Clinical Neurophysiology 130 (2019) 941–951

Contents lists available at ScienceDirect

Clinical Neurophysiology

journal homepage: www.elsevier.com/locate/clinph

Dorsal root ganglion stimulation for chronic pain modulates Aβ-fiber activity but not C-fiber activity: A computational modeling study

Robert D. Graham [a,b], Tim M. Bruns [a,b], Bo Duan [c], Scott F. Lempka [a,b,d,*]

[a] Department of Biomedical Engineering, University of Michigan, Ann Arbor, MI, USA
[b] Biointerfaces Institute, University of Michigan, Ann Arbor, MI, USA
[c] Department of Molecular, Cellular, and Developmental Biology, University of Michigan, Ann Arbor, MI, USA
[d] Department of Anesthesiology, University of Michigan, Ann Arbor, MI, USA

ARTICLE INFO

Article history:
Accepted 16 February 2019
Available online 15 March 2019

Keywords:
Chronic pain
Dorsal root ganglion
Computer simulation
Electric stimulation
Spinal cord stimulation

HIGHLIGHTS

- When using standard parameters, dorsal root ganglion (DRG) stimulation does not activate C-fibers.
- Straddling the active and return electrodes across the DRG increases neural activation.
- DRG stimulation may provide pain relief by activating pain-gating mechanisms in the spinal cord.

ABSTRACT

Objective: The goal of this project was to use computational models to investigate which types of primary sensory neurons are modulated by dorsal root ganglion stimulation (DRGS) to provide pain relief.
Methods: We modeled DRGS by coupling an anatomical finite element model of a human L5 dorsal root ganglion to biophysical models of primary sensory neurons. We calculated the stimulation amplitude needed to elicit an action potential in each neuron, and examined how DRGS affected sensory neuron activity.
Results: We showed that within clinical ranges of stimulation parameters, DRGS drives the activity of large myelinated Aβ-fibers but does not directly activate small nonmyelinated C-fibers. We also showed that the position of the active and return electrodes and the polarity of the stimulus pulse influence neural activation.
Conclusions: Our results indicate that DRGS may provide pain relief by activating pain-gating mechanisms in the dorsal horn via repeated activation of large myelinated afferents.
Significance: Understanding the mechanisms of action of DRGS-induced pain relief may lead to innovations in stimulation technologies that improve patient outcomes.

1. Introduction

Chronic pain is a debilitating disorder that affects over 100 million Americans and accounts for $560–635 billion in healthcare and productivity costs in the United States each year (Gaskin and Richard, 2012). For patients with chronic pain that is refractory to conventional medical management (e.g. pharmaceuticals, orthopedic surgery), neurostimulation therapies, such as spinal cord stimulation (SCS) and dorsal root ganglion stimulation (DRGS), are alternative treatment options. SCS has been a mainstay of refractory pain management for decades, and is achieved by implanting electrode arrays in the epidural space dorsal to the spinal cord (Lempka and Patil, 2018). To reduce pain, the goal of conventional SCS is to apply electrical impulses to the region of the spinal cord that innervates the patient's painful regions, which evokes paresthetic (i.e. tingling) sensations in those regions. Unfortunately, the anatomy of the spinal column makes it difficult for SCS to target certain regions of the body (e.g. the bladder, feet), and has contributed to the limited success of SCS in treating focal pain etiologies (Kumar et al., 2011). Furthermore, the presence of highly conductive cerebrospinal fluid (CSF) around the spinal cord can shunt electrical current away from the targeted region (Holsheimer, 2002). SCS leads are prone to migration over time, and changes in posture can affect the position of the spinal cord

* Corresponding author at: Department of Biomedical Engineering, University of Michigan, 2800 Plymouth Road, NCRC 014-184, Ann Arbor, MI 48109-2800, USA.
E-mail address: lempka@umich.edu (S.F. Lempka).

https://doi.org/10.1016/j.clinph.2019.02.016
1388-2457/

relative to the electrode lead, both of which further affect the accurate delivery of electrical stimulation to the spinal cord (Lempka and Patil, 2018). With these shortcomings in mind, DRGS was developed to provide a new therapy for patients with refractory focal pain.

In contrast to SCS, DRGS is achieved by implanting a cylindrical stimulating electrode in the intraforaminal epidural space above a dorsal root ganglion (DRG). Due to the compactness of the intraforaminal space and scarcity of CSF around the ganglion (Brierley, 1950), DRGS electrode leads consistently remain in close proximity to the DRG without much migration, and are less prone to the postural effects that hamper SCS leads (Kramer et al., 2015). Since a DRG innervates a single dermatome of the body, electrical stimulation of a DRG could provide dermatome-specific pain relief, suggesting that DRGS may be effective for patients with pain that is difficult to target with conventional SCS (e.g. bladder pain, focal foot pain). DRGS was approved by the Food and Drug Administration in 2016 to treat intractable complex regional pain syndrome (CRPS) of the lower limbs (Deer and Pope, 2016), and has been used off-label for several other pain etiologies (e.g. phantom limb pain, painful diabetic neuropathy, groin pain) (Schu et al., 2014; Eldabe et al., 2015, 2018; Mol and Roumen, 2018). Though preliminary clinical studies report success in many patients (approximately 75%) (Deer et al., 2017), not all patients receive adequate pain relief from DRGS. One contributing factor to the limited success rate of DRGS is that we do not understand the mechanisms of action by which DRGS provides pain relief. Without a mechanistic understanding of DRGS, we cannot optimize clinical parameters (e.g. stimulation amplitude, electrode lead position) to maximize pain relief in all patients.

The DRG is a bulge in the posterior spinal root, located bilaterally in the intraforaminal space at each spinal vertebral level. Each DRG contains the cell bodies of all the primary sensory neurons (PSNs) innervating the dermatome governed by its spinal segmental level (e.g. the left L5 DRG innervates the left foot). PSNs are pseudounipolar – the soma has a single axon process (the stem axon) that bifurcates at a large node of Ranvier called the T-junction. One axon projects centrally and terminates in the spinal cord, while the other projects to the periphery and terminates in a nerve ending (Ha, 1970; Spencer et al., 1973; Devor, 1999). Two types of PSNs commonly examined in pain pathophysiology studies are the large myelinated Aβ-fiber and the small nonmyelinated C-fiber (Devor, 1999, 2009; Djouhri et al., 2006). Aβ-fibers typically convey innocuous tactile stimuli, but have been shown to generate ectopic action potentials (APs) in some chronic pain models, and are known to contribute to the development of tactile allodynia (Campbell et al., 1988; Kajander and Bennett, 1992; Liu et al., 2000b; Devor, 2009; Kovalsky et al., 2009; Prescott et al., 2014). C-fibers typically convey noxious stimuli. In some chronic pain conditions, peripheral sensitization of C-fibers may generate aberrant action potentials at the site of a neuroma or tissue damage (Blumberg and Jänig, 1984; Welk et al., 1990; Liu et al., 2000b, 2000a). The importance of the DRG in the development and maintenance of chronic pain is well understood, making it an attractive target for neurostimulation therapies. However, our limited understanding of the therapeutic mechanisms of DRGS precludes the design of stimulation technologies (e.g. stimulus waveforms, electrode designs) to take full advantage of these mechanisms.

To understand the mechanisms of DRGS, it is imperative to first understand which neural elements are directly modulated by DRGS. Currently, there are several hypotheses to explain the therapeutic mechanisms of DRGS, ranging from filtering nociceptive impulses before they reach the spinal cord, to suppressing aberrant electrical activity of PSNs (Azeem and Attias, 2018). However, there is no clinical evidence directly supporting any one hypothesis. *In-vitro* studies have shown that C-type fibers exhibit a low-pass filtering effect at the T-junction that prevents some peripherally-generated noxious afferent signals from reaching the central axon branch leading to the spinal cord. These studies also suggest that extracellular electrical stimulation can enhance this filtering effect (Gemes et al., 2013; Koopmeiners et al., 2013). The only previously-published computer modeling study of DRGS showed that clinical DRGS may provide pain relief by augmenting this mechanism (Kent et al., 2018). However, the stimulation amplitudes required to produce filtering (approximately 9.5 mA) were far outside clinical ranges (typically ≤ 1 mA) (Deer et al., 2017), suggesting that DRGS provides pain relief through other mechanisms in clinical contexts. It is well understood that extracellular stimulation preferentially activates large-diameter myelinated axons over small nonmyelinated axons (Rattay, 1986) and this trend suggests that Aβ-fibers and not C-fibers may be directly stimulated by DRGS.

In this work, we developed a computer model of clinical DRGS to investigate the mechanisms by which DRGS provides pain relief. We developed a volume conductor model of a human L5 DRG, a common stimulation target to manage chronic foot pain (Bendinger and Plunkett, 2015; Eldabe et al., 2015, 2018). We coupled this anatomical model to multi-compartment models of Aβ- and C-fibers. We validated these cell models against experimental data. We developed the first computer model examining the effects of DRGS on both myelinated and nonmyelinated afferents, and showed that at stimulation amplitudes within typical clinical ranges, electrical stimulation is driving the activity of Aβ-fibers but not activating C-fibers. These results suggest that DRGS may provide pain relief by activating pain-gating mechanisms within the dorsal horn. Lastly, we examined the effect of electrode location on DRGS-induced neural activation, and suggest that straddling the active and return electrodes over the ganglion may be the optimal electrode configuration for activating neural tissue.

2. Methods

We developed computer models to investigate how DRGS affects sensory neurons in the DRG. We coupled multi-compartment models of primary sensory neurons to a three-dimensional finite element model (FEM) of a human L5 DRG. We calculated the voltage distribution generated by DRGS throughout the DRG and surrounding anatomy. We applied these voltages to the multi-compartment models of sensory neurons within the DRG, and examined how different sensory neuron types (i.e. mechanoreceptors and nociceptors) responded to DRGS.

2.1. Step 1: Calculate the extracellular voltages generated by DRGS

We constructed a three-dimensional FEM based on experimentally measured values to create an anatomically- and electrically-accurate volume conductor model of a human L5 DRG (Fig. 1 and Table 1). The geometry of the model was based on published cadaver and imaging studies of the DRG and surrounding anatomy (e.g. dural covering, intraforaminal tissue, bone) (Hasegawa et al., 1996; Hogan, 1996; Reina et al., 2007; Silverstein et al., 2015). The electrical conductivity of each tissue was based on values used in previous computational studies of neurostimulation for pain, and experimentally-measured tissue resistivities (Geddes and Baker, 1967; Grill and Mortimer, 1994; Gabriel et al., 1996; Lempka et al., 2015). Each conductivity was modeled as isotropic, except the nerve root, which was two-dimensionally anisotropic white matter (Table 2). The FEM was built in the commercially-available software 3-matic Module within the Mimic Innovations Suite (Materialise, Belgium). We included a model of the four-

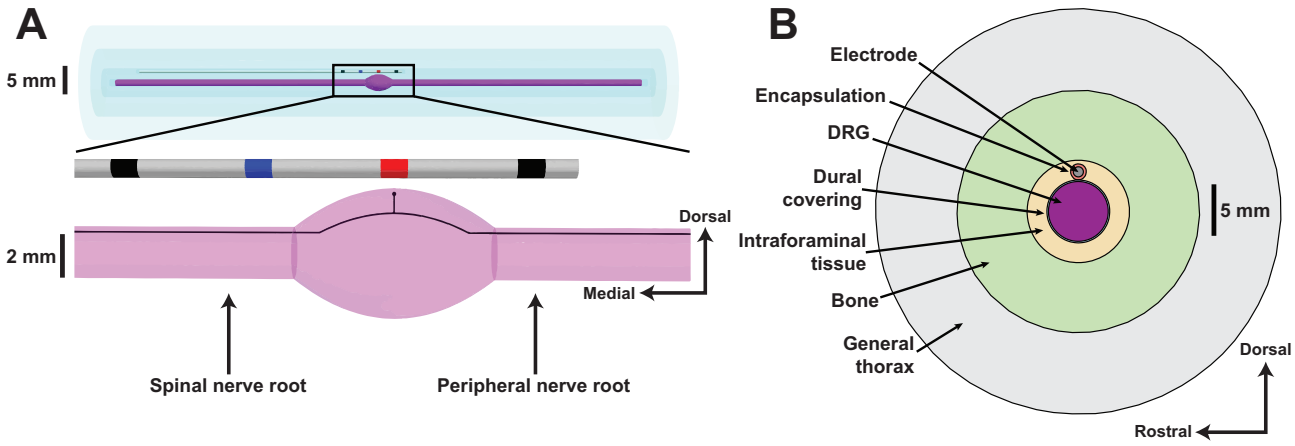

Fig. 1. Anatomy of the finite element model of a human L5 DRG and stimulating electrode. (A) Side view of the DRG with the DRG stimulating electrode oriented above the ganglion (red: active electrode, blue: return electrode, black: inactive electrode). An example primary sensory neuron trajectory is shown in black with the soma below the active electrode. (B) Cross sectional view through the middle of the DRG. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

Table 1
Anatomical parameters used to build the finite element model of a human L5 DRG.

Parameter	Value	Reference
DRG length	9.4 mm	(Hasegawa et al., 1996)
DRG width	5.9 mm	(Hasegawa et al., 1996)
Nerve root radius	1.19 mm	(Hogan, 1996)
Dural sheath thickness	150 μm	(Reina et al., 2007)
Foramen height	10.1 mm	(Silverstein et al., 2015)
Encapsulation layer	0.3 mm	(Grill and Mortimer, 1994)
Electrode contact length	1.25 mm	(Amirdelfan et al., 2018)
Electrode radius	0.5 mm	(Amirdelfan et al., 2018)

Abbreviations: DRG, dorsal root ganglion.

Table 2
Electrical conductivities used in the finite element model.

Parameter	Value	Reference
Gray matter	0.23 S/m	(Geddes and Baker, 1967)
White matter (longitudinal)	0.6 S/m	(Geddes and Baker, 1967)
White matter (transverse)	0.083 S/m	(Geddes and Baker, 1967)
Dural covering	0.6 S/m	(Lempka et al., 2015)
Bone	0.02 S/m	(Gabriel et al., 1996)
General tissue	0.25 S/m	(Geddes and Baker, 1967)
Encapsulation	0.17 S/m	(Grill and Mortimer, 1994)

contact Abbott Axium™ DRG electrode array (Abbott Laboratories, USA) oriented above the DRG such that the active electrode was centered directly above the middle of the ganglion. We wanted to examine the effect of electrode lead position on neural activation. Therefore, in some simulations (where noted below) we shifted the electrode so that the active and return electrodes straddled the DRG such that the halfway point between the middle of the two electrodes was directly above the middle of the ganglion. We shifted the electrode 3.125 mm along the nerve root (i.e. half of the distance from the middle of one contact to the middle of an adjacent contact). We encased the electrode in a 300-μm thick encapsulation layer to represent the typical foreign body response to implanted materials (Grill and Mortimer, 1994).

We imported the FEM into COMSOL Multiphysics (COMSOL, Inc., USA). Clinically, DRGS utilizes a bipolar electrode configuration (Kramer et al., 2015). To model bipolar DRGS, we applied boundary conditions at the active electrode (i.e. current stimulation) and the return electrode (i.e. ground; 0 V). We modeled the electrode shaft as a perfect insulator. We modeled inactive electrode contacts as equipotential with zero net current across their surface. To model DRGS, we calculated the voltage distribution generated by a unitary stimulus current (i.e. 1A) using the conjugate gradient method to solve the Laplace's equation:

$$\nabla(\sigma\nabla\Phi) = 0 \quad (1)$$

where σ is the tissue stiffness matrix and Φ is the calculated voltage distribution. We used Ohm's law to calculate the impedance of the bipolar stimulation configurations by measuring the average voltage generated at the active electrode and dividing by the applied stimulus current. We then compared our average model impedances to clinically-measured impedances. The model's average impedance (1500 Ω) was within clinically-reported impedance ranges (Deer et al., 2019).

2.2. Step 2: Define sensory neuron models in the DRG

We used the freely-available software package, NEURON (v7.4) (Hines and Carnevale, 1997), to construct all multi-compartment models of primary sensory neurons described below.

2.2.1. Aβ-fiber model

We developed a model of an Aβ-fiber (Fig. 2) based on morphological parameters from previous studies (Table 3) (Ito and Takahashi, 1960; Amir and Devor, 2003). We extended a model of a mammalian axon – the MRG model (McIntyre et al., 2002) – to describe the pseudounipolar morphology of Aβ-fibers. The MRG model is a double-cable model of a mammalian motor axon with nodes of Ranvier separated by three distinct finite impedance myelin segments: the myelin attachment segment, a paranode main segment, and internode regions. We accounted for two features of Aβ-fiber internode regions not accounted for in the original MRG model (Fig. 2): (1) the internode regions of the stem axon become increasingly myelinated near the bifurcation node, and (2) the first several internodes of the central and peripheral axons increase in length moving distally from the T-junction until they reach a consistent value (Amir and Devor, 2003). The spinal axons of PSNs are smaller in diameter than the peripheral axons (Ha, 1970). Therefore, we set our Aβ-fiber model central axon diameter to 5.7 μm and the peripheral axon diameter to 7.3 μm (Lee et al., 1986). The myelinated compartments were made of two concentric layers containing linear leak conductances with a parallel membrane capacitance. The nodes of Ranvier contained the parallel active nodal conductances of the sensory-specific axons

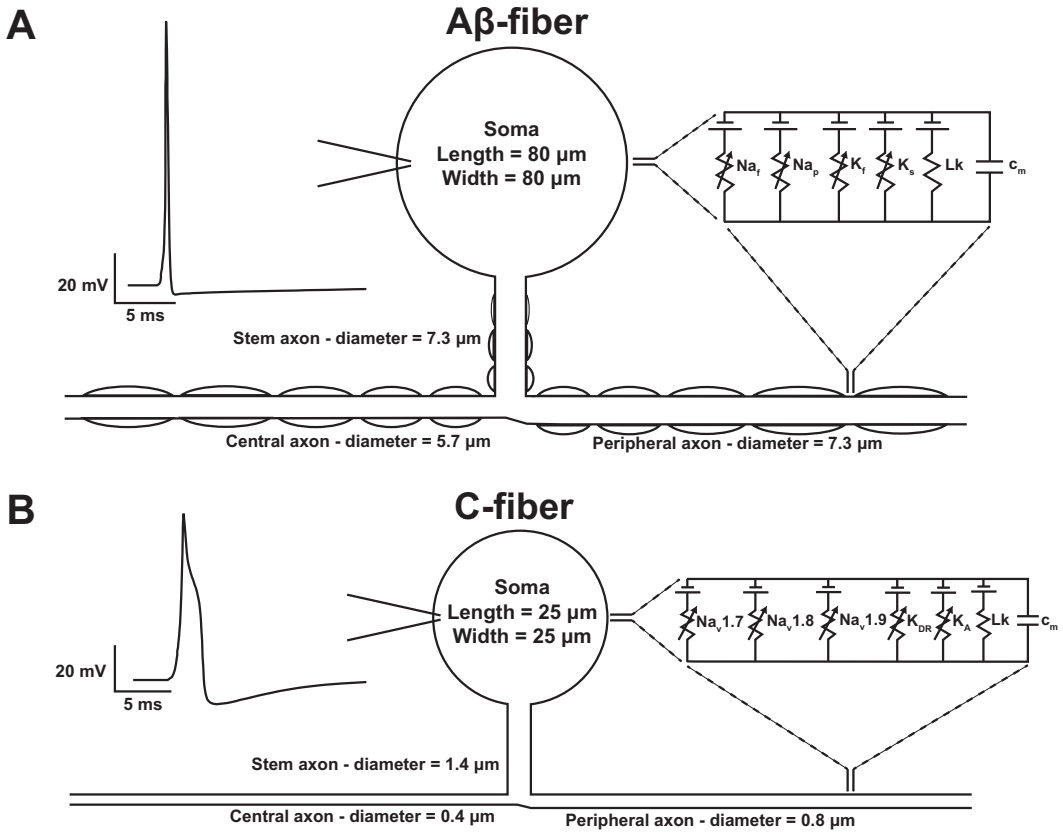

Fig. 2. Multi-compartment models of primary sensory neurons. (A) We modified a previously-published model of a mammalian sensory axon to represent the pseudounipolar morphology of an Aβ-fiber (McIntyre et al., 2002; Amir and Devor, 2003; Gaines et al., 2018). An example action potential is shown on the left. The equivalent circuit diagram with active ion conductances included in the nodal, initial segment, and soma compartments is shown on the right. (B). We constructed a model of a C-fiber based on morphological parameters and electrophysiological parameters from previous studies (Sheets et al., 2007; Huang et al., 2014; Sundt et al., 2015). An example action potential is shown on the left. The equivalent circuit diagram with active ion conductances included in all membrane compartments is shown on the right.

Table 3
Cell morphology parameters used to construct the Aβ- and C-fiber multi-compartment models.

Parameter	Aβ-fiber value	C-Fiber value	Reference
Fiber diameter (peripheral)	7.3 μm	0.8 μm	(Ha, 1970; Lee et al., 1986)
Fiber diameter (central)	5.7 μm	0.4 μm	(Ha, 1970; Lee et al., 1986)
Fiber diameter (stem)	7.3 μm	1.4 μm	(Lee et al., 1986; Sundt et al., 2015)
Stem axon length	789 μm	844 μm	(Ito and Takahashi, 1960; Amir and Devor, 2003; Sundt et al., 2015)
Soma length	80 μm	25 μm	(Ito and Takahashi, 1960; Amir and Devor, 2003; Sundt et al., 2015)
Soma diameter	80 μm	25 μm	(Ito and Takahashi, 1960; Amir and Devor, 2003; Sundt et al., 2015)
Node length	1.0 μm	–	(McIntyre et al., 2002)
Heminode diameter	5 μm	–	(Ito and Takahashi, 1960; Amir and Devor, 2003)
Initial segment length	200 μm	–	(Ito and Takahashi, 1960; Amir and Devor, 2003)
Initial segment diameter	5 μm	–	(Ito and Takahashi, 1960; Amir and Devor, 2003)
Paranode length	3.0 μm	–	(McIntyre et al., 2002)
Juxtaparanode length	Variable	–	(McIntyre et al., 2002)
Internode length	Variable	–	(McIntyre et al., 2002; Amir and Devor, 2003)

described by (Gaines et al., 2018): fast Na^+, persistent Na^+, fast K^+, and slow K^+ ion channels. The active nodal conductances were in parallel with a linear leakage conductance and membrane capacitance (Table 3). We increased the model's leak conductance from 6 to 8 mS/cm^2 to reduce membrane potential fluctuation at simulation onset. We increased the slow K^+ channel's β rate constant's *A* parameter from 0.03 to 0.06 ms^{-1} to better fit the experimental values of AHP amplitude and duration (Harper and Lawson, 1985b; Villière and McLachlan, 1996). The soma and initial segment contained the same active ion channels as the nodes, but with sodium channel densities of 300 channels/μm^2 and 500 channels/μm^2, respectively (Matsumoto and Rosenbluth, 1985). Note that we used an initial segment channel density of 500 channels/μm^2, which is slightly lower than the ~800 particles/μm^2 reported in (Matsumoto and Rosenbluth, 1985), but was necessary to prevent the cell from generating spontaneous action potentials at the initial segment. We believe this is a reasonable modification, as the Aβ-fiber model reproduced many action potential characteristics seen in literature (Table 4).

2.2.2. C-fiber model

We implemented a model of a nonmyelinated C-fiber (Fig. 2 and Table 3) based on morphological values described by (Sundt et al., 2015). The C-fiber membrane contained active conductances com-

Table 4
Validation metrics for our multi-compartment models against experimental data.

Aβ-Fiber			
Parameter	Our value	Literature ranges	Reference
Soma AP amplitude	107.7 mV	109.72 ± 11.21 mV	(Huxley and Stämpfli, 1951; Amir and Devor, 2003)
AP duration	1.225 ms	1.29 ± 0.59 ms	(Harper and Lawson, 1985b)
Rise time	0.775 ms	0.61 ± 0.13	(Djouhri et al., 1998)
Fall time	0.45 ms	0.89 ± 0.41	(Djouhri et al., 1998)
AHP amplitude	4.2 mV	7.9 ± 4.2 mV	(Harper and Lawson, 1985b)
AHP half-amplitude duration	14.7 ms	10.1 ± 11.0 ms	(Villière and McLachlan, 1996)
Resting potential	−79.1 mV	−80 mV	(Howells et al., 2012)
Ectopic spiking frequency	28 Hz	10–50 Hz	(Amir et al., 2005)
CV (peripheral axon)	25.00 m/s	14–30 m/s	(Harper and Lawson, 1985a)
CV (central axon)	17.02 m/s	14–30 m/s	(Harper and Lawson, 1985a)
C-Fiber			
Parameter	Our value	Literature ranges	Reference
Soma AP amplitude	76.5 mV	81.6 ± 6.9	(Harper and Lawson, 1985b)
AP duration (base)	3.5 ms	4.97 ± 2.16	(Harper and Lawson, 1985b)
Rise time	1.675 ms	2.5 ± 0.89	(Djouhri et al., 1998)
Fall time	1.825 ms	4.61 ± 3.5	(Djouhri et al., 1998)
Resting potential	−55 mV	−48.6 ± 9.2	(Harper and Lawson, 1985b)
AHP amplitude	10.9 mV	8.2 ± 5.1 mV	(Harper and Lawson, 1985b)
AHP 80	9.5 ms	14.4 ± 9.2 ms	(Djouhri et al., 1998)
AHP half-amplitude duration	5.2 ms	12.87 ± 8.4 ms	(Harper and Lawson, 1985b)
CV (peripheral axon)	0.28 m/s	0.2–0.8 m/s	(Zhang et al., 1998)
CV (central axon)	0.21 m/s	0.2–0.8 m/s	(Zhang et al., 1998)
CV (stem axon)	0.39 m/s	0.2–0.8 m/s	(Zhang et al., 1998)

Abbreviations: AP, action potential; AHP, afterhyperpolarization; CV, conduction velocity.

monly seen in C-type nociceptors, and are studied as targets in pharmacological pain treatment. Specifically, we implemented the active ion channels and corresponding channel densities described in (Sheets et al., 2007): TTX-Sensitive $Na_v1.7$, TTX-Resistant $Na_v1.8$, a delayed rectifier K^+ channel, and a transient A-type K^+ channel. We also included the slow TTX-Resistant $Na_v1.9$ from (Huang et al., 2014). We included a passive leak channel with a conductance set to balance the resting membrane potential at −55 mV (Sundt et al., 2015). All compartments contained equal distributions of each ion channel type, as nonmyelinated axons have largely homogeneous membrane structures (Waxman and Ritchie, 1985). To reduce computational demand while still ensuring model accuracy, we set the compartment lengths in the peripheral and spinal axons to 10 μm (Kent et al., 2018) for compartments within 20 mm of the bifurcation point (i.e. near the stimulating electrode) and 500 μm elsewhere along the axon. The stem axon was divided into 100 compartments of equal length (8.4 μm) (Sundt et al., 2015). The C-fiber model matched well with experimental somatic action potential values (Table 4).

2.2.3. Spontaneously active fibers

In a subset of simulations, we modified the Aβ-fiber and C-fiber models to produce spontaneous activity – a feature of some chronic pain states – to examine how DRGS affects pain-state sensory neurons. Aβ-fibers fire ectopic action potentials generated in the soma in some models of chronic pain (Campbell et al., 1988; Amir et al., 2002, 2005; Devor, 2009; Kovalsky et al., 2009). This phenomenon is mediated in part by a decrease in somatic potassium conductance (Xiao et al., 2002; Dawes et al., 2018; Hunt et al., 2018), and an increase in sodium conductance (Ishikawa et al., 1999; Waxman, 1999; Devor, 2006). We therefore decreased somatic potassium conductance by 20% (Dawes et al., 2018) and increased sodium conductance by 50% so the model generated ectopic action potentials in the soma at frequencies reported in experimental studies (28 Hz) (Kajander and Bennett, 1992; Amir et al., 2005).

C-fibers rarely generate ectopic APs in their somata (Devor et al., 1985; Song et al., 1999; Liu et al., 2000b; Amir et al., 2002). Instead, pain-state C-fiber activity often arises as aberrant signals coming from the periphery, usually at the site of tissue damage (e.g. neuroma, inflammation) (Blumberg and Jänig, 1984; Welk et al., 1990; Liu et al., 2000b, 2000a). Therefore, we modeled pain-state C-fibers by introducing synaptic events in the peripheral axon to simulate painful APs generated in painful tissue (NEURON's NetStim class, 50 ms spike period).

We next placed the sensory neurons models within the DRG. A recent study showed that in mammalian DRG, cell bodies are preferentially located around the dorsal edge of the ganglion (Ostrowski et al., 2017), but the spatial distribution of Aβ- and C-fibers within the DRG is unknown. Therefore, we homogeneously distributed each cell type throughout the DRG. We placed the somata of both sensory neuron models on a 2D regular grid within the sagittal and transverse planes of the DRG (Fig. 3A; Fig. 4A, gray shaded areas) with 100 μm spacing in all directions. Stem axons projected towards the midline of the ganglion, then bifurcated into central and peripheral processes that curved ventrally to enter the nerve root. The stem axon and soma totaled 869 μm in length for both cell models (Amir and Devor, 2003). Figs. 1 and 3 show an example axon trajectory within the FEM.

2.3. Step 3: Determine the cellular response to DRGS

We interpolated the extracellular voltages calculated from the FEM (Eq. (1)) onto the center of each neuron compartment. We used the NEURON simulation environment (v7.4) within the Python programming language (Hines and Carnevale, 1997; Hines et al., 2009) to apply the extracellular voltages to both cell models using NEURON's extracellular mechanism. For each simulation, we calculated each neural compartment's time-varying membrane potential, V_m, by using a backward Euler implicit integration method with a time step of 0.005 ms to solve the cable equation:

$$r_i c_m \frac{\partial V_m}{\partial t} = \frac{\partial^2 V_m}{\partial x^2} + \frac{\partial^2 V_e}{\partial x^2} - \frac{r_i}{r_m} \sum I_{ion} \quad (2)$$

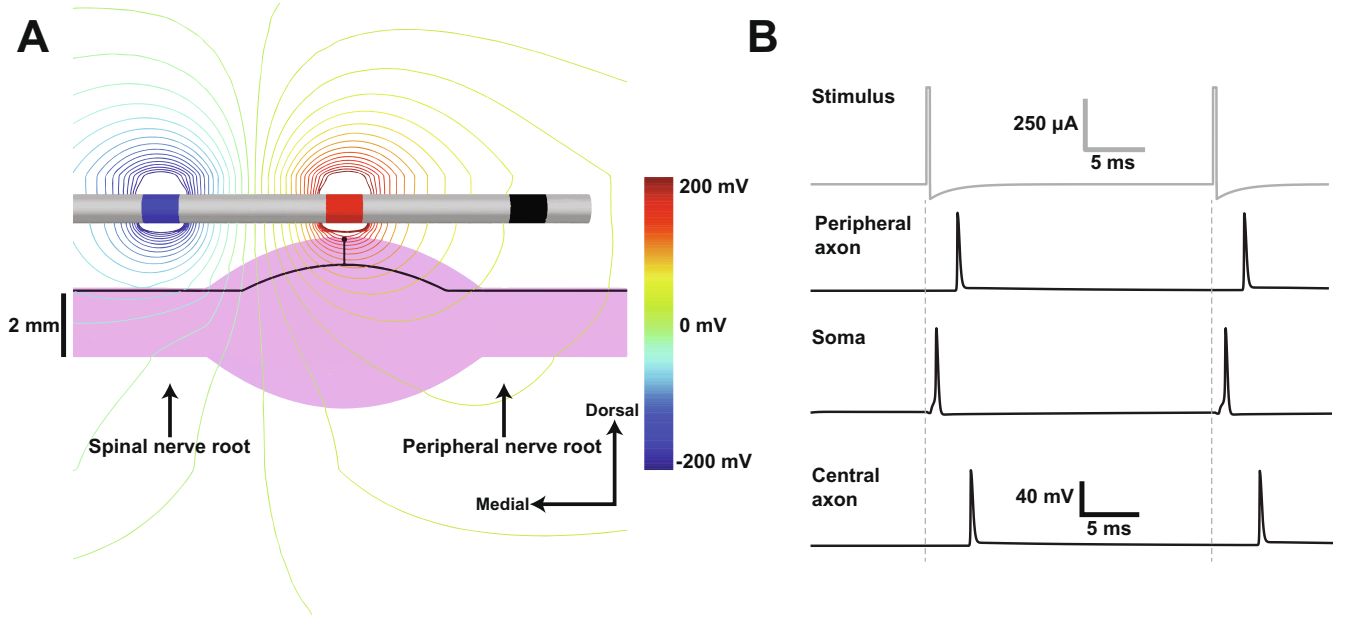

Fig. 3. Coupling the finite element model (FEM) of a human L5 DRG to the multi-compartment models of primary sensory neurons. (A) Isopotential lines of the extracellular voltages generated by bipolar DRGS calculated from the FEM. (B) Time-dependent transmembrane voltages resulting from stimulating an example Aβ-fiber with a 500 µA anodic DRGS pulse (top trace, gray). The action potential initiates near the soma and then propagates into the central and peripheral axons (bottom three traces, black).

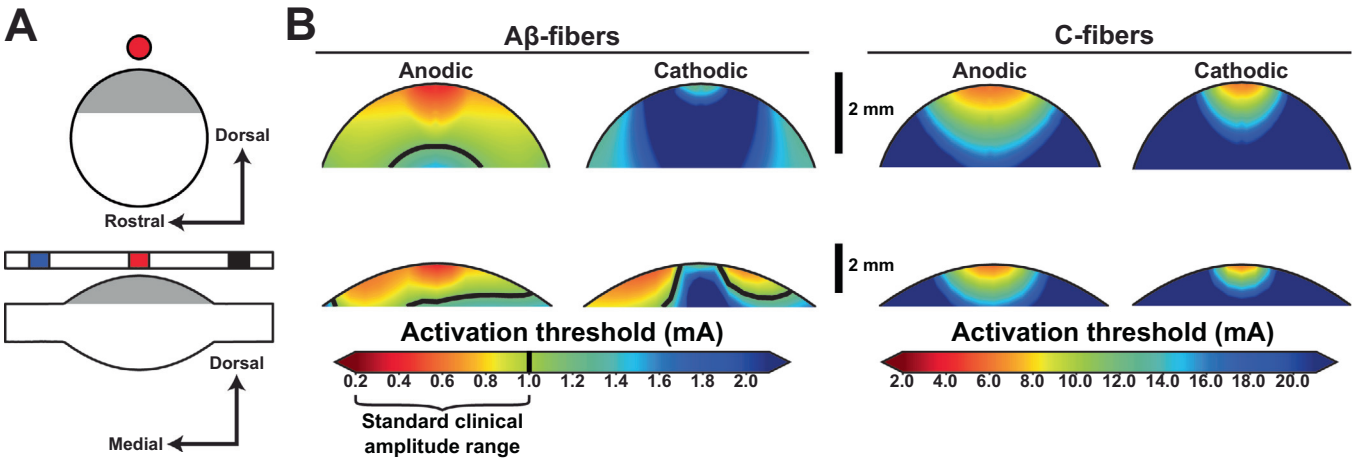

Fig. 4. DRGS amplitudes required to elicit one or more action potentials (activation threshold) in primary sensory neurons (PSNs) for anodic- and cathodic-first DRGS. (A) Sagittal (top) and transverse (bottom) DRG cross sections used to construct the threshold plots in B. Gray shaded regions indicate the locations of PSN somata. Electrode contacts are color coded such that: red = active electrode, blue = return electrode, black = inactive contact, white = insulated lead body. (B) Activation threshold plots for Aβ- and C-fibers. Black contour lines indicate the cutoff for clinical DRGS amplitude ranges ($\leq$1 mA). Note the difference in the color bar scales between the Aβ- and C-fibers. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

where r_m is the membrane resistance, r_i is the intracellular resistance, V_e is the extracellular voltage, and c_m is the membrane capacitance. The $\sum I_{ion}$ term represents the sum of all ionic currents through a given compartment. The ionic current for a generic ion (e.g. sodium, potassium) is represented by the Hodgkin-Huxley formalism:

$$I_{ion} = \bar{g}_{ion} s (V_m - E_{ion}) \quad (3)$$

where $\bar{g}_{ion}$ is the maximal ionic conductance, s is a state variable, and E_{ion} is the ionic reversal potential. Some ionic currents have more than one state variable. For the full formulation of each ion channel's current equation, we refer the reader to their original manuscripts (Sheets et al., 2007; Huang et al., 2014; Gaines et al., 2018). Because the FEM tissue conductivities were linear, the voltage distribution generated by a given stimulus amplitude was a scalar multiple of the voltage distribution generated by a unit stimulus (i.e. a 1 A stimulus) (Moffitt and McIntyre, 2005).

We examined sensory neuron response to DRGS (Fig. 3). We calculated the minimum stimulation amplitude to elicit one or more action potentials (i.e. the activation threshold) in both fiber types. All pulses were biphasic with a stimulus pulse followed by a passive discharge phase. To mimic common parameter values used in clinical DRGS, we used a stimulus pulse width of 300 µs, an interphase interval of 20 µs (i.e. delay between the end of a stimulus pulse and the start of the passive discharge phase), and a pulse frequency of 40 Hz (Deer et al., 2017; Kent et al., 2018; Lempka et al., 2018). We calculated activation thresholds for both anodic- and cathodic-first stimulus pulses. We used a binary search algorithm to find the activation thresholds to within 0.1 µA.

3. Results

3.1. Cell model validation

We created multi-compartment models of two types of sensory neurons that are important in pain processing: a myelinated Aβ-fiber and a nonmyelinated C-fiber. Both the Aβ-fiber and C-fiber models reproduced somatic action potential characteristics observed in experimental studies (Huxley and Stämpfli, 1951; Harper and Lawson, 1985b; Villière and McLachlan, 1996; Djouhri et al., 1998; Zhang et al., 1998; Amir and Devor, 2003; Amir et al., 2005; Howells et al., 2012). The Aβ-fiber model matched experimental ranges of AP amplitude, AP duration, AHP amplitude, AHP half duration, resting membrane potential, and conduction velocity (CV). The C-fiber model matched experimental ranges of AP amplitude, AP duration, rise time, fall time, AHP amplitude, AHP half duration, resting membrane potential, and CV. The action potential rise and fall times of the Aβ-fiber model were slightly outside of the experimental range, however the total duration of the action potential matched experimental data. Table 4 summarizes the somatic action potential characteristics of our models and how they compared to values reported in literature.

3.2. Activation thresholds

DRG contain several types of primary sensory neurons that convey different sensory modalities (e.g. touch, pain). Large myelinated fibers, such as Aβ-fibers, typically convey innocuous touch stimuli, while small nonmyelinated fibers, such as C-fibers, typically convey noxious stimuli (Devor, 1999). We wanted to determine which types of sensory neurons are likely being activated by DRGS. Therefore, we calculated the stimulation amplitudes necessary to elicit one or more action potentials in the multi-compartment models of Aβ- and C-fibers.

In Aβ-fibers, cathodic and anodic DRGS typically caused APs to initiate in either the peripheral or central axon – whichever was closer to the cathode. In C-fibers, most APs initiated in the stem axon when the cell body was near the anode, while APs were typically generated in the soma when the cell body was near the cathode. Fig. 4B shows contour plots of the activation thresholds for Aβ- and C-fibers. Aβ-fiber thresholds were lower than C-fiber thresholds. Anodic thresholds were consistently lower than cathodic thresholds for both cell types. PSNs with cell bodies below an anode had lower thresholds than PSNs with cell bodies below a cathode. Activation thresholds increased with distance from the active and return electrodes. The minimum stimulation amplitude needed to elicit an action potential in an Aβ-fiber was 0.36 and 0.24 mA for cathodic and anodic DRGS, respectively. The minimum stimulation amplitude needed to elicit an action potential in a C-fiber was 4.38 and 4.09 mA for cathodic and anodic DRGS, respectively. On average, DRGS amplitudes used in clinical practice do not exceed 1 mA (Deer et al., 2017). With a 1 mA pulse amplitude, cathodic DRGS activated 29.5% of the modeled Aβ-fibers in the DRG, while anodic DRGS activated 74.6% of Aβ-fibers in our DRG model. Interestingly, there were no C-fibers activated within clinical amplitude ranges. These results suggest that, with standard clinical amplitudes, DRGS directly activated myelinated Aβ-fibers without activating nonmyelinated C-fibers.

3.3. DRGS drives regular firing of Aβ-fibers

Primary sensory neurons may go through quiescent periods in which they do not fire action potentials (e.g. when they do not receive sensory input). PSNs may also experience periods of spontaneous activity, such as in response to sensory stimuli or in some chronic pain states. Currently, we do not know how DRGS modulates the activity of sensory neurons in either state to provide analgesia. One theory suggests that DRGS provides analgesia by suppressing PSN hyperexcitability, or otherwise silencing abnormal electrical patterns of DRG neurons brought about by chronic pain (Azeem and Attias, 2018). Conversely, the gate control theory of pain suggests that stimulation-induced pain relief is achieved by repeatedly activating large myelinated somatosensory fibers, activating inhibitory interneurons in the dorsal horn that silence transmission neurons (Melzack and Wall, 1965; Braz et al., 2014).

We tested these theories by examining how DRGS modulates PSN activity under quiescent and spontaneously-active conditions. We implemented a pain-state model of an Aβ-fiber that generates ectopic action potentials from its soma (a feature of tactile allodynia) (Devor, 2009), and a pain-state model of a C-fiber that generates action potentials in the peripheral axon (e.g. in response to tissue damage). We then applied suprathreshold clinical DRGS (0.75 mA pulse amplitude, 300 μs pulse width, 40 Hz pulse frequency) to examine the effect of stimulation on quiescent and spontaneously active fibers (Fig. 5). Stimulating both quiescent and spontaneously active Aβ-fibers caused the fiber to fire one action potential in response to every stimulus pulse (i.e. one-to-one activation). DRGS did not elicit any action potentials in quiescent C-fibers. When stimulating spontaneously active C-fibers, DRGS did not suppress or drive activity. Instead, the cell continued to fire at its original frequency, and DRGS only evoked subthreshold responses. These results further suggest that clinical DRGS directly drives the activity of large myelinated Aβ-fibers without modulating C-fiber activity.

3.4. Effect of lead location

DRGS leads are implanted percutaneously, and guided into the intraforaminal space above the DRG (Vancamp et al., 2017). Clinicians use fluoroscopic imaging to visualize lead location during implantation, but fluoroscopy cannot resolve neural tissue. Therefore, the position of active and return electrodes relative to the DRG is difficult to ascertain during implantation. With variations in patient anatomy, it is possible that electrode location with respect to the ganglion is inconsistent across patients, and could potentially lead to differences in patient outcomes. We examined the effect of electrode position on PSN activation thresholds to determine how lead placement altered neural activation.

After shifting the electrode along the nerve root 3.125 mm (i.e. half the distance from the middle of one contact to the middle of an adjacent contact) so that the active and return electrodes straddled the ganglion, cathodic and anodic DRGS again caused APs to typically initiate in the axon closest to the cathode for Aβ-fibers. For both cathodic and anodic DRGS, C-fiber APs usually initiated in the soma when the cell body was below a cathode, and the stem axon when the cell body was below an anode. When the cell body was halfway between the anode and cathode, C-fiber APs were generated in either the peripheral or central axon. Fig. 6B shows the activation thresholds for Aβ- and C-fibers when the active and return electrodes straddled the DRG. With the active and return electrodes straddling the ganglion, most cathodic thresholds were lower than anodic thresholds. The minimum amplitudes needed to elicit an action potential in an Aβ-fiber was 0.27 and 0.34 mA for cathodic and anodic DRGS, respectively. The minimum amplitude to elicit an action potential in a C-fiber was 8.51 and 6.72 mA for cathodic and anodic DRGS, respectively. For Aβ-fibers, slightly fewer cells had anodic activation thresholds within clinical ranges when the active and return electrodes straddled the ganglion compared to when the active electrode is centered over the ganglion: 72.4% of cells vs 74.6% of cells, respectively. However, there were more Aβ-fibers with cathodic activation thresholds

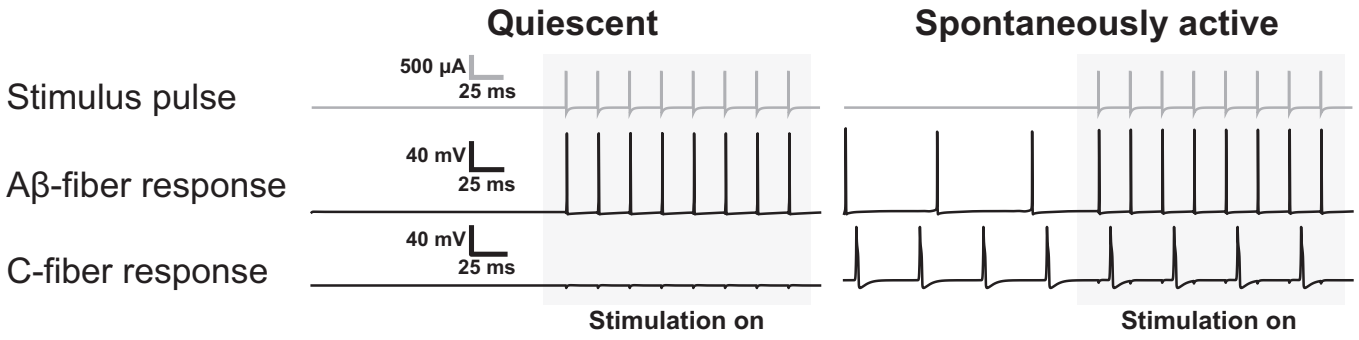

Fig. 5. Applying DRGS to quiescent and spontaneously-active primary sensory neurons. We applied an anodic DRGS pulse (top trace, gray) with an amplitude of 750 μA, a pulse width of 300 μs, and a pulse frequency of 40 Hz to example quiescent and spontaneously-active Aβ- and C-fibers. The somatic membrane potential traces (bottom traces, black) of example Aβ- and C-fibers before and during DRGS are shown. Gray shaded regions indicate when DRGS is applied.

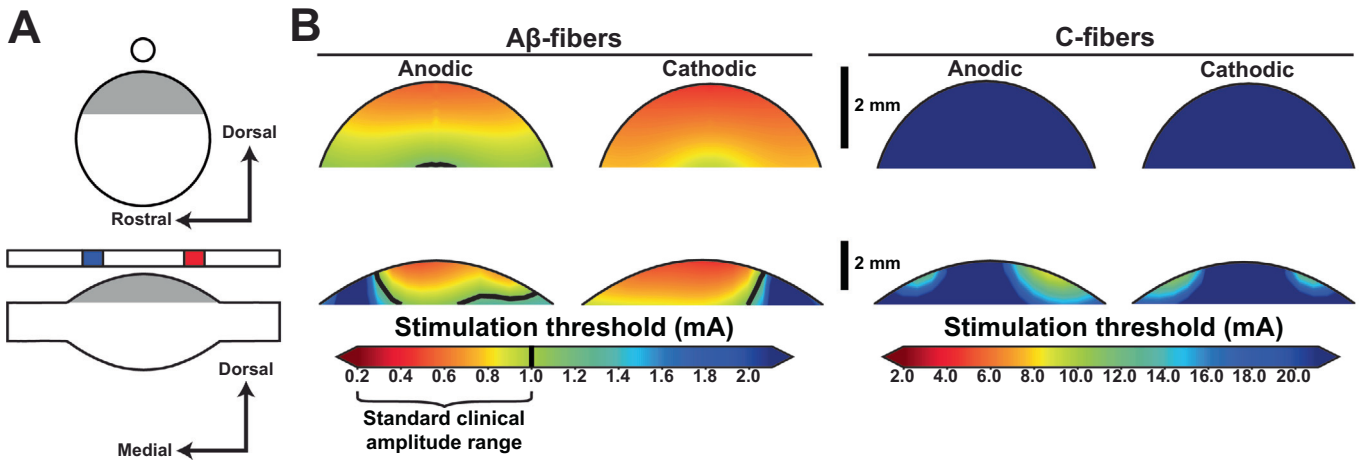

Fig. 6. DRGS amplitudes required to elicit one or more action potentials (activation threshold) in primary sensory neurons (PSNs) after shifting the electrode lead such that the active and return electrodes straddle the ganglion. (A) Sagittal (top) and transverse (bottom) DRG cross sections used to construct the threshold plots in B. Gray shaded regions indicate the locations of PSN somata. The electrode lead is color coded such that: red = active electrode, blue = return electrode, black = inactive contact, white = insulated lead body. (B) Activation threshold plots for Aβ- and C-fibers. Black contour lines indicate the cutoff for clinical DRGS amplitude ranges ($\leq$1 mA). Note the difference in the colorbar scales between the Aβ- and C-fibers. (For interpretation of the references to colour in this figure legend, the reader is referred to the web version of this article.)

within clinical ranges when the active and return electrodes straddled the ganglion compared to the active electrode centered over the ganglion: 86.6% of cells vs. 29.5%, respectively. Straddling the active and return electrodes across the ganglion did not produce any C-fiber activation within clinical ranges. These results indicate that both stimulus polarity and the positioning of anodes and cathodes relative to the ganglia may alter the number of neurons activated by DRGS.

4. Discussion

DRGS is a promising therapy for chronic intractable pain. However, not all patients receive sufficient pain relief from DRGS. There are several factors that may contribute to these shortcomings, such as inconsistencies in lead positioning, stimulation parameter selection, and possible differences in mechanisms of action of chronic pain between different pain etiologies. Another likely contributing factor is that the physiological mechanisms of stimulation-induced pain relief are unknown. This knowledge gap prevents the design of stimulation therapies to specifically target these mechanisms. Uncovering these physiological mechanisms will be essential in maximizing pain relief in all patient populations. The data presented in this study are an important next step towards this goal. Our results suggest that within the range of clinical stimulation parameters, DRGS activates large myelinated Aβ-fibers but not small nonmyelinated C-fibers. Therefore, we conclude that a primary mechanism of DRGS-induced pain relief may be the activation of pain-gating mechanisms in the dorsal horn. Furthermore, our data suggest that cathodic DRGS applied with the active and return electrodes straddling the ganglion may activate more Aβ-fibers than other electrode configurations.

4.1. Potential mechanism of clinical DRGS

We employed a computer modeling approach to study the mechanisms of DRGS on PSNs. DRG contain several types of sensory neurons: large myelinated proprioceptive and mechanoreceptive fibers (e.g. Aβ-fibers), small thinly-myelinated mechanoreceptive, thermoceptive, and nociceptive fibers (e.g. Aδ-fibers), and small nonmyelinated mechanoreceptive and nociceptive fibers (e.g. C-fibers). In our model, we considered two sensory neurons commonly studied in chronic pain – the large myelinated mechanoreceptive Aβ-fiber, and the small nonmyelinated nociceptive C-fiber. Our results suggest that DRGS within clinical ranges of stimulation parameters (e.g. amplitude, pulse width) are directly activating Aβ-fibers, but not C-fibers (Fig. 4). We observed this result irrespective of lead placement and stimulation configuration (Fig. 6). DRGS caused one-to-one activation of Aβ-fibers, regardless

of the fiber's activity before DRGS was turned on (Fig. 5). Repeated activation of large myelinated Aβ-fibers suggests that DRGS may provide pain relief by activating pain-gating mechanisms within the spinal cord (Melzack and Wall, 1965). This aligns well with the current theories on the mechanisms of action of SCS for pain, where SCS activates the large myelinated Aβ-fibers of the dorsal columns, which activate inhibitory interneurons in the dorsal horn (Holsheimer, 2002; Guan, 2012; Lempka and Patil, 2018).

A recent computational study of DRGS examined the effect of stimulation on C-fibers (Kent et al., 2018). Kent and colleagues showed that DRGS activates C-fibers with stimulation amplitudes on the order of several milliamps, similar to the ranges reported in this study. We also corroborated their finding that action potentials typically initiate around the soma or stem axon in C-fibers. Their results suggest that DRGS could potentially generate analgesia by blocking painful afferent signals from propagating into the spinal axon by enhancing low-pass filtering of noxious afferent signals at C-fiber T-junctions. However, the stimulation amplitudes reported to elicit sustained block were far outside clinical ranges (>9.5 mA). Therefore, we believe that in clinical scenarios, T-junction filtering is unlikely to be the primary mechanism of DRGS-induced pain relief, though it is likely important in normal physiologic pain processing (Gemes et al., 2013; Koopmeiners et al., 2013). Instead, our results suggest that DRGS within clinical parameter ranges directly activates large myelinated afferent fibers.

In this work, we used a computer model to examine the direct effects of DRGS on primary sensory neurons within the DRG. However, more work is needed to fully elucidate the pain-relief mechanisms of DRGS, particularly the downstream effects of stimulation. Recent studies have provided insight into the complexity of the spinal networks that govern pain transmission, highlighting that Aβ-afferents synapse onto both excitatory and inhibitory interneurons in the dorsal horn, which mediate the activity of projection neurons that carry sensory signals to the brain (Duan et al., 2014, 2018; Cheng et al., 2017). It is currently unknown: (1) how different chronic pain etiologies sensitize or disinhibit the various components of this network, (2) how the prolonged driving of Aβ-fiber activity with DRGS may induce changes in this network, (3) how Aβ-fiber and dorsal horn network response to stimulation may change in response to chronic DRGS, and (4) how long-term DRGS-induced changes in network dynamics vary between chronic pain etiologies. Experiments designed to answer these questions may provide insight into which pain etiologies are likely to receive therapeutic benefit from DRGS (Harrison et al., 2018), and why the therapeutic efficacy of DRGS appears to decrease over time (Eldabe et al., 2015; Morgalla et al., 2018). Furthermore, the results of those studies may inform the design of future computer models of DRGS to examine the effects of DRGS on dorsal horn circuitry. Such models could be used to optimize stimulation parameters to provide maximal pain relief.

4.2. Effect of electrode lead placement on neural activation

Because x-ray fluoroscopy cannot resolve neural tissue, it is difficult to determine the position of DRGS electrodes relative to the ganglion during implantation. It is possible that electrode placement with respect to the ganglion could be variable across patients, which may be a factor in the limited success of DRGS. To determine how this may affect the neural activation produced by DRGS, we examined the effect of lead position relative to the ganglion on DRGS-induced neural activation (Fig. 6). We showed that regardless of lead position, clinical DRGS activates Aβ-fibers but not C-fibers. When the active and return electrodes straddled the ganglion, cathodic DRGS activated significantly more Aβ-fibers than when the active electrode was centered above the ganglion (86.6% and 29.5% of Aβ-fibers within the ganglion, respectively). This result is likely due to the cathode being closer to the nerve root, which contains the axons of PSNs but not cell bodies. It is well understood that cathodic extracellular stimulation has lower thresholds when the cathode is near an axon compared to near a cell body (Ranck, 1975; McIntyre and Grill, 1999). Interestingly, when the active and return electrodes straddled the ganglion, the number of cells activated by clinical ranges of anodic DRGS only decreased by 2.2%, possibly because the active electrode remained close enough to the ganglion to directly stimulate cells with somata around the dorsal edge of the ganglion.

These results suggest that if DRGS provides pain relief by activating Aβ-fibers, the optimal stimulation parameters may be to have the active and return electrodes straddle the DRG and to apply cathodic DRGS. This is consistent with previous clinical reports that suggested straddling the second and third electrodes across the pedicle was the ideal electrode lead location (Eldabe et al., 2015). Lumbar ganglia are typically located under the pedicle in the 'foraminal region,' suggesting that electrode location with respect to the pedicle may be a good proxy for electrode location with respect to the ganglia at those levels (Kikuchi et al., 1994; Hasegawa et al., 1996; Silverstein et al., 2015).

Our model suggests that a straddled electrode configuration would activate the largest number of Aβ-fibers for a given stimulation amplitude, thus minimizing power consumption. It is important to note that our model assumed a homogeneous distribution of each afferent type throughout the DRG, while the spatial distribution of different types of PSNs in human DRG is unknown. Previous studies in rats suggest that two-thirds of L5 DRG neurons are C-type fibers (Tandrup, 1993), and that lumbar DRG may show digit-specific organization (Prats-Galino et al., 1999). However, it is unclear if DRG neurons also organize based on sensory modality, though it has been suggested (Puigdellívol-Sánchez et al., 1998). Deciphering the location of Aβ-fibers within human DRG may inform the ideal location in which to place the electrode lead to effectively target these populations.

4.3. Limitations

We used a computer model to investigate which cells are directly stimulated by DRGS. Computer modeling has been a powerful tool in understanding the mechanisms of action of other neurostimulation therapies, such as deep brain stimulation (McIntyre et al., 2004a,b) and SCS (Struijk et al., 1992, 1993). However, it will be imperative to confirm our findings with experimental data, and to use those data to validate and refine our model design. Furthermore, there are several limitations to our approach with regards to studying DRGS-induced pain relief. First, we examined only two sensory neurons found within human DRG: Aβ- and C-fibers. Though Aβ-fibers and C-fibers are crucial in the development and maintenance of chronic pain, other cell types, such as Aα-proprioceptors and Aδ-thermoceptors and nociceptors, may also play important roles (Devor, 1999). In particular, Aδ-fibers are of interest, as Aδ-fibers typically convey thermal or mechanical pain (Lawson, 2005; Todd, 2010; Hu et al., 2014). Since Aδ-fibers are myelinated, albeit thinly, it is possible that DRGS will directly affect their firing patterns compared to the nonmyelinated C-fibers. However, we excluded these fibers from our analyses because of a paucity of experimental data necessary to describe Aδ-fiber ion channel physiology. Because Aδ-fibers are known to play an important role in several forms of chronic pain (Kajander and Bennett, 1992; Todd, 2010; Hu et al., 2014), future computational modeling studies should consider the effects of DRGS on Aδ-fibers.

We made several simplifications with regards to the ion channels included in our multi-compartment sensory neuron models.

Sensory neurons express a myriad of ion channels, but due to computational demands and limited experimental data, it is not possible to model every ion channel type present in sensory neurons. Therefore, we focused on the major ion channels necessary to reproduce the somatic action potential characteristics described in previous experimental studies. Future DRGS studies could consider a more complete model of PSN ion channel physiology, particularly with regards to the long-term effects of stimulation (e.g. calcium sequestration, synaptic transmitter release).

We developed a simplified representation of a human DRG using a cylindrical volume conductor model, a similar approach used previously to study the mechanisms of action of neurostimulation therapies (McIntyre et al., 2004a,b; Datta et al., 2008; Lempka et al., 2015). We assumed an idealized trajectory for axons within the ganglion. In our models, stem axons projected towards the midline of the ganglion and nerve root, then bifurcated into central and peripheral axons which curved ventrally before entering the nerve root and following straight trajectories. In reality, stem axons are complex and winding, forming tightly packed glomeruli around somata before reaching bifurcating nodes (Devor, 1999). The impact of tightly coiled stem axons on DRGS thresholds is currently unclear. Future studies should examine the effects of complex stem axon trajectories on neuronal activation, and the extent to which ephaptic phenomena may influence DRGS outcomes.

5. Conclusions

DRGS is a promising therapy for chronic intractable pain. We examined which cell types in the DRG are directly stimulated by DRGS within clinical ranges of stimulation parameters. The results of this study suggest that large myelinated PSNs are directly driven by DRGS, indicating that DRGS-induced analgesia may be achieved by activating pain-gating mechanisms in the dorsal horn. We demonstrated that the position of the active and return electrodes can influence neural activation. Our results suggest that cathodic DRGS applied when the active and return electrodes straddle the ganglia activates more large myelinated afferents than electrodes placed over the medial aspect of the DRG.

Acknowledgements

Technical assistance: The authors would like to thank Dr. Stephen McMahon (King's College London, London, UK) for his helpful comments and feedback on the multi-compartment neuron models.

Funding: This research was supported in part through computational resources provided by Advanced Research Computing at the University of Michigan, Ann Arbor, by the National Institutes of Health (NIH R01 NS089530), and by the National Science Foundation (NSF CAREER award 1653080).

Conflict of interest

SFL is a shareholder and scientific advisory board member of Presidio Medical, Inc. All other authors declare no conflicts of interest.

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