); mouse

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anti-NK2 HOMEOBOX 2 (NKX2.2) (1/100; Developmental Studies Hybridoma Bank - DSHB; Cat. No. 74.5A5-c); rabanti-HOMEOBOX PROTEIN CHX10 (CHX10) (1/10,000; kindly provided by the late Dr. Thomas Jessell, Columbia University, New York, NY); mouse anti-HOMEOBOX PROTEIN HB9 (HB9) (1/30; DSHB; Cat. No. 81.5C10-c); mouse anti-ISLET1 (ISL1) (1/30; DSHB; Cat. No. 39.4D5-c): rabbit anti-LIMB HOMEOBOX CON-TAINING 3 (LHX3) (1/100; Abcam; Toronto, ON, Canada; Cat. No. ab14555), goat anti-FORKHEAD BOX PROTEIN 1 (FOXP1) (1/100; R&D Systems; Cat. No. AF4534), and guinea pig anti-SCIP (1/16,000; kindly provided by Dr. Jeremy Dasen). Secondary antibodies against primary reagents raised in various species were conjugated to Alexa Fluor 488, Alexa Fluor 555, or Alexa Fluor 647 (1/1000, Invitrogen: Burlington, ON, Canada), For quantification, images were acquired using an Axio Observer Z1 microscope connected to an AxioCam camera, using ZEN software (Zeiss Canada Ltd., Toronto, ON, Canada). For each culture and each time point (e.g., NPCs, MNPCs, MNs), images of > 500 cells in 3 random fields were taken with a 20X objective and analyzed with Image J. The fraction of cells expressing specific marker proteins was calculated as percent of total cells \pm standard error of the mean.

Preparation of single-cell suspensions from induced motor neuron culture

Single-cells in suspension were prepared from MNs cultured for 28 days (Day 0 defined as start of NPC induction), as follows. MNs were first rinsed with 2 mL of dPBS (calcium and magnesium free phosphate buffered saline) containing 0.04% BSA (Sigma-Aldrich; Cat. No. A7906) and dissociated with 2 mL of dissociation reagent containing papain (50U; Sigma-Aldrich; Cat. No. P4762) and Accutase (Thermo-Fischer Scientific; Cat. No. A11105-01). Cells in dissociation reagent were incubated for 15-20 min at 37°C to ensure dissociation of cell clusters before adding 5 mL of DMEM/F12 containing 0.04% BSA and 10% ROCK inhibitor Y-27632 (1/1000; Tocris; Cat. No. 1254), followed by resuspension by gentle pipetting. Cells in suspension were transferred into a 15 mL falcon tube and centrifuged at 1300 rpm for 3 min at room temperature. The cell pellet was resuspended in 2 mL of dPBS containing 0.04% BSA and ROCK-inhibitor (1/1000). Cells were centrifuged again at 1300 rpm for 3 min at room temperature and the cell pellet was resuspended in 500 µL of the above-mentioned resuspension buffer. A 30-µm strainer was used to remove cell debris and clumps and the single-cell suspension was transferred into a 2 mL Eppendorf tube placed on ice. Cells were counted to evaluate cell concentration and viability before sc-RNAseq. The targeted cell concentration was 700-1200 cells/μL, as recommended in the 10x Genomics (https://www. guidelines 10xgenomics.com/solutions/single-cell/).

Single cell RNA sequencing and in silico analysis

Cells were sequenced at a single-cell level using the microdroplet-based platform, 10x Genomics Chromium

Single Cell 3' Solution (10x Genomics: Pleasanton, Ca. USA), followed by sequencing on a HiSeq4000 system (Illumina; San Diego, CA, USA) at the McGill and Genome Quebec Innovation Center (https://cesgq.com/ en-services). The 10x cDNA libraries were sequenced at a depth of 50,000 reads per cell. The raw sc-RNAseq data (FASTQ files) were first processed using the Cell Ranger pipeline (10x Genomics) to demultiplex and align the sequences to the human reference genome. GRCh38. FASTQ files were aligned and empty droplet 10x barcodes were filtered out via Cell Ranger. Post-Cell Ranger, gene/cell matrices from 5900 single cells were imported into R. We performed quality control using the Bioconductor-package, scater (McCarthy et al., 2017) to filter out damaged cells based on higher than expected (>3 median absolute deviations) proportions of mitochondrial to nuclear genes and lower than expected (<3 median absolute deviations) genes per cell and transcripts per cell, all of which would suggest that the sequenced cells were dead or damaged and thus leaking nuclear transcripts. The normalization was perby first clustering the cells using the Bioconductor-package, scran (Lun et al., 2016) before computing cluster-based size factors (scran) to finally normalize the dataset. Next, technical noise in the dataset was removed by first modelling the noise (scran) and then performing principal-component analysis (scran). Later principle components account for very little of the variability in the dataset and are thus assumed to represent the random, technical noise while the endogenous variation of co-regulated genes is assumed to be represented in the earlier principle components. Thus, by removing the later principle components, the dataset can be denoised while preserving the biologically-driven variability of gene expression. All software packages are publicly available at the Bioconductor project (http://bioconductor.org). The workflow used for the analysis was adapted from a published workflow developed to accommodate dropletbased systems such as 10X Chromium (Lun et al., 2016). This workflow is available on https://github.com/regan-hamel/h-iPSCs-MNI.

RESULTS

Generation of an enriched population of human iPSC-derived motor neurons

Spinal MNPCs were generated from the h-iPSC NCRM-1 line by mimicking *in vitro* sequential steps of MN development *in vivo*, including neural induction, followed by caudalization and ventralization of NPCs (Li et al., 2005; Wichterle et al., 2002). Spinal NPCs were induced by inhibiting BONE MORPHOGENETIC PROTEIN/TRANSFORMING GROWTH FACTOR-BETA signalling, using a small-molecule cocktail composed of the CHIR99021, DMH1 and SB431542 reagents, as previously described (Du et al., 2015). After 6 days from the start of the induction protocol, $85 \pm 1\%$ of the induced cells expressed typical NPC markers, including SOX1, and $70 \pm 3\%$ expressed the cervical spinal cord marker HOXC4, indicative of a rostral spinal cell fate (Burke et al., 1995) (Fig. 1A, B). NPCs were ventralized by addi-

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tion of the SONIC HEDHEHOG (SHH) agonist, purmorphamine, at a concentration of 0.5 µM, in the presence of 0.1 µM RA, resulting in the generation of MNPCs, with $75 \pm 7\%$ of induced cells being PAX6-positive + and 77 ± 5% expressing the MNPC marker OLIG2 (Briscoe et al., 2000; Jessell, 2000; Alaynick et al., 2011) at day 12 (Fig. 1C, D). As expected, a small proportion of spinal ventral IN progenitors was detected in our cultures, with $1.8 \pm 0.3\%$ of the induced cells expressing the p3 domain marker NKX2.2 (Novitch et al., 2001; Sugimori et al., 2007) and 2.5 \pm 0.8% expressing the p2 domain marker CHX10 (Debrulle et al., 2019; Alaynick et al., 2011) (Fig. 1E, F).

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Continued exposure of MNPCs to RA and purmorphamine led to the generation of an enriched $(67 \pm 8\%)$ population of induced cells expressing the typical pan-MN markers ISL1 and HB9 (Amoroso et al., 2013) (Fig. 2A, B), as early as 25 days after the start of the differentiation protocol. Across a number of different MN derivation experiments, the yield of ISL1⁺/HB9⁺ cells varied from \sim 40% to as high as \sim 80% (Fig. 2B), possibly the result of different MN survival rates from one culture to

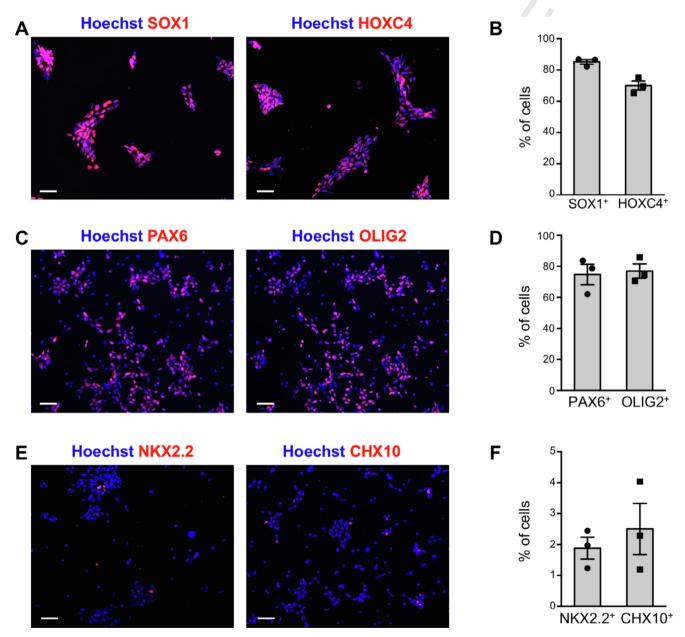
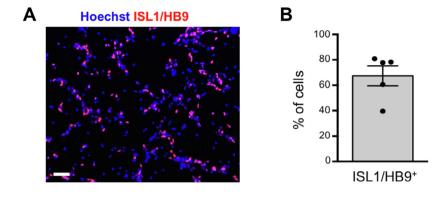
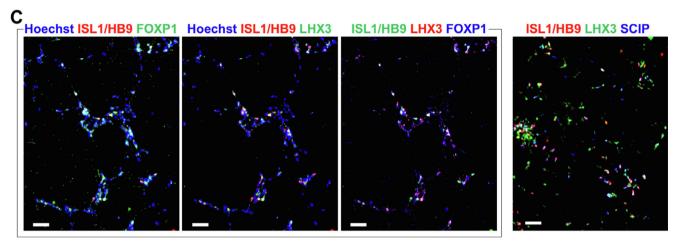


Fig. 1. Generation of an enriched population of human iPSC-derived motor neuron progenitor cells. (A, B) Representative images (A) and quantification (B) of neural progenitor cells (NPCs) subjected to immunocytochemistry with either anti-SOX1 or anti-HOXC4 antibodies 6 days after the start of the differentiation protocol. (C, D) Representative images (C) and quantification (D) of MN progenitor cells (MNPCs) subjected to immunocytochemistry with either anti-OLIG2 or anti-PAX6 antibodies 12 days after the start of the differentiation protocol. (E, F) Representative images (E) and quantification (F) of V3 interneuron progenitors (INPs) subjected to immunocytochemistry with anti-NKX2.2 antibody or V2 INPs visualized with anti-CHX10 antibody, 12 days after the start of the differentiation protocol. For all graphs, n = 3 cultures (with > 500 cells in random fields for each culture). Scale bars = $50 \mu m$.







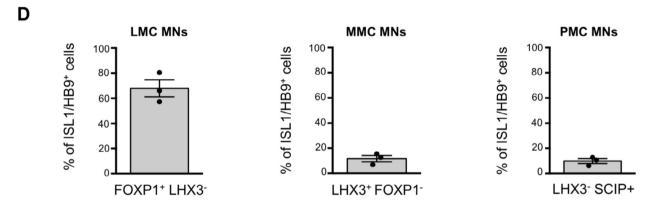


Fig. 2. Different subpopulations of human iPSC-derived motor neurons identified by immunocytochemistry. (**A**, **B**) Representative image (**A**) and quantification (**B**) of h-IPSC-derived MNs visualized by immunocytochemistry with the pan-MN markers HB9 and ISL1 combined (ISL1/HB9) 25 days after the start of the differentiation protocol (*n* = 5 cultures; > 500 cells in random fields for each culture). (**C**, **D**) Representative images (**C**) and quantification (**D**) of MN subpopulations identified through expression of different combinations of anti-ISL1/HB9, anti-LHX3, anti-FOXP1, and anti-SCIP antibodies, as revealed by immunocytochemistry. ISL1⁺/HB9⁺/FOXP1⁺/LHX3⁻ cells are defined as LMC MNs. ISL1⁺/HB9⁺/LHX3⁺/FOXP1⁻ cells are defined as MMC MNs. ISL1⁺/HB9⁺/SCIP⁺/LHX3⁻ cells are defined as PMC MNs. For all graphs in (**D**), *n* = 3 cultures (with > 500 cells in random fields for each culture). LMC, lateral motor column, MMC, median motor column, PMC, phrenic motor column. Scale bars = 50 μm.

another, and/or variability of cell culture reagents from one lot to another. The majority ($68 \pm 7\%$) of iPSC-derived ISL1⁺/HB9⁺ MNs did not express the LHX3 protein (Thaler et al., 2002; Agalliu et al., 2009) and instead expressed FOXP1, commonly considered as a marker of limb innervating MNs of the lateral motor column (LMC) (Dasen et al., 2003, 2008; Amoroso et al., 2013)

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(Fig. 2C, D). Among the ISL1 $^+$ /HB9 $^+$ cells that did not express FOXP1, 15 \pm 3% did not express LHX3 either, suggesting that this fraction of MNs had a molecular profile (FOXP1 $^-$ /LHX3 $^-$) similar to that of MNs of the hypaxial motor column (HMC), containing MNs innervating respiratory muscles *in vivo* (data not shown). Consistent with this possibility, we observed that 10 \pm 2% of

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ISL1 + /HB9 + MNs expressed the transcription factor POU CLASS 3 HOMEOBOX 1/OCTAMER BINDING PRO-TEIN 6/SCIP (SCIP), known to be enriched in vivo in MNs of the phrenic motor column (PMC), a component of the HMC (Bermingham et al., 1996; Philippidou et al., 2012; Machado et al., 2014) (Fig. 2C, D). Lastly, only $12 \pm 3\%$ of the h-iPSC-derived MNs were FOXP1⁻ and expressed LHX3, thus exhibiting a profile (FOXP1⁻/ LHX3⁺) resembling that of MNs of the median motor column (MMC) (Fig. 2C, D). Together, these observations suggest that h-iPSC-derived MNPCs can be differentiated into a population of heterogenous spinal MNs comprising cells exhibiting molecular profiles suggestive of LMC (68%). HMC (15%). and MMC (11%) MN fates. thus underscoring the ability of h-iPSCs to give rise to heterogenous MN cultures.

Characterization of cellular heterogeneity of human iPSC-derived MN culture using single-cell RNA sequencing

To further characterize the cellular composition of hiPSC-derived MN cultures, we performed microdropletsc-RNAseq. which enables а characterization of the genome-wide expression profile of individual cells (Stegle et al., 2015). We chose to analyze day-28 MN cultures, because at this relatively early stage of in vitro differentiation, induced MNs have not yet begun to coalesce into large cell clusters, as they do after continued culture (Calder et al., 2015; data not shown), which would make the isolation of single cells technically challenging. After sc-RNAseq, FASTQ files were acquired from 5900 single cells. We used the Bioconductor software (Lun et al., 2016) to perform quality control steps to filter out damaged cells, followed by principal-component analysis and t-distributed stochastic neighbor embedding (t-SNE) analysis of the remaining cells. A total of 4584 cells passed quality control, with a median of 5421 mapped reads per cell and a median of 2215 genes expressed per cell. The percentage of mitochondrial genes present in most cells was less than 2%.

The quality-controlled 4584 cells were divided into 14 shared nearest neighbour graph-based clusters (scran) that exhibited distinct gene expression patterns, consistent with cellular heterogeneity in the h-iPSCderived MN culture (Fig. 3A). As shown in Fig. 3B, the majority of induced cells were mainly contained in clusters #4 (28% of the cells), #6 (15%), #10 (10%) and #11 (9%). In order to characterize the different cell types in the identified clusters, we performed integrative analysis to compare the cell proportions and gene expression differences between each cluster. Based on differential genes enriched in each cluster, 6 major types of cells were identified (Fig. 3C). Clusters #1, #3, and #11 contained a large proportion of cells identified as "MNPCs and/or MNs", based on their expression of specific markers such as NEUROGENIN2 (NEUROG2), OLIG2, HB9, ISL1, ISL2, and CHOLINE ACETYL TRANSFERASE (CHAT). Cells of cluster #13 were annotated as "undifferentiated stem-like cells" based on high expression of the pluripotency markers, OCTAMER BINDING PROTEIN 4 (OCT4) and NANOG (Nichols

and Smith, 2012) (Fig. 3D). Clusters #10 and #12 were annotated as "NPCs" based on the expression of SOX1, SOX2 and MARKER OF PROLIFERATION KI-67 (MKI67) (Kan et al., 2007; Graham et al., 2003; Scholzen and Gerdes, 2000). Clusters #5 and #6 were annotated as "INs", with high expression of specific marker genes for IN progenitors such as SOX14, NKX2.2, VISUAL SYSTEM HOMEOBOX 1 (VSX1), CHX10, and SINGLE-MINDED HOMOLOG 1 (SIM1) (Ericson et al., 1997; Novitch et al., 2001; Sugimori et al., 2007; Alaynick et al., 2011; Debrulle et al., 2019), as well as the mature IN marker CALBINDIN 1 (CALB1) (Alvarez et al., 2005). Cluster #2 was annotated as "astrocytic glial cells" based on high expression of S100 CALCIUM BIND-ING PROTEIN B (\$100\beta) and \$OX9 (Rosengren et al., 1986; Sun et al., 2017). Cluster #4 represented a mix of MNPCs, astrocytic glial cells and oligodendrocytes, with high expression of NEUROG2, OLIG2, HB9, ISL1, ISL2, **VESICULAR ACETYLCHOLINE TRANSPORTER** (VACTH), S100β and SOX9, as well as PLATELET DERIVED GROWTH FACTOR RECEPTOR ALPHA (PDGFRa) and GALACTOSYLCERAMIDASE (GALC) (Hall et al., 1996; Miller, 2002). Clusters #8, #9, and #14 represented "apoptotic cells", with high expression of BCL2 ASSOCIATED X PROTEIN (BAX) (Wei et al., 2001; D'Orsi et al., 2015) and NERVE GROWTH FAC-TOR (NGF) (Frade and Barde, 1999).

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To confirm this cluster annotation, we correlated genes specifically expressed in different clusters with defined gene ontology (GO) terms. Genes that were expressed in clusters associated with NPCs were significantly enriched for neurogenesis ($p = 3.366e^{-07}$) and nervous system development $(p = 8.511e^{-05})$ categories. Genes that were specifically expressed in clusters associated with MNs were significantly enriched for MN axon guidance pathways ($p = 3.084e^{-05}$). Genes specifically expressed in the IN clusters were significantly enriched for ventral spinal cord IN $(p = 8.826e^{-05})$ specification and neuronal differentiation $(p = 3.004e^{-06})$. Genes specifically expressed in the astrocytic glial cell clusters were significantly enriched for immune system processes $(p = 6.116e^{-06})$ and immune responses $(p = 8.909e^{-05})$. Genes that were enriched in clusters associated with apoptotic cells were significantly enriched for regulation of programmed cell death $(p = 1.039e^{-10})$ and neuronal apoptotic processes $(p = 7.76e^{-05})$. Overall, cells that went through sc-RNAseg analysis unscathed were mainly enriched in MNs (35%), INs (28%) and glial cells (22%) (Fig. 3D). As shown in Fig. 3E, the vast majority (96.2%) of INs were identified as V2 INs expressing SOX14, CHX10 and GATA BINDING PROTEIN 3 (GATA3). Ventral V3 INs, expressing NKX2.2 and SIM1, represented only 0.7% of the IN population, and the more dorsal IN populations were mainly absent: specifically, V1 INs [ENGRAILED1 (EN1)+/EVEN-SKIPPED HOMEOBOX 1 (EVX1)-] accounted for 1.9% of cells; V0 INs (EN1-/ EVX1+) accounted for 0.5% of cells; and dorsal INs [LADYBIRD HOMEOBOX $(LBX1)^+/T$ 1 CELL LEUKEMIA HOMEOBOX 3 (TLX3)+, or LBX1+/PAX2+)

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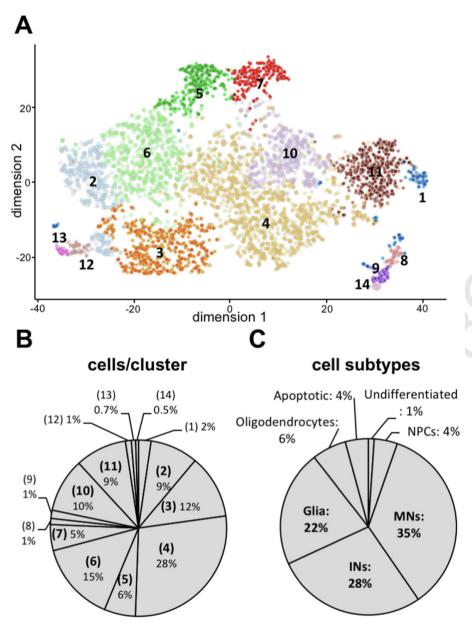


Fig. 3. Heterogenous composition of human iPSC-derived motor neuron culture defined by single cell RNA sequencing. **(A)** t-SNE plot of h-iPSC derived MN culture after 28 days of differentiation, showing 14 cell shared nearest neighbour graph-based cell clusters. **(B)** Percentage of total cells present in each cluster. **(C)** Relative proportion of iPSCs, NPCs, INs, MNs and glial cells, identified based on the specific expression of the following genes: *NANOG* and *OCT4* for iPSCs; *SOX1*, *SOX2*, and *MKl67* for NPCs; *PAX2*, *PAX3*, *LBX1*, *EVX1*, *EN1*, *CHX10*, *GATA3*, *SOX14*, *SIM1*, *TLX3* for INs; *NEUROG2*, *OLIG2*, *HB9*, *ISL1*, *ISL2*, *CHAT* for MNs; *S100B*, *SOX9* for glial cells. **(D)** t-SNE plot colored for MNPCs and MNs (orange dots), identified based on the specific expression of the following genes: *NEUROG2*, *HB9*, *ISL1*, *ISL2*, *CHAT*. Blue dots represent the rest of the cells. **(E)** Proportion of each of the spinal interneuron (IN) subtypes identified based on combinatorial gene expression patterns: dorsal INs (dINs), *LBX1*⁺ *IPAX2*⁺ *ITLX3*⁺; V0 INs, *EVX1*⁺ *|EN1*⁻; V1 INs, *EVX1*⁻ *|EN1*⁺; V2 INs, *CHX10*⁺ *|SOX14*⁺ *|GATA3*⁺; V3 INs, *SIM1*⁺ *|NKX2*.2 ⁺.

for 0.5% of cells. Together, these results show that h-iPSC-derived cultures obtained under MN differentiation experimental conditions and subjected to sc-RNAseq contain mainly MNs and V2 INs. Furthermore, when compared to immunocytochemistry results shown in Figs. 1 and 2, as well as previous similar immunocytochemistry studies by other groups (e.g., Amoroso et al., 2013; Maury et al., 2015; Du et al.,

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2015), these findings suggest that MN viability may be affected by the single-cell isolation procedure more than other cell types, leading to a more selective loss of MNs during sc-RNAseq compared to other cell types.

Different subtypes of human iPSC-derived motor neurons identified by single-cell RNA sequencing

We next sought to identify the different MN subtypes derived from h-iPSCs. To this end, we selected the cells collectively characterized as MNPCs and/or MNs: namely, high with expression of NEUROG2, OLIG2, HB9, ISL1, ISL2, and CHAT, as described above. A total of 1629 such cells passed quality control. with a median of 6322 mapped reads per cell and a median of 2483 genes expressed per cell. The percentage of mitochondrial genes present in most cells was less than 2%. The 1629 cells divided into 8 nearest neighbour graph-based clusters exhibiting distinct gene expression patterns, suggesting heterogeneity in the MNPC/MN population (Fig. 4A). As shown in Fig. 4B, the majority of cells were mainly found in clusters #2 (26% of the cells), #1 (23%), #5 (20%) and #6 (16%).

To identify the different MN subtypes within these clusters, we performed integrative analysis to compare the cell proportions and expression differences between each cluster. Based on differential genes enriched in each cluster, 6 major types of cells were identified (Fig. 4C). Clusters #1, #2, #5, and #7 harboured a large proportion of cells identified as LMC MNs, based on their expression of FOXP1 and lack of expression of LHX3 (Fig. 4D, top t-SNE plot). Conversely, MMC MNs, defined as expressing LHX3

and lacking *FOXP1* expression, were mainly contained in clusters #6 and #8 (Fig. 4D, middle t-SNE plot). Furthermore, spinal HMC MNs, expressing *HOMEOBOX A5* (*HOXA5*) and lacking both *FOXP1* and *LHX3*, were found in clusters #5 and #6 (Fig. 4D, bottom t-SNE plot). In addition, cluster #4 represented MNPCs with high expression of *NKX6.1*, *OLIG2* and

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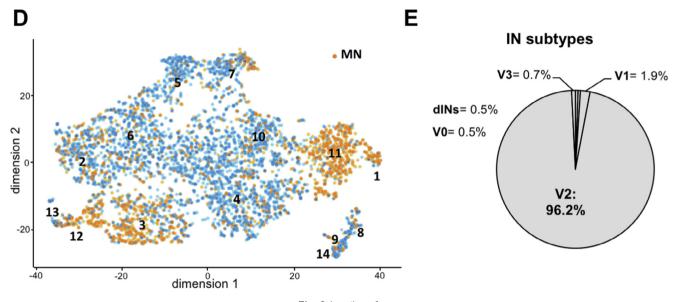


Fig. 3 (continued)

LHX3 (Briscoe et al., 2000), while cluster #3 was annotated as "apoptotic cells", with high expression of BAX, CASPASE 3 (CASP3), NGF and FAS CELL SURFACE DEATH RECEPTOR (FAS) (Raoul et al., 1999).

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To confirm this cluster annotation, we searched for genes specifically expressed in each cell type that were enriched for the expected appropriate GO terms (Fig. 4E). For example, genes that were specifically expressed in the MNPC cluster were significantly associated with mitotic cell cycle ($p = 2.596e^{-49}$), migration ($p = 3.193e^{-07}$), and pattern specification processes $(p = 7.509e^{-0.5})$. Genes that were expressed in the apoptotic cell cluster were significantly enriched for neuronal apoptotic processes $(p = 6.596e^{-05})$ and regulation of neuronal death $(p = 6.111e^{-0.5})$. Genes expressed in the LMC clusters were significantly enriched for locomotor behavior $(p = 9.601e^{-09}),$ trans-synaptic signaling $(p = 1.341e^{-07})^{7}$ and spinal cord development $(p = 7.078e^{-05})$. Genes specifically expressed in the MMC clusters were significantly enriched for MN axon guidance $(p = 3.192e^{-07}),$ G-protein coupled acetylcholine receptor signaling pathways $(p = 3.192e^{-07})$ and spinal cord development $(p = 4.941e^{-05})$. Genes that were specifically expressed in the HMC clusters were significantly enriched for sensory system development ($p = 3.835e^{-06}$), MN axon quidance $(p = 8.383e^{-05})$ and respiratory system development $(p = 7.284e^{-05}).$ Interestingly, expressing the specific brainstem marker genes, MAF BZIP TRANSCRIPTION FACTOR B (MAFB) and HOXB1, were also identified and were mainly contained in cluster #1. However, cells in this cluster did not express the typical hindbrain markers ORTHODENTICLE HOMEOBOX 2 (OTX2), T-BOX TRANSCRIPTION FACTOR 20 (TBX20) or PAIRED-LIKE HOMEOBOX 2A/B (PHOX2A/B), suggesting the presence of incompletely caudalized neurons, rather than more mature brainstem MNs. Overall, LMC MNs

were the most predominant (58%), followed by HMC MNs (19%), and incompletely caudalized MNs (14%). The majority of HMC MNs (63%) expressed genes such as *SCIP* or *TEASHIRT ZINC FINGER HOMEOBOX 1* (*TSHZ1*), known to be enriched in phrenic MNs, and they were thus annotated as PMC MNs (Fig. 4C). MNPCs were also detected (6%), whereas we did not detect MNs of the spinal accessory column (SAC) (Fig. 4C). Together, these results provide evidence for different subtypes of h-iPSC-derived MNs, as well as other neural cell types that normally arise during the transition from undifferentiated progenitors to committed precursors to differentiated neurons in the spinal cord.

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Different subtypes of human iPSC-derived LMC motor neurons identified by single-cell RNA sequencing

LMC MNs were observed in four separate clusters (#1, #2, #5, and #7) (Fig. 4D). We next asked whether this observation could be due to the presence of distinct subsets of LMC MNs. Indeed, LMC MNs acquire specialized "pool" identities that determine their ability to form selective connections with limb muscles in vivo. Dasen and colleagues showed that HOX proteinregulated mechanisms operate within MNs and assign rostro-caudal motor pool positions, as well as pool identities at a single segmental level (Dasen et al., 2005). Consequently, subsets of LMC MNs can be distinguished by their expression of specific HOX proteins (Carpenter, 2002; Lance-Jones et al., 2001, Dasen et al., 2005). In addition, LIM homeodomain proteins define the medial and lateral subdivisions of the LMC (Sockanathan and Jessell, 1998; Kania and Jessell, 2003: Rousso et al., 2008). Early born LMC MNs coexpress ISL1 and ISL2, and at later stages ISL1 specifies medial LMC (LMCm) MNs. Later born LMC MNs downregulate ISL1 and express LHX1, whose expression

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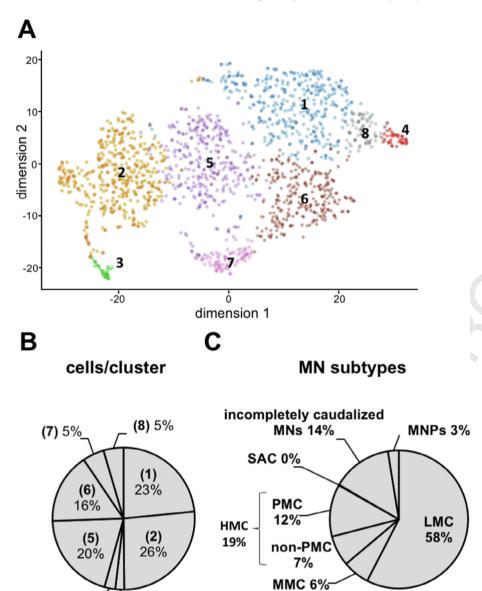


Fig. 4. Identification of motor neuron subtypes with single-cell RNA sequencing. **(A)** t-SNE plot of all cells identified as MNs in h-iPSC derived MN culture after 28 days of differentiation, showing 8 shared nearest neighbour graph-based cell clusters. **(B)** Percentage of total cells present in each cluster. **(C)** Proportion of each MN subtype, identified by their expression of specific genes: MNPCs, $O(G^2)$; LMC MNs, $O(G^2)$; MMC MNs, $O(G^2)$; MMC MNs, $O(G^2)$; PMC MNs, $O(G^2)$; Carvical HMC expressing $O(G^2)$; PMC MNs, $O(G^2)$; PMC MNs, $O(G^2)$; Carvical HMC expressing $O(G^2)$; PMC MNs, $O(G^2)$; PM

defines lateral LMC (LMCI) MNs (Kania and Jessell, 2003).

(3) 2%

To characterize different human-iPSC-derived LMC MN subtypes, we performed integrative analysis to compare ISL1, LHX1 and HOX genes expression differences between each cluster. Based on differential genes enriched in each cluster, 4 major types of LMC MNs were identified: 'cervical LMCI' (24%, blue colour),

'cervical LMCm' (33%, orange), 'immature cervical LMC', which were not identified as more developmentally mature LMCI or LMCm (34%, purple), and 'lumbar LMC' (5%, pink) (Fig. 5A). The majority of the LMC MNs (91%) were identified as cervical LMC MNs, co-expressing HOX6 genes and ALDH1A2, and were mainly contained in clusters #1, #2, and #5 (Fig. 5B). In contrast, the LMC MNs contained in cluster #7 were identified as lumbar LMC MNs. HOX6 lacking genes and expressing HOXD8 and HOX9 genes: this group represented only 5% of the LMC MNs and 1.1% of the total number of MNs (Fig. 5C). Among the cervical LMC MNs, the rostral-most cells, expressing higher levels of HOX5 genes and lower levels of HOXC8, were mainly contained in clusters #1 and #2 (Fig. 5D), while the caudal-most cervical LMC MNs (HOXC8high/HOX5low) were limited to cluster #1 (Fig. 5E). In addition, clusters #2 and #7 contained cells expressing the highest levels of ISL1, defining LMCI MNs (Fig. 5F). In contrast, cells of clusters #1 and #5 expressed higher levels of LHX1, specifying LMCm neurons (Fig. 5G). As depicted in Fig. 5H, cluster #1 contained a majority of cervical LMCI MNs (57%, blue) while cluster #2 contained mainly cervical LMCm MNs (64%, orange). Cluster #5 contained a majority of cervical LMC MNs that were not identified as either LMCI or LMCm (53%, purple). The lumbar LMC MNs accounted for 41% of the LMC found in cluster #7 (pink).

To extend this analysis, we considered the previous demonstration that the specific HOX profiles of LMC MNs direct the differential expression of the transcription factors RUNX1, SCIP, and PEA3, which in turn

defines four groups of MNs with distinct rostro-caudal and intrasegmental positions within the cervical LMC (Dasen et al., 2005). However, none of the LMC MNs expressed either *RUNX1* or *PEA3* and only a few expressed *SCIP*, suggesting a developmentally immature state of LMC MNs after 28 days *in vitro*. In summary, cervical LMC MNs were the most predominant (91%), while

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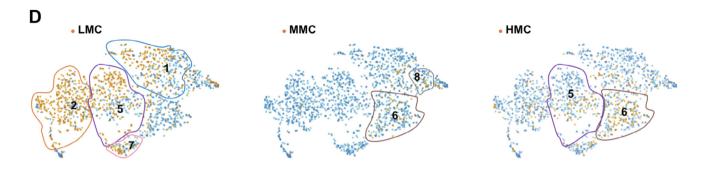
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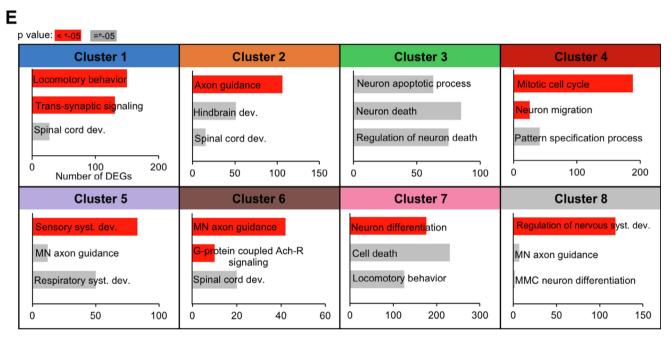


Fig. 4 (continued)

only 5 % were identified as lumbar LMC MNs under the examined experimental conditions.

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DISCUSSION

In most studies to date, the characterization of h-iPSCderived MNs has relied mainly on the expression of markers specific molecular by immunocytochemistry or real-time PCR approaches (Li et al., 2005; Patani et al., 2011; Amoroso et al., 2013; Chen et al., 2014; Maury et al., 2015; Du et al., 2015). Nascent spinal MNs are characterized by transient coexpression of LIM homeodomain (LIM-HD) transcription factors like HB9, ISL1/2, and LHX3 (Sharma et al., 1998; Arber et al., 1999; Thaler et al., 1999). Thus, most MN derivation studies rely on a combination of HB9 and ISL1/2 immunostaining (operationally referred to as pan-MN staining – Amoroso et al., 2013) to characterize the MN phenotype in vitro. However, LIM-HD proteins are gradually down-regulated during motor neuron development in vivo, suggesting that these proteins may not be ideal markers to monitor the gradual differentiation of induced MNs in vitro. The CHAT and VACTH genes are

expressed by all cholinergic neurons including spinal MNs and they have been used as markers for more developmentally mature MNs (Habecker and Landis, 1994). These generic MN markers are frequently used in combination with more specific motor column MN markers, such as FOXP1 or SCIP, to identify particular MN subtypes. Even these combined approaches, however, fall short of providing tools for precisely defining the molecular profiles of all h-iPSC-derived MNs, especially when considering that common differentiation protocols give rise to heterogenous neural cell cultures (Li et al., 2005; Patani et al., 2011: Amoroso et al., 2013: Chen et al., 2014: Maury et al., 2015; Du et al., 2015). Based on these observations, the present study aimed at developing protocols to perform untargeted characterization of gene expression in all cell subtypes present in cultures of hiPSC derived spinal MNs.

We chose to analyze day-28 h-iPSC-derived MN cultures because, at this relatively early stage of *in vitro* differentiation, induced MNs already express the typical pan-MN markers ISL1 and HB9. Furthermore, at this stage of differentiation, h-iPSC-derived MNs have not yet coalesced into large cell clusters, as they typically

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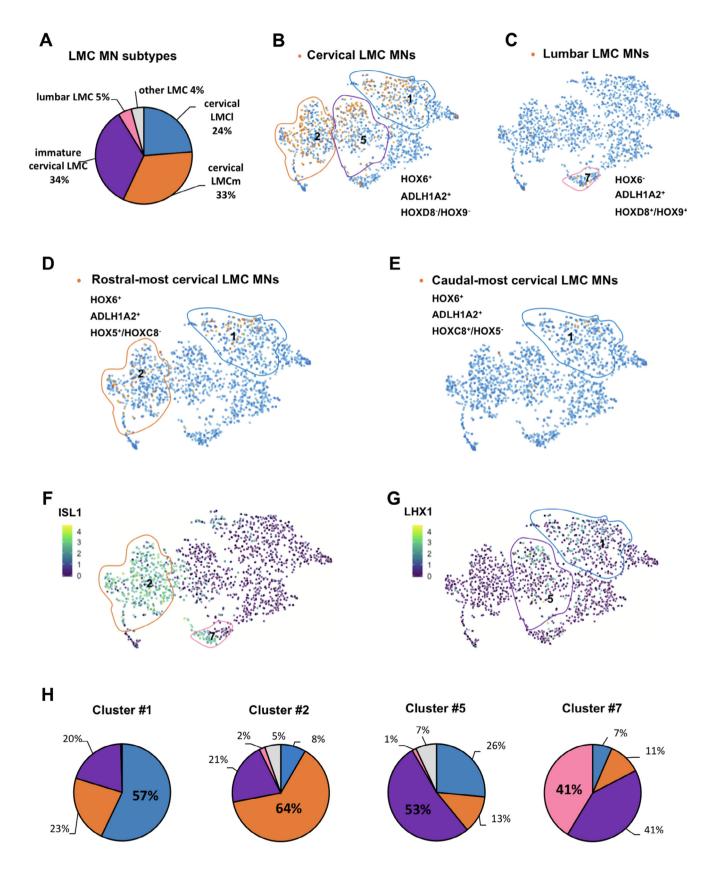
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do at more developmentally mature stages under standard in vitro derivation protocols. The presence of these large MN clusters would make it technically challenging to isolate single MNs without causing cell damage due to the need of harsher dissociation techniques. The sc-RNAseg results presented in this study show that h-iPSCs can give rise, in 28 days of differentiation, to heterogenous neural cell cultures containing a majority of spinal MNPCs and MNs, as well as other spinal neural cells such as INs and glia. We observed that immunocytochemical analysis of h-iPSCderived cultures after 25 days of differentiation showed a relative proportion of induced MNs (67%) larger than the fraction of MNs detected using sc-RNAsea (35%). This situation could be the result of a specific loss of MNs over other cell types during single-cell suspension preparation prior to sequencing, as MNs may be more sensitive to mechanical and enzymatic cell dissociation.

Strategies to generate and characterize different hiPSC-derived MNs are important to be able to study the function and dysfunction of distinct human MNs, including their pathologies in MN diseases such as ALS (Frey et al., 2000; Stifani, 2014). However, little is known about the diversity of induced human MNs in vitro. The present immunocytochemistry and sc-RNAseq data strongly suggest that h-iPSCs can give rise to spinal MNs of the lateral, median, hypaxial and phrenic motor columns in vitro. Both approaches revealed that the majority (58%) of MNs exhibit a molecular profile similar to that of LMC MNs. This finding is consistent with the enrichment in LMC MN identity previously shown by Amoroso and coworkers through the combined use of RA, the SHH pathway activator Smoothened Agonist, and purmorphamine (Amoroso et al., 2013). It is worth mentioning that other studies (e.g., Davis-Dusenbery et al., 2014; Qu et al., 2014; Maury et al., 2015) reported generation of mixed populations of LMC and MMC subtypes in human stem cell-derived MNs in vitro. At the other end of the spectrum, enhanced specification of the MMC MN fate was achieved with the omission of retinoids from the differentiation medium (Patani et al., 2011).

In the present study, we have identified four separate pools of LMC MNs by combining the expression of previously identified LMC MN markers, such as *FOXP1* and *ALDH1A2*, with the differential expression of *HOX* family genes, *ISL1* (a marker of LMCm MNs) and *LHX1* (a marker of LMCl MNs). The scRNA-seq data used to obtain a catalog of distinct *in vitro* generated human LMC MNs will undoubtedly provide a publicly available

resource to the community that will enhance efforts aimed at characterizing MN subtype-specific markers. Similarly, our present observation that MNs exhibiting a molecular profile corresponding to HMC MNs represent $\sim\!19\%$ of the h-iPSC-derived MNs, and that $\sim\!12\%$ of these cells express either SCIP or TSHZ1, two PMC MN markers, provides a foundation for future characterization of the identity, and possibly diversity, of human HMC MNs. This information is currently lacking. In summary, the results of the present studies show that untargeted assessment of gene expression by RNA profiling on a single cell level can provide a global measure of spinal MN diversity in h-iPSC-derived MN cultures.

Improved means to precisely phenotype the different MN subtypes generated from human iPSCs are expected to promote advancements in various fields of research. They will facilitate the study of the biology of different types of human MNs, enabling a better characterization of their physiological properties. Moreover, they may lead to the development of strategies to enrich for defined MN subtypes that may offer more attractive options for modeling specific MN diseases and/or injury conditions. In turn, deeply phenotyped disease-relevant MN subtypes may provide ideal experimental model systems to develop cellular assays with increased potential to facilitate early-stage drug discovery efforts in ALS and other MN diseases.

DATA AVAILABILITY

All data underlying the results as well as the R workflow used for the analysis are available on GitHub: https://github.com/regan-hamel/h-iPSCs-MNI.

AUTHOR CONTRIBUTIONS

LT performed all experiments, data analysis, figure preparation and wrote the first draft of the manuscript. LT and RH analyzed the sc-RNAseq data. SS, TD and SP conceived the study plan. SS designed the experiments and supervised data analysis and manuscript writing.

COMPETING INTERESTS

The authors declare no competing interests.

Fig. 5. Identification of LMC motor neuron subtypes by single-cell RNA sequencing. **(A)** Proportion of different LMC MN subtypes identified by their expression of specific genes: cervical LMCI MNs (blue), $HOX6^+/ALDH1A2^+/HOX5^+/LHX1^+$, or $HOX6^+/ALDH1A2^+/HOXC8^+/LHX1^+$; cervical LMC MNs (orange), $HOX6^+/ALDH1A2^+/HOXC8^+/LHX1^+$; lumbar LMC MNs (pink), $HOX6^-/ALDH1A2^+/HOXD8^+/HOX9^+$. Cervical LMC neurons that were not identified as mature LMCm or LMCI MNs were annotated as 'immature cervical LMC' (purple). LMC neurons that did not belong to any of these categories were annotated as "other LMC" (grey). **(B, C)** t-SNE plot of MNs, colored for cervical **(B)** or lumbar **(C)** LMC MNs (orange dots), identified by their expression of specific marker genes: cervical LMC MNs, $FOXP1^+/LHX3^-/HOX6^+/ALDH1A2^+/HOXD8^-/HOX9^-$; lumbar LMC MNs, $FOXP1^+/LHX3^-/HOX6^-/ALDH1A2^+/HOXD8^+/HOX9^+$. **(D, E)** t-SNE plot of MNs colored for the rostral-most **(D)** or the caudal-most **(E)** cervical LMC MNs (orange dots), identified by their expression of the following specific marker genes: rostral-most cervical LMC MNs, $HOXA5^+/HOXC5^+/HOXC8^+$; caudal-most cervical LMC MNs, $HOXA5^-/HOXC5^-/HOXC8^+$. **(F, G)** t-SNE plot of cells identified as MNs colored according to their level of expression of the transcription factor-encoding genes ISL1 **(F)** or LHX1 **(G)**. **(H)** Proportion of each LMC MN subtypes identified as described above, in each of the four clusters previously annotated as LMC MN clusters (#1, #2, #5, and #7). LMC, lateral motor column; LMCI, lateral LMC, LMCm, medial LMC.

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9 May 2020

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