## **ORIGINAL COMMUNICATION**



# **Repetitive transcranial magnetic stimulation for post‑stroke depression: a randomised trial with neurophysiological insight**

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Received: 18 October 2020 / Revised: 5 November 2020 / Accepted: 8 November 2020 / Published online: 20 November 2020 © Springer-Verlag GmbH Germany, part of Springer Nature 2020

## **Abstract**

**Objective** Despite high incidence of depression after stroke, few trials have investigated the therapeutic efficacy of repetitive transcranial magnetic stimulation (rTMS). Here, we aimed to evaluate clinical beneft of delivering a higher dose of rTMS compared to previous stroke trials. Secondary aims were to document adverse efects and investigate the role of functional connectivity as a potential mechanism of clinical response to rTMS treatment.

**Methods** Eleven chronic stroke survivors were recruited to a double-blind, Sham-controlled, randomised trial to investigate 10 sessions of high-frequency rTMS for depression. Clinical assessments were obtained at baseline, after treatment and a 1-month follow-up. Adverse events were documented at completion of the treatment. Resting electroencephalography recordings were performed at baseline and after treatment to estimate functional connectivity.

**Results** There were no differences in baseline characteristics between groups (all  $p \ge 0.42$ ). Beck Depression Inventory scores decreased for the Active rTMS group from baseline to 1-month follow-up  $(p=0.04)$ , but did not change for the Sham group at post-treatment or follow-up ( $p \ge 0.17$ ). Stronger theta frequency functional connectivity between the left frontal cortex and right parietal cortex was associated with lower baseline depression (*r*=− 0.71, *p*=0.05). This network strength increased following Active rTMS, with change in connectivity associated with improvement in BDI scores  $(r=0.98, p=0.001)$ . Adverse events were transient and minor and were not statistically different between groups ( $p \ge 0.21$ ).

**Conclusions** Active rTMS signifcantly improved depression and was well tolerated. The mechanistic role of theta frequency functional connectivity appears worthy of further investigation.

The trial was registered on the Australian and New Zealand Clinical Trials Registry (ACTRN12619001303134) on September 23, 2019.

**Keywords** Depression · Stroke · Repetitive transcranial magnetic stimulation · Connectivity · Electroencephalography

## **Abbreviations**



**Electronic supplementary material** The online version of this article [\(https://doi.org/10.1007/s00415-020-10315-6\)](https://doi.org/10.1007/s00415-020-10315-6) contains supplementary material, which is available to authorized users.

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## **Introduction**

Stroke is a leading cause of adult disability and  $\sim$  40% of stroke survivors subsequently experience depression [\[16,](#page-9-0) [38\]](#page-10-0). Depression may manifest from experiencing devastating impairment after stroke (reactive depression) or be underpinned by structural and/or functional abnormalities in frontal brain networks as a result of the lesion [[15,](#page-9-1) [48](#page-10-1)]. Those with depression after stroke experience poor recovery, increased hospital stay, reduced activities of daily living,

reduced self-efficacy and increased mortality [\[16,](#page-9-0) [33,](#page-10-2) [37](#page-10-3), [45,](#page-10-4) [48](#page-10-1)]. Therapies to treat post-stroke depression could improve clinical outcomes, provide greater opportunity for recovery or reduce the burden of care for the whole health system.

Repetitive transcranial magnetic stimulation (rTMS) is a non-invasive technique to induce plasticity within the human cortex and has shown promise as a treatment for depression. Low-frequency stimuli  $(< 1$  Hz) decrease cortical excitability, while high frequencies (5–20 Hz) increase cortical excitability [[8,](#page-9-2) [31,](#page-10-5) [35](#page-10-6), [36](#page-10-7)]. Therapeutically, several studies have investigated the efficacy of high-frequency rTMS over the left DLPFC [[13](#page-9-3), [34](#page-10-8)], or low-frequency rTMS over the right DLPFC in depressed, but otherwise neurologically intact adults with promising results [[24\]](#page-10-9). Of importance, rTMS is well tolerated compared to pharmacological therapy, where several side effects and poor treatment adherence have been reported [[2,](#page-9-4) [9,](#page-9-5) [33,](#page-10-2) [41](#page-10-10), [43](#page-10-11)]. rTMS could have therapeutic value in post-stroke depression.

However, to date, only a few randomized controlled trials with low treatment dose have investigated the efficacy of rTMS for post-stroke depression. Two trials both reported that 10 sessions of left DLPFC high-frequency (10 Hz) rTMS in chronic stroke survivors improved depressive symptoms [[14,](#page-9-6) [23\]](#page-10-12). Of note, both trials employed similar rTMS protocols delivering 1000 pulses each session [\[14,](#page-9-6) [23](#page-10-12)]. Increasing pulse number provides greater treatment dose and could accelerate the trajectory of rTMS response [\[11\]](#page-9-7). Delivering 3000 pulses per session in depressed, but otherwise neurologically intact adults was not associated with elevated risk of serious adverse events and might produce more robust improvements in depression [\[32](#page-10-13)]. It may be that increasing pulse number can enhance rTMS improvements in depression and is worthy of investigation in people with stroke. However, stroke is associated with increased seizure risk [\[4](#page-9-8)], so increasing dosage could elevate potential for serious adverse events. Attempts to increase therapeutic response by increasing dose should be carefully monitored.

Furthermore, investigation of neurophysiological mechanism underpinning this treatment might help further inform and optimize rTMS treatment for post-stroke depression. Functional connectivity is one mechanism worth investigating as there is good evidence that a lesion can modify brain activity, even in the opposite hemisphere [\[18](#page-9-9), [46](#page-10-14), [47](#page-10-15)], and connectivity appears to infuence neuromodulation. For example, in both healthy adults and people with stroke, greater functional connectivity of the stimulated network in alpha and beta bands was associated with a bigger increase in cortical excitability following excitatory brain stimulation [\[19,](#page-10-16) [20\]](#page-10-17). Understanding if and how functional connectivity mediates an improvement in depression with rTMS in people with post-stroke depression deserves investigation. Therefore, the purpose of this study was to investigate the efficacy of left DLPFC high-frequency (10 Hz) rTMS in people with post-stroke depression compared with a Sham control condition. Specifcally, we were interested in delivering a higher dosage of rTMS compared to previous studies by increasing pulse number to 3000 per session, in line with the FDA approved protocol for depression. Secondary purposes were to document adverse effects and investigate the role of functional connectivity in mediating any improvements in depression with rTMS. It was hypothesized that rTMS would improve depressive symptoms to a greater extent for those receiving Active treatment compared to Sham treatment. Furthermore, we hypothesized that rTMS would be safe, well tolerated and improvements in depression would be associated with enhanced functional connectivity.

## **Materials and methods**

#### **Participants**

Eleven chronic stroke survivors (9 male, aged  $62.5 \pm 11.1$  years) participated in this study. All participants were aged>18 years, had depression (Patient Health Questionnaire-9 (PHQ-9) $>$ 5) with onset of symptoms occurring after stroke, had no change in antidepressant medication for 6 months prior to participation or during the trial, no contraindications to TMS such as metallic implants, pregnancy or a history of seizures [\[39\]](#page-10-18) and no history of craniotomy or craniectomy as skull defects are known to afect electroencephalography (EEG) signal. The PHQ-9 was selected as the screening tool for depression given ease of administering via a telephone interview. Participants who were unable to communicate and provide informed consent were excluded. All participants provided written informed consent and ethical approval was provided by the University of South Australia Human Research Ethics Committee (200697). The trial was registered on the Australian and New Zealand Clinical Trials Registry (ACTRN12619001303134).

#### **Experimental protocol**

This study was a double-blind randomized controlled trial with participants randomized to one of two parallel groups on enrolment (Active or Sham). Both participants and outcome assessors were blind to allocation. Participants were informed that there was an Active and Sham group and they would be unable to determine the diference between conditions. Randomization was performed by an assessor not involved in data collection, experimental procedures or analysis. Sequence generation was from a random number generator. Baseline assessments included demographics, clinical characteristics, depression (Beck Depression Inventory—II (BDI) and PHQ-9), self-efficacy (Stroke Self-Efficacy Questionnaire (SSEQ)) and neurophysiology (EEG). Following

this, participants completed 10 daily sessions of Active or Sham rTMS (Monday to Friday over a 2-week period). Clinical assessments of depression and self-efficacy were repeated at the completion of the 10 rTMS sessions and a 1-month follow-up. Neurophysiology (EEG) was re-assessed at the completion of the 10 rTMS sessions.

## **Intervention**

#### **Electromyography**

Surface electromyography (EMG) was used to record motor evoked potentials (MEPs) from the frst dorsal interosseous (FDI) for determining resting motor threshold (RMT) of the non-lesioned hemisphere. Initially, the skin was prepared by cleaning with alcohol and lightly abrading with NuPrep paste. A ground strap was placed around the wrist. Signals were sampled at 5 kHz (CED 1401; Cambridge Electronic Design, UK), amplifed (×1000) (CED 1902; Cambridge Electronic Design) and fltered (20-1000 Hz).

#### **Repetitive transcranial magnetic stimulation**

At the frst treatment session, RMT of the non-lesioned hemisphere was determined by applying single bi-phasic TMS pulses at  $0.2 \text{ Hz} \pm 10\%$ . The hotspot was identified by placing the coil over the non-lesioned motor cortex hand representation, with the coil held tangentially to the scalp and handle pointing 45° posterolaterally to induce a posterior–anterior current across the cortex. The coil position was systematically moved to identify the optimal position for evoking MEPs in the contralateral and relaxed FDI. RMT was defned as the minimum stimulus intensity for evoking MEPs with a peak-to-peak amplitude larger than 50  $\mu$ V in at least 5 out of 10 trials.

Focal rTMS was administered using a Magstim Super Rapid (Magstim, UK) connected to either an active 70 mm fgure-8 air-cooled coil (part number 3910-23-00), or placebo coil that was identical, but did not produced an electromagnetic feld (part number 3950–23-00). For all participants, rTMS was applied at 110% RMT to the left DLPFC (F3 from the 10–20 EEG system). At each treatment session, 3000 pulses were applied at 10 Hz (4 s on and 26 s off; total duration 37.5 min) with a total of 10 rTMS sessions completed at a similar time of day over a 2-week period.

## **Outcome measures**

#### **Clinical assessment**

The primary clinical outcome measure was the BDI. Secondary clinical assessments were the PHQ-9 and SSEQ. The BDI is a valid and reliable 21-item scale for assessing depression severity  $[10]$  $[10]$  $[10]$ . Total scores range from 0–63, with higher scores indicative of more severe depressive symptoms and a 17.5% reduction considered a minimal clinically important diference [[3,](#page-9-11) [7\]](#page-9-12). The PHQ-9 is a valid and reliable 9-item scale for measuring depression [\[25,](#page-10-19) [26](#page-10-20)]. Total scores range from 0–27, with higher scores indicating greater depressive symptoms and a 5-point decrease considered a clinically meaningful improvement [[28\]](#page-10-21). The SSEQ is a 13-item assessment of an individual's confdence or belief in their ability to successfully achieve a task [\[21](#page-10-22)]. Self-efficacy was assessed as improved depression may lead to greater confdence in functional performance and aspects of self-management. Total scores range 0–130, with higher scores indicating greater self-efficacy.

#### **EEG acquisition**

Prior to and following the treatment phase, three minutes of EEG was acquired with an ASA-lab EEG system (ANT, Netherlands). Participants were ftted with a cap that had 64 sintered Ag–AgCl monopolar electrodes in standard 10–10 positions. During data collection, participants were seated in a comfortable chair in a quiet room and asked to relax while keeping their eyes open, maintaining their gaze toward a fxation point straight ahead, refraining from speaking or moving and not engaging in any cognitive or mental tasks. Signals were sampled at 2048 Hz, amplifed 20x, fltered (high pass, DC; low pass 553 Hz) and online referenced CPz. Impedance was kept below 5 kΩ and recorded data were stored on a computer for offline analysis.

#### **Adverse events and efectiveness of blinding**

Adverse events following rTMS were documented as either absent, mild, moderate or severe (see supplementary materials for tool)  $[6]$  $[6]$ . To determine the effectiveness of blinding, participants were asked if they believed they had received the Active rTMS treatment (yes/no) and their confdence in this response (range; 0, not at all confdent—10, completely confident).

#### **Magnetic resonance imaging acquisition and processing**

For a subset of participants  $(n=9)$  magnetic resonance imaging (MRI) data were available and included T1- and T2-weighted sequences performed using a Siemens 3T MAGNETOM Skyra scanner (Siemens, Germany) with a 64-channel head coil. The scan protocol was as follows: T1-weighted image MPRAGE (voxel 1 mm x 1 mm x 1 mm, repetition time =  $2300$  ms, echo time =  $2.98$  ms, flip angle =  $9^{\circ}$ ); T2-weighted fluid-attenuated inversion recovery (voxel 1 mm  $\times$  0.5 mm  $\times$  0.5 mm, repetition time = 5000 ms, echo time=393 ms). Image processing was performed in FSL (FMRIB Software Library, Oxford, UK). T1-weighted images were linearly registered to T2-weighted images for lesion identifcation. Lesion masks were manually traced by an experienced investigator blind to group allocation and lesion volume determined.

#### **EEG pre‑processing and analysis**

EEG data were exported to MATLAB 9.2.0 (MathWorks, Inc., Natick, MA) for pre-processing and analysis. Data were fltered 1–80 Hz (second order Butterworth) and band-stop flter 48–52 Hz. Visibly bad channels were removed, and data was segmented into 180 one-second epochs. An independent component analyses using the EEGLAB fast ICA function identifed non-physiological artefactual components for removal (e.g., eye blinks and scalp muscle activity). Following artefact removal, missing channels were interpolated.

The debiased weighted phase lag index (dwPLI) was computed as a measure of functional connectivity (FieldTrip toolbox for MATLAB). The dwPLI is a conservative estimate of phase consistency that weights against zero phase lag relationships [[44\]](#page-10-23), limiting effects of volume conduction and common reference problems. Values range from 0 (negative values can incidentally occur due to limited sampling) to 1 (maximum phase coupling). The dwPLI was determined for delta  $(1-3 \text{ Hz})$ , theta  $(4-7 \text{ Hz})$ , alpha  $(8-13 \text{ Hz})$ , low-beta (14–20 Hz), high-beta (21-30 Hz) and gamma (31–45 Hz) spectral frequencies.

To determine if baseline EEG functional connectivity was associated with response to rTMS, a partial least squares (PLS) regression analysis was performed using the N-way Toolbox for MATLAB. PLS identifes a model of connectivity between the seed electrode (F3, rTMS target) and all other electrodes that maximally accounted for baseline clinical scores for the primary (BDI) or secondary outcome measures (PHQ-9 or SSEQ). Similar to previous studies, the frst component was used to generate all PLS models with a conservative threshold of 0.7 relative to the maximal correlation coefficient  $[19, 30]$  $[19, 30]$  $[19, 30]$  $[19, 30]$ . Data were mean-centered and submitted to a direct orthogonal signal correction for increased efficiency. PLS models were cross-validated using leave-one-out and predict analysis. For the PLS model with greatest efect size, clusters of electrodes defned as 3 or more adjacent electrodes were identified and the mean dwPLI values of the clusters were then determined and correlated against the dependent variable.

#### **Statistical analysis**

Statistical analyses were performed using SPSS software (IBM Corp., V24, Armonk, NY, USA) with signifcance level set at  $p < 0.05$ . Normality of the data was checked, and where required, non-parametric statistics applied. Demographics and clinical characteristics were compared between Active and Sham groups with independent *t*-tests or Fisher's Exact tests. Lesion volume was compared between groups with a Mann–Whitney *U* test. Adverse events were compared between groups with a Fisher's Exact test. Clinical responses for the primary (BDI) and secondary (PHQ-9, SSEQ) outcomes following rTMS were analysed with separate 2 GROUP (Active, Sham) X 3 TIME (baseline, postrTMS, follow-up) linear mixed models that were adjusted for time since stroke and lesion volume. Main efects or interactions were evaluated with Bonferroni corrected t-tests. PLS analysis to identify EEG connectivity models were further investigated by correlating dwPLI and baseline clinical measures for both the primary (BDI) and secondary (PHQ-9, SSEQ) outcomes. For signifcant correlations between dwPLI and baseline clinical measures, data were further investigated by comparing the rTMS-induced change in dwPLI (normalized to baseline) between Active and Sham groups (independent t-test) and correlating the change in dwPLI with change in clinical measure (baseline to postrTMS). Finally, lesion volume was correlated with both baseline and change scores for both the primary (BDI) and secondary (PHQ-9, SSEQ) outcomes. Where appropriate, Cook's distance identifed infuential data points in correlational analyses. A threshold of 4/n was used to classify an observation as a statistical outlier [[5\]](#page-9-14).

## **Results**

## **Participant characteristics, missing data and adverse events**

Six participants were randomized to Active and five to Sham rTMS. Demographics and baseline characteristics are reported in Table [1](#page-4-0) and individual MRI scans for the subset of participants with MRI data  $(n=9)$  are shown in Fig. [1.](#page-4-1) There were no group diferences in age, sex, time since stroke, lesion characteristics, RMT or baseline BDI, PHQ-9 and SSEQ (all  $p \ge 0.42$ ). All participants completed all 10 rTMS sessions and all clinical and neurophysiological assessments. A detailed summary of individual participant demographics, clinical characteristics and MRI outcomes is provided in the supplementary materials.

One participant randomized to the Sham condition experienced strong dental pain that appeared to be linked to the delivery of Sham rTMS but likely underpinned by other mitigating circumstances. This has been detailed in a separate report [\[17](#page-9-15)]. Participation in the study was delayed by 3 months and upon re-enrolment this participant experienced very minor, but tolerable, discomfort and completed all experimental procedures. At completion of treatment, four participants ( $n=2$  Active,  $n=2$  Sham) reported mild <span id="page-4-0"></span>**Table 1** Participants demographics and characteristics for Active and Sham groups



*%MSO* percentage of maximal stimulator output, *BDI* Beck Depression Inventory—II, *PHQ-9* Patient Health Questionnaire 9 Item scale, *RMT* resting motor threshold, *rTMS* repetitive transcranial magnetic stimulation, *SD* standard deviation, *SSEQ* Stroke self-efficacy questionnaire

\* Magnetic resonance imaging data only available for four participants in the Active rTMS group



subset of participants in the trial. The slice with greatest cross-sectional area of the lesion is shown. The lesion tracing is highlighted in red. The top row shows four participants in the Active rTMS group and the bottom row shows fve participants from the Sham rTMS group.  $L = left$ ;  $R = right$ ; rTMS=repetitive transcranial magnetic stimulation. Note, MRI data were only available for four of the six participants in the Active rTMS group

<span id="page-4-1"></span>**Fig. 1** Lesion imaging for a

headaches; two participants from the Active condition reported mild neck pain and two from the Sham condition reported moderate neck pain; two participants (*n*=1 Active,  $n=1$  Sham) reported mild sleep disturbances; and five participants ( $n=4$  Active,  $n=1$  Sham) reported mild mood changes (noted as an improved mood) at the completion of treatment. No other adverse efects were noted and there were no statistical diferences in reported adverse events between groups (all  $p \ge 0.21$ ).

Participant blinding was effective. All participants in the Sham rTMS group believed they had received the Active treatment with a moderate level of confdence (mean  $5.6 \pm 2.9$ , range 2–10). Of interest, only 50% of participants in the Active group believed they had received the Active treatment (high level of confidence; mean  $8.7 \pm 2.9$ , range 7–10), while the remaining participants believed they had received the Sham treatment (moderate level of confdence; mean  $5.3 \pm 2.3$ , range 4–8).

#### **Treatment responses**

Participants that received Active rTMS had a reduction in depression scores measured with the primary clinical outcome (BDI) from baseline to follow-up (Fig. [2](#page-5-0)). There was no main effect of GROUP ( $F_{(1,7)} = 1.82$ ,  $\beta = -0.75$ ,  $p=0.22$ ), but there was a main effect of TIME ( $F_{(2,14)}=8.28$ ,  $\beta$ =− 4.60,  $p$ =0.004) and a GROUP X TIME interaction  $(F_{(2,14)}=4.55, \beta=-11.55, p=0.05)$ . Post-hoc analysis found BDI scores reduced in the Active rTMS group from baseline to post-rTMS, but became insignifcant following correction for multiple comparisons  $(t_{(5)}=2.71, p=0.08,$ Bonferroni corrected). There was a signifcant decrease in BDI from baseline to follow-up in the Active group  $(t_{(5)}=3.42, p=0.04,$  Bonferroni corrected). For Sham, there were no statistical diferences between baseline BDI and either post-rTMS BDI  $(t_{(4)} = 2.30, p = 0.17,$  Bonferroni corrected) or follow-up BDI ( $t_{(4)}$ =1.55,  $p$  = 0.39, Bonferroni corrected).

For the secondary clinical outcome measures, there was a main effect of TIME for the PHQ-9 ( $F_{(2,14)}$ =7.56,  $\beta$ =−6.20, *p*=0.04), with post-hoc analysis finding PHQ-9 scores decreased from baseline to post-rTMS  $(t_{(10)}=3.95,$  $p=0.006$ , Bonferroni corrected), and follow-up ( $t_{(10)}=3.80$ ,  $p = 0.006$ , Bonferroni corrected). However, there was no effect of GROUP ( $F_{(1,7)}$ = 2.70,  $\beta$  =  $-$  0.80,  $p$  = 0.14) or GROUP X TIME interaction  $(F_{(2,14)} = 0.72, \beta = -3.80,$ 

 $p=0.50$ ; Fig. [2](#page-5-0)). These findings suggest that PHQ-9 scores improved from baseline to post-rTMS and follow-up; however, there was no diference between groups. For SSEQ there was a main effect of TIME ( $F_{(2,14)} = 16.85$ ,  $\beta = 19.4$ ,  $p = 0.02$ ), with post-hoc analysis finding SSEQ scores increased from baseline to post-rTMS  $(t_{(10)} = -3.25,$  $p=0.02$ , Bonferroni corrected), and follow-up ( $t_{(10)}=-3.36$ ,  $p=0.01$ , Bonferroni corrected). However, there was no effect of GROUP ( $F_{(1,7)}$ =1.12,  $\beta$ =4.40,  $p$  = 0.33) or GROUP X TIME interaction  $(F_{(2,14)}=2.11, \beta=13.30, p=0.16;$  Fig. [2](#page-5-0)). These fndings suggest SSEQ scores improved from baseline to post-rTMS and follow-up; however, there was no diference between groups.

## **Electroencephalography and baseline clinical outcomes**

For the baseline primary clinical outcome (BDI), a theta frequency PLS model identifed a cluster of electrodes approximately overlying the right parietal cortex (ftted  $R^2$  = 0.46, cross-validated  $R^2$  = 0.41; Fig. [3\)](#page-6-0). Greater theta band dwPLI for this model was associated with lower BDI scores  $(r = -0.71,$  Bonferroni corrected  $p = 0.05$ , Fig. [3\)](#page-6-0). Electrode clusters for PLS models in alpha, lowbeta and gamma frequencies were also identifed but were not signifcantly correlated with baseline BDI scores (all

<span id="page-5-0"></span>**Fig. 2** Clinical response to repetitive transcranial magnetic stimulation from baseline to post-treatment and a 1-month follow-up. Data are presented as mean±SEM for (**a**) Beck Depression Inventory, (**b**) Patient Health Questionnaire 9 Item scale, and (**c**) Stroke selfefficacy questionnaire. There was a signifcant improvement in Beck Depression Inventory scores at follow-up for participants in the Active rTMS group, but not the Sham rTMS group. \*indicates a statistically signifcant diference





<span id="page-6-0"></span>**Fig. 3** PLS models identifed electrode clusters where dwPLI functional connectivity between F3 and the identifed electrodes maximally accounted for variance in baseline clinical outcomes. For the EEG topoplots, the white circle represents F3, where rTMS was applied to the left DLPFC and was the seed electrode. Stars represent

Bonferroni corrected  $p > 0.20$ ). PLS models for delta and high-beta frequencies did not identify any electrode clusters.

For the baseline secondary clinical outcome (PHQ-9), a low-beta frequency PLS model identifed a cluster of electrodes approximately overlying the left parietal cortex (fitted  $R^2$ =0.[3](#page-6-0)8, cross-validated  $R^2$ =0.27; Fig. 3). Greater low-beta dwPLI for this model was associated with higher PHQ-9 scores  $(r=0.74,$  Bonferroni corrected  $p=0.03$ , Fig. [3](#page-6-0)). Electrode clusters for PLS models in alpha and gamma frequencies were also identifed but were not signifcantly correlated with baseline PHQ-9 scores (all Bonferroni corrected  $p > 0.45$ ). PLS models for delta, theta and high-beta frequencies did not identify any electrode clusters.

For the baseline secondary clinical outcome (SSEQ), electrode clusters for PLS models in delta, theta, high-beta and gamma frequencies were identifed but did not reach signifcance when correlated with baseline SSEQ scores (all

electrodes within the identifed PLS models. Black flled stars represent electrodes in a cluster. Electrodes that were in the PLS model, but not in a cluster are show as grey stars. BDI, Beck Depression Inventory—II; dwPLI, debiased weighted phase lag index; PHQ-9, Patient Health Questionnaire-9

Bonferroni corrected  $p > 0.35$ ). PLS models for alpha and low-beta frequencies did not identify any electrode clusters.

A detailed summary for all PLS analyses for each frequency and clinical measure is provided in the supplementary materials.

#### **rTMS‑induced changes in neurophysiology**

For theta connectivity between F3 and the cluster approximating the right parietal cortex, there was a non-signifcant trend indicating a greater increase in dwPLI for the Active group compared to Sham  $(t_{(9)}=1.6, p=0.08)$ . However, there was no signifcant diference between groups for change in low-beta dwPLI between F3 and the cluster approximately overlying the left parietal cluster  $(t_{(9)}=0.24,$  $p=0.41$ ; Fig. [4](#page-7-0)).

For the active group, there was a correlation between change in theta band dwPLI from F3 to the electrode



<span id="page-7-0"></span>**Fig. 4** Change in dwPLI following rTMS treatment and correlation with improvement in depression. Top left, change in dwPLI from baseline to post-rTMS treatment for PLS model (F3—Right parietal) in the theta frequency (mean $\pm$ SEM). An increase in dwPLI was observed for the active rTMS group and a slight decrease for the Sham rTMS group. Top right, change in dwPLI from baseline to post-rTMS treatment for PLS model (F3—Left parietal) in the lowbeta frequency (mean $\pm$ SEM). Both Active and Sham rTMS groups exhibited a slight decrease in dwPLI after treatment. Bottom, a sig-

cluster approximately overlying the right parietal cortex and change in BDI scores after treatment  $(r = 0.98,$  $p = 0.001$ ; Fig. [4](#page-7-0)). Cook's distance found that no datapoints had signifcant infuence over the correlation and even a conservative approach of re-analysing the data after removal of the upper right data point demonstrated that this correlation remained strong  $(r=0.86, p=0.06)$ . These fndings suggest that an increase in theta dwPLI after treatment was associated with improved depression measured by BDI. For the Sham group, the correlation between change in theta band dwPLI and BDI was not significant  $(p=0.29)$ . Similarly, for both groups, the change in low-beta dwPLI for the PHQ-9 PLS model and change in PHQ-9 scores were not significant (all  $p > 0.48$ ).

nifcant positive correlation between the improvement in depression (change beck depression inventory) following Active rTMS and the change in dwPLI for PLS model (F3—Right parietal) in the theta frequency. This fnding suggests an increase in dwPLI in the theta frequency between F3—Right parietal region was associated with improvement in depression. Inset bottom right, the theta dwPLI PLS model of connectivity between F3 (seed electrode, white circle) and a cluster approximating the right parietal region (black stars)

## **Lesion volume and clinical outcomes**

Lesion volume did not correlate with baseline clinical measures (all  $p > 0.28$ ) or improvements in clinical outcomes (all  $p > 0.16$ ).

## **Discussion**

This preliminary investigation demonstrated that left DLPFC high-frequency rTMS in chronic stroke survivors with moderate post-stroke depression reduced symptoms of depression to a greater extent in those receiving Active compared to Sham treatment. This fnding was evident for the primary

clinical outcome measure (BDI). Both secondary clinical outcomes (PHQ-9 and SSEQ) reduced following treatment but were not diferent between groups. Stronger theta frequency resting state functional connectivity between F3 and a cluster of electrodes overlying the right parietal cortex was associated with lower BDI scores at baseline. For those in the Active treatment group, rTMS appeared to increase this model of theta connectivity, with the magnitude of increase in connectivity strongly associated with improvements in the BDI scores after treatment. Finally, the rTMS protocol employed in this study appears safe with only mild and temporary side efects that are common in rTMS literature noted [[29\]](#page-10-25). Together, these fndings suggest rTMS is a promising treatment for post-stroke depression. Clinical improvements in post-stroke depression following rTMS might be related to theta band connectivity between an approximate left DLPFC and right parietal cortex network.

Previous studies have provided good evidence that left DLPFC high-frequency rTMS is an effective treatment for depression, but little work has been performed in poststroke depression. Here, in a small sample, we demonstrate that rTMS produced statistically signifcant and clinically meaningful improvement in depressive symptoms. For the primary clinical outcome measure (BDI), the magnitude of improvement after treatment (14 points) and at follow-up (11.8 points) exceeded the minimal clinically important difference of a 17.5% reduction, equating to 4 points in this study [[7](#page-9-12)]. Similarly, for the secondary clinical outcome measure (PHQ-9), improvements of 8.5 points after treatment and 6.7 points at follow-up exceeded minimal clinically important diferences (5 points), although this was not statistically signifcant compared to Sham [[28](#page-10-21)]. Our fndings, therefore, support the few available trials investigating rTMS in post-stroke depression that have reported significant improvements in BDI and the Hamilton Depression Rating Scale [\[14,](#page-9-6) [23\]](#page-10-12). Of note, this study did safely deliver a greater dosage of rTMS compared to previous stroke studies (3000 vs 1000 pulses per session). This may be one factor that led to greater BDI improvement in this study (14 point improvement) compared to previous work (7.3 point improvement) [\[14\]](#page-9-6). Further extending previous literature, this study also investigated the effect of rTMS on self-efficacy as a secondary clinical outcome. Although no group level diferences were observed between Active and Sham treatment, it is noteworthy that self-efficacy, a measure of internal sense of control, improved across assessment time points irrespective of group allocation. One explanation for both groups showing improved self-efficacy may be that involvement in the trial provided a sense of increased confdence in their ability to participate within society. Although not directly assessed in this study, participation aspects such as leaving home to attend treatment sessions, transportation and social interactions may have contributed to greater self-efficacy. Given the importance of self-efficacy in stroke recovery  $[22]$  $[22]$ , we suggest future studies continue to investigate the effects of rTMS on the confdence of people with stroke to perform functional tasks and aspects of self-management.

A novel fnding was that enhanced theta frequency functional connectivity between an electrode approximating the left DLPFC and a cluster of electrodes approximating the right parietal cortex appeared to underpin improvement in BDI following rTMS. Previous studies with depressed, but otherwise neurologically intact, people have indicated that rTMS treatment efficacy might rely on functional connectivity with the DLPFC [\[1](#page-9-16), [12](#page-9-17), [27\]](#page-10-27). In particular, there is some indication that connectivity within a frontoparietal central executive network is abnormally diminished, while connectivity of a prefrontal–parietal default mode network is abnormally increased in people with depression [[27\]](#page-10-27). Highfrequency DLPFC rTMS was found to normalize default mode network connectivity, but did not alter frontoparietal central executive network connectivity [\[27](#page-10-27)]. Although spatial resolution of EEG recordings limits interpretation of anatomical brain regions generating the recorded signal, it is possible our fndings provide some support for a role of the default mode and central executive networks in rTMS treatment for depression after stroke. That theta connectivity is thought to refect cognitive processes underpinned by these networks provides further support for our fnding that theta interhemispheric frontoparietal connectivity is an important mechanism of response to rTMS in post-stroke depression [\[40](#page-10-28)]. Although further investigation is required, theta resting state functional connectivity may be a neurophysiological mechanism that enables rTMS to improve clinical outcomes in post-stroke depression.

Along similar lines, we observed that reduced low-beta connectivity between F3 and a cluster of electrodes approximating the left parietal cortex was associated with lower levels of depression on the PHQ-9 at baseline. However, our fndings do not support a relationship between connectivity of the left frontoparietal network and improved depression with rTMS. This is because rTMS did not appear to modify low-beta connectivity and there was no evidence that a change in connectivity was associated with clinical improvement. It appears unlikely low-beta connectivity has a relationship with depression and response to rTMS.

There are several limitations to this study. First, the sample size was small, limiting our ability to conclusively demonstrate rTMS is an efective and generalizable treatment for post-stroke depression. However, it is important to note that this well-designed, registered, double-blind randomized controlled trial adds to the available evidence supporting the efficacy of left DLPFC high-frequency rTMS for post-stroke depression. Second, we note that, on average, participants had a moderate level of depression. It is, therefore, not clear whether similar improvements in depression would be evident for those with more severe symptoms. Third, we did not have a measure of stroke severity. Although MRI data were available and there is some indication of a strong association between lesion volume and stroke severity (National Institutes of Health Stroke Scale; NIHSS) [[42](#page-10-29)], we suggest future studies should assess NIHSS to gain further insight to the relationship between depression and rTMS treatment. Fourth, EEG suffers from poor spatial resolution and neural signal can be affected by volume conduction, making it difficult to directly infer the neural generator. To mitigate this limitation we have; (1) used a conservative measure of functional connectivity that biases against phase diferences of 0 or 180 degrees; and (2) cautiously referred to our fndings by referring to electrode clusters that approximate cortical regions as we do not know where the recorded EEG signals were generated. Finally, we acknowledge that imaging data were not available for all participants in this study. Although not required to address our research questions, this did partially limit ability to accurately describe lesion characteristics for all study participants and determine if lesion metrics correlated with clinical measures.

In conclusion, post-stroke depression is a serious consequence of stroke that requires new treatment options. This preliminary study investigated rTMS of the left DLPFC and found that those receiving the Active treatment had greater improvements in depression compared to Sham. Delivering an increased dosage of rTMS compared to previous stroke studies appears to enhance clinical beneft and was well tolerated, with only mild and temporary side efects noted. Therefore, our fndings support the possible use of rTMS as a treatment for post-stroke depression. The mechanistic role of theta frequency functional connectivity appears worthy of further investigation.

**Acknowledgements** The authors would like to acknowledge Dr Tobias Loetscher for assistance during study design.

**Funding** This research was funded by a Research Themes Investment Scheme—University of South Australia grant. BH was supported by National Health and Medical Research Council (NHMRC) fellowship (1125054).

#### **Compliance with ethical standards**

**Conflicts of interest** None of the authors have potential conficts of interest to be disclosed.

**Ethical standard** This study was approved by the University of South Australia Human Research Ethics Committee (ID number 200697). The study conformed to the standards defned in the latest revision of the Declaration of Helsinki. All patients and controls signed a written informed consent.

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