

# Neurosensory Assessments of Concussion

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**ABSTRACT** The purpose of this research was to determine if cortical metrics—a unique set of sensory-based assessment tools—could be used to characterize and differentiate concussed individuals from nonconcussed individuals. Cortical metrics take advantage of the somatotopic relationship between skin and cortex, and the protocols are designed to evoke interactions between adjacent cortical regions to investigate fundamental mechanisms that mediate cortical–cortical interactions. Student athletes, aged 18 to 22 years, were recruited into the study through an athletic training center that made determinations of postconcussion return-to-play status. Sensory-based performance tasks utilizing vibrotactile stimuli applied to tips of the index and middle fingers were administered to test an individual’s amplitude discrimination, temporal order judgment, and duration discrimination capacity in the presence and absence of illusion-inducing conditioning stimuli. Comparison of the performances in the presence and absence of conditioning stimuli demonstrated differences between concussed and nonconcussed individuals. Additionally, mathematically combining results from the measures yields a unique central nervous system (CNS) profile that describes an individual’s information processing capacity. A comparison was made of CNS profiles of concussed vs. nonconcussed individuals and demonstrated with 99% confidence that the two populations are statistically distinct. The study established solid proof-of-concept that cortical metrics have significant potential as a quantitative biomarker of CNS status.

## INTRODUCTION

Currently, there is no standard, reliable, cost-effective paradigm or methodology for assessing the degree to which the central nervous system (CNS) is impacted by neurological disorders. One of these disorders or systemic central alterations due to trauma is concussion, or mild traumatic brain injury (mTBI). Although awareness of concussion and mTBI is significantly growing in the general public, there is still no standardized, quantitative, biologically based methodology that is effective for assessing the impact of mild neuro-trauma. Current existing methods and products for this need are expensive, extremely slow, and in many cases fail to definitively and quantitatively diagnose the problem. For example, medical imaging technologies—though they are able to discern differences in subjects with traumatic brain injury—show few or no differences for mTBI or concussion, are costly (about \$1K per scan), are not portable, and are not practical for getting a quick assessment. No modern medical imaging techniques are as sensitive to subtle alterations in cortical information processing as those detected by sensory percept. While it is unlikely that there will be any medical imaging technologies able to provide such high resolution in the near future, it is even more improbable that such a technology could be widely distributed.

One of the greatest issues with concussion, or mTBI, is determination of return-to-duty status for the military or return-to-play status for athletes at multiple levels of competition

(secondary school, college/university, and professional level). Because injury from secondary concussions can be much more serious, if not fatal, during the critical postconcussion recovery period, it is imperative that methods for this determination be developed. Several years ago, we proposed to design and fabricate a noninvasive, portable, sensory-based diagnostic system using state-of-the-art technology to investigate cortical information processing. Sensory perceptual protocols were designed based on our findings from *in vivo* studies of cerebral cortical dynamics in nonhuman primates (and thus called cortical dynamic metrics or “cortical metrics”). These proved successful in that a number of specific protocols appeared to be very sensitive to detecting differences between subjects with compromised neurological conditions and healthy controls. Multiple proof-of-concept studies have independently demonstrated that a number of these newly developed metrics are sensitive to systemic cortical alterations.<sup>1–16</sup>

The somatosensory system is uniquely suited for the design of a diagnostic system for overall cortical health for a number of reasons. First, the somatotopic organization of the somatosensory system provides an ideal template for evoking cortical–cortical interactions in adjacent or near-adjacent cortical regions. Second, ambient environmental noise in the system can be easily controlled (i.e., it is less likely that a patient will be exposed to distracting tactile input than auditory or visual input). Third, the somatosensory system is the only sensory system that is highly integrated with the pain system, and this is often an important aspect of a patient’s diagnosis. Fourth, a key concept in the model is that alterations in sensory percept occur in parallel with alterations in systemic cortical alterations, and “sampling” from the center of the brain (where the somatosensory cortex is located) is more analogous to obtaining a noninvasive biopsy of the cerebral cortex than any other sensory modality.

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In this study, we obtained cortical metrics from both concussed and nonconcussed individuals, and subsequently, comparisons of the results were obtained that demonstrated that concussion had impacted the metrics significantly.

## METHODS

A portable, noninvasive tactile stimulator was designed and fabricated to deliver stimuli to adjacent finger tips (previously described in Holden et al<sup>17</sup> [Fig. 1]). Taking advantage of the somatotopic relationship between skin and cortex, biologically based hypothesis-driven protocols were designed to evoke interactions between adjacent cortical regions and investigate fundamental mechanistic changes that occur in cortical-cortical interactions. The measured changes in sensory percept can be easily and rapidly obtained (1 to 3 minutes per test) in a manner similar to reading an eye chart, and the battery of tests described below takes approximately 20 minutes to administer. In this report, we describe three sets of paired metrics, which are relatively simple sensory perceptual measures obtained in the presence and absence of a conditioning stimulus. Because the conditioning stimuli result in healthy controls performing worse, we define these conditioning stimuli as confounding or illusion-inducing. Descriptions of the paired tests administered are described in the section below after the general procedure section.

### Subjects

Data were collected from 89 college students (67 male, 22 female, mean age = 20.1 years, and SD = 1.2 years), of which 31 experienced a sports-related concussion (15 played football, 7 basketball, 7 soccer, and 2 lacrosse). All concussed athletes were diagnosed with mTBI in the form of a concussion by a certified athletic trainer and the team physician with the help of the Sport Concussion Assessment Tool 2

(SCAT-2) and had no prior history of concussion or any other diagnosed medical conditions. The assessments reported were obtained in 1 to 3 days postconcussion. The experimental procedures were reviewed and approved in advance by an institutional review board.

### General Procedure

During the experimental session, the subjects were situated with the left arm on an armrest attached to the head unit of a portable four-site vibrotactile stimulator. Mechanical stimulation was applied on the glabrous tips of the second (index, D2) and/or the third (middle, D3) fingers of the left hand. An automated procedure guided subjects through a series of questions (answered via computer mouse) related to what the subjects perceived on D2 and D3. In each of the procedures described below, a simple tracking procedure that utilized a two-alternative forced choice (2AFC) paradigm was used to determine an individual's difference limen (DL). The tracking procedures for each of the protocols queried the individual as to which of two stimuli were larger (amplitude discrimination), which of two stimuli came first (temporal order judgment [TOJ]), or which of two stimuli lasted longer (duration discrimination), and differences between the two stimuli delivered were made smaller when subjects answered correctly.

Visual cueing was provided via a computer monitor during the experimental runs. Specifically, an on-screen light panel indicated when the subject was to respond. An audiometer was used to make sure that no auditory cues were emitted from the stimulator during delivery of the stimuli. Practice trials were performed before each test to allow the subjects to become familiar with the test, and correct responses on three consecutive training trials were required before commencing with the data acquisition portion of the test. The subject was not given performance feedback or knowledge of the results during data acquisition.

### Paired Cortical Metrics No. 1: Amplitude Discrimination Capacity in the Presence and Absence of Confounding Conditioning Stimuli

#### Baseline Metric

Amplitude discriminative capacity is defined as the minimal difference in amplitudes of two mechanical sinusoidal vibratory stimuli at which an individual can successfully identify the stimulus of larger magnitude. Two stimuli were delivered simultaneously to D2 and D3, and discrimination capacity was assessed using a previously described 2AFC tracking protocol.<sup>1,11,12,14-16,18,19</sup> The standard stimulus was set at 200  $\mu\text{m}$  and the test stimulus was initially 400  $\mu\text{m}$ . This difference was subsequently decreased or increased as a result of subject response (decreased for correct answers and increased for incorrect responses). Which of the two fingers received the standard stimulus and which finger received the test stimulus was chosen randomly on each trial.



**FIGURE 1.** Four-site vibrotactile stimulator. Each of the four probe tips was positioned by rotating the four independently positioned drums to maximize contact between finger pads and the simulator tips.

*Illusory Conditioning*

The amplitude discrimination procedure described above was repeated in the presence of a vibrotactile conditioning stimulus delivered 1 second before the presentation of the pair of tests and standard stimuli (Fig. 2). The result of such a protocol modification is that the DL is typically significantly elevated due to a healthy subject's ability to adapt to the stimulus.<sup>1,7,10,11,14,16</sup>

**Paired Cortical Metrics No. 2: TOJ in the Presence and Absence of Confounding Stimulation**

*Baseline Test*

To evaluate TOJ, two sequential taps were delivered, one to each digit tip, with an initial interstimulus interval of 150 ms. The interstimulus interval was subsequently reduced as a result of subject response as defined by a 2AFC protocol. The finger that received the first of the two pulses was chosen randomly on each trial. Subjects were queried as to which finger was tapped first.

*Illusion-inducing Conditioning*

TOJ was assessed in the presence of simultaneously delivered synchronized 25 Hz conditioning stimulation before the TOJ task. In healthy controls, this synchronized conditioning typically significantly impacts TOJ, but it does not impact TOJ in some neurologically compromised individuals.<sup>3,13,20</sup>

**Paired Cortical Metrics No. 3: Duration Discrimination Capacity in the Presence and Absence of an Illusory Confound**

*Baseline Metric*

Duration discriminative capacity is the minimal difference in durations of two stimuli at which an individual can successfully identify the stimulus of larger duration. Sequential stimuli were delivered to D2 and D3. Discrimination capacity was assessed using a 2AFC tracking protocol, and subjects were queried as to which of the two digits received the longer stimulus duration. The standard stimulus lasted 500 ms and the initial test stimulus lasted 750 ms. The finger

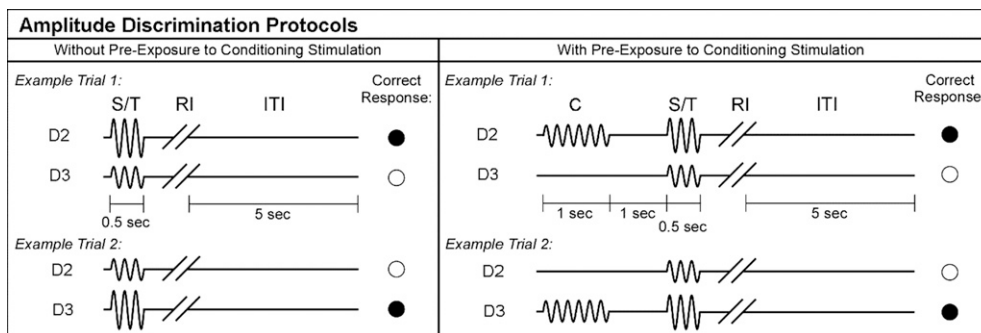
and order of the stimuli were chosen at random on each trial. The duration of the test stimulus was reduced when subject responses were correct and increased when responses were incorrect.

*Illusion-Inducing Confound*

Duration discrimination capacity was assessed in the presence of an increased standard amplitude. Increasing the amplitude results in a neurophysiological response that is longer in duration<sup>21,22</sup> and would predictably make it more difficult for healthy controls to correctly discriminate duration.

**Data Analysis**

Statistical significance of the difference of the means between the concussed and healthy control samples was assessed separately for each of the six cortical metrics using a paired *t* test. In addition, using the approach of quantitative sensory testing—which treats the performance of a human subject on a battery of psychophysical tests as a multidimensional “sensory profile” of that subject, potentially reflecting the functional status of his/her CNS<sup>23,24</sup>—quantitative performance of each subject in this study on six cortical metrics tests was treated as the “CNS profile” of that subject, localizing him/her in a 6-dimensional cortical metrics space. The cortical metrics space is an abstract space in which each coordinate axis corresponds to one of the cortical metrics. Since different metrics vary on different scales, to make different axes of the cortical metrics space comparable to each other, each metric contributing to the CNS profile was autoscaled by subtracting its mean (measured over the entire studied subject population) and dividing by its standard deviation. Hotelling's T-squared test of the difference between the multivariate means of different populations<sup>25</sup> was used to compute the statistical significance of the difference in the locations in the cortical metrics space of the centers of the concussed and healthy control samples. Finally, to graphically visualize the spatial relationship between the clusterings of the concussed and healthy control subjects in the cortical metrics space, the 6-dimensional space and all the subject-representing data points in it were projected, using the Partial Least Squares Discriminant Analysis



**FIGURE 2.** Schematics of amplitude discrimination protocols. The vibrotactile conditioning stimulus was delivered 1 second before presentation of the pair of test and standard stimuli (right panel).

(PLS-DA) algorithm,<sup>26</sup> onto a 2-dimensional plane oriented such as to maximize the separation between the concussed and healthy control distributions.

**RESULTS**

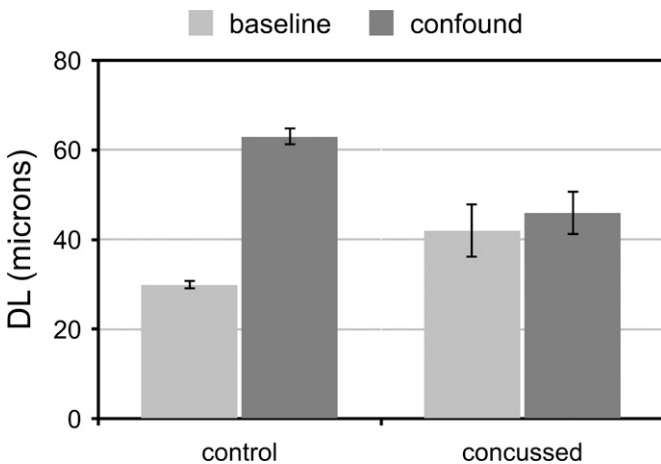
**Paired Cortical Metrics No. 1: Amplitude Discrimination Capacity in the Presence and Absence of Confounding Conditioning Stimuli Demonstrates That Concussed Individuals Adapt Less Than Nonconcussed Individuals**

Control data were consistent with amplitude discriminative capacity measures that previously demonstrated robustness across the age spectrum.<sup>16</sup> Figure 3 shows that concussed subjects performed worse on the amplitude discrimination task than did healthy controls (DL of controls  $30.1 \pm 1.3 \mu\text{m}$  vs. concussed  $42.1 \pm 5.9 \mu\text{m}$  for a 200  $\mu\text{m}$  standard).

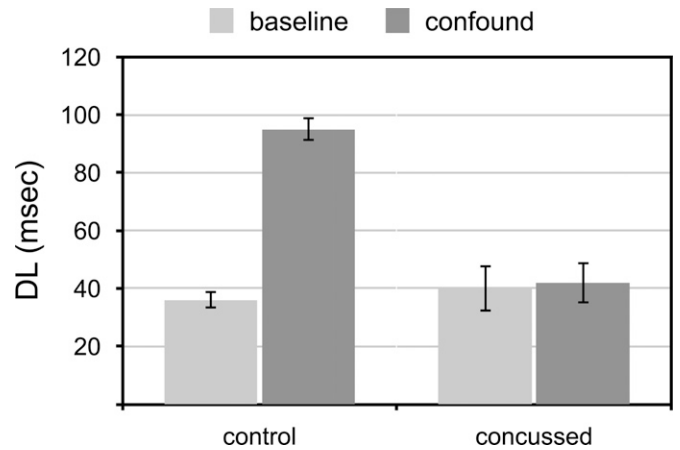
With the addition of a confounding conditioning stimulus, amplitude discriminative capacity is typically worse across the age spectrum<sup>16</sup> and the results in Figure 3 are consistent with that previous finding for control values (DL increased from  $30.1 \pm 1.3 \mu\text{m}$  to  $63 \pm 2.2 \mu\text{m}$  with confound). However, concussed subjects did not perform significantly differently postconditioning (DL increased from  $42.1 \pm 5.9 \mu\text{m}$  to  $46 \pm 5.4 \mu\text{m}$ ).

**Paired Cortical Metrics No. 2**

Typically, healthy individuals have a TOJ capacity on the order of 30 to 40 ms, and in the presence of an illusory conditioning stimulus healthy controls perform significantly worse on the same TOJ task.<sup>13,20</sup> Figure 4 shows that healthy control data in this study are consistent with that finding (DL increases from  $36.4 \pm 2.8 \text{ ms}$  to  $95.2 \pm 4.3 \text{ ms}$ ), and concussed subjects do not appear to deviate significantly



**FIGURE 3.** Amplitude discriminative capacity in absence (baseline) and presence (confound) of an illusory conditioning stimulus. Performance decreases significantly with the confound in controls ( $t(57) = 3.74, p < 0.0005$ ) but is not impacted by the confound in concussed subjects ( $t(30) = 0.19, p = 0.85$ ).

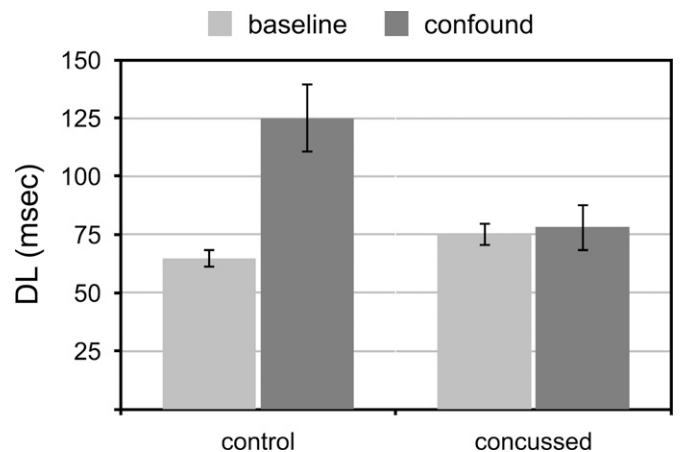


**FIGURE 4.** Temporal order judgment in absence (baseline) and presence (confound) of an illusory conditioning stimulus. Performance decreases significantly ( $t(57) = 3.53, p < 0.001$ ) with the confound in controls but is not impacted by the confound in concussed subjects ( $t(30) = 0.05, p = 0.96$ ).

from healthy controls on the baseline TOJ metric. However, concussed subjects did not perform worse in the presence of the “illusion-inducing confound” (DL for concussed subjects was  $40.1 \pm 7.6 \text{ ms}$  without conditioning vs.  $42.5 \pm 7.3 \text{ ms}$  with conditioning).

**Paired Cortical Metrics No. 3**

Comparison of healthy controls and concussed subjects (Fig. 5) suggests that while there is little or no difference between duration discriminative capacity of the two subject groups (DL for controls  $64.6 \pm 3.7 \text{ ms}$  vs.  $75.2 \pm 5.4 \text{ ms}$  for concussed individuals), the discriminative capacity of healthy controls is impacted by the illusion-inducing confound (DL for controls increased to  $124.7 \pm 15.2 \text{ ms}$ ) while the confound does not appear to impact the discriminative



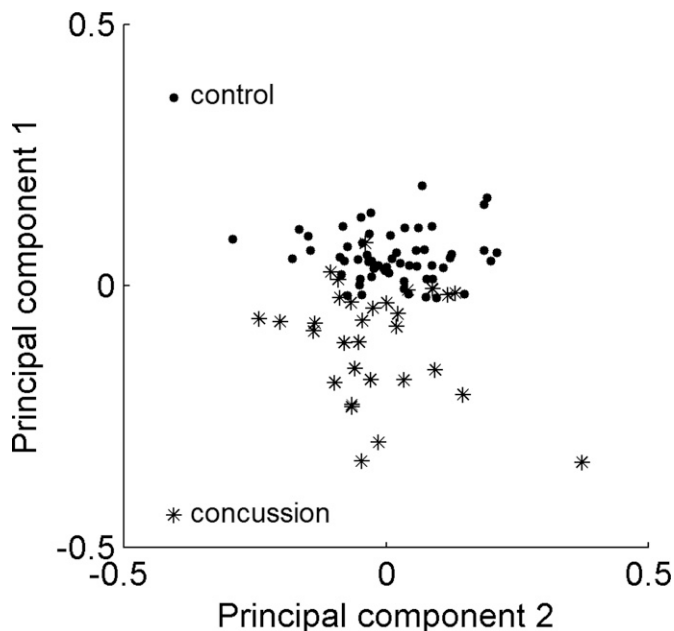
**FIGURE 5.** Duration discriminative capacity in absence (baseline) and presence (confound) of an illusory condition. Performance decreases significantly with the confound in controls ( $t(57) = 4.03, p < 0.0002$ ) but is not impacted by the confound in concussed subjects ( $t(30) = 0.15, p = 0.88$ ).

capacity of concussed subjects significantly (DL increased to  $77.7 \pm 10.3$  ms).

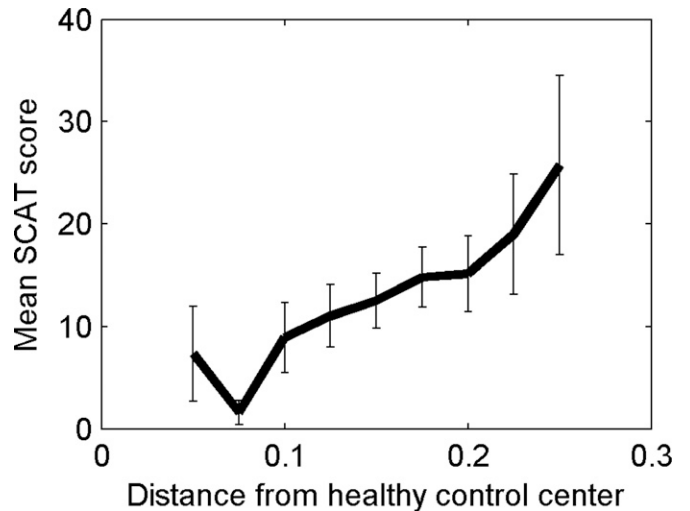
### Multivariate Analysis Demonstrates Different Profiles for Concussed vs. Nonconcussed Individuals

Treating the performance of any given subject on multiple cortical metrics tests as a multidimensional metrics vector (or CNS profile) in an abstract space, each axis of which corresponds to one of the test metrics, we can compare the spatial distributions of such vectors in the concussed vs. healthy control groups. To visualize these two group distributions, they were projected onto a 2-dimensional plane, shown in Figure 6, using PLS-DA algorithm. In Figure 6, control individuals are shown as black dots and concussed individuals are shown as asterisks, revealing that these two groups form distinct, only partially overlapping clusters. While a few concussed individuals are mixed in among the control individuals—thus indicating that their performance on the cortical metrics tests was indistinguishable, as a whole, from the control population—the majority of concussed subjects were clearly displaced relative to the control distribution. Hotelling's T-squared statistic indicates with greater than 99% confidence that these two populations have different centers.

Figure 7 suggests that the distance between the performance vector of a given individual and the center of the healthy control distribution might be indicative of the concussion impact. The plot in Figure 7 was constructed by computing the average concussion symptom score SCAT-2 for 9 different subsets of concussed subjects, each subset farther away from the center of the control distribution. This plot



**FIGURE 6.** PLS-DA plot of locations of the concussed (asterisks) and healthy control (black dots) subjects in the cortical metrics space.



**FIGURE 7.** Plot comparing a concussed individual's symptom score vs. the distance between his/her location in the PLS-DA subspace of the cortical metrics space (Fig. 6) and the center of the healthy control population (SCAT; vertical bars = SEM).

shows that concussed subjects with more distant performance vectors tended to have higher SCAT-2 scores.

### DISCUSSION

For the past several years, we have been developing protocols that utilize illusion-inducing confounds that alter the perception of a sensory stimulus. For example, delivery of a repetitive vibrotactile conditioning stimulus to one of two skin sites before an amplitude discrimination task results in degradation of performance in healthy controls.<sup>10,11,14–16</sup> However, a number of neurologically compromised subjects have demonstrated that this conditioning stimulus—or the illusion-inducing confound—does not impact their performance. In other words, some subject populations (e.g., individuals with autism, alcoholism, multiple types of chronic pain, and concussion) do not adapt to the conditioning stimulus, and because the illusion-inducing conditioning stimulus has little or no impact, they actually “outperform” healthy controls on the postconditioning amplitude discriminative task.<sup>1,11,16</sup> Another example of an illusion-inducing conditioning stimulus is one in which healthy controls perform worse (but neurologically compromised subjects do not) on a TOJ task in the presence of synchronized, but not asynchronous, conditioning stimuli.<sup>12,13</sup> Duration discrimination, or the ability to accurately determine which of two stimuli has a longer temporal duration, is impacted in an illusory manner by increasing the intensity of one of the stimuli. This illusory condition apparently has less of an impact on individuals who are concussed.

It should be emphasized that the measures described in this report do not simply reflect alterations in tactile perception, but rather differences in cortical information processing capacity. The lack of a difference in amplitude discrimination

with vs. without the illusion-inducing confound reflects a systemic cortical alteration and a decrease in the individual's capacity to adapt. In other words, plasticity has been reduced, and the alteration in the somatosensory-based task is a reflection of a systemic cortical alteration. The lack of a change in the TOJ metric in the presence of the confound also reflects a systemic cortical alteration—cortical ensembles are no longer coordinated in their response to the tactile conditioning, and the TOJ cortical metric reflects an alteration in functional connectivity. Similarly, the lack of an impact of the confound on duration discrimination reflects a systemic alteration in neuron-glia interactions, possibly due to neuroinflammation that occurs with concussion.

The potential utility of this work is highly significant. A simple, fast, noninvasive, and cost-effective means for assessing the impact of concussion on CNS health that could be utilized by health care providers would have a far-reaching impact. To date, there are no standardized, quantitative measures that are biologically based for assessing concussion. The advantage of the proposed methodology is that it will be low-cost, easy to use, and effective at both providing information about a patient that would enable a diagnostician to make a more informed decision about diagnosis or treatment, and providing a means for assessing treatment efficacy.

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