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# Right temporal alpha oscillations as a neural mechanism for inhibiting obvious associations

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Creative cognition requires mental exploration of remotely connected concepts while suppressing dominant ones. Across four experiments using different samples of participants, we provide evidence that right temporal alpha oscillations play a crucial role in inhibiting habitual thinking modes, thereby paving the way for accessing more remote ideas. In the first experiment, participants completed the compound remote associate task (RAT) in three separate sessions: during right temporal cortex alpha (10 Hz) tACS, left temporal alpha tACS, and sham tACS. Participants performed better under right tACS only on RAT items in which two of the three words shared misleading semantic associations. In the second experiment, we measured EEG while the participants solved RAT items with or without shared misleading associations. We observed an increase in right temporal alpha power when participants correctly solved RAT items with misleading semantic associations. The third experiment demonstrated that while solving divergent thinking tasks, participants came up with more remote ideas when stimulated by right temporal alpha tACS. In the fourth experiment, we found that participants showed higher right temporal alpha power when generating more remote uses for common objects. These studies altogether indicate that right temporal alpha oscillations may support creativity by acting as a neural mechanism for an active inhibition of obvious semantic associations.

alpha oscillations  $\mid$  creativity  $\mid$  active inhibition  $\mid$  EEG  $\mid$  brain stimulation

#### Introduction

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A long-standing theory of creativity postulates that the ability to come up with remote and less expected semantic associations is a key characteristic of creative individuals (1). These semantic associations can be represented as edges between different nodes (concepts), linked through their proximity or common use (2). According to the spreading activation theory of semantic processing (3), every time we search for concepts associated with a word, we start from stronger associations to move progressively, in the order of strength of semantic associations, towards weaker or more remote ones (e.g., cat > dog > animal > pet > human > people > family). That is to say that, the activation (concept's retrieval) spreads from strongly connected nodes (concepts) to less connected ones. Creativity requires reaching those more remote associations on the less connected concepts. Using graph theory and an insightful analytical approach, it has been shown that highly creative individuals, compared to less creative ones, show broader and less modular semantic networks (4, 5). Nonetheless, we do not know what are the neural mechanisms which enable to inhibit strongly connected concepts to reach the most remote ones

A key question is how creative individuals are able to engage flexibility of thought to avoid the "most travelled paths" to get to their alternative routes and draw more remote associations. For instance, more creative individuals are shown to avoid taking obvious routes when solving creative problems (6). Further, a study showed that under low cognitive load, individuals tend to explore alternative routes or more remote associations (7). The authors suggested that inhibition mediates this exploration by actively and naturally inhibiting most immediate associations, which could explain why we expand our semantic networks as we work on a problem.

Creative thinking involves searching through a clutter of associated concepts or ideas, and the presence of obvious associations is a distraction from the desired creative solution (e.g., finding unusual uses for an object or finding a remote association); such obvious but misleading associations are needed to be actively inhibited for producing more creative associations. Here we tested the hypothesis that alpha oscillatory activity enables us to inhibit the most obvious associations in order to get to more remote ideas. Considering the key role of alpha oscillations in the active inhibition of distractions in both visual search (8, 9) and working memory tasks (10), we predicted that this process of actively inhibiting obvious or strong associations could be mediated by an increase in alpha oscillations as it occurs when inhibiting other internal or external distractors.

We suggest that this hypothesis could potentially explain a wide range of findings with regards to the role of alpha oscillations (specially right lateralised) in creative problem solving (11). For example, alpha power increases during both divergent (i.e. ability to come up with a large number of original ideas) and convergent (i.e. ability to come up with one appropriate correct solution) creative thinking processes under higher internal attentional demand (12). Right lateralized alpha oscillations have also been shown to be higher during the generation of more original ideas in a divergent thinking task (13). Further, modulating frontal alpha oscillations with transcranial alternating current brain stimulation (tACS) increased performance on divergent thinking tasks (14).

## Significance

'Taking a less travelled path' is often considered an effective approach to creativity, i.e., creative thinking calls for a break from habitual thinking and associations. Yet little is known about its underlying neural mechanism. In a series of four independent experiments involving electrophysiological and brain stimulation methods, we provide evidence that this process is mediated by the right temporal alpha oscillations. Alpha oscillations are known to represent a process of active inhibition to suppress irrelevant information, such as inhibiting distractions during visual search. Through monitoring the brain's electrical activity during different creativity tasks and by stimulating the right temporal brain region at the alpha frequency, we show that a similar process of active inhibition is also key to creative thinking.

**Reserved for Publication Footnotes** 



Fig. 1. Effects of tACS on performance in the RAT. A. Proportion of correct solutions during left, sham and right tACS averaged over items with vs. without shared wrong semantic associations. **B.** Relative efficacy index during each stimulation condition (left, sham, and right temporal tACS); **C.** Relative efficacy index for each condition for items which have a shared wrong associated word between two of the cues vs. the ones that did not (without shared wrong association); and **D.** Relative efficacy index for items with 0, 1, and 2 or more shared wrong associations for left (first graph), sham (mid-graph) and right tACS stimulation. Error bars represent +/- 1 S.E.M. \* p < .05, \*\* p < .01, \*\*\* p < .001.

Fig. 2. RAT performance accuracy. Proportion of: A. correct; B. incorrect solutions; and C. time outs (non-responses), for non-shared (blue) and shared (red) items. Error-bars represent +/- 1 S.E.M. \*\*\* p < .001.

Finally, right lateralized alpha oscillations increased prior to cognitive insight (15-17).

Here, across four experiments with independent samples, we investigated how alpha oscillations contribute to both convergent and divergent creative cognition, and provided a neural mechanism linking these two distinct cognitive processes. For brain stimulation, we targeted the right temporal region due to its key role in semantic processing (18-20), integration of associated information (21), and in recognising associations between different concepts (22). The first experiment aimed at understanding the effects of the right temporal alpha (10 Hz) tACS on the remote associates task (RAT), a classical convergent thinking task, relying on the remote associations between presented cues. We predicted that right alpha tACS would improve performance on RAT items containing a shared wrong semantic association, as these require

stronger active inhibition in order to find the remote association. In the second experiment, by recording EEG, we investigated the brain oscillatory responses to the RAT items that contained shared wrong associations compared to the ones that did not. In the third experiment, we applied tACS at the individual alpha peak frequency (IAF) over the same brain regions of experiment 1, before, during, and after an alternative uses task, a classical divergent thinking task. We predicted that the right temporal alpha tACS would be associated with the generation of more remote ideas. In the fourth experiment, by recording EEG, we investigated the IAF power during the alternative uses task. We predicted that more remote ideas would be associated with higher individual alpha power compared to less remote ideas. Therefore, across all four experiments, our common binding hypothesis was that the right temporal alpha oscillations play a key role in

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Fig. 3. Individual alpha power during remote associate items with and without wrong shared associations. A. Topographical distribution of the differences represented as t-values in the relative individual alpha power (IAF, log10); B. Average relative individual alpha power (IAF, log10); at the right temporal electrode (highlighted in A) averaged over the whole trial, separately for correct and incorrect responses in RAT items with shared wrong associations (red) and without (blue), \* p < .050, \*\* p < .025, \*\*\* p < .001.

creative cognition, by inhibiting the obvious semantic associations which can pave the way to more remote and creative ideas.

## **Experiment 1**

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Mednick's remote associate task, (RAT, 1, 23) is a typical convergent thinking task which emphasizes the importance of association of remote concepts in creative cognition. In the RAT's compound-word version (24), participants are presented with three cue words (e.g., walker/main/sweeper) and are asked to find a solution or target word which makes a compound word with each of these three words (e.g., solution is street: streetwalker/main-street/street-sweeper). People tend to seek the solution word by searching in the pool of semantically related words to the presented cues (25-27). However, there is a trap in this habitual thinking; when two cue words have close semantic association with a word that is not the correct solution, this can get in the way of the true solution, thereby acting as an important distractor which attracts internal attention (6). For example, the two cues (ear and tone) of the RAT item ear/tone/finger share a dominant but misleading association (sound), which needs to be inhibited in order to reach the solution (ring). In contrary, the cues of the RAT item high/teacher/mate (solution: school) do not share any strong common association. The ability to inhibit the most obvious but misleading semantic association is therefore of particular benefit for solving difficult remote associate problems (28), and more creative individuals are found to successfully avoid most common but incorrect candidate solutions (6). Yet, the neural mechanism underlying this process of inhibiting the habitual, most obvious associations and promoting the remote, less dominant associations during creative problem solving has largely been uncharacterized.

Considering that right temporal alpha oscillations have been consistently found to be involved in the insightful solutions of these problems (15-17) and in coming up with original ideas (11, 13), we tested the role of alpha oscillations in the temporal regions (right, left, sham). By stimulating alpha oscillations through tACS during the RAT, we tested whether alpha oscillations are involved in establishing weak or distant associations or in helping to inhibit dominant, but misleading, semantic associations. tACS can be used to modulate brain oscillations in a frequency-specific manner (e.g. 29), and is a powerful tool to examine the role of cortical oscillations in human behaviour by directly manipulating brain states in a controlled fashion. Considering the key role of alpha oscillations in the active inhibition of distractions (8, 9), we predicted that, rather than boosting creative problem solving in general, right temporal alpha would be specifically involved in inhibiting the most obvious associations.

#### Results

Using a large dataset of semantic associations (30, 31), we considered the RAT items as having a "shared wrong association" if two out of the three cues were strongly associated with a word which was not the solution (see Materials and Methods). Thirty participants received right, left temporal and sham 10 Hz tACS in three separate sessions while solving RAT items with or without shared wrong semantic associations. We entered the proportion of correct solutions to those problems in a 2 (shared wrong association: yes vs. no) x 3 (stimulation condition: left, sham, right tACS) within-subjects ANOVA. The results (Fig. 1A) revealed a significant effect of stimulation condition ( $F_{(2,28)} = 4.52, p = .015$ ,  $\eta^2 = .139$ ). Importantly, we observed a significant interaction between shared wrong association and stimulation condition ( $F_{(2,28)} =$ 3.22, p = .047,  $\eta^2 = .10$ ), since the proportion of correct solutions was higher during right tACS compared to both sham ( $t_{(28)} =$ 2.27, p = .031, *Cohen's d* = .450) and left tACS ( $t_{(28)} = 2.99$ , p =.006, *Cohen's d* = .555) only for the RAT items with shared wrong associations; there was no significant difference between these conditions for the items without shared wrong associations (p > .2). There was no difference between left tACS and sham for either shared or non-shared items (p > .2). Unsurprisingly, there was a significant main effect for shared wrong association ( $F_{(1,28)} =$ 8.17, p = .008,  $\eta^2 = .226$ ) since the accuracy was expectedly higher for items which did not have a shared wrong association.

To compare how successful the stimulation was for each of the RAT items according to their semantic associations, we calculated the relative efficacy index for each RAT item (Materials and Methods) as the difference between the proportion of correct solutions in one condition (e.g., right tACS) and the average of the proportion of correct solutions in the other two conditions (e.g., sham and left tACS). Positive (negative) values of the index indicate a larger (smaller) proportion of correct solutions under a given stimulation/sham condition in relation to the average of the other two. The mean efficacy index for each condition is presented in Fig. 1B. A repeated-measures ANOVA with stimulation condition (left tACS, sham, right tACS) as a factor revealed that more RAT items were correctly solved during the right tACS stimulation compared to the left tACS and sham ( $F_{(2,268)} = 3.593$ , p = .029,  $\eta^2 = .026$ ). Further, we observed a significant linear trend in solved RAT items from left, sham to right ( $F_{(2,268)} = 6.04$ , p = .015,  $\eta^2 = .043$ ) tACS. Participants correctly solved more RAT items during right than during left stimulation (p = .015, Cohen's d = .425) and sham (p = .029, Cohen's d = .381), but there was no difference between left tACS and sham (p = .612).

Next, we probed whether the items with shared wrong associations were more likely to be solved during right tACS compared to left tACS and sham, and whether this effect was stronger on items with more shared wrong associations. The relative efficacy index was analysed in a 3 (shared wrong association:  $0, 1, \ge 2$ ) x 3 (stimulation condition) mixed design ANOVA. We observed a significant main effect of stimulation condition ( $F_{(2,242)} = 6.06, p$ = .002,  $\eta^2$  = .052), as well as a significant interaction between 402stimulation condition and shared wrong association ( $F_{(4,242)} = 2.57$ , 403 p = .038,  $n^2 = .041$ ). The effectiveness of right tACS increased 404 with the number of shared wrong associations (Fig. 1C), whereas 405 the opposite was true for left tACS (within-subject effects for 406 the interaction between stimulation condition and shared wrong 407 association:  $F_{(2,121)} = 4.894, p = .009, \eta^2 = .075$ ). The right tACS 408



**Fig. 4.** Average ratings for AUT responses before, during, and after tACS (vs. sham). A. Averaged creativity ratings for items before (top - blue), during (middle - red), and after (bottom - blue) left, sham, and right IAF tACS. **B.** The same analysis as in A for the remoteness. **C.** The same analysis as in A and B for the cleverness ratings. The error bars represent +/- 1 S.E.M. \*\*\* p < .001; \*\* p < .01; \* p < .05.



Fig. 5. Differences between AUT answers rated as high vs. low in three rating dimensions. A. Topographical distribution of the differences (paired *t*-tests) between IAF power during the generation of ideas which were rated as high (above the median) vs. low (below the median) in remoteness, cleverness and general creativity. B. Mean and variability of IAF power at the right temporal electrode T8 during the generation of ideas rated as high and low in the three criteria. The error bars represent +/- 1 S.E.M. \*\*\* p < .001; \*\* p < .05.

efficacy was higher on RAT items with 2 or more associations as evidenced by a large effect size ( $\geq 2$  vs. zero) shared wrong associations: *Cohen's d* = .848, CI: .811 to .886,  $t_{(73)} = 4.59$ , p < .001). Sham stimulation efficacy was independent of the items' semantic associations (p > .3).

#### **Experiment 2**

The second experiment was designed to investigate the role of alpha oscillations in inhibiting strong misleading associations in a new group of participants. Based on the semantic analysis we performed for Experiment 1, we selected a set of 45 RAT items, which share a misleading semantic association, and another set of 45 RAT items, which do not. Of note, these two sets were matched for difficulty based on the performance accuracy in Experiment 1. We conducted an EEG study comparing individual alpha frequency (IAF) oscillatory power in response to RAT items containing shared vs. non-shared associations. This experiment was also designed to analyse the frequency and spatial specificity of the differences between shared vs. non-shared RAT items. We hypothesized that, in order to solve RAT items with a shared wrong association, participants would need to actively inhibit the prominent, but incorrect association in order to reach the desired solution. Therefore, on the neural level, we predicted that RAT items with shared wrong associations would elicit stronger right temporal IAF power compared to the non-shared RAT items. Further, correct responses to shared items was predicted to be as-sociated with higher IAF power than incorrect responses, due to successful inhibition of the wrong association. At the behavioural 

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Results

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However, if right temporal alpha oscillations are indeed associated with the inhibition of obvious associations in general, we expected that they would also promote more remote responses in other tasks involving creative cognition. Therefore, we conducted

level, we predicted that shared RAT items would induce a higher

rate of false alarms (incorrect responses), as suggested by others

Fig. 2A shows the proportion of correct solutions with or without

shared wrong association; no difference between the two was

observed  $(t_{(56)} = -1.041, p = .302, Cohen's d = .138)$ , showing that

the shared and non-shared categories are matched for difficulty

as expected since the two sets of items (shared and non-shared)

were earlier matched for accuracy. Fig. 2B shows the proportion

of incorrect solutions for the two types of RAT items; as predicted,

the participants made more mistakes on items with shared wrong

associations compared to non-shared (paired *t*-test:  $t_{(56)} = -3.756$ ,

p < .001, Cohen's d = .498), suggesting that shared items induced

more false alarms compared to non-shared items. Fig. 2C shows

the proportion of no responses or time-out trials; a paired *t*-test

revealed that participants tended to answer more to the items with

shared associations  $(t_{(56)} = 3.865, p < .001, Cohen's d = .512),$ 

which is not surprising since misleading associations might cause

alpha frequency (IAF) in response to RAT with vs. without shared

wrong associations for correct and incorrect solutions (Fig. 3A).

IAF power values were analysed by a three-way repeated mea-

sures ANOVA with shared wrong association (yes, no), accuracy

(correct, incorrect) and ROI (right frontal: RF, left frontal: LF,

right temporal: RT, left temporal: LT, right parietal: RP, left

parietal: LP, mid-central: MC) as factors. We found that IAF

power was higher for shared compared to non-shared items but

the effect was dependent on the ROI (interaction between shared

wrong association and ROI:  $F_{(6,246)} = 3.775, p = .001, \eta^2 = .084)$ ,

and a three-way interaction between shared wrong association,

*ROI*, and *accuracy* ( $F_{(6,246)} = 2.251$ , p = .039,  $\eta^2 = .052$ ). There

was no main effect for accuracy ( $F_{(1,41)} = 2.432$ , p = .127,  $\eta^2$ 

= .056) nor shared wrong association alone ( $F_{(1,41)}$  = .185, p =

.669,  $\eta^2 = .005$ ), neither interactions between the two ( $F_{(1,41)} =$ 

.431, p = .515,  $\eta^2 = .010$ ), indicating that the effects of shared

wrong associations on alpha power was specific to the ROIs

and dependent on whether the item was solved correctly. To

investigate the interaction further, we compared alpha power

between shared and non-shared on each of these ROIs (t-maps

shown on Fig.3A). We observed that for correctly solved trials,

individualised frequency alpha power was higher when the par-

ticipants were solving shared compared to non-shared items (RT:

 $t_{(41)} = 2.685, p = .010, Cohen's d = .416$ ). IAF power at the right

temporo-parietal electrode was also higher during RAT items

with shared associations ( $t_{(41)} = 2.395, p = .021, Cohen's d = .369$ ),

but not at the right parietal region (*RP*:  $t_{(41)} = 1.904$ , p = .064,

oscillation, we conducted the same analysis on the average power

over alpha band power (8-12 Hz) and also over the traditional

frequency bands, including theta (4-8 Hz), beta (13-30 Hz) and

gamma (30-40 Hz). The results showed that the effects were non-

significant in other frequency bands (p > .05) except for the alpha

frequency band in which we observed similar effects compared to

alpha oscillations in inhibiting strong associations in a RAT task.

a third experiment to investigate the effects of right temporal

tACS on the alternative uses task (33), a commonly employed

Experiments 1 and 2 focused on investigating the role of

In order to investigate whether this effect was specific to alpha

Cohen's d = .293, see methods for ROI definition).

the IAF (see SI Appendix, Fig. S2).

Experiment 3

For EEG data, we compared relative power of the individual

the participants to provide the associate word as a solution.

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measure of divergent thinking, i.e. capacity to generate a number613of original ideas. A new sample of participants was asked to gen-614erate alternative uses to commonly used objects whilst receiving615either sham, left or right temporal tACS at their individual alpha616frequency (IAF, see Materials and Methods) based on their resting617state EEG.618

Three raters, blind to the conditions (double blinded), rated each response for general creativity, remoteness, and cleverness. The ratings were based on items generated before, during, and after tACS (left, sham, and right IAF). We tested each period separately because the objects used during the stimulation were different (Materials and Methods). As the effects of tACS are mainly limited to the stimulation period, we expected that the effects of right IAF tACS would be significant during stimulation. For each participant, we calculated the average fluency (number of nonobvious responses) and the average ratings for general creativity, remoteness, and cleverness (see Materials and Methods). Since we expected the effects to be most significant for remoteness ratings, we analysed each rating separately by a one-way ANOVA with stimulation condition as a within-subjects factor. We predicted that the participants would come up with more remote responses during the right temporal alpha stimulation. We did not run a mixed ANOVA due to the fact that the items in the pre- and postwere counterbalanced but the items during the stimulation were always the same (see Materials and Methods for more details).

# Results

First, we observed no significant differences between groups in the pre-test for any of the measures, including fluency ( $F_{(2,33)}$ ) = .38, p = .688), general creativity ( $F_{(2,33)}$  = 1.66, p = .206), remoteness ( $F_{(2,33)} = .42, p = .663$ ), and cleverness ( $F_{(2,33)} = .73$ , p = .489), suggesting no pre-existing differences between groups. Second, during tACS, we observed, as predicted, a significant effect of *stimulation condition* on the remoteness of the uses  $(F_{(2,33)} = 5.27, p = .010, partial \eta^2 = .24)$ , but not on their general creativity ( $F_{(2,33)} = .94, p = .401, partial \eta^2 = .054$ ), fluency ( $F_{(2,33)}$ = .89, p = .421, partial  $\eta^2 = .051$ ), or cleverness ( $F_{(2,33)} = .48$ , p =.623, partial  $\eta^2 = .028$ ). Post-hoc contrasts revealed that the right IAF tACS group came up with significantly more remote items compared to both left IAF tACS (p = .003, Cohen's d = 1.3, C.I. = 1.18-1.39) and sham (p = .030, Cohen's d = 0.92, C.I. = 0.82-1.03) groups (Fig. 4). There was no significant difference between sham and left IAF tACS (p = .385). Third, we observed that these effects vanished in the post-test period (i.e. after stimulation had ended) as there was no difference between groups in relation to the remoteness of the ideas ( $F_{(2,33)} = .33$ , p = .724, partial  $\eta^2 = .019$ ), nor in any other measure including fluency ( $F_{(2,33)} = .80$ , p = .458, partial  $\eta^2 = .046$ ), general creativity ( $F_{(2,33)} = .129$ , p = .879, *partial*  $\eta^2$  = .008), and cleverness ( $F_{(2,33)}$  = .46, p = .955, partial  $\eta^2 = .003$ ).

## **Experiment 4**

In experiment 3, we demonstrated that stimulating right temporal alpha at the IAF is associated with an increase in remoteness of the items generated during a divergent thinking task. Since the stimulation was delivered during the task, we tested whether IAF would be higher for more remote items. In order to address this question, we measured EEG while a new sample of participants generated a number of different ideas in an alternative uses task (AUT). We measured power at each participant's individual alpha frequency peak (IAF) during the generation of each separate idea. All responses were judged by raters blind to the experimental conditions (see *Materials and Methods*).

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# Results

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682 We compared IAF power on trials with average ratings above 683 (high) or below (low) the median using a 3 (rating type: remote-684 ness, cleverness, general creativity) x 2 (performance: high vs. low) 685 x 7 (ROI: LF, LT, LP, ML, RF, RT, RP) within-subjects ANOVA. 686 We observed a significant three-way interaction between rating 687 *type*, *performance*, and ROI ( $F_{(12,1476)} = 2.030, p = .019$ , *partial* 688  $\eta^2 = .020$ ) since we only observed significant differences in IAF 689 between high and low remoteness ratings. To investigate the in-690 teraction further, we run additional 2 (performance: high vs. low) x 691 7 (ROI: LF, LT, LP, ML, RF, RT, RP) ANOVAs per rating type. 692 We observed a significant interaction between *performance* and 693 *ROI* only for remoteness ratings ( $F_{(6,774)} = 3.454, p = .002, partial$ 694  $\eta^2 = .026$ ), but not for cleverness ( $F_{(6,774)} = 1.349, p = .233, partial$ 695  $\eta^2$  = .010) or for general creativity ( $F_{(6,774)}$  = 0.738, p = .619, 696 697 *partial*  $\eta^2 = .006$ ). The topography of the differences between high 698 and low performance on each rating (Fig.4) provides evidence 699 that the differences between items with high vs. low remoteness 700 peaked at the right temporal electrode ( $t_{(123)} = 2.756, p = .007,$ 701 Cohen's d = .247). There was no statistically significant difference 702 in IAF power between high and low performance on cleverness 703 and general creativity in any of the ROIs (all contrasts p > .1). Furthermore, there was no main effect of *rating performance*  $(F_{(1,123)} = .092, p = .762, partial \eta^2 = .001)$ , indicating that the differences were not a result of a better performance in general. 704 705 706 707 We conducted the same analysis in the traditional frequency 708 bands (theta: 4-8Hz, alpha: 8-12 Hz, beta:12-30 Hz, and gamma: 709 30-40 Hz), but observed no significant three-way interaction in 710 any of them nor a main effect of rating performance (for more 711 details of the analysis and the topoplots of the contrasts, see SI 712 Appendix). 713

# Discussion

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In this paper we provide evidence supporting the role of right temporal alpha oscillations in creative cognition. We suggest that alpha oscillations in the right temporal brain region shapes inhibition of the most common or obvious associations. We presented evidence in support of this hypothesis in four separate experiments. In our first experiment, we observed that right temporal alpha tACS was most beneficial for those RAT items that required participants to override prominent but wrong candidate solutions, indicating that right temporal alpha oscillations play a critical role in the ability to override habitual, but misleading, associations. In a second experiment, we observed higher right temporal alpha power while the subjects were trying to solve RAT items with shared wrong associations. In a third experiment, we observed that the right temporal tACS at the IAF was associated with an increase in remoteness of uses in an alternative uses task, but not in cleverness or general creativity. In a fourth experiment, we observed that the participants showed higher right temporal alpha activity (IAF) when they were generating items with higher as compared to lower remoteness. Altogether, our results provided robust evidence supporting the hypothesis that right temporal alpha oscillations are involved in actively inhibiting strong semantic associations, in both convergent and divergent thinking tasks. In the remainder of this discussion, we consider the principal ways our findings critically advance our understanding on the role of alpha oscillations on creative cognition, its neurophysiological mechanisms and the limitations in our approach.

First, our findings support the hypothesis that right lateralized alpha is a core feature of creative cognition, which might underlie our capacity to override strong semantic associations that are shaped by prior experience. Our results also support the hypothesis that exploration is mediated through active inhibition. This idea was put forward by Baror & Bar (7) who observed that when the cognitive load was high, participants tended to fail in supressing stronger semantic associations. Alpha oscillations have earlier been linked to the process of active inhibition (34): they do not merely signalise idle activity, but an energy consuming suppression process. Our study provides the first evidence suggesting that right temporal alpha oscillations may be critical to the inhibition of strong semantic associations.

Second, our results shed new light on our understanding of both convergent and divergent creativity. Although the neuroscience of creativity has shown some inconsistent results in relation to its neural mechanisms (35), most of the EEG research on the topic showed a robust association between alpha oscillations and creativity both during task and at rest (for a review see: 11). This involvement with alpha oscillations is evident in a number of studies showing increases in right hemispheric alpha during creative ideation (12, 13, 36-38). For example, alpha oscillations increase over the right hemisphere during idea generation and this increase is higher for more creative ideas (13). Higher alpha oscillations are also predictive of cognitive insight (17). Furthermore, right hemispheric alpha power previous to a hint presentation in an RAT task was predictive of whether the participants would successfully use the hint to correctly solve the problem (16). These studies, though informative, have no control over how much the RAT items or specific tasks required the participants to override immediate semantic associations, yet this process is crucial in both divergent and convergent creative problem solving (39). For instance, if we need to generate alternative uses of a glass, first we must inhibit our past experience leading to think of a glass as a container. Our study is the first (to our knowledge) to demonstrate that right temporal alpha oscillations is linked with overriding these strong associations in both convergent and divergent thinking.

Third, by providing a fine-grained analysis of two well-known creativity tasks (RAT and AUT), we offer a new approach for the investigation of higher order cognition and how it links to more basic neurophysiological processes. For instance, our findings support the account that right hemispheric alpha is involved in inhibiting common or more obvious associations which might get on the way of generating non-obvious creative solutions, i.e. remote associations. We provide evidence that inhibiting wrong semantic associations can be facilitated by alpha tACS on the right, but not left, temporal area. Previous tACS work (14) showed a general effect of frontal alpha (F3, F4 and Cz) on creativity, which could be related to general top-down mechanisms necessary to complete the task rather than specific cognitive processes associated with higher originality of the responses. This is consistent with a previous EEG study (12) showing that both convergent and divergent creativity were associated with higher prefrontal alpha oscillations when these tasks are done under higher internal attentional demand. It is possible that alpha oscillatory activity could represent different processes depending on the brain regions they occur during creative ideation.

Alpha synchronization is known to represent a process of 801 heightened attention by blocking both external and internal dis-802 tractions, which is necessary for creativity and consistent with 803 the role of alpha oscillations in active inhibition of distractions 804 (8, 9). Previous studies showed that higher alpha-band power is 805 associated with the suppression of distracting information in both 806 working memory (e.g. 10) and attentional tasks (e.g. 40). For 807 creative cognition, we suggest prominent associations between 808 two cues (i.e. wrong candidate solutions) or between an object 809 and its common use need to be inhibited in order to reach more 810 remote ones. Our findings suggest that this inhibitory process 811 is stronger in the right temporal area, which is a key region for 812 processing semantic associations (18, 19, 21, 22). This is relevant 813 since here we show the role of alpha oscillations in a task-relevant 814 area. Considering that alpha oscillations were found to coordi-815 nate the timing of the action potentials (41), it has been suggested 816

817 (42) that higher alpha frequency power leads to more precise 818 timing of neuronal activity, and therefore reflects the temporal 819 structure for the processes controlling the access to information 820 stored in complex knowledge systems. Selective access to higher 821 order information would depend on inhibiting task-irrelevant 822 memory entries. In our study, both tasks required semantic search 823 for remote associations that might be facilitated by sustained 824 inhibition of stronger associations, which could be considered 825 as task-irrelevant memories. According to Klimesh, Sauseng, & 826 Hanslmayr (42), higher alpha amplitude in task-relevant areas 827 promote inhibition by silencing weakly excited cells inducing a 828 pulsed pattern of action potentials in cells with higher excitation 829 level (threshold), a process which would increase the signal-to-830 noise ratio in the region, shaping the access to the knowledge systems. Here we speculate that the inhibition of the obvious 831 832 associations requires a similar tuning of semantic association 833 brain regions. We suggest future studies to combine EEG and 834 fMRI to investigate how alpha oscillations shape the inhibition 835 of the semantic association networks as in our study, we did 836 not have enough spatial resolution to understand the anatomo-837 functional substrates of this process. It is important to notice 838 that the strongest effects were observed in the individual alpha 839 frequency which we measured based on the peak power at the 840 right temporal region. Although the effects were similar in the 841 traditional alpha frequency band and also pronounced when we stimulated at 10Hz, we cannot rule out that different findings 842 843 could have emerged if we had compared the conditions using the 844 individual alpha frequency of other regions or stimulated other 845 regions at their own individual peak frequencies. 846

In summary, we provided robust evidence that the right 847 temporal alpha oscillations play a critical role in the ability to 848 override habitual, but misleading, associations during creative 849 problem solving. 'Taking a less travelled path' is often considered 850 an effective path to creativity (i.e. creative thinking calls for a 851 break from habitual thinking and associations), and our findings 852 support that the underlying cognitive mechanisms are served by 853 the temporal alpha oscillations. In order to understand the pro-854 cesses underlying the production of novel and adequate ideas, we 855 need to break down its constituent processes, dissecting creativity 856 as much as possible at first, and then analyzing them in context, 857 putting them back together through careful consilience. 858

#### **Materials and Methods**

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All participants across four experiments gave written informed consent before the beginning of each experiment. The study protocols of experiments 1 and 3 were approved by the local ethics committee at Goldsmiths, University of London. The study protocols of experiments 2 and 4 were approved by the local ethics committee at Queen Mary University of London. All experiments were conducted in accordance with the World Declaration of Helsinki (1964). Experiment 1

Participants. Thirty (15 females) right-handed participants was recruited from the student population at Goldsmiths, University of London. Participants received course credit or monetary reimbursement at a rate of £10 per hour. Exclusion criteria were: a personal or family history of epilepsy and/or neuropsychiatric disorders, pregnancy and the presence of any metallic or medical implants. Participants were also excluded if they took any recreational drugs within the past month or consumed any alcohol within 24 hours preceding each experimental session. One participant took part in another experiment on RAT prior to completing this study, and was excluded from analysis. The final sample (n = 29) was aged between 18-46 years (24.6 ± 5.9 years; Mean ± SD)

Experimental design and task. A counter-balanced, within-participants design was adopted; participants attended three separate stimulation sessions in three different days with an inter-session interval of 7 days. In each session, participants completed a computerised version of the compound word version (24) of the remote associate task (1, 23) under one of three online tACS stimulation conditions - 10 Hz right temporal, 10 Hz left temporal, and sham stimulation. Participants were blind to the condition. On each RAT trial (SI, Fig. S1A), participants were shown three cue words (e.g., line/house/palm), and had to come up with the solution word (tree), which would form a valid compound word with each of the three cue words (treeline, treehouse, palm-tree). The solution word can be joined either at the beginning or end of the cue words, and the resultant compound word may be one that would be written as one word, or as two separate words

(with or without a hyphen). There were 45 trials per stimulation condition (counterbalanced, see SI Materials and methods for details).

Semantic Word Association. We extracted the word association mea-887 sures based on the largest database for word associations (30, 31), available 888 online at http://www.smallworldofwords.com/new/visualize/#. This database 889 draws word associations based on a large corpus of English words (12000 English words, with over 70000 participants) and was built based on primed 890 associations by asking participants to give the strongest three associated 891 words for a given word (31). For each cue and solution word of each RAT 892 item (i.e. triplet or triad), we checked the top 20 associated words as listed in 893 the database. To observe if there was a shared wrong association, we looked into the first 20 associated words for each cue and found whether the cues 894 shared a same word as top association. Subsequently, we classified the RAT 895 items according to whether or not they shared a wrong candidate solution 896 (yes = 59/ no = 65). Two additional measures (cue-solution and solution-cue 897 association) were also employed as a control measure (see SI methods and SI 898 additional analyses).

Transcranial Alternating Current Stimulation (tACS). Transcranial alternating current stimulation (tACS) was delivered using a Neuroconn DC-Plus Stimulator, a constant current device (NeuroConn Ltd., Ilmenau, Germany). Electrodes were positioned based on the international 10-20 EEG electrode placement system, with one electrode (5cm x 7cm) positioned over the vertex (Cz), and the target electrode (5cm x 5cm) positioned over either the left (T7) or right (T8) anterior temporal lobe, depending on the stimulation condition (Fig. S1B). In each session, a 10 Hz sinusoidal current (1 mA peak-to-peak), with a zero-degree phase offset and no DC offset, was delivered via two saline soaked sponge-covered rubber electrodes, attached to participants' scalps with rubber head straps. The current was ramped up and down over 10 seconds at the beginning and end of stimulation. In both active stimulation sessions, participants received 30 minutes of online stimulation. For the sham condition, the stimulation was delivered for just 30 seconds at the start and the current was subsequently ramped down and remained off for the remainder of the session. In both active sessions, stimulation began five minutes prior to commencement of the experimental task, and then continued for the subsequent 25 minutes during which participants completed the computerised RAT. Across all sessions, electrode impedance was kept below 20 kΩ throughout.

Data analysis. We calculated the accuracy as the percentage of correct solutions for each participant in each condition. To quantify the effectiveness of a stimulation condition on individual RAT item performance, we calculated an index, termed as the relative efficacy index, which was the difference between the proportion of correct solutions for the stimulation condition (e.g., right tACS) and the average of the proportion of correct solution for the other two conditions (left tACS and sham).

Experiment 2

Participants. Sixty-two neurologically healthy adults (39 female) aged between 18 and 27 years (20.47 ± .25 years: mean ± SD) took part in this experiment. All participants were native speakers of English and righthanded (self-reported). Three participants were excluded due to technical problems (computer crashed at the end - data was not recorded), and two more due to poor performance (less than 10 correct responses), resulting in 57 participants used for the behavioural analysis. For the EEG analysis, 5 participants were further excluded due to noisy EEG recording (coughing, muscle artifacts) resulting in a total of 52 participants (5 excluded due to behavioural data and 5 due to poor EEG quality). Because we focused on the comparisons between items with vs. without shared associations which were correctly responded (vs. incorrect), we included in the analysis only participants who had at least 5 valid trials in each condition, resulting in a total number of 42 participants. All participants received a monetary compensation of  $\pounds 10$ /hour for their participation.

Experimental task and procedures. The task was identical to the one in experiment 1 (Fig. S1A) except that there were 90 RAT items in total. There were 45 items with 1 or 2 shared wrong associations, and 45 items with no shared associations (see Experiment 1). We selected these 90 items strategically by excluding items that presented ceiling (>90% correct) or floor (< 10% correct) effects in order to control for difficulty. Further, two categories were matched for difficulty (p > .05, i.e. no significant differences between the accuracy of the shared vs. nonshared items based on participants' performance in experiment 1). The presentation order of RAT items was randomised across participants.

EEG recording and analysis. The EEG was recorded using a Starstim 20 (Neuroelectrics, Spain) and preprocessed according to standard procedures (see SI Materials and Methods). To compute the time-frequency representation (TFR), the EEG signal (entire duration from stimulus presentation to 944 response) was convolved with a complex Morlet wavelet on a trial-by-trial 945 basis. The TFR was calculated from 2 to 40 Hz, in steps of 0.5 Hz, using 6-946 cycle wavelets. The TFR values were averaged for each of the four conditions 947 correct shared, correct non-shared, incorrect shared, and incorrect nonshared - for each participant over the whole epoch and also from 0 to 1 948 second after stimulus presentation. The individual alpha peak frequency 949 (IAF) was calculated as the frequency with the highest power from 8 to 12 950 Hz at the right temporal electrode (T8). The mean IAF was 10.02 (SD = 1.05).

951 Data analysis. For behavioural data, we compared the proportion of correct and incorrect (false alarms) responses, reaction times and insight 952

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953 ratings of each participant, for shared vs. non-shared items. For EEG data, we compared brain responses to shared and non-shared RAT items separately 954 for correct and incorrect solutions: time-out trials were excluded from future 955 analysis. Spectral power in each frequency immediately following the RAT 956 item presentation (whole trial and also 0 to 1s) was log-transformed (base 957 10) due to its positively skewed distribution and divided by the total power 958 (2 to 40 Hz). Therefore, we analysed relative power in each frequency band: theta (4-8 Hz), alpha (8-12 Hz), beta (12-30 Hz) and gamma (30-40 Hz), as 959 well as the IAF, defined as the frequency with the highest power from 8 to 960 12 Hz (+/- 2 Hz). 961

#### Experiment 3

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Participants. Thirty-six participants aged between 19 and 35 years (23.9 ± 4.45 years; Mean ± SD) took part in this study in exchange for course credit or a monetary reimbursement at £10/hr. Participants were randomly assigned to one of the three conditions: left, sham, and right tACS. There were no differences between age and sex distribution between groups. Standard exclusion criteria were applied (the same criteria for Experiments 1 and 2).

Alternate Uses Task (AUT). In this divergent thinking task (Guildford, 1967), participants were asked to come up with unusual uses for an everyday object within a time period of 2 min per object. There were two sets, one containing 4 objects (Set 1: tin can, newspaper, spoon, baseball cap) and another containing 3 objects (Set 2: brick, shoe, cardboard box). The first set was used before and after the stimulation (2 objects each, counterbalanced across participants), and the second set was used during the stimulation (presented in random order). Additionally, in the post stimulation period, the objects presented in the before the stimulation were presented again, in order to check for changes in performance of the new versus old objects The order of the objects was alternated (each subsequent participant started with a different order).

976 Creativity ratings. Responses were rated by three independent eval-uators who were blind to the conditions and to the objectives of the 977 978 experiment. We used the Consensual Assessment Technique, CAT (43), which is considered by some as the gold standard method for assessing creativity 979 (44). CAT relies on intuitive ratings by two or more trained evaluators, and 980 has been successfully used to evaluate creativity in previous studies (e.g. 981 45, 46). Ratings of creativity have been based on the idea that creativity 982 depends on three core factors: uncommonness, remoteness, and cleverness 983 (47, 48). According to the three-factor definition, uncommonness relates to how unique ideas are (inversely related to their frequency) whereas 984 remoteness refers to how far the suggested use for an object is from its 985 common or everyday use (49). Cleverness in this context refers to how insightful, ironic, humorous, fitting or smart a given use is. In order to 986 investigate how alpha oscillatory activity relates to each of these processes, 987 the judges provided ratings of all responses (presented in random order) 988 on three attributes separately: (i) general creativity: how creative they felt 989 that response was based on intuition and their own ideas of creativity: (ii) 990 remoteness: how remote they thought that the idea was from the original use; (iii) *cleverness:* how clever or appropriate the idea was. We observed a reasonable agreement between the three raters (intra-class correlation: IC) 991 992 for the general creativity (IC = .67; CI: .64 - .70) and remoteness (IC = .70; CI: 993 .68 - .72), and a slightly reduced agreement on the cleverness judgments (IC 994 = .56; CI: .50 - .62). The ratings of three judges were z-scored (all responses, 995 per object) and averaged for analysis.

EEG and tACS protocol. EEG was recorded before the brain stimulation session using a StarStim (Neuroelectrics, Spain) with 8 channels. The EEG was recorded at a sampling frequency of 500 Hz, referenced to the arithmetic average of the left and right mastoids, high-pass filtered at 1 Hz, and lowpass filtered at 45 Hz. Automatic artefact rejection was applied at ±85 µV. Power was estimated in each frequency from 1 to 45 Hz in steps of 0.5 1000 Hz using Welch's Periodogram (50% overlap). For tACS, the stimulation 1001 frequency was set at the alpha peak frequency (largest power during eyes-1002 closed resting period, from 8 to 12 Hz) at the stimulated region (left or right temporal) and the current was 1mA (peak to peak). For the sham group, 1003 half were stimulated (only ramp up) at the IAF on the left temporal and the 1004 other half at the right. The mean IAF for the left tACS group was 10.00 (SD = 1005 0.64) and for the right tACS it was 9.99 (SD = 1.16). There was no significant 1006 difference in the IAF between the left and the right tACS groups ( $t_{(22)} = .027$ , 1007 p = .979).

Procedures. At the beginning, participants were instructed to keep their eyes closed for a period of 3 minutes while their EEG were recorded; we estimated the IAF from this EEG recording. Subsequently, the participants responded to 2 practice items and carried on with the pre-test task. Following the pre-test, the EEG electrode corresponding to the stimulation condition (left or right) was replaced by a round rubber stimulation electrode (25 cm<sup>2</sup>) soaked in saline solution. In each session, a sinusoidal current (1mA peak-to-peak) at the individual alpha peak frequency, with a zero-degree

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phase offset and no DC offset, was delivered via two saline soaked sponge-1021 covered rubber electrodes. One electrode was positioned on either T8 (right 1022 temporal) or T7 (left temporal) and the other was always positioned at Fz. 1023 During sham, half of the participants had the electrodes positioned at T8-Fz 1024 and the other half at T7-Fz. The participants were blind to the stimulation condition. The AUT started after 5 minutes of the start of the stimulation. 1025 The total duration of the stimulation was 25 minutes, during which the 1026 participants performed three AUT items and 2 figural creativity tasks (not 1027

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analysed in this paper). Following the stimulation, the stimulation electrode (T7 or T8) was removed, the area was cleaned and the EEG electrodes were placed. The signal was visually inspected to assure good quality. The EEG was recorded immediately after the signal passed this check, including 3minute eyes-closed and 3-minute eyes-open (fixating on a cross on the wall) recordings. Following the EEG, the participants completed the AUT and figural creativity tasks.

#### Experiment 4

Participants. One-hundred thirty participants (67 females) aged between 18 and 32 (21.2 ± 2.63 years: Mean ± SD) took part in this experiment in exchange for course credit or a monetary reimbursement at a rate of £7.5/h. The exclusion criteria were the same as in the previous experiments.

Alternate Uses Task (AUT). The experimental task was the same as in Experiment 3. The participants were presented with one object (e.g., table) and were asked to generate unusual uses for it within a 2-min time period. The participants were instructed to fixate at the centre of the screen while thinking and press a button to enter an idea. Once they typed and confirmed this idea, they kept generating other ideas until the 2 minutes were finished. In total, the participants were presented with 4 objects (table, shoe, tin-can, and umbrella) and provided an average of 25 ideas for all the objects (SD = 11.8, range: 2-67).

1044 EEG recording and analysis. The EEG was recorded using a Starstim 20 1045 (Neuroelectrics, Spain) and preprocessed according to standard procedures (see SI: Materials and Methods). The IAF was estimated as with procedures 1046 identical to experiments 2 and 3. For estimating the power spectrum during 1047 the generation of ideas in the AUT trials, we used the whole epoch, from the 1048 word to the button press (to type the response). We only used those epochs 1049 which contained more than 2 seconds of usable data. We estimated alpha 1050 power using Welch periodogram with 1s time-windows with an overlap of 50%. The spectrum was first estimated from 4 to 40 Hz in steps of 1 Hz. The 1051 IAF was defined as earlier as in experiment 2 and 3. The mean IAF was 9.73 1052 (SD = 1.15). For normalization, we divided the power in the IAF adjusted band 1053 power (peak +/- 2 Hz) by the average power of the whole spectrum (4 to 40 1054 Hz).

Creativity ratings. As in experiment 3, each response to the AUT was 1055 rated for general creativity, remoteness, and cleverness, on a scale from 0 1056 (least) to 10 (most), as described in Experiment 3. Due to the large number 1057 of responses (130 participants - 4810 responses in total), 2 raters rated all 1058 responses related with 2 objects, and other 2 raters another two objects. 1059 Another 2 raters rated the entire pool of responses. The ratings were subsequently z-scored separately, per item and per rater. This procedure resulted 1060 in a good agreement (intra-class correlation) between raters for the creativity 1061 ( $\alpha$  = .88), remoteness ( $\alpha$  = .89) and cleverness ( $\alpha$  = .84). This procedure resulted 1062 in an average of 12 ideas per condition (high and low), with the average idea (+/- SD) of 12.8 (SD=6) for high and 12.6 (SD = 5.88) for low remote, 1063 12.8 (SD=5.9) for high and 12.7 (SD=5.9) for low cleverness, 12.8 for high (SD=6) and 12.6 (SD=5.9) for low creativity. There was no difference in the number of trials between any of the conditions (p > .8). However, because 1064 1065 1066 some participants had a low number of ideas, we conducted the main analysis using data of the participants who had a minimum of 5 ideas per condition 1067 (n = 124). Nonetheless, we present the analysis with all participants in the SI. 1068

Data analysis. We compared the whole epoch alpha band power (IAF +/- 2 Hz) during the idea generation phase (or "thinking time"), i.e. when 1069 the subjects were engaged with generating ideas. For each participant, we 1070 selected the trials with ratings higher or lower than the median for each 1071 rating individually (remoteness, cleverness, general creativity). We calculated 1072 the relative alpha power (by dividing it by total power) on the individual 1073 alpha frequency band (as in Experiments 2 and 3) in the low vs. high rating 1074 trials of each subject. 1075

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