

1 Running head: Brain activity during analogy learning

2 **Analogy instructions promote efficiency of cognitive processes during hockey push-**
3 **pass performance**

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24

Analogy instructions promote efficiency of cognitive processes during hockey push-pass performance

Abstract

Analogy instructions may promote effective skill acquisition by providing movement specific information that can be processed as a single, meaningful unit, rather than as separate ‘bits’ of information (Liao & Masters, 2001; Masters, 2000). Behavioural evidence suggests that information processing associated with analogy instructions is less effortful than information processing associated with explicit instructions, resulting in reduced verbal-analytical involvement in movement control (Lam, Maxwell, & Masters, 2009b).

This experiment was designed to test whether analogy instructions promote higher psychomotor efficiency, characterised by greater high-alpha power in the left hemisphere of the brain (Hillman, Apparies, Janelle, & Hatfield, 2000) and reduced co-activation between the verbal processing (left temporal lobe T7) and motor planning regions of the brain (frontal midline Fz, Hatfield & Hillman, 2001) during motor performance.

Novices practiced a hockey push-pass task using an analogy instruction, explicit instructions or no instructions (control). Push-pass accuracy during a combined task (passing coupled with decision-making) was significantly better following the analogy instruction, which suggested that information processing was less effortful. Left-temporal (T7) EEG high-alpha power was significantly higher in the analogy condition, but T7-Fz co-activation was not significantly different among the conditions.

It is possible that the analogy instruction influenced verbal aspects of information processing without impacting on efficiency of motor planning. Consequently, an analogy instruction may promote cognitive, rather than psychomotor, efficiency.

Keywords: Analogy motor learning, EEG alpha power, EEG coherence, psychomotor efficiency

Introduction

1
2 Implicit motor learning research has shown that during early stages of learning it can be advantageous
3 to accrue only a minimum of declarative information about the movement to be learned (Masters, 1992).
4 Various forms of implicit motor learning have been developed, including error-reduced learning (e.g.,
5 Maxwell, Masters, Kerr, & Weedon, 2001), dual-task learning (e.g., Maxwell, Masters, & Eves, 2000)
6 and analogy learning (e.g., Liao & Masters, 2001). Benefits have been reported during performance
7 under pressure (Hardy, Mullen, & Jones, 1996; Koedijker, Oudejans, & Beek, 2007; Lam, Maxwell, &
8 Masters, 2009a, 2009b; Liao & Masters, 2001; Masters, 1992), fatigue (Masters, Poolton, & Maxwell,
9 2008; Poolton, Masters, & Maxwell, 2007) and when decisions have to be made during performance
10 (Masters, Poolton, Maxwell, & Raab, 2008; Poolton, Masters, & Maxwell, 2006). Performance of
11 implicitly learned tasks has also been shown to remain stable when a cognitively challenging second
12 task is completed concurrently (Koedijker et al., 2011, 2007; Lam et al., 2009b; Masters, Lo, Maxwell,
13 & Patil, 2008; Maxwell et al., 2001; Poolton et al., 2006).

14 Analogy learning is a form of motor learning in which an analogical instruction is presented instead
15 of declarative rules about the movement. An analogy conveys information about a complex construct
16 or task (in this case, a motor task) by way of comparison with a simple, familiar concept, often in the
17 form of an image. Liao and Masters (2001) provided empirical evidence that analogy learning benefits
18 performance similarly to other methods of implicit motor learning (e.g., errorless learning, secondary
19 task learning). Table tennis novices were instructed that in order to learn a topspin forehand they should
20 “strike the ball while bringing the bat up the hypotenuse of [a] triangle” (Liao & Masters, 2001, p. 310).
21 No other information was provided. Performance of participants instructed by analogy was robust both
22 in a dual-task situation and under psychological stress, compared to participants instructed explicitly
23 with rules for how to hit a topspin forehand. Other research has since confirmed that when a skill is
24 learned by analogy instead of declarative rules, performance remains stable under pressure (e.g., in an
25 adapted basketball task, Lam, Maxwell, & Masters, 2009), when high-complexity decisions have to be
26 made concurrently (Masters, Poolton, Maxwell, et al., 2008; Poolton et al., 2006), and in dual-task
27 settings (Lam et al., 2009b).

1 The exact mechanism by which analogy instructions influence motor learning and performance
2 remains ambiguous. Donnelly and McDaniel (1993) showed that analogy learning leads to accrual of
3 less verbalisable (but more inferential) knowledge about scientific concepts, which is one of the
4 defining characteristics of implicit learning (Berry & Broadbent, 1984; Hayes & Broadbent, 1988). Liao
5 and Masters (2001) found that analogy learners accrued only a small amount of explicit knowledge
6 about the motor task that they were learning. Similarly, Schücker, Ebbing, and Hagemann (2010)
7 showed that analogy learning was associated with less awareness of skill-related factors under pressure
8 compared to explicit learning. Worry (under pressure) or a cognitive secondary task can disrupt motor
9 planning and performance if the limited capacity of working memory, the mental domain for short-term
10 storage and information processing, is reduced by a cognitive load. However, experimental studies
11 suggest that motor skills that are acquired implicitly do not rely on working memory to the same extent
12 as skills acquired explicitly; processing of these skills is more efficient and performance is less likely
13 to be disrupted (e.g., Maxwell, Masters, & Eves, 2003; Poolton, Masters, & Maxwell, 2005). It has been
14 argued that analogy learning promotes efficient information processing by packaging movement-
15 specific information in a single, meaningful unit, which reduces reliance on working memory (Liao &
16 Masters, 2001; Masters, 2000; Masters & Liao, 2003). However, little evidence exists to support this
17 claim.

18 Highly efficient cognitive processing is a trademark of expert performance. Hatfield and Hillman
19 (2001) used the term psychomotor efficiency to describe refined allocation of neural resources, absence
20 of effortful cognition (based on brain activity measures), and adaptive, efficient movements by experts.
21 Generally, psychomotor efficiency may reflect either higher performance with reduced neural effort or
22 at least no change in neural effort, or maintenance of performance using less neural effort. Psychomotor
23 efficiency may therefore reflect less reliance on explicit, verbal information during preparation or
24 performance of a movement, as seen in experts compared to novices (Hatfield & Hillman, 2001),
25 following practice (Landers et al., 1994) or between successful and unsuccessful executions (Hatfield
26 & Hillman, 2001; for a review see Hatfield, Haufler, Hung, & Spalding, 2004). If analogies represent
27 movement-specific information as a unit of information rather than as a collection of explicit rules,

1 analogy instruction might reduce the amount of verbal-declarative information that is processed during
2 motor preparation or performance and therefore increase psychomotor efficiency.
3 Electroencephalography (EEG) provides an objective method by which to examine this possibility.
4 EEG quantifies electrical signals on the scalp surface. The signals are measured at different frequencies,
5 which reflect functionally different cognitive processes (Janelle et al., 2000; Ray & Cole, 1985; see also
6 Smith et al., 1999). Psychomotor processes involve medium-range communication between different
7 brain areas, which manifests in signals of alpha-band frequency range (8-12 Hz, Crews & Landers,
8 1993; Klimesch, 1999; Nunez & Srinivasan, 2006). Alpha-wave activity measured on the scalp displays
9 different cognitive functions depending on the exact scalp locations at which the electrical signals are
10 measured. Verbal-cognitive activity, for example, is associated with alpha activity in the left temporal
11 lobe, which underlies the T7 region in the International 10-20 system of electrode placement. Visuo-
12 spatial processes are associated with activity in the right temporal lobe (T8 region) and motor planning
13 is commonly associated with activity in the premotor cortex (frontal midline or Fz region, Kaufer &
14 Lewis, 1999).

15 Alpha band activity is, in general, inversely related to cortical activation, meaning that increased
16 alpha power reflects decreased cerebral activation. Contrastingly to broadband alpha power, which
17 represents general attention processes as well as task-specific processes, activity in the higher-frequency
18 half of the bandwidth (high-alpha power) is more specifically related to long- and medium-range
19 cortico-cortical communication (Crews & Landers, 1993; Nunez & Srinivasan, 2006; Janelle et al.
20 2000; Nunez et al. 1999). High-alpha power is representative of task-specific processes and inter-
21 regional cross-communication (Smith et al. 1999; for a review see Klimesch, 1999). In various expert-
22 novice comparison studies, expertise has been associated with higher alpha power, suggesting that
23 experts are neurally more efficient than non-experts when programming and executing a task (Haufler,
24 Spalding, Santa Maria, & Hatfield, 2000). Studies have also found higher alpha power at frontal and
25 central sites in successful compared to unsuccessful performance (e.g., Crews & Landers, 1993;
26 Hillman et al., 2000). Cooke et al. (2015) found less power in the high alpha band (10-12 Hz) during
27 the pre-movement period in golf putting following errors (especially in experts), which they attributed

1 to increased conscious activity associated with processing and correcting errors. For a review of recent
2 research using psychophysiological measures in sport performance, see Cooke (2013). Neural
3 coactivation between brain regions can provide further insight into psychomotor efficiency. Termed
4 EEG coherence, this measure can tell us how much cross-communication occurs between two regions
5 at a specified time. For example, coherence between signals measured at the left temporal and frontal
6 midline regions indicates involvement of verbal brain areas during motor planning, and potentially is a
7 marker of psychomotor efficiency (Hatfield & Hillman, 2001).

8 If motor analogies convey complex motor skill information in the form of a simple concept or image,
9 then an analogy instruction may lead to reduced information processing demands during motor planning
10 of the specific skill. This increased psychomotor efficiency should be evident in reduced neural
11 coactivation between the left temporal lobe and frontal midline during movement preparation (at least
12 compared to explicit instructions or no instructions). Zhu, Poolton, Wilson, Maxwell, and Masters
13 (2011b) showed that implicit motor learning (using an errorless approach during golf putting) resulted
14 in less neural coactivation between the left temporal lobe (T3)¹ and the frontal midline (Fz) than explicit
15 motor learning, which supports this conclusion (see also continuous tracking; Zhu, Poolton, Wilson,
16 Hu, et al., 2011a). Additionally, increased left-temporal high-alpha power should reflect economy of
17 task-specific cognitive processes brought about by analogy learning. To date, no research has been
18 conducted involving EEG alpha power as a measure of psychomotor efficiency in an implicit learning
19 scenario, nor has any research generalized EEG findings related to error-reduced (implicit) learning
20 (Zhu et al., 2011a; Zhu et al., 2011b) to analogy learning.

21 We developed an analogy instruction for a push-pass in field hockey (“move the [hockey] stick as
22 if you are sloshing a bucket of water over the floor”) and asked whether it promoted higher psychomotor
23 efficiency than explicit instructions (provided by a qualified coach) or no instructions. Psychomotor

¹ In this paper, all labels are translated to the nomenclature suggested in the American Electroencephalographic Society’s “guidelines for standard electrode position nomenclature” (American Electroencephalographic Society, 1994; Chatrian et al., 1985; Jurcak et al., 2007; Klem et al., 1999). The terms T7 and T8 are used for left and right temporal lobes, while Fz is used for the frontal midline. Odd numbers indicate left hemisphere, even numbers indicate right hemisphere locations.

1 efficiency was quantified by measuring left-temporal high-alpha power and T7-Fz (left temporal-
2 frontal) coherence. Participants performed the push-pass as a single task and as a combined task (with
3 concurrent decision-making), both before and after practice (24h delayed retention). Combined tasks
4 reduce the capacity available for motor processing (e.g. Koedijker et al., 2011; Lam et al., 2009b; Liao
5 & Masters, 2001) and therefore may be more sensitive to changes in efficiency than regular (single-
6 task) tests. Based on previous findings (e.g. Liao & Masters, 2001), task-related knowledge (measured
7 by verbal protocols) was expected to be significantly lower in the Analogy instructed group compared
8 to the Explicit and No-Instruction groups, while the latter two groups were not expected to differ. EEG
9 activity was assessed during a 4s-preparation period prior to performing the push-pass alone (single
10 task). We expected to find a greater increase in high-alpha power in the left temporal lobe (T7)
11 following analogy instruction and a greater decrease in T7-Fz coherence, reflecting higher psychomotor
12 efficiency. Alpha power at the right temporal lobe (T8) and coherence between T8 and frontal midline
13 was also assessed, but no differences were expected. We expected greater psychomotor efficiency in
14 people who were taught by analogy to be reflected by better push-pass performance in the combined
15 task compared to people who were instructed with explicit rules or no instructions.

16

17

Method

18 Participants

19 Forty-eight novice hockey players (Mean age = 22.21, SD = 6.16) with normal or corrected-to-normal
20 vision and no movement impairments participated in the study. Participants were recruited from the
21 University of Waikato student population, from classes and by word of mouth. Participants were
22 incentivized to participate with cafeteria vouchers (value NZD10). Participants with more than 20 hours
23 of experience were excluded from the study. Ethical permission for the study was received from the
24 Faculty Ethical Committee of the institution. Participants all provided informed consent.

25

1 **Materials**

2 Standard field hockey sticks (92.7 cm length) were used on an artificial grass surface. Standard
3 Wilson® tennis balls replaced hockey balls. Passes were directed toward a red semi-circle positioned
4 on the wall at ground level, which was surrounded by 13 concentric semi-circles at 10 cm intervals (see
5 Figure 1, left). The distance from the starting position to the target was 340 cm. A Texas Instruments
6 DLP projector was used to project images onto the blank laboratory wall. Performance (accuracy) was
7 measured as distance from the target center and was obtained by manual analysis of video footage from
8 a Sony RX10pi camera focused on the target.

9 *Electroencephalography*

10 EEG equipment included a wireless EEG / tDCS transmitter, a set of 4 measuring and 2 reference
11 electrodes, conducting gel and electrode contact stickers (Neuroelectrics Barcelona, SLU, ESP). The
12 system was connected to a desktop computer and analyzed using Neurosurfer software by
13 Neuroelectrics. EEG activity was recorded from 6 silver/silver chloride (Ag/AgCl) electrodes on the
14 scalp positioned using different sized neoprene caps with pre-defined holes. Two reference electrodes
15 were placed at the earlobe using a clip. Where the earlobe was too small to hold the clip, two adhesive
16 electrodes were attached to the left mastoid. Caps and electrodes were adjusted carefully in line with
17 the 10-20 system (Chatrian, Lettich, & Nelson, 1985) and checked by two technicians before the start
18 of the experiment. Measurement electrodes were positioned at the left and right temporal lobes (T7,
19 T8), at the frontal midline (Fz) and at the parietal lobe (Pz, control) of the scalp. Signals were collected
20 at a sampling rate of 500 Hz with 24-bit resolution and 0 to 125 Hz bandwidth.

21 Prior to commencing the task, an appropriate level of impedance was achieved by adjusting electrode
22 positions, the participant's hair and the amount of electrolyte gel. While an upper limit of 15 kOhm was
23 used for inclusion, impedance levels were generally below 5 kOhm. Potential issues associated with
24 using repeated measures on two different days were overcome by fully standardizing the procedures
25 and by scheduling the two sessions exactly 24h apart (see Ring, Cooke, Kavussanu, McIntyre, &

1 Masters, 2015)² The pre-session criteria required participants to (a) wash their hair on the
2 evening/morning before testing, and (b) not consume caffeine in the 2 hours preceding testing.

3 **Procedure**

4 *General procedure*

5 Participants were randomly allocated to an analogy instruction group (AG; n = 17), an explicit
6 instruction group (EG; n = 14) or a no instruction group (NIG; n = 17), using a random number
7 generator. They were asked to attend the laboratory on two separate days at the same time. On both
8 days, participants were fitted with a Neuroelectrics cap and EEG electrodes were attached. Participants
9 performed a hockey push-pass task in a pretest (day 1) and a retention test (day 2). Prior to completing
10 the pretest, participants were shown two animations that illustrated the requirements of the push-pass;
11 however, participants were not instructed how to move. A push-pass is a shot in which the hockey stick
12 guides the ball towards a target without use of a backswing. In our experiment, it was required that the
13 ball rolled along the ground. An animation that was described as the desired outcome showed a square
14 (representing the hockey stick) and an adjacent circle (representing the ball) moving from the left to the
15 right side of the screen. A second animation that was described as a negative outcome showed a circle
16 resting in the middle of the screen and a square approaching it, “hitting” it towards the right side of the
17 screen. In both the pretest and the retention test, a single task was performed (20 trials), followed by a
18 combined task (20 trials). The single task required participants to pass the ball as accurately as possible
19 to the target.

20 For the combined task, 20 images of hockey players (n=3) standing in different positions were
21 projected onto the opposing wall. Two players were wearing black shirts and one was wearing an orange
22 shirt. Arrangements of the players varied, with one or two players in the foreground (85% of life size)
23 and the others in the background (70% of life size, see Figure 1, right). Participants were informed that

² Baseline EEG data was collected on both days prior to commencing the experiment (120 seconds seated and motionless), in order to determine whether high-alpha power was comparable between day 1 and day 2. Correlations were evident for T7 (r = .646, p < .001), T8 (r = .464, p < .005) and Fz (r = .358, p < .05).

1 they were a member of the black team and were to push-pass the ball as quickly and as accurately as
2 possible towards the hockey stick (also 70 or 85% of life size, i.e. around 88mm hook diameter) of the
3 player who was in the best position to receive the ball. Presentation of each image was preceded by a
4 brief countdown on a blank background.

5 At the end of the retention test, participants were required to complete verbal protocols in which
6 they reported any rules or self-instructions that they recalled consciously using to control their
7 movements. This approach was used as a manipulation check for the analogy instruction and to evaluate
8 whether the No Instruction group had indeed acquired a similar amount of declarative knowledge to the
9 Explicit group, which would be expected based on hypothesis testing.



10

11 *Figure 1. Execution of a push-pass in the single task (left) and combined task condition (right).*

12 *Instruction and practice*

13 Between the pretest and retention test, participants were provided with the analogy instruction (AG),
14 written instructions about how to execute a push-pass (EG), or no instructions (NIG) (see Table 1 for
15 the exact instructions). They then practiced the push-pass by performing 4 blocks of 32 trials each. For
16 each trial, they were required to pass the ball to a virtual teammate (75% of life size) who moved from
17 right to the left on the screen, and vice versa (random order). Participants were instructed that they
18 should time the pass so that the ball would accurately hit the strike zone of their teammate's hockey
19 stick. The strike zone was indicated by a yellow circle (11cm diam) bounded by a blue circle (18cm
20 diam). An opponent/defender, played by one of the researchers, was positioned 1.3 m from the screen

1 either directly in front of the participant or 90 cm to the right or left, respectively. The participant was
2 instructed to pass the ball so that the opponent/defender could not intercept it. Before starting each block
3 of trials, participants were asked to repeat the specific instructions that they had received, in order to
4 ensure that they remembered them and used them consciously during the block. Performance was
5 recorded and feedback (knowledge of results) was provided to participants at the end of each block in
6 order to maintain motivation.³

7 Previous research has shown that analogies need to be meaningful and linked to personal experience
8 in order to be of benefit during learning (e.g., Gentner, 1983; Poolton et al, 2007). Therefore, preceding
9 the analogy instruction, participants in the AG performed a familiarization task designed to provide
10 them with personal experience of the analogy concept. EG and NIG participants performed a control
11 task of the same duration with the same materials⁴. Participants in the AG were provided a bucket of
12 water and were instructed to knock over as many cones as possible (lined up on the floor in a single
13 file) by “sloshing” the water underneath a bar raised 15 cm from the ground. The task, which was
14 repeated twice, was designed to familiarize participants with the concept represented by the analogy
15 (move the stick as if you are sloshing a bucket of water over the floor). Discussions with an experienced
16 hockey player and an international coach suggested that the analogy (and the familiarization task)
17 appropriately captured the concept of a push-pass (see Figure 2).

18 The control task for the EG and NIG participants was to scoop water from a full bucket into an empty
19 one using a cup. The EEG cap worn by each participant was protected from water by a shower cap and
20 the tasks were performed in an outdoor area next to the laboratory. After the familiarisation task,
21 participants were provided with the analogy instruction (AG), written instructions about how to execute
22 a push-pass (EG), or no instructions (NIG, see Table 1).

³ The practice task was designed to be realistic and ecologically valid, but for practical reasons, and to maximize measurement accuracy, the pretest and retention test were conducted in a “laboratory style” manner. This mismatch in task specificity was held consistent across groups and was therefore not expected to lead to confounding results.

⁴ We acknowledge that the experience of sloshing a bucket of water over the floor might have benefitted the Analogy group. However, this potential benefit was deemed to be minimal.



1

2 *Figure 2. Performance of the familiarization task (left) vs. performance of a hockey push-pass (right).*

3 *Table 1. Push-pass instructions for each group*

Group	Instructions
Analogy	Move the [hockey] stick as if you are sloshing a bucket of water over the floor.
Explicit	Hold the stick with a wide grip The ball should be in front of the right foot Make a side step with the left foot Pull the ball past the left foot Keep contact with the ball while pushing Finish by pointing at the target with the stick
No-instruction	Try to push the ball to the target as exactly as possible.

4

5

6

1 **Dependent variables and data analysis**

2 *Dependent variables*

3 Measurements for both performance variables were made using video recordings collected at normal
4 speed (30 fps) and played frame-by-frame in order to determine the time when the ball contacted the
5 wall. Single task performance was represented by mean contact distance from the target during the
6 single task test (20 trials). Combined task performance was represented by mean contact distance from
7 the target chosen by the participant (20 trials). For both tasks, we were mostly interested in improvement
8 due to the intervention; therefore we investigated performance change between the pretest and the
9 retention test, calculated by subtracting mean distance at pretest from mean distance at retention⁵. A
10 positive value represents worse performance, whereas a negative value represents improved
11 performance. Verbal protocols were evaluated by counting each rule or self-instruction that concerned
12 a separate aspect of the movement.

13 *Data Reduction*

14 EEG values were only recorded during the single task, because pilot work showed that the combined
15 task required participants to scan a large area of the screen in front of them, which created EEG artefacts
16 as a consequence of head movements. No baseline subtraction was performed. Raw EEG signals were
17 bandpass filtered at 1-30Hz. Signals were then resampled at 256 Hz. Data from the pretest and retention
18 test were processed as 4 sec segments prior to movement initiation (which was recorded on the EEG
19 timetrace during the experiment using manual markers). Blinks and eye movements are characterized
20 by high potentials (Boudet, Peyrodie, Gallois, & Vasseur, 2006). Eye artifacts were excluded by an
21 extreme measures approach. Epochs (0.25s length) within each 4s segment that contained signals above
22 $60 \mu V^2$ were discarded. An average of 174.39 (SD = 69.14) epochs per participant in the pretest and
23 167.35 (SD = 67.14) epochs per participant in the retention test were retained. A Fast Fourier Transform
24 with a Hamming window taper and 50% overlap with a resolution of 0.49 Hz, was applied to each 4s

⁵A one-way ANOVA revealed no significant differences between groups at pretest during the single task ($F(2,45) = 1.417, p = .253$) or the combined task ($F(2,45) = 1.778, p = .181$).

1 segment. EEG high-alpha (10-12Hz) power was calculated for the 4 sec segment preceding each trial
2 (e.g., Deeny et al., 2003). Manual manipulation of the trigger may have slightly compromised the
3 validity of the power and coherence measures because of experimenter error, but considerable care was
4 taken to avoid this. The EEG analyses in this study focused on the high-alpha (10-12 Hz) band. Activity
5 in this bandwidth is representative of task-specific attention processes (e.g., Klimesch, 1999). Matlab
6 scripts (MATLAB Release 2016b, The MathWorks, Inc., Natick, MA - US) were used to calculate EEG
7 outputs. The processing and analysis steps described above were implemented with the EEGLAB
8 toolbox (Delorme & Makeig, 2004). EEG coherence was calculated using a formula based on Equation
9 (1), in which P_{xx} and P_{yy} represent the power spectral density of signals at location x and y ,
10 respectively, and P_{xy} represents the cross power spectral density of x and y (e.g., Zhu, Poolton, Wilson,
11 Maxwell, et al., 2011). The measure was not z transformed.

$$C_{xy}(f) = \frac{|P_{xy}(f)|^2}{P_{xx}(f)P_{yy}(f)} \quad (1)$$

15 *Statistical analyses*

16 In order to test our a priori predictions concerning high-alpha power at T7, and T7-Fz coherence, as
17 well as combined task performance, we conducted orthogonal contrasts. The NIG was expected to learn
18 by discovery and thus to show the same behaviour as the EG. Orthogonal contrasts were therefore used
19 to compare the AG against the EG and NIG in the first instance, and the EG against the NIG in the
20 second instance. Based on unequal variances in high-alpha power at T7 variable, Bonferroni correction
21 was used in this instance. We did not make clear predictions regarding changes in T8-Fz coherence, T8
22 or Fz high-alpha power, so mixed ANOVA with repeated measures was conducted to investigate alpha
23 power at Fz and at T8 during the pretest and retention test and 3-way (between groups) univariate
24 ANOVA was conducted on T8-Fz coherence. Mixed ANOVA with repeated measures on the test factor
25 was used to investigate pretest and retention test single task performance in the different instruction
26 groups. Orthogonal contrasts were also used to compare the number of rules reported in each group,

1 since AG was expected to differ from the EG and NIG groups, which were not expected to differ.
2 Statistical significance was set at $p < .05$ for all primary analyses.

3

4

Results

5 Table 2 shows mean values during the pretest and retention test and change scores in performance and
6 EEG power as well as coherence between the pretest and retention tests, for all groups collapsed and
7 separately.

8

[Please refer to Appendix for Table 2]

9 Verbal protocols

10 Orthogonal contrasts revealed a significant difference in movement-related knowledge (number of
11 rules) between the analogy group ($M = 2.235 / SD = 1.393$) compared with the explicit ($M = 3.786 /$
12 $SD = 1.929$) and no-instruction groups ($M = 3.412 / SD = 2.181$; $t(45) = -2.426$, contrast = -2.727 , $p =$
13 $.019$), but no significant difference between the explicit and the no-instruction group ($t(45) = .557$, $p =$
14 $.580$).

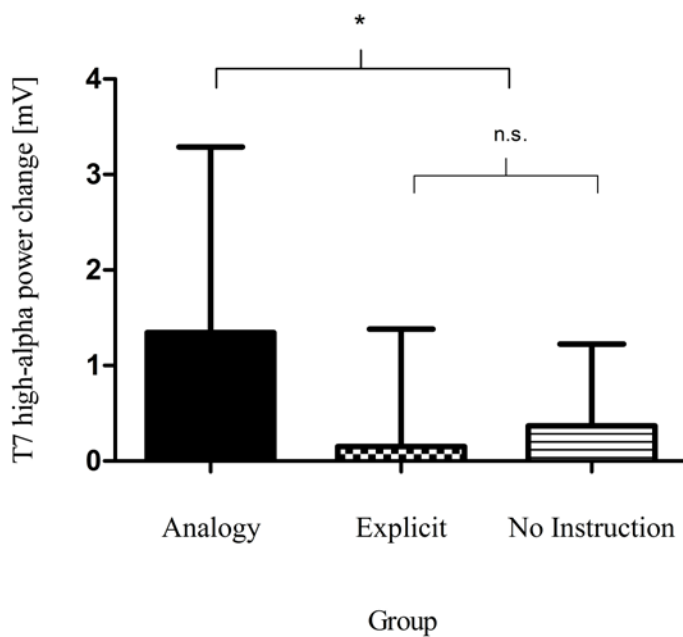
15 EEG power and coherence

16 EEG high-alpha power at T7, measured during the single task, was analysed using orthogonal contrasts.
17 Change in EEG high-alpha power at T7 was significantly different in the AG compared to the EG and
18 NIG combined ($t(21.490) = -2.131$, contrast = -2.172 , $p = .045$). No difference was evident between EG
19 and NIG ($t(22.508) = .562$, $p = .580$). Figure 3 illustrates the mean change in high-alpha power for each
20 group.

21 EEG coherence between the T7 and Fz regions, measured during the single task, was also analysed
22 using orthogonal contrasts. Change in EEG coherence was not significantly different in AG compared
23 to the EG and NIG combined ($t(45) = -.073$, $p = .942$), nor was there a difference between the EG and
24 NIG ($t(45) = .795$, $p = .431$).

1 A 2 (test; pre, retention) x 3 (group; Analogy, Explicit, No Instruction) mixed ANOVA with repeated
 2 measures on the test factor was conducted to investigate T8-Fz coherence. No significant effect of test
 3 ($F(1,45) = 1.528, p = .223, \text{partial } \eta^2 = .033$) or group ($F(2,45) = 0.375, p = .689, \text{partial } \eta^2 = .016$) was
 4 found, and no significant interaction was evident ($F(2, 45) = .016, p = .984, \text{partial } \eta^2 = .001$).

5 A 2 (test; pre, retention) x 2 (location; T8, Fz) x 3 (group; Analogy, Explicit, No Instruction) mixed
 6 ANOVA with repeated measures on the test factor was conducted to investigate alpha power at Fz and
 7 at T8. No significant effect of test ($F(1,45) = 3.741, p = .059, \text{partial } \eta^2 = 0.077$), or group ($F(2,45) =$
 8 $0.617, p = .544, \text{partial } \eta^2 = 0.027$) was found. A significant main effect was found for location ($F(1,45)$
 9 $= 4.107, p = .049, \text{partial } \eta^2 = 0.084$). Significant interactions were not evident between test x group
 10 ($F(2,45) = 1.887, p = .163, \text{partial } \eta^2 = .077$) or location x group ($F(2,45) = 0.820, p = .447, \text{partial } \eta^2$
 11 $= 0.035$), but a significant interaction was found between test x location ($F(1,45) = 5.863, p = .020,$
 12 $\text{partial } \eta^2 = .115$).

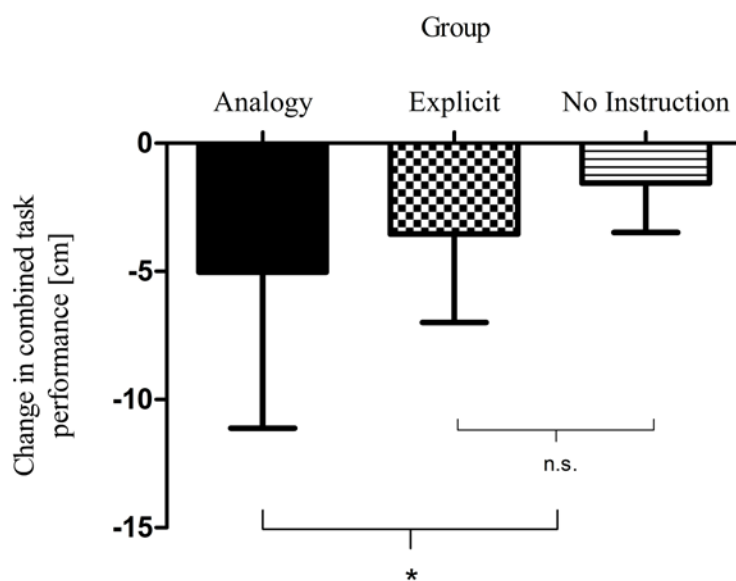


13
 14 *Figure 3. Change (mV²) in high-alpha power at T7 between the pretest and retention test. A higher*
 15 *value indicates increased power (but reduced activation). * indicates a significant difference between*
 16 *groups.*

1 Performance

2 All groups showed identical improvement in single task accuracy, as shown by a 2 (test; pre,
3 retention) x 3 (group; Analogy, Explicit, No Instruction) mixed ANOVA with repeated measures on
4 the test factor. A significant main effect for test ($F(1,43) = 11.242, p = .002$, partial $\eta^2 = .207$) but not
5 group ($F(2) = 1.332, p = .275$, partial $\eta^2 = .058$) and no interaction ($F(2,43) = 1.204, p = .310$, partial
6 $\eta^2 = .053$) were found.

7 Change in combined task performance was analysed using orthogonal contrasts. A significant
8 difference was evident between the AG and the EG and NIG combined: $t(45) = 2.058$, contrast = 11.777,
9 $p = .045$ (equal variances assumed). The contrast between EG and NIG was not significant ($t(45) =$
10 $1.025, p = .311$). Figure 4 shows combined task performance change for each group.



11

12 *Figure 4. Change (cm) in combined task performance between the pretest and the retention test. A*
13 *greater negative value indicates greater improvement. * indicates a significant difference between*
14 *groups.*

15

16

Discussion

1 We investigated whether using an analogy instruction leads to increased psychomotor efficiency
2 compared to explicit instructions or no instructions (discovery). Previous research has shown that
3 analogy learning limits the accrual of task-related, verbalisable knowledge compared to uninstructed
4 discovery learning or explicit instructions (e.g., Liao & Masters, 2001). Verbal protocols collected as a
5 manipulation check following the learning phase in our study showed that movement-related knowledge
6 (number of rules) differed significantly between the analogy group compared with the explicit and no-
7 instruction groups, but not between the explicit and the no-instruction group.

8 While all participants improved in single task performance following practice, improvement did not
9 differ between instruction groups. This meets expectations, considering that changes in efficiency due
10 to analogy instructions were expected to happen on a cognitive rather than a motor level, and thus were
11 less likely to impact motor performance in the single task to the same extent as the combined task. The
12 analogy group showed greater improvement in combined task performance compared to the explicit
13 and no instruction groups. This finding is consistent with previous research on analogy learning and
14 confirms the validity of the hockey push pass analogy developed for this study. We speculate that this
15 finding might also provide some support for our hypothesis that analogy instructions promote efficiency
16 in verbal-cognitive processing related to motor planning, as it suggests that motor planning following
17 analogy instruction was successful even when cognitive resources were limited by the secondary task
18 (choosing the target). However, a limitation of the current study is that EEG data was not collected
19 during the combined task. If we had data on EEG high-alpha power in the left temporal region during
20 the combined task, which is a useful index of verbal-cognitive processing, we would be able to conclude
21 more strongly.

22 With respect to our EEG measures, differences between the instruction groups were evident in
23 verbal-cognitive brain regions (left temporal lobe), but not in motor planning or visuo-spatial regions,
24 with an increase in EEG high-alpha power evident in the left temporal lobe for the analogy group
25 compared to the explicit and no instruction groups. This finding provides support for our premise that
26 cognitive efficiency may be promoted by analogy instructions relative to explicit instructions or no
27 instructions. Increased high alpha power at the left temporal lobe may imply a reduction in verbal-

1 cognitive processing.⁶ Efficiency is defined as better performance related to less effort. Since the
2 analogy group displayed performance improvements during the single task that were similar to the other
3 groups, and also displayed increased high-alpha power at the left temporal lobe, it is possible that the
4 analogy group exhibited greater efficiency in verbal-cognitive processing relative to the other two
5 groups. EEG high-alpha power in the Fz and T8 regions did not differ between the groups, which is
6 consistent with our expectations; activation in these areas was not expected to become more efficient
7 due to the analogy instruction. High-alpha power at Fz represents motor planning processes, which did
8 not seem to be affected by analogy instructions. Since no differences were found in motor performance
9 (single task), these results fit well with the neural data. Regular motor performance, as well as neural
10 processes related to motor planning, did not improve due to the analogy instruction.

11 EEG coherence between the left temporal lobe and the frontal midline (T7 and Fz) did not show the
12 expected difference between groups, thus the hypothesis that an analogy instruction would affect this
13 measure of psychomotor efficiency was not supported. This finding may indicate that analogies affect
14 efficiency of verbal-cognitive processes but not verbal-cognitive motor control. Since T7-Fz coherence
15 reflects verbal-motor cross-communication, including motor planning processes (Deeny, Hillman,
16 Janelle, & Hatfield, 2003), the measure is likely linked to efficiency in motor planning and verbal
17 processing combined rather than verbal processing alone. This notion is supported by work of Zhu et
18 al. (2011), who showed a connection between T7-Fz coherence and motor performance in a single task
19 as well as dual task condition. In their experiment, participants in an implicit (error-reduced) treatment
20 condition exhibited lower T7-Fz coherence compared to participants in an explicit (errorful) treatment
21 condition. This decrease in T7-Fz coherence was not only connected to reduced mental load, reflected
22 by superior dual-task performance, but also to performance benefits at a purely motor level, as shown
23 by improved single task performance. Therefore, coherence may not represent efficiency of verbal-
24 cognitive processes alone but rather efficiency of psychomotor processes (see Hatfield and Hillman,
25 2001). Although learning by analogy has been linked to implicit motor learning, the mechanism that
26 underpins analogy instruction may be different from error-reduced learning and may only affect

⁶ We acknowledge that EEG indices provide only an indirect measure of verbal processing.

1 efficiency of the verbal-cognitive aspect of information processing. The notion that learning by analogy
2 affects cognitive but not motor processes finds some support from work by Lam et al. (2009b), which
3 failed to find significant differences in kinematic outcomes between analogy and explicit learners in a
4 basketball shooting task. The authors concluded that analogy learning may not cause qualitative
5 differences in the way that a motor task is performed.

6 The fact that analogy instructions may result in more efficient verbal-cognitive processing explains
7 why performance differences in dual-task tests, but not single-task tests, have been found in previous
8 analogy learning research (Koedijker et al., 2011; Lam et al., 2009b; Liao & Masters, 2001). To date,
9 there has been little evidence that dual-task performance benefits can be attributed to increased
10 efficiency. However, the present study provides objective neural evidence that this is the case. The
11 mechanism by which analogy instructions render cognitive processes more efficient remains unclear,
12 however.

13 A tentative mechanism underpinning the effects of analogy learning uses the concept of chunking
14 (Masters, 2000; Masters & Liao, 2003), during which information becomes organized into higher order
15 structures – many small ‘bits’ of information are collapsed into fewer larger chunks. Although fewer
16 chunks are processed, they contain the relevant information, meaning that information can be processed
17 with relatively less cognitive effort; processing becomes more efficient (Newell & Rosenbloom, 1980).
18 This chunking process is a part of the learning process. Masters and Liao (2003) suggested that during
19 motor learning, slow natural chunking processes can be accelerated by using analogy. The analogy has
20 been described as an “all encompassing, biomechanical metaphor” (Koedijker et al., 2011; Liao &
21 Masters, 2001; Masters, 2000). Since all necessary information for the fulfillment of the task is
22 condensed into the analogy, it represents a higher level of organization among the rules for the
23 movement rather than explaining the task step-by-step (Gentner, 1983). Analogy instructions may thus
24 render information processing more efficient by chunking movement relevant information into a single
25 unit or concept (Masters, 2000). However, this theory has not been backed by strong empirical support
26 to date. Gathering sufficient evidence to either corroborate or discard such a chunking hypothesis of
27 implicit motor learning is an important next research step to determine the mechanism of analogy

1 learning.

2 *Conclusion*

3 In this experiment, we observed that people who were instructed by analogy improved more distinctly
4 at a combined task compared to people who practised using explicit instructions or no instructions.
5 Increased EEG high-alpha power at verbal processing regions of the brain during performance
6 suggested that analogy instructions may have resulted in more efficient verbal-cognitive processing
7 compared to learning by explicit instructions. Brain regions related to purely motor aspects of the
8 movement did not display increased efficiency. These findings lead us to contend that benefits of
9 analogy instructions may reflect improved efficiency in the processing of verbal-cognitive information,
10 but not in motor planning. In future work, we plan to use dual-task or combined task settings that do
11 not require head movements, during which EEG variables can be collected.

12

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21

22

1 *Table 2. Means and standard deviations of pretest, retention test and change scores in power, coherence and performance across groups.*

2

Group	Test	High-alpha power [μV^2]			High-alpha coherence (0-1)		Performance (distance from target [cm])	
		T7	T8	Fz	T7-Fz	T8-Fz	Single	Combined
Analogy	Pretest	3.917 (2.537)	4.383 (1.704)	3.190 (1.046)	.466 (0.135)	.417 (0.145)	22.000 (11.363)	31.286 (11.156)
	Retention test	5.263 (3.060)	4.929 (2.578)	3.727 (1.547)	.466 (0.182)	.439 (0.180)	15.757 (5.840)	20.164 (6.065)
	Change pre-ret	1.346 (1.941)	.546 (2.263)	.537 (1.491)	-.0001 (0.170)	.021 (0.188)	-6.243 (9.444)	-11.123 (8.558)
Explicit	Pretest	3.697 (0.878)	4.439 (1.818)	3.058 (1.025)	.495 (0.091)	.433 (0.130)	20.605 (13.000)	29.855 (13.443)
	Retention test	3.848 (1.512)	4.513 (1.943)	3.431 (1.121)	.468 (0.153)	.464 (0.122)	16.625 (6.455)	22.870 (8.005)
	Change pre-ret	.151 (1.232)	.074 (1.139)	.373 (1.158)	-.027 (0.148)	.031 (0.072)	-3.980 (8.702)	-6.985 (11.625)
No Instr.	Pretest	3.557 (1.319)	4.562 (1.256)	3.031 (0.790)	.464 (0.157)	.451 (0.158)	16.175 (6.510)	24.643 (7.313)
	Retention test	3.927 (1.494)	4.445 (1.036)	3.133 (0.867)	.483 (0.102)	.478 (0.103)	14.162 (5.419)	21.160 (6.273)
	Change pre-ret	.370 (0.856)	-.117 (1.269)	.102 (0.743)	.020 (0.163)	.026 (0.140)	-2.013 (5.418)	-3.483 (8.309)

3

