BRAIN COMMUNICATIONS

Transcranial magnetic stimulation reveals diminished homoeostatic metaplasticity in cognitively impaired adults

Homoeostatic metaplasticity is a neuroprotective physiological feature that counterbalances Hebbian forms of plasticity to prevent network destabilization and hyperexcitability. Recent animal models highlight dysfunctional homoeostatic metaplasticity in the pathogenesis of Alzheimer's disease. However, the association between homoeostatic metaplasticity and cognitive status has not been systematically characterized in either demented or non-demented human populations, and the potential value of homoeostatic metaplasticity as an early biomarker of cognitive impairment has not been explored in humans. Here, we report that, through preconditioning the synaptic activity prior to non-invasive brain stimulation, the association between homoeostatic metaplasticity and cognitive status could be established in a population of non-demented human subjects (older adults across cognitive spectrums; all within the non-demented range). All participants (n = 40; age range, 65–74, 47.5% female) underwent a standardized neuropsychological battery, magnetic resonance imaging and a transcranial magnetic stimulation protocol. Specifically, we sampled motor-evoked potentials with an input/output curve immediately before and after repetitive transcranial magnetic stimulation to assess neural plasticity with two experimental paradigms: one with voluntary muscle contraction (i.e. modulated synaptic activity history) to deliberately introduce homoeostatic interference, and one without to serve as a control condition. From comparing neuroplastic responses across these experimental paradigms and across cohorts grouped by cognitive status, we found that (i) homoeostatic metaplasticity is diminished in our cohort of cognitively impaired older adults and (ii) this neuroprotective feature remains intact in cognitively normal participants. This novel finding suggests that (i) future studies should expand their scope beyond just Hebbian forms of plasticity that are traditionally assessed when using non-invasive brain stimulation to investigate cognitive ageing and (ii) the potential value of homoeostatic metaplasticity in serving as a biomarker for cognitive impairment should be further explored.

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Abbreviations: APB: abductor pollicis brevis; CI: cognitively impaired; CN: cognitively normal; EMG: electromyography; FLSD: Fischer's least significant difference; I/O: input/output; iTBS: intermittent theta-burst stimulation; LTP: long-term potentiation; MEP: motor-evoked potential; MT: motor threshold; MVC: maximum voluntary contraction; NHST: null hypothesis significance testing; MVC: repetitive TMS; TMS: transcranial magnetic stimulation

Graphical Abstract



Introduction

A conceptual shift has occurred in the field of Alzheimer's disease research to recognize the disease along a wider spectrum, with greater consideration for pre-clinical neuropathological alterations that precede the manifestation of clinical symptoms (Dubois *et al.*, 2016). This pathophysiological onset of disease can precede the clinical syndrome of amnestic dementia by decades (Caselli and Reiman, 2013). In order to develop targeted interventions for disease modification and prevention, there is an urgent need for enhanced characterization of the neurophysiological features at this pre-clinical stage. One potential surrogate marker is altered neural plasticity.

Neural plasticity can be broadly defined as the brain's ability to reorganize in the presence of external or internal stimuli in order to adapt to a lifetime of experiences in our capricious environments. Importantly, the nervous system's ability to reorganize represents a critical neurobiological underpinning of learning and memory (Lynch, 2004). Long-term potentiation (LTP), famously conceptualized by Hebb as *neurons that fire together, wire together*, is a well-studied mechanism of neural plasticity that results in synapse-specific strengthening. Long-term potentiation, however, carries high potential for network destabilization since it is a positive feedback loop that

must be tightly regulated to prevent runaway excitability (Abbott and Nelson, 2000). This can be achieved through the phenomena of homoeostatic metaplasticity, referred to as the *plasticity* of synaptic plasticity, which dynamically refines synaptic scaling in an activity-dependent manner (Abraham and Bear, 1996). In the presence of prolonged neural activity, for example, homoeostatic metaplasticity spawns a compensatory synaptic downscaling to make subsequent LTP less favorable (Jang and Chung, 2016). This homoeostatic synaptic downscaling simultaneously promotes long-term depression, which, as the inverse of LTP, is the process of synapse-specific weakening in an activity-dependent manner. Thus, the stable, yet flexible neural function that enables complex human behavior depends on the dynamic interplay between mechanisms of homoeostatic and Hebbian synaptic plasticity (Turrigiano et al., 1998; Tononi and Cirelli, 2014; Fernandes and Carvalho, 2016). Long-term potentiation deficits in early Alzheimer's disease has long been appreciated (Rowan et al., 2003), but there is accumulating evidence, implicating diminished homoeostatic metaplasticity in the genesis of the pathophysiological cascade (Jang and Chung, 2016; Frere and Slutsky, 2018).

Non-invasive brain stimulation technologies, like transcranial magnetic stimulation (TMS), can be used to characterize changes in neural plasticity in healthy aging and in neurological disease (Freitas et al., 2013). To do so, TMS is applied to the motor cortex in which single-pulse measures of cortical excitability (motor-evoked potentials; MEPs) are interleaved with a repetitive TMS (rTMS) paradigm. The degree of change in the amplitude of MEPs induced by the patterned rTMS is representative of neural reorganization and, thus, is inferred as an index of neural plasticity (Bestmann and Krakauer, 2015; Rossini et al., 2015). Depending on the frequency of patterned stimuli employed, rTMS paradigms can induce either long-term depression or LTP-like neural plasticity (Ziemann et al., 2008). Despite well-documented inter-individual variability, a recent meta-analysis reports that the intermittent theta burst stimulation (iTBS) variant of rTMS robustly increases cortical excitability, which is evidenced by a relative increase in the amplitude of MEPs and thought to reflect LTP-like effects (Huang et al., 2005; Wischnewski and Schutter, 2015). Though it is impossible to directly demonstrate a link between the effects of rTMS and synaptic plasticity in the human brain, several lines of converging evidence in support of this inference have been reviewed elsewhere (Hoogendam et al., 2010).

Though alterations to the primary motor cortex (M1) are generally not representative of cognitive function, TMS-M1 studies afford outsized utility for the characterization of neurophysiological features of cognitive aging relative to other stimulation sites. Notably, TMS-M1 studies among populations with Alzheimer's disease and mild cognitive impairment suggest that M1 is not exempt from pathophysiological changes that underpin cognitive decline in hallmark brain regions of dementia. Recent systemic reviews highlight a rich body of literature in this clinical population that points to both baseline hyperexcitability and impaired motor cortical plasticity in response to rTMS (Freitas et al., 2011; Bunse et al., 2014). A deeper examination of TMS-M1 studies in Alzheimer's disease indicates that deficits in LTP-like plasticity are observed in both newly diagnosed and late-stage patients (Koch et al., 2012; Nardone et al., 2014; Di Lorenzo et al., 2016; Motta et al., 2018). Furthermore, this body of research also suggests that LTP-like deficits are correlated with both the severity of clinical symptoms and the biomarkers like CSF-Tau (Di Lorenzo et al., 2016; Koch et al., 2017). Among patients diagnosed with mild cognitive impairment, findings pertaining to LTP-like plasticity are less consistent (Trebbastoni et al., 2015; Lahr et al., 2016). Thus, even earlier along the spectrum of disease (i.e. pre-clinical), measures of Hebbian-like plasticity may lack the sensitivity to characterize neurophysiological features of pre-clinical Alzheimer's disease.

When adding different synaptic activation pre-conditions to the experimental design, TMS paradigms can actually be used to probe homoeostatic metaplasticity. Briefly, this can be achieved either by *exogenous* or by *endogenous* experimental modulation of synaptic activation history prior to TMS application. The former can be achieved by combining multiple rTMS exposures in short succession to 'prime' (i.e. exogenously modulate the synaptic activation history) with the first bout of rTMS prior to the subsequent 'test' application of rTMS (Müller et al., 2007; Murakami et al., 2012). Such studies report that increasing the preceding activation history by priming the stimulation site with iTBS precludes the otherwise faciliatory effects for subsequent exposure to iTBS, which is indicative of homoeostatic metaplasticity (i.e. activity-dependent synaptic down-scaling following the iTBS priming). Alternatively, the synaptic activation history can also be modulated endogenously by instructing participants to voluntarily contract the muscle that corresponds with the targeted stimulation site, which, in turn, alters the synaptic activation history of the targeted cortical tissue (Vallence and Ridding, 2014; Müller-Dahlhaus and Ziemann, 2015). There are numerous reports in healthy younger adults, demonstrating that voluntary contraction of the targeted hand muscle prior to TBS introduces homoeostatic interference that prevents the induction of Hebbian-like neural plasticity (Gentner et al., 2008; Jezzi et al., 2008; Goldsworthy et al., 2014).

In this study, we sought to investigate this neurophysiological phenomenon of homoeostatic metaplasticity in older adults across the cognitive spectrum within the non-demented range. Specifically, in addition to assessing the LTP-like response to iTBS in the conventional fashion, we introduced an experimental paradigm that artificially elevated the preceding synaptic activation history of the targeted cortical tissue to introduce homoeostatic interference. Furthermore, in the scope of cognitive aging, it was our objective to investigate this phenomenon in association with cognitive status in a population of healthy older adults. With this approach, we could investigate how the iTBS effect is influenced by (i) cognitive status, (ii) the experimental paradigm (i.e. Hebbian versus Homoeostatic TMS paradigm) and (iii) the interactions therein. To the best of our knowledge, this is the first report to characterize the integrity of the dynamic interplay between homoeostatic metaplasticity and Hebbian plasticity in older adults presenting with cognitive impairment.

Materials and methods

Participants

Forty community dwelling, healthy older adults (mean- \pm standard deviation: 69.2 \pm 2.9 years, age range: 65– 74 years, 19 women) enrolled in this study. No participants had a clinical diagnosis for either mild cognitive impairment or Alzheimer's disease. Exclusion criteria also included: (i) diagnosis of any clinical neuropsychiatric condition, (ii) medications and/or recreational drugs potentially affecting the central nervous system and (iii) contraindications to TMS/magnetic resonance imaging (MRI) that would adversely influence the safety profile. All





Figure 1 Experimental design. Participants were stratified by cognitive status and randomly assigned to participate in one of the two experimental paradigms. Thus, there were four experimental cohorts, each with 10 participants. CN: cognitively normal; CI: cognitively impaired; MRI: magnetic resonance imaging; MVC: maximum voluntary contraction; MT: motor threshold; I/O: input/ output; iTBS: intermittent theta burst stimulation

experimental procedures were approved by the University of Arizona Institutional Review Board. Informed written consent was obtained in accordance with the Declaration of Helsinki.

Experimental design

Each participant attended two study visits (Fig. 1). During session 1, participants completed a comprehensive neuropsychological battery. As detailed below, groups were counterbalanced to include 20 classified as cognitively normal (CN) and 20 classified as cognitively impaired (CI).

Session 2 was composed of both MRI and TMS. Transcranial magnetic stimulation was applied to the primary motor cortex. A single-pulse protocol was used to assess the features of cortical excitability both immediately before and after the application of iTBS. During single-pulse protocols, MEPs were measured with surface electromyography (EMG). There were two distinct experimental TMS paradigms and each participant was randomly assigned to one of the two paradigms:

- The 'active' condition, during which participants were instructed to maintain a steady voluntary muscle contraction corresponding with 10–20% maximal force for the entirety of the 8-min sampling window. This paradigm modulated synaptic activation history of the targeted cortical tissue to probe homoeostatic metaplasticity.
- The 'rest' condition during which participants were instructed to keep the muscles corresponding with the targeted stimulation site relaxed prior to the application of iTBS. In the 'rest condition', care was taken to make sure that the targeted muscle was relaxed for >20 min prior to the iTBS application to avoid potential homoeostatic interference. As a control condition, this paradigm probed Hebbian forms of plasticity.

Thus, as shown in Fig. 1, there were four subgroups: 'Rest—Cog Normal, Rest—Cog Impaired, Active—Cog Normal, Active—Cog Impaired'. These subgroups were counterbalanced for age, sex and education (Table 1).

Neuropsychological assessment

Cognitive functions were assessed using the National Alzheimer's Coordinating Center Uniform Data Set Neuropsychological Battery, Version 3 (UDSNB-3; Weintraub *et al.*, 2018). The UDSNB-3 was developed by *The Neuropsychology Work Group of the National Institute of Aging Clinical Task Force*, and it provides a valuable non-proprietary resource for conducting research on cognitive aging and dementia. The battery comprises the Montreal Cognitive Assessment (Nasreddine *et al.*, 2005), Craft Story (Craft *et al.*, 1996), Digit Span (Wechsler, 1987), Semantic and Verbal Fluency (Besser *et al.*, 2018), Trail-making Test Parts A and B (Reitan and Wolfson, 1985), Benson Complex Figure Test (Possin *et al.*, 2013).

The standardized nature of the UDSNB-3 enables unique tools, such as the interactive web-based normative calculator that accounts for demographic characteristics (Shirk et al., 2011). Raw scores for each participant were entered into this web-based normative calculator to generate Z-scores that were adjusted for age, sex and education. Using these normalized scores, participants were classified as cognitively impaired according to the socalled 'comprehensive criteria' (Jak et al., 2009; Bondi et al., 2014). More specifically, individuals were classified as cognitively impaired if they scored >1 SD below adjusted normative data on either (i) two tasks within the same domain or (ii) three tasks across all domains (Bondi et al., 2014). In support of this strategy, a recent empirical analysis determined this comprehensive criteria to be more accurate than conventional approaches that classify individuals with cognitive impairment on the basis of a single impaired score (Jak et al., 2016).

Electromyography

Electromyography data were collected from the abductor pollicis brevis (APB) muscle, which was identified via manual palpation. Three electrodes were placed in a belly-tendon montage, with the grounding electrode placed on the ulnar tuberosity. The participants were seated upright in a comfortable position, with their arms resting on a supportive pillow. The EMG signal was amplified using a gain of 5000 with a bandpass filter between 30 and 1000 Hz, and a line filter (notch, 60 Hz). Electromyography signal was acquired through analog-todigital converter (CED 1401) and Spike2 software (version 7.20). The EMG signal was subsequently post-processed using MATLAB to measure MEP response, which was defined as the difference between the maximum and the minimum amplitudes in the window from 20 to 50 ms after each TMS trigger.

Table | Participant characteristics

	Rest CN; <i>n</i> = 10	Active CN; $n = 10$	Rest CI; $n = 10$	Active CI; $n = 10$	Group comparisons
Age (years)	69.3 ± 2.6	67.9 ±2.9	$\textbf{68.8} \pm \textbf{2.6}$	$\textbf{70.8} \pm \textbf{2.1}$	P > 0.1
Sex	7m, 3f	5m, 5f	5m, 5f	4m, 6f	P > 0.1
Education	17.2 ± 1.9	16.6±1.9	16.4 ± 2.3	16.8 ± 2.5	P > 0.1
Resting MT (%MSO)	$\textbf{50.7} \pm \textbf{6.5}$	$\textbf{52.9} \pm \textbf{10.2}$	51.6 ± 6.7	50.7 ± 6.5	P > 0.1
Active MT (%MSO)	$\textbf{43.8} \pm \textbf{4.6}$	45.8 ± 7.7	$\textbf{46.4} \pm \textbf{5.9}$	$\textbf{47.8} \pm \textbf{10.2}$	P > 0.1
Montreal Cognitive Assessment (MoCA)	28.2 ± 1.3ª	28.1 ± 2.6 ^b	26.4 ± 1.5ª	24.9 ± 2.1 ^{<i>b</i>}	P<0.005
Average UDSNB-3 Normalized Score	0.22 ± 0.3^{a}	$0.31\pm0.5^{\textit{b}}$	$-0.32\pm0.4^{\textit{a}}$	$-$ 0.64 \pm 0.4 ^b	P<0.001

This table presents participant characteristics across the four experimental cohorts. To assess differences across the four groups, a one-way ANOVA was performed across the four cohorts. There was no significant difference among demographic characteristics, but as expected, there is a significant difference in the measures of cognition. MoCA is a general measure of cognition often used to screen cognitive deficits. The other measure included is a composite score of the UDSNB-3, which is an average of all adjusted Z-scores in the tasks comprising this battery.

^{a,b}Pairwise comparisons were performed with FLSD at P < 0.05.

Abbreviations: CN: Cognitively normal, CI: cognitively impaired, MSO: maximum stimulator output; UDSNB-3: Uniform Data Set Neuropsychological Battery, version 3.0.

Prior to the TMS protocols, the participants' maximum voluntary contraction (MVC) was measured by instructing participants to pinch their thumb and pinky, and to exert maximal force for ~ 5 s.

Transcranial magnetic stimulation

First, the participant's structural T1 brain scan was uploaded into a 3D Neuronavigation platform and carefully co-registered to landmarks on the participant's head using an infrared-based frameless stereotactic system (Polaris System, Localite Version 3.0.41). To identify the stimulation target corresponding with the APB muscle, the motor 'hand knob' area was visually identified on the left pre-central gyrus for each participant's anatomical MRI (Yousry et al., 1997). The stimulation target was subsequently refined based on observed MEPs from the APB. The optimal motor hotspot was recorded within the neuronavigation system, which enabled precise coil positioning throughout the duration of the TMS session. The coil handle was oriented roughly perpendicular to the central sulcus to ensure optimal activation of the corticomotor neural cells (Rossini et al., 2015).

Transcranial magnetic stimulation was delivered with MagPro ×100 (MagVenture Ltd.) equipment. All TMS procedures were completed by the same practitioner to avoid inter-investigator variability (Cueva et al., 2016) and the stimulation parameters conformed to the current guidelines from the International Federation of Clinical Neurophysiology (IFCN) to ensure both the safe application of TMS and the reliable acquisition of single-pulse measures of cortical excitability (Rossi et al., 2009; Rossini et al., 2015). Single-pulse TMS was applied with the 'CB60' figure-of-eight coil and iTBS was applied with the 'Cool-B65 A/P' coil. For both the procedures, biphasic pulses were delivered with the current flowing in AP-PA (Anterior–Posterior and Posterior-Anterior) directions.

Both resting and active motor thresholds (MT) were estimated with an adaptive method using a freeware program (TMS Motor Threshold Assessment Tool 2.0; http://www.clinicalresearcher.org/software.htm) that employs maximum-likelihood parameter estimation by sequential testing strategy without the need for *a priori* information. During the active MT acquisition, participants were instructed to maintain a steady muscle contraction in the targeted APB muscle at $\sim 10-20\%$ of their previously determined MVC. Real-time visual feedback of the root mean square EMG signal was provided for participants to maintain steady muscle contraction. In addition to having physiological relevance (i.e. indicative of neuronal excitability), MTs are used to calibrate the intensity of subsequent TMS protocols.

Intermittent theta burst stimulation

Using the 3D NeuroNavigation platform, the coil was precisely positioned over the previously recorded motor hotspot. The iTBS protocol comprised 600 pulses at 80% of the active MT. The stimuli were patterned in three-pulse bursts at 50 Hz, which repeated at a frequency of 5 Hz, and were delivered in intermittent trains, each lasting 2 s with a 6.9-s inter-train interval for a total duration of 178 s.

Single-pulse TMS protocol

To assess cortical excitability before and after iTBS, we obtained an input-output (I/O) curve to assess the characteristics of MEP as a function of variable TMS intensities. The I/O curve is composed of a flat region at sub-threshold intensities where no MEP is elicited, a steep rise as MEP amplitudes linearly increase with increasing stimulator intensity, and a maximal plateau where MEP amplitude is saturated (Fig. 2) (Goetz *et al.*, 2014). The sigmoidal relationship between the TMS intensity and the MEP amplitude was fit with the Boltzmann equation to evaluate specific parameters of the fitted curve (e.g. slope). The I/O curve was chosen rather than sampling at just a single TMS intensity because it provides a more comprehensive assessment of cortical-spinal excitability (Houdaver *et al.*, 2008; Burke and Pierrot-Deseilligny,





Figure 2 Input–output curve. (**A**) A repetitive I/O curve during the rest paradigm. We examined the neuroplastic response at four distinct components of the curve: (I) 110% MT, (II) 140% MT, (III) 165% MT and (IV) the calculate slope of the fitted curve. (**B**) An example of MEP waveform. In this example, the TMS intensity was 145% MT and the peak-to-peak amplitude was determined to be \sim 2100 uV. For each curve, 64 such MEPs were plotted with amplitude as a function of TMS intensity. The sigmoidal curve is fit with the Boltzmann equation

2010; Goetz *et al.*, 2014). Although it presents many advantages, relatively few studies have utilized I/O curves to measure changes in cortical excitability induced by rTMS (Houdayer *et al.*, 2008; Burke and Pierrot-Deseilligny, 2010; Goetz *et al.*, 2014; Vallence *et al.*, 2015).

As shown in Fig. 1, the duration of the I/O curve protocol was $\sim 8 \text{ min}$. Upon the completion of the baseline I/O curve, there was a \sim 5-min interval before the onset of the iTBS protocol to switch coils and prepare equipment. Following the iTBS protocol, there was another \sim 5-min interval prior to the sampling of the postiTBS I/O curve. Each I/O curve comprised 16 TMS intensity levels (80%, 90-155% with 5% increments, and 165% MT). Data from four MEP trials were acquired at each TMS intensity level, yielding a total of 64 MEPs. The TMS intensity is expressed as a percentage relative to the previously determined MT. The order of the TMS pulses was pseudo-randomized to minimize the potential hysteresis effect and to account for potential fatigue in the active condition (Möller et al., 2009). The interstimulus interval was pseudo-randomly jittered (6000-9000 ms) to avoid train effects.

During the active I/O acquisition, real-time visual feedback was provided for participants to maintain steady muscle contraction at 10–20% MVC in the APB muscle. The IFCN guidance for TMS delivered during the active condition calls for 'slight tonic contraction of the target muscle at approximately 20% of MVC' (Rossini *et al.*, 2015). We further consulted previous literature to stay in line with this ~20% of MVC guidance, while also trying to strike a balance between sufficient modulation of cortical activation history and limiting potential fatigue during the prolonged I/O acquisition. To address the former, Goldsworthy and colleagues (2014) reported that 10% of MVC was sufficient to pre-condition TBS response. To address the latter, we consulted studies with active I/O conditions that employed contractions in the 10–20% MVC range (Talelli et al., 2008; Van Den Bos et al., 2017).

MEP analysis

Motor-evoked potentials were quantitatively assessed by measuring peak-to-peak amplitudes of the MEP waveform acquired with EMG. The mean MEP amplitude at each of the 16 intensity levels was calculated for each curve and these mean MEP values were used in the subsequent group analysis. To scrub out non-physiological variance in line noise for sub-threshold intensities with no response detected in the REST condition, an artificial floor of 35 uV was selected (i.e. all values < 35 uV were replaced with 35 uV).

Consistent with the literature, the neuroplastic response was assessed as the relative change in MEP amplitude induced by iTBS (i.e. degree of neural reorganization). This effect was captured by normalizing each participant's post-iTBS MEP values to their respective baseline values for each sampled TMS intensity level. These normalized values reflect the raw difference in MEP amplitude (MEP_{DELTA} = MEP_{Post-iTBS} – MEP_{Pre-iTBS}). Thus, any positive grand means are indicative of an increase in cortical excitability, which is a proxy for LTP-like neural plasticity. This normalization procedure was selected because it resulted in values resembling a normal distribution, as opposed to an indexing approach $\left(\frac{\text{MEP}_{\text{Post-iTBS}}}{\text{MEP}_{\text{Pre-iTBS}}}\right)$ which did not. Furthermore, this normalization procedure is more robust than % change MEP in cases of potential ceiling effect for recordings with higher baseline levels of cortical excitability.

Similar to previous research, we sought to leverage the full utility of the I/O curve by quantifying iTBS-induced neuroplasticity along different components of the curve (Vallence et al., 2015). This is advantageous because different physiological mechanisms are principally involved at different stimulus intensities. This insight comes from the data collected from human participants with electrodes implanted in their cervical spinal cords, from which epidural recordings of descending volleys of activity in the cortical spinal tract can be obtained. Briefly, there are *D*-waves, which reflect direct activation of pyramidal cell axons that descend from the cortex, and I-waves, which reflect indirect activation of these pyramidal neurons via trans-synaptic transmission from directly activated cortical interneurons (Di Lazzaro et al., 2012; Legatt et al., 2016). Motor-evoked potentials represent the aggregate sum of these descending cortical volleys (Bestmann and Krakauer, 2015). Accordingly, we analyzed the neuroplastic response to iTBS across each of the following four components of the I/O curve (Fig. 2):

110% MT: A recent empirical study investigating differential effects iTBS across the I/O curve components reported that iTBS effects are most pronounced at 110% of MT (Fig. 2, I) (Goldsworthy *et al.*, 2016).

- 140% MT: This component was selected because, according to guidance from the IFCN, there is predominant contribution of late I-waves in the generation of MEPs at this TMS intensity level (Fig. 2, II) (Groppa *et al.*, 2012). Notably, iTBS aftereffects principally involve these late I-waves.
- **165% MT:** This value is the highest stimulus intensity included in our experimental design, and it represents the maximal plateau of the I/O curve (Fig. 2, III). At maximal intensities, there is typically less I-wave involvement as the pyramidal cell axons are directly stimulated resulting in the 'D-wave' (Di Lazzaro *et al.*, 2004).
- **I/O Slope:** This value reflects the rise of the fitted I/O curve (Fig. 2, IV), which was modelled using the Boltzmann's equation. The slope parameter is believed to reflect the corticospinal pathway's recruitment gain and/or trans-synaptic synchronization of cortical interneurons (Devanne *et al.*, 1997; Ridding and Rothwell, 1997). If larger pools of neurons are excited in a less synchronous manner, phase cancellation could prevent the expected rise in the I/O curve and result in a reduced slope of the fitted curve (Pitcher *et al.*, 2003).

Statistical analysis

There has been an increasingly salient debate surrounding reproducibility spanning virtually all domains of biomedical sciences, including neuropsychological research (Ioannidis, 2005; Amrhein *et al.*, 2017; Szucs and Ioannidis, 2017; Fanelli, 2018). One of the issues at the centre of this debate is the heavy reliance on null hypothesis significant testing (NHST), i.e., *P*-values (Wasserstein and Lazar, 2016). Consequently, many have argued that Bayesian analysis should be integrated into ongoing research (Dienes and Mclatchie, 2018; Shrout and Rodgers, 2018), which has several key benefits worth highlighting:

- (1) Bayesian parameter estimation provides richer information when examining group differences (Kruschke, 2013).
- (2) Bayesian approaches may be particularly useful in the studies that might be underpowered with small sample sizes (McNeish, 2016; Melinscak and Montesano, 2016).
- (3) The customizable models offer more flexibility without many of the assumptions and constraints of NHST (Kruschke, 2010).
- (4) The posterior distribution of parameter estimates does not change when additional comparisons are made and hence *there is no need to correct for multiple comparisons* (Kruschke, 2010).
 Herein, we report the results from NHST and Bayesian

analyses in parallel to assess neuroplastic responses in each of the I/O curve components described above.

Null hypothesis significant testing

Baseline cortical excitability profiles were assessed for differences according to cognitive status. Resting and active MTs were examined independently, using separate oneway ANOVAs with GROUP (*Cog Normal*, *Cog Impaired*) as a between-group factor for each measure.

To analyse the iTBS response, traditional NHST analyses of raw (non-normalized) log-transformed MEP values comprised two separate three-way mixed ANOVAs for each of the two experimental paradigms (Active & Rest). Each three-way ANOVA included GROUP (*Cog Normal, Cog Impaired*) as a between-group factor, and INTENSITY (16 levels) and TIME (Pre-iTBS, Post-iTBS) as within-group factors. Since this analysis was performed on raw data not normalized to baseline values, we did not include PARADIGM as a between-group factor because raw MEPs are inherently different depending on the state of muscle contraction.

To further examine interactions across cognitive status and experimental paradigm, two-way ANOVAs with GROUP (Cog Normal, Cog Impaired) and PARADIGM (Active, Rest) as between-group factors for MEP_{DELTA} at each of the four I/O curve components identified a priori. This analysis provided an examination of GROUP × PARADIGM interaction in the response to iTBS. Where appropriate, Greenhouse-Geisser corrections were applied to correct for non-sphericity of the data (uncorrected Degrees of Freedom are presented). Where appropriate, in the *post-hoc* analysis of these ANOVAs, we employed Fischer's least significant difference (FLSD) value to identify significant differences across pairwise comparisons at each intensity. The FLSD was previously shown to provide the optimal balance of reducing both Type I and Type II errors to promote correct decisions (Carmer and Swanson, 1973). Risk of false discovery was further mitigated with our Bayesian analysis.

Bayesian analysis

In addition to the standard ANOVA analyses, we fitted a Bayesian generalized linear model using the brms package (Bürkner, 2017). In all Bayesian analyses, non-committal priors were used, which implies that the prior has minimal influence on the parameter estimates, and even a modest amount of data will overwhelm prior assumptions (Kruschke, 2013). To reduce the influence of outliers, the Bayesian models assumed Student's T-distributions with heavier tails to account for large variance present in the normalized MEP data (Wang and Blei, 2018). The model was fit using an adaptive Hamiltonian Monte-Carlo Markov-Chain algorithm implemented in Stan (Carpenter et al., 2017). We ran four Markov chains simultaneously; each for 5000 iterations with the first 2500 of iterations discarded as warm-up samples to adaptively tune the Monte-Carlo Markov-Chain sampler. Convergence of chains was inspected visually and quantitatively (R statistic was confirmed to be ~ 1.00 for all parameters).

In short, the Monte–Carlo Markov–Chain estimates regression coefficients through exploration of the parameter space to produce a posterior distribution of plausible parameter estimates. This posterior distribution indicates the

relative probability of every possible parameter value for each coefficient, given the observed data. Importantly, such Bayesian analysis does not rely on P-values (Kruschke, 2010). Instead, the computed posterior distributions are reported using credibility intervals, which capture 89% of the posterior distribution's probability mass. If the 89% density intervals for parameter estimates for two groups do not overlap, we can infer that there is a credible difference between the groups. As reported elsewhere, 89% is deemed to be a stable interval for this analysis, though it remains somewhat arbitrary (Makowski et al., 2019). To further aid interpretation, we also report the probability of direction, which is the proportion of the probability mass for each coefficient estimate that is above/below zero (reported as a range of 0.5-1.0). The higher this proportion is, the more likely that the particular parameter represents a true increase or decrease depending on the specified direction of probability. A proportion of 0.5 indicates that the parameter is equally likely to represent an increase or a decrease (Craddock et al., 2019; Makowski et al., 2019).

All statistical analysis was performed in R, version 3.6.0 (R Core Team, 2019). Unless otherwise stated, all data are shown as mean \pm standard error of the mean. The criterion for NHST statistical significance was P < 0.05.

Data availability

Data supporting the findings of this study is available from the corresponding authors, upon reasonable request.

Results

Cognitive status is not associated with baseline cortical excitability profiles

Using separate one-way ANOVAs, we compared baseline cortical excitability profiles according to cognitive status. No differences in MTs were observed between cognitively normal and cognitively impaired participants for either active ($F_{(1,36)} = 1.0$, P = 0.32) or resting ($F_{(1,36)} = 0.1$, P = 0.83) paradigm. The intensity of iTBS was determined by the MT of individual participants and, accordingly, there was no difference in iTBS intensity across the four experimental cohorts ($F_{(3,36)} = 2.0$, P = 0.13). The mean intensity used for iTBS was $37 \pm 5\%$ MSO.

In addition to MTs, we also assessed the amplitude of baseline MEPs for group differences. A two-way ANOVA with GROUP and PARADIGM as factors revealed a significant main effect of PARADIGM on baseline MEP amplitude ($F_{(1,36)} = 14.99$, P = 0.00044). Given the background voluntary contraction, the active paradigm participants had significantly elevated baseline amplitude relative to those in in the rest paradigm. For cognitive

groups, there was a slight increase in baseline MEP for cognitively normal participants, but this was not statistically significant ($F_{(1,36)} = 3.61$, P = 0.066) (Fig. 3). Finally, there was no evidence of a GROUP×PARADIGM interaction for baseline MEP amplitudes ($F_{(1,36)} = 0.25$, P > 0.62).

Significant group differences for iTBS response present only in the active paradigm

In the active paradigm, the three-way ANOVA revealed a significant main effect of intensity $(F_{(15, 270)} = 119,$ P < 0.001), and а significant INTENSITY × TIME × GROUP interaction effect ($F_{(15,270)}$) = 3.1, P = 0.00014). There was a borderline group effect for cognitive status $(F_{(1,18)} = 3.8, P = 0.067)$, but no main effect of time $(F_{(1,18)} = 1.9, P = 0.18)$. Post-hoc analysis of the interaction effect revealed that there was an increase in MEP facilitation following iTBS only in cognitively impaired group. This interaction was facilitated by differential responses to iTBS according to cognitive status, which varied across levels of TMS intensity (Fig. 3A and B).

Conversely, in the rest paradigm, the analysis revealed only a significant main effect of intensity ($F_{(15,270)} = 109$, P < 0.001), but no significant main effects of time ($F_{(1,18)} = 0.87$, P = 0.36) and group ($F_{(1,18)} = 0.75$, P = 0.39), nor any significant interaction effects (Fig. 3C and D).

Multiple IO curve components suggest diminished metaplasticity in cognitively impaired cohort

MT, At 110% the two-way ANOVA (GROUP × PARADIGM) performed on normalized MEP values revealed no significant main effect of group $(F_{(1,36)})$ = 0.33, P = 0.57), paradigm ($F_{(1,36)} = 0.96, P = 0.33$), nor a GROUP × PARADIGM interaction ($F_{(1,36)} = 0.21$, P = 0.65) (Fig. 4A). The Bayesian GLMM findings support this NHST analysis, but also provide richer information about the iTBS responses (Table 2). The 89% credibility intervals for the mean parameter estimate of all four groups overlap, implying there was no credible probability of group differences. Additionally, however, this model further suggested that there was a small, yet robust, increase in MEP only in the Active: Cog Impaired cohort as this was the only parameter where the vast majority of posterior samples for the coefficient fell above zero ($P(\beta > 0) = 0.98$).

At 140% MT, the two-way ANOVA revealed a significant GROUP × PARADIGM interaction ($F_{(1,36)} = 8.2$, P = 0.007), but no main effect of group ($F_{(1,36)} = 0.04$, P = 0.85) or paradigm ($F_{(1,36)} = 1.76$, P = 0.19). Underlying this interaction, FLSD *post-hoc* analysis revealed that the MEP response for cognitively normal

9



Figure 3 Raw MEPs Pre- and Post-iTBS. The averaged pre- and post-iTBS I/O curves are plotted for each cohort. The mean MEPs for each intensity are plotted at both time points, and the sigmoidal I/O curve is fit with the Boltzmann equation. Blue denotes baseline cortical excitability profiles pre-iTBS and red denotes post-iTBS cortical excitability profiles. The difference between the two reflects response to iTBS, in which an LTP-like effect is observed when post-iTBS MEP amplitudes (red) are greater than baseline MEP values (blue)

individuals in the active paradigm was significantly blunted when compared to (i) cognitively normal peers in rest paradigm (P = 0.0054) and (ii) cognitively impaired peers in the same paradigm (P = 0.038) (Fig. 4B). This evidence suggests that homoeostatic metaplasticity is intact among cognitively normal participants, but notably absent in the cognitively impaired cohort. The Bayesian GLMM supported this finding. The most notable finding from this supplementary analysis at 140% MT was the striking difference in parameter estimates for the iTBS response in the active paradigm between the cognitively normal and the cognitively impaired individuals (Table 2 and Fig. 5). In this paradigm designed to introduce homoeostatic interference, the median coefficient estimate for the effect of iTBS was negative in cognitively normal individuals ($\beta = -133$; indicative of a decrease in MEP) with >90% of posterior samples being negative $(P(\beta < 0) = 0.92; indicative of 92\% probability that MEP$ *will decrease*), but positive in the cognitively impaired individuals ($\beta = 127$) with >90% of posterior samples falling above 0 ($P(\beta > 0)=0.93$; *indicative that an increase in MEP is 93% probable*). Alternatively, in the rest paradigm, there was only a probable direction of effect in the cognitively normal individuals (increased MEP; $P(\beta > 0)=0.98$), but not in cognitively impaired individuals ($P(\beta > 0)=0.54$). Examination of credibility intervals indicates the presence of homoeostatic interference only in the cognitively normal individuals (Table 2).

At 165% MT, the maximal intensity tested, there was a significant interaction effect of GROUP x PARADIGM $(F_{(1,36)} = 4.9, P = 0.034)$, but no main effect of group $(F_{(1,36)} = 1.124, P = 0.30)$ or paradigm $(F_{(1,36)} = 3.28, P = 0.08)$. Post-hoc analysis with FLSD indicated (i) significant difference between the rest and the active experimental paradigms in the cognitively impaired cohort (P = 0.007), and (ii) significant group difference in iTBS





Figure 4 Interaction plots on normalized MEP data. The interaction effect of cognitive status and experimental paradigm on normalized MEP values are shown. Values > 0 represent an excitatory (LTP-like) iTBS effect and, and values < 0 reflect an inhibitory (long-term depression-like) response. This plot illustrates the divergent responses to iTBS by cognition and paradigm. There is a greater response to iTBS in the active paradigm in the cognitively impaired participants, but the opposite is true among cognitively normal participants. This is most evident 140% MT (B) where there is predominant late I-wave contribution, which is known to underly iTBS effects. The P-values depicted in subtitles indicate interaction effect result from two-way ANOVA (GROUP × PARADIGM). As indicated by FLSD, * denotes pairwise significant differences in group responses (within paradigm) and # denotes pairwise significant differences between conditions (within group)

responses between cognitively normal and cognitively impaired individuals only in the active paradigm (P = 0.03) (Fig. 4C). The Bayesian GLMM mirrored these findings with distinct credibility intervals for the parameter estimates across the same two pairwise comparisons reported above in the NHST analysis (Table 2). The Bayesian analysis further suggested that this effect was driven by a large excitatory response to iTBS among cognitively impaired individuals in the active paradigm with 100% of the posterior samples of this cohort's parameter estimate falling above 0 ($P(\beta > 0) = 1.00$).

When examining the slope of the fitted I/O curve, a two-way ANOVA revealed a significant main effect for group ($F_{(1,36)} = 4.81$, P = 0.03) and a significant interaction effect of GROUP × PARADIGM ($F_{(1,36)} = 4.27$, P = 0.046), but no main effect of paradigm ($F_{(1,36)} = 0.19$, P = 0.67). When examining change in slope, *post-hoc* analysis revealed significant group difference between cognitively normal and cognitively impaired individuals in

the active paradigm (P = 0.03), with the slope increasing only in the cognitively impaired cohort (Fig. 4D). The Bayesian GLMM provided additional support for this finding, with distinct credibility intervals for the coefficients estimates for iTBS response in the active paradigm across cognitive status. Additionally, the credibility intervals were distinct among cognitively normal individuals across the active and rest paradigms. This effect appeared to be primarily driven by a decrease in I/O curve slope among cognitively normal participants with >99% of values in this posterior distribution falling below 0 ($P(\beta < 0) = 0.99$).

Discussion

Homoeostatic metaplasticity is associated with cognitive status

This study is the first to demonstrate that compromised homoeostatic metaplasticity may be a discernable feature of cognitive decline in older adults. Recall that homoeostatic metaplasticity dynamically refines synaptic scaling in an activity-dependent manner. In other words, when the immediate activation history of the synapse is high, this phenomenon is a protective physiological feature that triggers synaptic down-scaling to prevent runaway excitability (Abraham and Bear, 1996). Previous studies have probed this neurophysiological phenomenon in healthy young adults with TMS. Specifically, they report that experimentally modulating the synaptic activation history with targeted voluntary muscle activity prior to the rTMS application introduces homoeostatic interference that blunts the induction of LTP/long-term depression-like neural plasticity (Gentner et al., 2008; Iezzi et al., 2008; Goldsworthy et al., 2014).

Our findings from cognitively normal older adults (mean age, 67.9 ± 2.9 years) are consistent with the literature. This homoeostatic interference can be readily observed among cognitively normal individuals in the active paradigm (Figs. 3A, 4 and 5A). This indicates that, among cognitively normal older adults, artificially increasing the synaptic activation history triggers what can be conceptualized as a 'homoeostatic harness', which blunts the typical LTP-like response to iTBS.

Most notably, however, despite identical experimental procedures, this homoeostatic harness appears to be relatively absent among older adults presenting with cognitive impairment. Our Bayesian analysis indicates that, at all I/O curve levels assessed, there is >90% probability of an excitatory response to iTBS in this cohort of cognitively impaired individuals. This novel finding is visually evident as well (Figs. 3B, 4 and 5B), with consistent MEP facilitation across different components on the I/O curve in this experimental cohort, which, at times, exceeds the LTP-like response observed in other experimental cohorts

Table 2 Bayesian analysis of neuroplastic response

		Median parameter estimate	89% Credible interval	Probability of direction
1. 110%				
	Active: Cog normal	70	[-26, 164]	$(\beta > 0 = 0.88)$
	Active: Cog impaired	90	[22, 161]	Increase ($\beta > 0 = 0.98$)
	Rest: Cog normal	45	[-25, 128]	$(\beta > 0 = 0.84)$
	Rest: Cog impaired	12	[-43, 88]	(β>0=0.64)
II. 140%				
	Active: Cog normal	-133	[-286, 21.8] ^a	Decrease ($\beta < 0 = 0.92$)
	Active: Cog impaired	127	[-8.11, 273]	Increase ($\beta > 0 = 0.93$)
	Rest: Cog normal	199	[45.6, 347] ^a	Increase ($\beta > 0 = 0.98$)
	Rest: Cog impaired	-7.4	[-147, 123]	(β < 0 = 0.54)
III. 165%				
	Active: Cog normal	65	[-89.6, 212] ^b	$(\beta > 0 = 0.75)$
	Active: Cog impaired	361	[223, 504] ^b	Increase ($\beta > 0 = 1.00$)
	Rest: Cog normal	101	[-34, 242]	$(\beta > 0 = 0.88)$
	Rest: Cog impaired	15.5	[-134, 146]	$(\beta > 0 = 0.57)$
IV. Slope				
	Active: Cog normal	-30	[-50, -10] ^{c,d}	Decrease ($\beta < 0 = 0.99$)
	Active: Cog impaired	4	[—7, 15] ^c	$(\beta > 0 = 0.71)$
	Rest: Cog normal	4	[-5, 15] ^d	$(\beta > 0 = 0.77)$
	Rest: Cog impaired	-5	[-15, 6]	$(\beta < 0 = 0.77)$

This table presents findings from separate Bayesian GLMs performed at different components of the I/O curve. We report the (i) median parameter estimate from each respective posterior distribution, (ii) the 89% density intervals of the posterior distributions and (iii) probability of parameter direction. If the 89% credibility intervals do not overlap, we can infer there is a credible group difference, as denoted with ^{a, b, c, d}. The probability of direction represents the probability mass of the posterior distribution that falls above or below zero, representing an increase or decrease, respectively, in MEP values. Values of 0.5 indicate 50% chance of increase or decrease, whereas value of 1.0 indicates 100% probability of a specified direction. The direction corresponds with the sign on the median parameter estimate.

in the control paradigm (Rest) without synaptic preconditioning.

When examining the interplay between homoeostatic and Hebbian mechanisms of neural plasticity across components of the I/O curve, the discriminant features associated with cognitive impairment appear to be most pronounced when the MEP response is probed at intensities with predominant late I-wave activity. Particularly, the interaction is nicely portrayed when examining MEPs elicited at 140% MT (Figs. 4B and 5), which the IFCN guidelines indicate that it is associated with maximal Iwave involvement (Groppa et al., 2012). This is notable, given prior evidence from epidural recordings that the neuroplastic response to iTBS is primarily mediated by the trans-synaptic activity of these late *I-waves* (Huang et al., 2011). Another advantage of utilizing the I/O curve rather than sampling at a single fixed intensity is that we can evaluate the overall shape of the motor response across variable intensities by examining the slope of the fitted curve. The typically steep gain in motor response depends on both the integrity of neuronal fibers in the descending corticospinal tract and the synchronous transsynaptic activity that generates late *I-waves* (Devanne et al., 1997; Potter-Baker et al., 2016). Given the I-wave involvement in the neural plastic response to rTMS, the slope of the I/O curve is a reasonable outcome measure when assessing iTBS-induced plasticity (Devanne et al., 1997; Gangitano et al., 2002; Goldsworthy et al., 2016). In this study, the slope of the I/O curve appears to be a discernible indicator for homoeostatic metaplasticity.

Specifically, in cognitively normal older adults, the homoeostatic 'harness' appears to reverse the polarity of the iTBS effect by decreasing the I/O curve slope, but there is still an observed increase in I/O curve slope in the cognitively impaired participants in the active paradigm.

This finding of discriminant homoeostatic metaplasticity is further evidenced by examining the interactions between cognitive status and experimental paradigm. Given our experimental design, in addition to observing group differences in iTBS response between cognitively normal and cognitively impaired individuals following the muscle contraction in the active paradigm, we are able to add an additional layer of evidence by comparing the responses across experimental paradigms within a given cognitive status (Fig. 4). The findings presented above are robust because they are consistent across both NHST and Bayesian analyses.

No evidence of discriminant LTP-like plasticity or altered cortical excitability

As observed from data collected in our rest paradigm, which is our control condition where there is no attempt to introduce homoeostatic interference, we report no strong evidence that LTP-like responses are associated with cognitive status in this study among non-demented older adults. The Bayesian analysis suggests a stronger probability of facilitation in cognitively normal adults at each of the four I/O curve components that we examined,



Figure 5 Posterior distribution for possible parameter values at 140% of MT. Derived from the Bayesian analysis of normalized MEP values at 140% MT, this figure shows the probability distribution of possible parameter values for each experimental cohort. The probability of direction value represents the probability mass of the posterior distribution that falls above or below zero, representing a predicted increase or decrease, respectively, in MEP values. Values of 0.5 indicate 50% chance of increase or decrease, whereas value of 1.0 indicates 100% probability of a specified direction. This figure shows that iTBS results in: (A) 92% probability that MEP will decrease in cognitively normal individuals when preceding synaptic activation history is high (apparent homoeostatic interference), (B) 93% probability that MEP will increase cognitively impaired individuals when preceding synaptic activation history is high (diminished homoeostatic metaplasticity), (C) 98% MEP will increase in cognitively normal individuals when preceding synaptic activation history is unaltered (strong LTP-like response), (D) \sim 50% probability that MEP will either increase or decrease (weaker LTP-like response) in cognitively impaired individuals when preceding synaptic activation history is unaltered

but there was no credible difference in these LTP-like responses. Though absent in this study population, this feature is consistently reported in the literature among participants with Alzheimer's disease (Koch *et al.*, 2012; Nardone *et al.*, 2014; Di Lorenzo *et al.*, 2016; Motta *et al.*, 2018).

Additionally, we report no evidence of hyperexcitability (Table 1) in participants with cognitive impairment. Hyperexcitability, as evidenced by a decrease in MT, is

typically a robust finding in the TMS literature among participants diagnosed with Alzheimer's disease (Freitas *et al.*, 2011). From pharmacological trials, this is shown to be a reliable indicator of membrane excitability that is mediated by voltage-gated Na⁺ channels (Paulus *et al.*, 2008). Together, this suggests that dysfunctional homoeostatic metaplasticity may precede LTP-like deficits and hyperexcitability in the context of cognitive aging and dementia.

Homoeostatic metaplasticity and Alzheimer's disease pathophysiology

Numerous animal models directly implicate aberrant homoeostatic metaplasticity in the earliest phases Alzheimer's disease (Megill *et al.*, 2015; Gilbert *et al.*, 2016; Li *et al.*, 2017; Trillaud-Doppia and Boehm, 2018). Complex behavior requires a delicate balance between plasticity and network stability. Thus, it is likely that dysfunctional homoeostatic metaplasticity may directly contribute to cognitive dysfunction in early Alzheimer's disease (Abraham and Robins, 2005; Styr and Slutsky, 2018). Though the behavioral implications are worthy of future discussion, we will focus this discussion on the pathophysiological links between aberrant homoeostatic metaplasticity and other pathological hallmarks of Alzheimer's disease.

Failed homoeostatic control of synaptic strength could lead to a pathological level of excitability and even to the induction of epileptic seizures (Abraham, 2008). This is notable, given the numerous lines of converging evidence indicative of neuronal hyperexcitability in Alzheimer's disease (Frere and Slutsky, 2018; Styr and Slutsky, 2018). In extreme cases, this may manifest with a higher risk of seizure in Alzheimer's disease, some of which may be clinically silent (Amatniek et al., 2006; Lam et al., 2017). In other cases, this neuronal hyperexcitability may more insidiously contribute to the pathophysiological cascade of disease (Hynd et al., 2004). Importantly, this neuronal hyperexcitability is also thought to be present in the early stages of Alzheimer's disease (Stargardt et al., 2015). Is it possible that deficits in homoeostatic metaplasticity precede, and perhaps even contribute to, this more welldocumented pathological feature of Alzheimer's disease? Some authors have previously suggested that this might be the case (Jang and Chung, 2016).

In this study, we offer evidence, suggesting this to be the case, but future research is required to follow-up on these exploratory results.

Limitations

There remains considerable inter-individual variability that we are not able to fully account for. Given our relatively small sample size, it is possible that there were more participants genetically pre-disposed to be non-responders to iTBS in our cohort. Future studies can more adequately account for this by collecting genetic data to assess critical genotypes (e.g. BDNF) (Cheeran *et al.*, 2008). Similarly, to further reduce the influence of interindividual variability, future work may be improved by collecting data for each of the two experimental paradigms from the same cohort of individuals in a crossover design with an adequate wash-out period.

There are several other methodological features of this study that are worthy of further consideration. First, as it is conventional, our I/O curves were sampled at fixed intensity levels (80-165%). For some participants, 165% does not appear to reflect full saturation of MEP values to form an upper plateau and, thus, may not represent a true maximum. We are currently developing an adaptive protocol that dynamically changes intensity levels to ensure that the entire gain of the motor system is captured. Second, as an intrinsic feature of our study design, the MEPs themselves were sampled under different conditions (Active versus Rest). A background tonic voluntary contraction during MEP sampling is known to increase Iwave involvement (Devanne et al., 1997; Di Lazzaro et al., 2004). Future studies may want to consider sampling MEPs in a consistent fashion (e.g. only during rest), and then separately introduce voluntary background contraction to modulate synaptic activation history. Finally, this study endogenously modulated synaptic activation history prior to stimulation with targeted voluntary muscle contractions. Although this is a well-recognized approach to modulate homoeostatic metaplasticity (Vallence and Ridding, 2014; Müller-Dahlhaus and Ziemann, 2015), implementing methodology to exogenously prime the stimulation site may be more reliable to ensure more consistent synaptic pre-conditioning across all participants.

Conclusion

As a novel finding, we report the detection of dysfunctional homoeostatic metaplasticity in non-demented older adults presenting with cognitive impairment. Notably, this was observed in the absence of other neurophysiological features like impaired LTP-like plasticity and hyper-excitability, which are both consistently reported in the Alzheimer's disease TMS literature. Given that dysfunctional homoeostatic metaplasticity is an emerging feagenesis of Alzheimer's disease's ture in the pathophysiological cascade, this represents a potential surrogate marker for the pre-clinical phase of the disease.

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Competing interests

The authors report no competing interests.

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