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Article Model insights into EEG origin under transcranial direct current stimulation (tDCS) in the context of psychosis

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Abstract: Schizophrenia is a psychotic disease that develops progressively over years with a transi-1 tion from prodromal to psychotic state associated with a disruption in brain activity. Transcranial 2 Direct Current Stimulation (tDCS), known to alleviate pharmaco-resistant symptoms in patients 3 suffering from schizophrenia, promises to prevent such a psychotic transition. To understand better 4 how tDCS affects brain activity, we propose a neural cortico-thalamo-cortical (CTC) circuit model 5 involving the Ascending Reticular Arousal System (ARAS) that permits to describe major impact features of tDCS, such as excitability for short-duration stimulation and electroencephalography 7 (EEG) power modulation for long-duration stimulation. To this end, the mathematical model relates 8 stimulus duration and Long-Term Plasticity (LTP) effect, in addition to describing the temporal LTP 9 decay after stimulus offset. Moreover, we reproduce successfully EEG-power modulation under tDCS 10 in a ketamine-induced psychosis model and confirm the N-methyl-d-aspartate (NMDA) receptor 11 hypofunction hypothesis in the etiopathophysiology of schizophrenia. The model description points 12 to an important role of the ARAS and the δ - rhythm synchronicity in CTC circuit in early stage 13 psychosis. 14

Keywords: tDCS, ketamine, psychotic transition, EEG, modelling, thalamocortical circuit

1. Introduction

Schizophrenia is a psychotic disease that affects almost 1% of the worldwide pop-17 ulation. This disorder has a multifactorial etiology which includes environmental and 18 genetic factors, and develops progressively along years before to manifest generally be-19 tween 15 and 25 years old. During the prodromal pre-psychotic phase, first low-intensity 20 psychotic/positive symptoms insidiously appear [1,2]. About one-third of the at-risk 21 mental state patients will experience the psychotic transition, marked by the intensification 22 and worsening of psychotic symptoms over almost 2 years. This frequently culminates 23 in an acute episode of psychosis, and finally resulting to the chronicisation of the psy-24 chotic syndromes [1,3,4]. For patients diagnosed with schizophrenia, pharmacological 25 and psychological therapy allow to alleviate symptoms and significantly improve patients 26 every-day-life. Nevertheless, finding treatments to prevent the psychotic transition would 27 be a precious lever for patients and psychiatry. 28

One of the promising non-invasive preventive approaches is the transcranial Direct Current Stimulation (tDCS). It modulates neuronal activity by electric currents and is efficient in the reduction of pharmaco-resistant psychotic and negative symptoms, as well as improvement of cognitive performance in patients and healthy subjects [5–7]. For instance, in patients suffering from schizophrenia long-lasting (several months) and robust reduction of negative and positive symptoms with low side-effects have been observed after application an anodal tDCS protocol of few days [5,8,9]. While a large number of studies

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Copyright: © 2022 by the authors. Submitted to *J. Clin. Med.* for possible open access publication under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). demonstrate the powerful potential of the tDCS as a treatment for psychotic disorder, the 37 questions of whether and how psychosis can be prevented by tDCS remains open. To 38 get closer to this aim, it is mandatory to understand better the mechanism of action and 39 electrophysiological influence of tDCS on neuronal networks. 40

The dysconnection hypothesis in schizophrenia allows to reveal links between the 42 pathophysiology of the disease and clinical signs, and indicates inter- and intra-structural 43 impairments in functional integration processes [10,11]. Indeed, Cortico-Thalamo-Cortical (CTC) dysfunctions and disturbance in functionally associated neuronal oscillations were 45 reported from the prepsychotic phase of schizophrenia. These oscillopathies encompass an 46 increased power of prefrontal resting state activity in the broadband γ -frequency (30 - 80 47 Hz) [12,13], as well as a reduced power in cortical low-frequency oscillations, like in the δ – band (1 - 4 Hz) [14,15] and in non-REM sleep spindles occurring in the σ – frequency 49 band (10 - 17 Hz) [16,17].

Interestingly, some of these prodrome-related osccillopaties can be transiently re-52 produced in humans and rodents by a sub-anesthetic administration of the N-methyl-d-53 aspartate (NMDA) receptor antagonist ketamine. A single sub-anesthetic dose of ketamine 54 induces psychotomimetic effects in healthy humans [18] and worsen positive symptoms in 55 patients suffering from schizophrenia [19]. Moreover, electrophysiological studies in rats 56 [20–22] and humans [23–25] showed that such a psychotomimetic ketamine administration 57 disrupts the CTC functional dynamics, and induces an increased power of γ – oscillations 58 and a reduced power of slow wave, an effect reversed by the antipsychotic action of cloza-59 pine [26]. Therefore, the sub-anesthetic ketamine provide a reliable animal model of a 60 transition to a psychosis-relevant state [27], and support the dysconnection hypothesis 61 for the etiopathophysiology of schizophrenia, more precisely via an hypofunction of the 62 NMDA receptors [28]. 63

Here, we propose to explain the impact of anodal tDCS on psychotic brain dynamics 65 by the use of a mathematical model of the CTC circuit. This model encompasses the 66 CTC connectivity topology, as well as excitatory and inhibitory neuronal populations 67 in the network structures. At first, we have reproduced typical activity modulations 68 by tDCS, such as excitability and EEG power spectrum, to validate the neural model. Then, the psychosis network dynamic is mimicked by modeling the action of ketamine 70 on glutamatergic neurotransmission. Finally, tDCS application in the context of psychosis 71 has been simulated and forecasts of tDCS action on CTC structures are provided. The 72 neuromodulatory action of tDCS has been modeled by a cortical constant input and a 73 change in the neuronal population transfer function. Cortical electroencephalograms (EEG) 74 have been computed numerically for all conditions and compared with literature. We 75 shed light on the essential neural mechanisms and CTC interactions that allow to mimic 76 prodrome-related oscillopathies and the observed effect of tDCS in psychotic patients. 77

2. Materials and Methods

2.1. The model

It is well-established that EEG originates from population activity in cortical layers [29, 80 30]. Neural ensemble models are well-known to provide a very good description of EEG 81 [30–33]. The model employed describes population activity in the supragranular cortex 82 layers I-III (SG) and the cortico-thalamic loop between granular/infragranular cortical 83 layers IV-VI (GIG), the thalamic relay cells and the reticular structure, see Appendix for 84 details. The network is sketched in Fig. 1. SG cells receive input from the brainstem, or more 85 generally from the Ascending Reticular Arousal System (ARAS) [34,35], and cells in input 86 layer IV exhibit afferent connections from thalamic structures and connect to infragranular 87 cortical cells in layers V and VI (Fig. 1(A)). Moreover, the GIG cells receive input from 88 thalamic relay cells in the CTC and project back to thalamic relay and reticular cells, cf. 89

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Fig. 1(B). GABAergic neurons in the reticular nucleus receive excitatory inputs from GIG pyramidal cells and thalamic relay neurons, while the inhibitory reticular outputs are send to the thalamic relay cells.

Figure 1. Cortico-thalamo-cortical network model of neural populations. (A) The supragranular layers I-III, granular layer IV and infragranular layers V and VI exhibit excitatory (represented by squares) and inhibitory (circles) neurons. (B) Blue and red connections between cortex and thalamic structures denote excitatory and inhibitory synaptic connections. The reticular and relay structures includes inhibitory (circles) and excitatory (squares) neurons, respectively.

The principal brain rhythms investigated in the present study are the $\delta - (1 - 4\text{Hz})$, $\sigma -$ ⁹³ (10 - 17Hz) and the γ - rhythm (30 - 80Hz). Following previous modeling studies [32,36-38], we hypothesize that the δ - and σ - rhythms originate in the cortico-thalamic circuit (including both thalamic and GIG structures), whereas γ -rhythms are generated in the SG layers [38,39] in accordance to experimental findings [40]. The proposed model considers interactions of excitatory and inhibitory local networks as the major rhythm origin in line with previous modeling studies [41,42].

2.2. The action of transcranial Direct Current Stimulation

Transcranial Direct Current Stimulation is a neuromodulatory noninvasive brain stimulation tool [43,44] known to be able to alleviate patients from symptoms in schizophrenia [5,8,9], major depression [45] or autism [46]. It generates a constant current between two electrodes and current polarity distinguishes anodal and cathodal tDCS (a-tDCS and c-tDCS).

To understand and describe the action of tDCS by a model, it is important to distinguish short and long stimulations. Short applications, i.e. from seconds to a few minutes, of tDCS result in altered membrane resting potentials and excitability shifts during stimulation but no long-term after-effects [43,47]. A-tDCS increases excitability and the resting potential, whereas c-tDCS diminish both excitability and resting potential. The present work considers primarily a-tDCS and implements its impact by an increase of constant

input and steepness decrease of transfer functions of both neuron types in all cortical layers. ¹¹² As demonstrated in previous studies [39,48], the synchronous impact on both input and ¹¹³ transfer function steepness is a direct result of a modulation by Poisson spiking activity in ¹¹⁴ the ensemble, cf. the Appendix. ¹¹⁵

The excitability effect by tDCS has been demonstrated experimentally by several previous studies [47,49]. Typically, neural responses are evoked by a different experimental stimulus, such as transcranial magnetic stimulation (rTMS). Anterior experimental research has demonstrated the increased (decreased) evoked response magnitude with increasing a-tDCS (c-tDCS) current. To describe this effect, we have implemented a transient external stimulation and evaluate the systems response magnitude and its baseline level subject to the model tDCS current. Here, we model a-tDCS and c-tDCS currents by model currents $I_{tDCS} > 0$ and $I_{tDCS} < 0$, respectively.

Conversely, stimulation of several minutes or longer can elicit prolonged after-effects 125 of several hours [44,50]. These prolonged plasticity effects request neural action evolving 126 on a larger time scale than the synaptic short-time action. A good candidate is Long 127 Term Potentiation (LTP), that has indeed been found as a probable underlying long-term 128 mechanism in long-stimulation a-tDCS [51,52]. The plasticity is triggered by anodal tDCS-129 induced neural synchronization that induces complex dynamics of diverse ion channels, 130 cascade signaling and protein transcriptions. We describe the overall impact as an enhanced 131 excitatory synaptic efficacy in accordance to previous studies [51–53]. To this end, we 132 introduce a factor f_{tDCS} for the excitatory synaptic efficacy in both supra- and infra-granular 133 layers, cf. the Appendix for more details. 134

2.3. The action of ketamine

The anesthetic ketamine induces several diverse neural actions [54–56]. For instance, it antagonizes NMDA-receptors in cortical and subcortical structure, increases the cortical and subcortical glutamate concentration and affects the cortical dopamine system mammals. As a major effect, at sub-anesthetic doses it is known to enhance the excitability level in cortical and subcortical structures, possibly through disinhibition of excitatory cortical pyramidal neurons [57,58].

Since the balance between excitation and inhibition impacts the oscillatory brain activity, 142 it is expected that ketamine modulates the EEG power spectrum. Indeed, ketamine induces increased gamma power and a decreased power in lower delta frequency bands 144 in humans [23] and rats [20,21,58,59]. Moreover, a general δ – power reduction has been 145 observed in the entire CTC circuit [26,58]. Recent experimental studies on a slow-wave 146 sleep model in rats has shown a decrease of frontoparietal spectral power in the σ -frequency band [26,60]. We have implemented the ketamine modulation of excitation and inhibition 148 on neural populations, cf. the Appendix, to reproduce the EEG power spectrum modulation 149 observed in previous experimental studies. 150

2.4. Functional connectivity

Our model network includes connected neural populations. To learn more on the 152 interaction among these populations, we evaluate the functional connectivity (FC) between 153 them. FC quantifies the time-dependent degree of interaction between two populations. 154 Several measures have been proposed to quantify it [61], such as spike-field coherence [37] 155 or other synchronization indices. We consider here the time-averaged phase coherence [37, 156 62] which represents the phase-locking value (PLV) [63] between two time series with 157 $0 \leq PLV \leq 1$. These time series represent the activity of different populations in different 158 frequency bands. It has been shown recently [64], that phase synchronization quantifies the degree of information sharing in noise-driven models. For PLV = 1, two time series are 160 completely phase locked and their populations activity is maximum synchronized, whereas 161 PLV = 0 reflects a complete activity de-synchronization. The larger the phase coherence 162

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PLV, the larger is the functional connectivity between two populations and the more the two populations interact.

3. Results

3.1. Excitability

Excitability modification is one of the major features of short-term tDCS. Figure 2 shows model simulations of an event-related potential (ERP) (A) and its impact on the resting state activity (B). We observe an augmented excitability for a-tDCS in the ERP. For both GIG cortical and thalamic relay neurons, short-term tDCS induce an increased (decreased) resting membrane potential for a-tDCS (c-tDCS). Conversely, the resting firing rate is poorly affected. These results are in good accordance to previous experimental observations [43,47].



Figure 2. tDCS-induced excitability. (A) The evoked potential time course is shown for tDCS input current $I_{tDCS} = 0.0$ (dashed), $I_{tDCS} = 0.3$ (dotted) and and $I_{tDCS} = 0.8$ (solid). The larger I_{tDCS} , the larger is the response magnitude during transient stimulation (up to ~ 200ms). After stimulation, the system response is almost identical for all input currents. (B) The relative baseline resting potential (left panel) and firing rate (right panel) in the precursor time interval 50ms before stimulation input. The value $\bar{V}_0(\bar{f}_0)$ is the baseline resting potential (resting firing rate) for absent input currents. The lines denotes the summed up relative cortical resting activity in the cortical GIG neurons (solid line), in the excitatory relay cells (dashed line) and the reticular cells (dotted line). We observe an increase of the resting membrane potential (left) for $I_{tDCS} > 0$ (a-tDCS) and a decrease for $I_{tDCS} < 0$ (c-tDCS) in cortical and relay cells, whereas no impact on reticular cells is found. Conversely, the resting firing rate is poorly modulated by the tDCS current.

3.2. Anodal tDCS-effect on spectral power

Long duration a-tDCS stimulation is known to yield cognitive enhancement [6], in-175 duces LTP [53] and may serve an important role in clinical psychiatry in the future [5,8,9,65]. 176 To describe the involved plasticity, we have developed a model that relates tDCS duration 177 and plasticity effect. Figure 3 (A, left panel) shows the major model idea: for short stimula-178 tion duration, no plasticity is present, while the impact increases with longer stimulation. 179 It has also been found experimentally, that the plasticity impact saturates after some time, 180 i.e. the long-term effect of tDCS does not change anymore [44,66]. After a-tDCS offset, 181 the plasticity reduces but much slower, see Fig. 3 (A,right panel). The understanding of 182 both enhanced and diminished plasticity in the course of time is important since a-tDCS 183 stimulation protocols alternate between stimulation with a certain duration and current 184 intensisty, and stimulation pauses. Our temporal model postulates the tDCS impact on 185

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plasticity strength subjected to stimulation time and stimulation pauses. Figure 3(B) shows the impact of the single stimulation duration in a stimulation sequence on the plasticity, similar to the tDCS studies described in [44]. We observe an increase in plasticity strength $f_{\rm plast}$ with increasing stimulation duration T_s and hence a prolonged long-term effect after stimulation offset. For details on the numerical implementation, please see the Appendix.



Figure 3. Modelled plasticity impact during and after anodal tDCS stimulation. (A) *Left panel:* very short stimulus duration does not induce any plasticity (the synaptic plasticity factor is $f \approx 1$), medium duration exhibits a strong plasticity effect ($1 \le f \le f_{sat}$) that does not enhance anymore for long duration stimuli [44] ($f \rightarrow f_{sat}$) with saturation factor f_{sat} . For high and low a-tDCS currents (black and green curve, resp.), the qualitative behavior is similar, but it takes more time to induce the same plasticity effect for lower a-tDCS currents [66]. Our model describes this temporal evolution of plasticity effect by a population growth model, see Appendix for more details. *Right panel:* after stimulation offset the plasticity effect diminishes exponentially with time. Experimental studies [66] indicate that the decay time scale is in the range of tens of minutes for typical previous stimulation current ($\sim 0.5 - 1$ mA). (B) Simulation of the plasticity effect in a typical a-tDCS sequence motivated by [44]. Arrows indicate stimulation periods. A single a-tDCS period had a duration T_s with a stimulation pause of 12 hours, 10 repetitions and a final period of 34 hours, cf. Appendix for more details. Further parameters are $\tau_{plast} = 3h$ and $\tau_{decay} = 500h$.

The plasticity effect is accompanied by spectral power enhancement, as shown in Fig. 4. We demonstrate that long duration a-tDCS induces EEG power enhancement in the δ -, σ - and γ - frequency range, which decreases with time after the stimulation ends. Experimental observations during sleep in healthy subjects similarly report an increased power of the sigma frequency band after a slow oscillatory a-tDCS application [67,68]. Moreover, it is show in [69] that oscillations in the delta frequency band are enhanced following a-tDCS.





(B)

Figure 4. Long duration-anodal tDCS impact on EEG. (A) Upper panels: simulated EEG time traces before a-tDCS stimulation and immediately after. Lower panel: the corresponding power spectral density distributions for activity before (dashed line) and immediately after (solid line) stimulation. (B) Relative power change with respect to power before stimulus for different time periods after stimulation. Plasticity effects are modeled by an increase of excitatory efficacy with factors $f_{tDCS} = 1.2$ (0min after stimulation), $f_{tDCS} = 1.1$ (20min after stimulation) and $f_{tDCS} = 1.05$ (40min after stimulation). We have assumed a stimulation duration time of 12 min implying the plasticity time scale $\tau_{plast} = 1$ min and a decay of the plasticity effect with $\tau_{decay} = 30$ min. In addition, the excitatory synaptic efficacy to ARAS input is $f_{tDCS}^{resp} = f_{tDCS}$.

The model simulations also permit to predict population activity in the thalamic structures, cf. Fig. 5. We observe a relay cell population activity, which is very similar to the EEG activity. Conversely, the reticular population exhibits a much weaker γ -activity but a strong δ -activity. The a-tDCS appears to have no impact on the activity of thalamic structures.



Figure 5. Long duration-anodal tDCS impact on subcortical activity. Upper panels: time series of simulated population activity for a-tDCS stimulation with $f_{tDCS} = 1.2$. Lower panels: spectral power density distribution of relay and reticular population activity in the absence (dashed line, $f_{tDCS} = 1.0$) and presence (solid line, $f_{tDCS} = 1.2$) of a-tDCS stimulation.

3.3. Impact of anodal tDCS in psychosis model

Previous experimental studies on humans [23,24] and rats [59,70,71] under ketamine 207 have shown that the experimental setup represents a reasonable psychosis model. The 208 subjects exhibit pathological ketamine-induced enhanced γ - and diminished σ - and 209

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 δ -activity [20–24,60]. These spectral features resemble the power modulation in at risk 210 mental state patients for psychosis. It has also been shown experimentally that an addi-211 tional long duration-anodal tDCS stimulation reverses the impact of ketamine [60] which 212 resembles the clinical impact of a-tDCS in human psychosis patients. Figure 6 presents EEG 213 and subcortical activity in the control condition (no ketamine, no a-tDCS), under ketamine 214 but no a-tDCS and in the presence of ketamine and a-tDCS. Under ketamine, the EEG 215 power decrease in the δ - and σ -frequency range but increases in γ - frequency range. 216 The relay cell population responds similarly but the ketamine impact is less prominent. 217 Conversely, in the reticular cell population ketamine enhances slightly spectral power in 218 the δ -frequency range only. 219

Now applying a-tDCS enhances EEG power in the δ - and σ -frequency band and moves the spectral EEG power from the γ -frequency band to lower frequencies. Relay cells respond to the a-tDCS by a similar power increase in the δ - and σ -frequency, while γ -activity is retained. In the reticular population, the a-tDCS stimulation enhances the δ -power but does not affect the spectral power in larger frequencies.



Figure 6. Cortical and subcortical activity under ketamine and anodal tDCS. (A) Model activity time courses of EEG (upper panels), relay cell population (center panels) and reticular cell population (lower panels) under different conditions. (B) Power spectral density distributions of EEG (top panel), relay cell population panel (center panel) and reticular cell population (bottom panel). Parameters are $f_{tDCS} = 1.05$ corresponding to stimulation duration of 4min with $\tau_{plast} = 1 \text{ min}$, $f_{ketamine} = 0.7$ in the cortico-thalamic loop and $f_{ketamine} = 0.8$, $f_{tDCS}^{resp} = 2.0$ in SG layers.

These ketamine-induced effects are summarized in Fig. 7(A), where cortical and relay 226 cell power decrease in the δ - and σ - frequency band with ketamine, while ketamine en-227 hances δ -power in reticular cells. Additional a-tDCS stimulation enhances further cortical 228 and relay cell population power in the δ - and σ -band, while the impact on reticular pop-229 ulation is weak. Conversely, γ -activity is strongly enhanced by ketamine in cortical cells 230 and diminished by a-tDCS. The sub-cortical γ -activity is poorly affected by the a-tDCS 231 application. Despite a difference in the δ - band reticular response to ketamine, theses 232 findings show good accordance to previous experimental findings in rodents [26,60] and 233 patients suffering from schizophrenia [9]. 234

To reveal more details on the brain dynamics in psychosis, functional connectivity between brain areas provide some insights [72,73]. We have computed the phase coherence in the CTC between their involved neural populations, cf. Fig. 7(B). Ketamine enhances FC in the δ -frequency range between the cortical GIG, the relay and the reticular cells, while it diminishes FC in the σ - range between these populations. The FC is also reduced between cortical and thalamic relay cells and between the thalamic structures in the γ -frequency 240

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range under ketamine, whereas it does not affect the cortico-reticular connectivity. Now adding a-tDCS, FC increases between almost all areas and frequency bands, except in the intra-thalamic connections in the γ -band. Hence, a-tDCS inverses the ketamine FC reduction in the σ -band between all areas and in the γ -range between GIG layer cells and relay cells. 243



Figure 7. Relative spectral power and phase coherence PLV in the cortico-thalamic circuit. (A) The ratio of power spectral density averaged over frequencies in the corresponding frequency band and the corresponding average power spectral density in the control condition. The power in cortical cells consider GIG cells. (B) Degree of phase coherence (PLV) between excitatory cortical GIG population activity and the excitatory relay population activity (top panel), the excitatory cortical GIG layer and the reticular population activity (center panel) and between the reticular and relay cells (bottom panel). To notice, there is no cortico-reticular phase coherence in the basal condition. Model parameters are $f_{\text{tDCS}}^{\text{resp}} = 2.0$, $f_{\text{tDCS}} = 1.03$ and $f_{\text{tDCS}} = 1.05$ for stimulation input I_1 and $I_2 > I_1$, respectively. Ketamine parameters are identical to parameters used in Fig. 6.

4. Discussion

4.1. Excitability and spectral power

We present a neural population model which permits to reproduce major experimental 249 EEG data features observed under tDCS. This model implies a cortico-thalamic feedback 250 loop that generates the δ - and σ -rhythm. This loop includes GIG cortical cells, relay 251 cells and reticular cells with corresponding excitatory and inhibitory synaptic connections. 252 Moreover, a SG cell population is the origin of the γ -rhythm in good accordance with 253 previous experimental results [74,75]. The reproduced features include an increased (de-254 creased) excitability for a-tDCS (c-tDCS) in good agreement with previous experimental 255 findings [47,49]. The presented excitability study is very brief and demonstrates a fun-256 damental excitability modulation with tDCS. Future work should evaluate the presented 257 evoked potential model much further, e.g. comparing modeling results to previous detailed 258 expertimental results [76]. 259

In addition, long duration a-tDCS enhances EEG power in good agreement with experimen-260 tal studies in humans [9,67–69,77,78]. Our model assumes LTP-like long term potentiation 261 of excitatory synapses and corresponding model simulations reproduce well the EEG 262 power enhanced by a-tDCS. We propose to describe the rather complex neurophysiological 263 plasticity effects by a simple modulation of the synaptic excitatory efficacy. Moreover, we 264 present a stimulation-timing model that relates a temporal stimulation protocol with the 265 plasticity effect. Future studies will evaluate this model by comparison to experimental 266 tDCS effects as described in [79,80]. 267

Since this model simplification reproduces EEG power features successfully, the present work supports the LTP-like effect of a-tDCS. The model also permits to predict the a-tDCS impact on thalamic cells and we find a poor effect on the thalamic power. Future experimental work will evaluate and verify this finding. As an additional well-known effect, 271

long-term impact of tDCS on the brain decays after some time. This effect is central in 272 patients whose possibly successful tDCS impact decay after some months after treatment 273 stop [5,8,9,44]. We have proposed a decay model of the plasticity effect which describes 274 well the modulation of the tDCS after stimulation ends, cf. Figs. 3 and 4. Several previous studies have modeled the electric field induced by tDCS [81–83]. Such 276 studies provide some insights into the spatial location of tDCS impact, but does not allow 277 to explain the dynamic impact on experimentally observed data. A different recent model 278 study has focused on the tDCS impact on single neuron activity in neural populations considering homeostatic structural plasticity [84]. This impressive work takes into account 280 different stimulation protocols in more detail than our work does. However it does not explain major tDCS effects on neural oscillatory brain activity that has been observed vastly 282 in previous studies. The present work provides such an explanation in the context of psychosis taking into account recent neurophysiological hypothesis. Moreover, the ensemble 284 model does not exhibit a realistic brain topology such as our CTC model and hence is less 285 realistic concerning the brain network structure. 286

4.2. Spectral power in the psychosis model

We have further extended the neural model to describe EEG under psychosis assum-288 ing a ketamine model [25,27]. Identifying the brain state induced by ketamine with the 289 psychotic state and the control brain state as a healthy state, we observe a drop of δ – and σ -power in the simulated EEG in the psychotic state compared to the healthy state. Con-291 versely, the psychotic state exhibits a strong γ – power enhancement. These findings are in 292 good agreement with experimental data in humans [23–25] and rats [20–22]. Nevertheless, 293 we also show an increase in the δ - power of reticular cells in the simulated psychotic 294 state. This result defer from recent findings in which all CTC structures present a δ – power 295 decrease after acute ketamine treatment [26,58]. Also, previous experimental studies have 296 shown that a-tDCS may alleviate psychosis patients from symptoms [5,8,9,85]. Our model 297 predicts an enhancement of δ – and σ – power and a reduction of γ – power by a-tDCS, 298 which well replicate ancient experimental findings in an animal ketamine model [60]. 299

4.3. Connectivity modulation in the psychosis model

The functional connectivity between brain areas reflects the brains ability to pass and 301 share information between the structures. For instance, brain networks in mental disor-302 ders exhibit diminished FC between brain areas and thus a network fragmentation [86]. 303 Enhanced functional dysconnectivity has been found in early psychosis [87] and reduced 304 conscious access in psychosis is related to diminished long-range structural connectiv-305 ity [88], then supporting the dysconnection hypothesis in schizophrenia [10,11]. This fragmentation can be reversed by psychotherapy in combination with a placebo or anti-307 psychotics [89] and by a-tDCS [73]. It is interesting to note that a-tDCS not only enhances FC in psychosis patients but also in healthy subjects [90]. This indicates that a-tDCS may 309 enhance brain FC in general. We have investigated this effect by computing FC in our neural model and found equivalent results. In the σ - and γ - frequency range, FC decreases 311 in the ketamine model compared to the control condition. Conversely FC between all CTC 312 structures increases in the δ - frequency band during the ketamine condition suggesting a 313 δ – hypersynchronisation in the entire CTC network in the psychotic state. This new result 314 adds to the previous finding of intra-thalamic γ – synchronisation [26] driven by cortical 315 " γ - noise" [22]. Interestingly, for all frequency bands, a subsequent a-tDCS stimulation 316 re-enhances FC. The only exception is the intra-thalamic FC in the γ - range that decreases 317 by a-tDCS. 318

4.4. Strength and limits of the neural model

The proposed model permits to reproduce experimental results on excitability and spectral power of EEG originating in cortical layers, as well as excitability and spectral

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power of neural activity in non-cortical brain areas. Moreover, the model allows to predict 323 FC in the cortico-thalamic circuit and elucidates how tDCS augments information sharing 324 between brain areas. To gain these insights, the neural model considers recent hypothesis 325 how tDCS affects synapses and neuronal populations. For instance, we assume that tDCS 326 induces an intrinsic Poisson-noise activity in single neurons that represents a modulated 327 input current and transfer function in the population [48]. This allows to describe the 328 well-known modulated excitability by short duration-tDCS. Moreover, the simple assump-329 tion that long duration-anodal tDCS reflects an augmented excitatory synaptic efficacy in 330 cortical neurons similar to the effect of LTP permits to describe the EEG power modulation 331 under a-tDCS. 332

To describe the anodal tDCS-impact in psychosis-related prodrome, we present a neu-333 ral ketamine model that considers both the hypofunction of NMDA receptors and the ketamine-induced disinhibition. Both mechanisms appear to be essential to reproduce the 335 σ -power diminution and γ -enhancement found experimentally. Since ketamine both in-336 hibits excitatory cells and inhibitory cells and the latter inhibition yields disinhibition of the 337 population, it is an open question how the different power responses emerge. Our model 338 explains this by actions in two sub-circuits. Neuronal populations in the cortico-thalamic 339 loop, including granular/infragranular cortical layer, thalamic relay cells and reticular 340 neurons, experience primarily the ketamine-induced hypofunction generating the power-341 diminished σ -rhythm. Simultaneously, the cortical supragranular layer neurons and the 342 ARAS are affected by the ketamine-induced disinhibition. Since the thalamus and ARAS 343 are known to project to the supragranular layer neurons generating the γ -rhythm [38], the 344 ketamine-induced disinhibition yields a γ -power enhancement as observed experimen-345 tally. 346

Now recalling that a-tDCS has been found to enhance the brain, it appears counter-348 intuitive that the additional a-tDCS diminishes the γ -power in the ketamine model as shown experimentally [60]. To resolve this seeming contradiction, our simulations indicate 350 that the combination of the cortical Poisson-neuron input and ARAS input in the supragranular layers yields a power shift from the γ -frequency range to lower frequencies, and 352 hence a drop in γ -power. This power shift explains the γ -power drop, but remains to be 353 shown experimentally. 354

The presented model is a rate-coding population model that considers firing rates of single neurons but neglects the timing of single spikes and spike train modes. This 357 simplification is reasonable to describe mesoscopic population activity such as Local Field 358 Potentials or EEG [33]. However, tDCS modulates both spike patterns and spike timing [91] 359 and may affect the spectral power of neural populations without modulating neuron firing 360 rates [92]. Our neural model does not describe such a spike train effect, making it unable to 361 capture such rhythm modulations. This represents a limit of the population rate model. 362

Moreover, the model does not specify the underlying neuron type but implies a 364 general type-I neuron [93]. It also does not specify details of intra- and inter-network 365 connections, such as realistic spatial neural networks in single brain areas and topographic 366 thalamo-cortical mapping. At a first glance, this may represent a strong limitation of the 367 model and questions its validity. However, we argue that we are interested in the general 368 underlying neural mechanism of tDCS and its impact in psychosis valid for all mammals. 369 Since tDCS in different subjects of different mammalian species trigger similar EEG neural responses [44,51,65,66], it is important to choose a general rather simplistic population 371 model that captures essential neural features and hence is independent of specific model choices. Here, the essential features are the nonlinear transfer function between synaptic 373 input and population firing rate, realistic synaptic response models and a brain network 374 topology of realistic polarity, i.e. with realistic excitation and inhibition. For instance, the 375 emergence of a reticular δ -activity observed in Fig. 4 matches experimental findings in the 376

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thalamus [94,95] and results from the chosen network topology as shown previously [32].

Future work should improve the neural model by including neural mechanisms of 379 spindles since these are known to represent important EEG markers in psychosis and 380 their prodrome [26,96,97]. Incorporating spiking modes of the reticular population should 381 allow to reproduce such dynamics, switching from bursting mode in the control/healthy 382 condition to single action potential/tonic mode in the psychosis/ketamine condition [26]. 383 In addition, there is strong evidence that the δ -rhythm originates in the cortico-thalamic loop [98,99] and its role in psychosis remains to be revealed [100]. Future work will ad-385 dress the function and origin of δ -rhythms in psychosis in more detail. Essentially, the present work demonstrates how to describe mathematically neurostimulation impact on 387 EEG and how to predict brain activity. This may trigger models for other neurostimulation techniques over the scalp, such as transcranial Alternating Current Stimulation (tACS), 380 transcranial Magnetic Stimulation (TMS) or cerebellar neurostimulation. Indeed, most neuromodulatory approaches have attracted increasing attention in recent years and seem 391 to represent promising tools for future clinical treatment and prevention in psychiatry [101]. 392

5. Conclusions

The present work provides a mathematical description of tDCS impact on brain activ-395 ity in the context of psychosis and give track to improve experimental setups. To reproduce 396 the ketamine-induced oscillopathies, usually used to mimic the schizophrenic prodrome-397 related EEG, the essential neural mechanisms are a reduced cortical inhibitory efficacy 398 and an increased ARAS input to cortical structures. This supports the NMDA receptor hypofunction hypothesis in schizophrenia. Moreover, the simulation of tDCS influence on 400 EEG can be achieved by simple modulation of synaptic efficacy, with a temporal dimension 401 to mimic long-term plasticity effects. Finally, these findings support the idea that a-tDCS 402 could reduce, or even normalize, schizophrenia prodrome-related oscillopathies, indicating 403 its powerful potential as a preventive treatment. 404

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Appendix A Mathemtical details of the population model

Appendix A.1 The population model

The model describes population activity in the cortex layers I-III and the corticothalamic loop between cortical layers IV-VI, the thalamic relay cells and the reticular structure. The layer I-III excitatory (inhibitory) mean potential is u (v), the excitatory (inhibitory) mean potential in the layer IV-VI neurons is denoted as V_e (V_i), the variables $V_{th,e}$ and $V_{th,i}$ denote excitatory and inhibitory mean potentials in the thalamic relay cells

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and V_{ret} denotes the mean potential in the reticular structure. In a good approximation for large networks, these variables obey

$$\begin{aligned} \tau_{e} \frac{dV_{e}(t)}{dt} &= -V_{e}(t) + F_{e}T_{c}[V_{e}(t) - V_{i}(t)] + F_{ct}T_{th}[V_{th,e}(t-\tau) - V_{th,i}(t-\tau)] \\ &+ F_{ccx}S_{e}[u(t)] + \mu_{e} + I_{e} + \rho_{e}(t) + c_{1}I(t) \\ \tau_{i}\frac{dV_{i}(t)}{dt} &= -V_{i}(t) + F_{i}T_{c}[V_{e}(t) - V_{i}(t)] + \mu_{i} + I_{i} + \rho_{i}(t) + c_{2}I(t) \\ T_{th,e}\frac{dV_{th,e}(t)}{dt} &= -V_{th,e}(t) + F_{tc}T_{c}[V_{e}(t) - V_{i}(t)] + \mu_{th,e} + \rho_{th,e}(t) \\ \tau_{th,i}\frac{dV_{th,i}(t)}{dt} &= -V_{th,i}(t) + F_{tr}T_{ret}[V_{ret}(t)] + \mu_{th,i} + \rho_{th,i}(t) \\ \tau_{ret}\frac{dV_{ret}(t)}{dt} &= -V_{ret}(t) + F_{rt}T_{th}[V_{th,e}(t) - V_{th,i}(t)] + F_{rc}T_{c}[V_{e}(t) - V_{i}(t)] + \mu_{ret} + \rho_{ret}(t) \\ \tau_{ce}\frac{du(t)}{dt} &= -u(t) + F_{cx}^{u}S_{e}[u(t)] - M_{cx}^{u}S_{i}[v(t)] \\ &+ F_{cx,th}T_{th}[V_{th,e}(t-\tau) - V_{th,i}(t-\tau)] + \mu_{ce} + I_{ce} + \rho_{ce}(t) + c_{3}I(t) \\ \tau_{ci}\frac{dv(t)}{dt} &= -v(t) - F_{cx}^{v}S_{i}[v(t)] + M_{cx}^{v}S_{e}[u(t)] + \mu_{ci} + I_{ci} + \rho_{ci}(t) + c_{4}I(t) \end{aligned}$$

with the transfer functions

$$T_m[x] = \frac{1}{2} \left(1 - \operatorname{erf}\left(-\frac{x}{\sqrt{2}\sigma_m}\right) \right)$$
(A2)

$$S_m[x] = \frac{1}{2} \left(1 - \operatorname{erf}\left(-\frac{x}{\sqrt{2}\sigma_{\rm cm}}\right) \right)$$
(A3)

$$\langle \xi_x(t) \rangle = 0$$
 , $\langle \xi_x(t) \xi_y(t') \rangle = \frac{D_x}{N} \delta_{xy} \delta(t-t')$.

Here, *N* is the number of neurons considered in the underlying network and D_x is the variance of the input noise in population x = e, *i*, {th, e}, {th, i}, ret, *ce*, *ci*. We point out that the population model is a mean-field model originating from a neuron variance do [27, 20, 102, 104] and d differentiation input to the temp for function T_x and C_y

network [37,39,102–104] and additive noise input shapes the transfer functions T_m and S_m by the corresponding noise variance σ_m , σ_{cm} . In more detail, the variance σ_m^2 in the transfer function (A2) is in a good approximation

$$\begin{split} \sigma_c^2 &= \frac{D_e}{\tau_e} + \frac{D_i}{\tau_i} \quad , \quad \sigma_{th}^2 = \frac{D_{th,e}}{\tau_{th,e}} + \frac{D_{th,i}}{\tau_{th,i}} \quad , \quad \sigma_{ret}^2 = \frac{D_{ret}}{\tau_{ret}} \\ \sigma_{ce}^2 &= \frac{D_{ce}}{\tau_{ce}} \quad , \quad \sigma_{ci}^2 = \frac{D_{ci}}{\tau_{ci}} \; . \end{split}$$

Appendix A.2 Implementation of tDCS

To describe the impact of tDCS on the brain, it is important to distinguish short-term and long-term stimulation. For short stimulus periods, no plasticity effect occurs. Anodal tDCS induces an increased input current *I* and increased variances σ_c^2 and σ_{ce}^2 [39,48]. For long-term stimulation, we assume an increased excitatory synaptic efficacy in cortical layers with $F_e \rightarrow f_{tDCS}F_e$, $F_{ct} \rightarrow f_{tDCS}F_{ct}$, $F_{ccx} \rightarrow f_{tDCS}F_{ccx}$, $\mu_e \rightarrow f_{tDCS}\mu_e$, $I_e \rightarrow$ 430

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 Table A1. Parameter set of model (A1).

parameter	description	value
τ_e	exc. decay time (infragranular)	10ms
$ au_i$	inh. decay time (infragranular)	50ms
$\tau_{th.e}$	exc. decay time (relay)	5ms
$\tau_{th.i}$	inh. decay time (relay)	30ms
$ au_{ret}$	exc. decay time (reticular)	8ms
$ au_{ce}$	exc. decay time (supragranular)	5ms
$ au_{ci}$	inh. decay time (supragranular)	20ms
τ	cortico-thalamic propagation delay	35ms
F _e	exc. synaptic strength	1.0
F_i	inh. synaptic strength	2.0
F_{ct}	synaptic strength (relay \rightarrow cortex)	1.2
F _{tc}	synaptic strength (cortex \rightarrow relay)	1.0
F_{tr}	synaptic strength (reticular $ ightarrow$ relay)	1.0
F_{rt}	synaptic strength (relay $ ightarrow$ reticular)	0.3
F _{rc}	synaptic strength (cortex $ ightarrow$ reticular)	0.6
F^u_{cx}	synaptic strength (exc. $ ightarrow$ exc.)	2.18
M^u_{cx}	synaptic strength (inh. $ ightarrow$ exc.)	3.88
F_{cx}^v	synaptic strength (inh. $ ightarrow$ inh.)	2.18
M_{cx}^v	synaptic strength (exc. $ ightarrow$ inh.)	3.88
F _{ccx}	synaptic strength (supragranular $ ightarrow$ infragranular)	0.05
$F_{cx,th}$	synaptic strength (thalamic relay \rightarrow supragranular)	0.1
μ_e	exc. noise input (infragranular)	0.1
I_e	exc. resting input (infragranular)	0.2
μ_i	inh. noise input (infragranular)	0.0
I_i	inh. resting input (infragranular)	1.7
$\mu_{th,e}$	exc. noise input (relay)	1.2
$\mu_{th,i}$	inh. noise input (relay)	1.0
μ_{ret}	exc. noise input (reticular)	0.0
μ_{ce}	exc. noise input (supgragranular)	0.05
Ice	exc. resting input (supragranular)	1.1
μ_{ci}	inh. noise input (supgragranular)	0.05
I _{ci}	inh. resting input (supragranular)	0.4
D_e	exc. input noise variance (infragranular)	$3 \cdot 10^{-5}$
D_i	inh. input noise variance (infragranular)	0.001
$D_{\rm th,e}$	exc. input noise variance (relay)	$2.5 \cdot 10^{-6}$
$D_{\rm th.i}$	inh. input noise variance (relay)	$12.6 \cdot 10^{-6}$
$D_{\rm ret}$	exc. input noise variance (reticular)	$10.9\cdot10^{-6}$
D_{ce}	exc. input noise (supragranular)	$2 \cdot 10^{-5}$
D_{ci}	inh. input noise (supragranular)	$8\cdot 10^{-5}$
N	number of neurons	1000

 $f_{tDCS}I_e, D_e \to f_{tDCS}D_e, c_1 \to f_{tDCS}c_1 \text{ and } F_{cx}^u \to f_{tDCS}F_{cx}^u, M_{cx}^v \to f_{tDCS}M_{cx}^v \text{ and the plas-}$ ticity factor $f_{tDCS} > 1.$ 434

The plasticity factor is chosen as a fixed value in the majority of simulations, but here we provide a model to describe how it may evolve in time during and after tDCS. Following the strong relation between synaptic plasticity and LTP which may originate from tDCS-induced neural synchronization, we assume that the plasticity effect reflects a certain degree of synchronization and thus is low for short tDCS and saturates at a maximum value for long tDCS. Then the growth of f_{tDCS} with stimulation time may obey the growth law of populations. With $f_{tDCS} = 1 + f$ we postulate

$$\frac{df}{dt} = p(f) - d(f) \tag{A4}$$

with the plasticity birth process obeying a logistic equation

 $p(f) = \frac{I_0 f}{\tau_{\text{plast}}} \left(1 - \frac{f}{f_{\text{sat}} - 1} \right)$

and the plasticity death or decay process

$$d(f) = -rac{f}{ au_{
m decay}} \, .$$

The time constant τ_{plast} and τ_{decay} represent the time scale at which tDCS enhances and diminishes plasticity-induced excitation, respectively. Experiments show that plasticity is enhanced rather fast (tens of minutes) compared to long-term plasticity (hours and days). Hence, we choose $\tau_{\text{plast}} \ll \tau_{\text{decay}}$. Moreover, when tDCS is applied it is $I_0 = 1$ and otherwise $I_0 = 0$.

For illustration, neglecting the decay of plasticity ($\tau_{decay} \rightarrow \infty$)

$$f_{\text{tDCS}}(t) = 1 + \frac{f_{\text{sat}} - 1}{1 + \frac{f_{\text{sat}} - 1 - f_0}{f_0} e^{-t/\tau_{\text{plast}}}}$$

where *t* is the stimulation time and f_0 is the initial plasticity $f_0 = f(t = 0)$. This is the logistic function shown in Fig. 3(A, left panel). For absent tDCS ($I_0 = 0$), the plasticity decays by

$$f_{\rm tDCS}(t) = f_0 e^{-t/\tau_{\rm decay}}$$

cf. Fig. 3(A, right panel).

In addition, model equation (A4) permits to describe the a-tDCS impact of a certain stimulation protocol with intermittent periods of stimulation. Fig. 3(B) shows solutions of model equation (A4) for different a-tDCS duration. According to typical a-tDCS stimulation protocols, one applies a-tDCS with a duration T_s (typically tens of minutes) and pauses between stimulations (typically several hours or days).

Appendix A.3 Implementation of evoked potentials

We assume an input current as a sum of a constant tDCS current I_{tDCS} = const and 461 a time-dependent stimulus-evoked current $I_{EP}(t)$, i.e. $I(t) = I_{tTDCS} + I_{EP}(t)$. In addition, 462 the evoked current affects the system transfer functions yielding $\sigma_c^2 \rightarrow \sigma_c^2 + \gamma_1 I(t)$ and 463 $\sigma_{ce}^2 \rightarrow \sigma_{ce}^2 + \gamma_2 I(t), \ \sigma_{ci}^2 \rightarrow \sigma_{ci}^2 + \gamma_3 I(t) \text{ with some factors } \gamma_1, \ \gamma_2, \ \gamma_3 > 0.$ 464 The evoked stimulation $I_{EP}(t)$ is modeled as a sequence of periods with durations T with 465 $I_E P = 0.05$, while these periods have an equally distributed random duration in the interval 466 $180 \text{ms} \le T \le 220 \text{ms}$. The stimuli exhibit a random interstimulus interval ISI, which is 467 equally distributed in the interval $370 \text{ms} \le \text{ISI} \le 530 \text{ms}$. A simulation time of 90s yields 468 \sim 200 trials, whose average represents the Event-related Potential component (ERP). Its 469

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magnitude illustrates the degree of excitability of the system, i.e. the larger is the response the more excitable the system is. Moreover, we define the baseline activity in the interval just 50ms before the stimulus onset in each trial. Its trial average indicates the system excitability as well, similar to the response magnitude, cf. Fig. 2.

Appendix A.4 Implementation of ketamine impact

The anesthetics ketamine is an antagonist of NMDA receptors [54,55] and affects the 475 brain dopamine system [56]. Ketamine has several diverse actions. At sub-anesthetic doses 476 in humans, it induces an hypofunction of NMDA receptors and increases the release of 477 glutamate in cortical structures [105,106]. Similar results were found in rats [107]. This 478 counterintuitive excitation effect could be due to the preferential and markedly inhibitory 479 action of ketamine over GABAergic cortical interneurons [57] and thalamo-reticular neu-480 rons [26,58]. Since the NMDA hypofunction at GABAergic neurons diminishes their activity, 481 an effective disinhibition of glutamatergic neurons of cortical layer IV and the thalamus 482 is triggered. At subcortical levels, sub-anesthetic ketamine induces a discharge reduction 483 in reticular and thalamic neurons [58]. According to previous experiments on rats [60], 484 we assume sub-anesthetic doses implying a major disinhibition and an inhibition effect at 485 NMDA receptors. In our model, we implement these effects by a factor $f_{ket} < 1$ in the corti-486 cal inhibitory efficacy parameter $F_i \rightarrow f_{ket}F_i$, in the excitatory cortico-thalamic connection 487 to the relay cell population $F_{tc} \rightarrow f_{ket}F_{tc}$, in the inhibitory reticular-relay cell connection 488 $F_{tr} \rightarrow f_{ket}F_{tr}$, in the excitatory relay-reticular connection $F_{rt} \rightarrow f_{ket}F_{rt}$ and the excitatory 489 cortico-thalamic connection to the reticular structure $F_{rc} \rightarrow f_{ket}F_{rc}$. Moreover, ketamine 490 diminishes the inhibitory synaptic efficacy in layers I-III and we choose $M_{cx}^v \rightarrow f_{ket} M_{cx}^v$. 491

In addition, the neurophysiological impact of ketamine proposes a strong disinhibition in subcortical structures, indicating an enhanced ARAS input to cortical structures [108,109]. Since cortical layers I-III receive ARAS input, we consider enhanced activity noise input to these layers. In our mathematical model, this input is taken into account by $\sigma_{ce} \sim 1/f_{\text{ket}}$, where σ_{ce} is the noise input variance to layer I-III neurons. Together with the excitatory plasticity factor for input response $f_{\text{tDCS}}^{\text{resp}} > 1$, we choose $\sigma_{ce} \rightarrow f_{\text{tDCS}}^{\text{resp}}/f_{\text{ket}}\sigma_{ce}$.

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