

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22
23
24
25

Implicit versus explicit attitude to doping: Which better predicts athletes' vigilance towards unintentional doping?

Authors: Derwin King Chung Chan^{ab*}, David A. Keatley^c, Tracy C. W. Tang^a, James A. Dimmock^d, Martin S. Hagger^{be}

University of Hong Kong^a
Curtin University, Australia^b
University of Lincoln, UK^c
University of Western Australia, Australia^d
University of Jyväskylä, Finland^e

*Corresponding author
School of Public Health, Li Ka Shing Faculty of Medicine, The University of Hong Kong
Email: derwin.chan@hku.hk

Total word count: 2998
Abstract word count: 202
Number of tables: 3
Number of appendix: 0

1
2
3
4
5
6
7
8
9
10
11
12
13
14
15
16
17
18
19
20
21
22

Implicit versus explicit attitude to doping: Which better predicts athletes' vigilance towards unintentional doping?

Total word count: 2998
Abstract word count: 202
Number of tables: 3
Number of appendix: 0

Abstract

Objectives: This preliminary study examined whether implicit doping attitude, explicit doping attitude, or both, predicted athletes' vigilance towards unintentional doping.

Design: A cross-sectional correlational design.

Methods: Australian athletes ($N = 143$; $M_{age} = 18.13$, $SD = 4.63$) completed measures of implicit doping attitude (brief single-category implicit association test), explicit doping attitude (Performance Enhancement Attitude Scale), avoidance of unintentional doping (Self-Reported Treatment Adherence Scale), and behavioural vigilance task of unintentional doping (reading the ingredients of an unfamiliar food product).

Results: Positive implicit doping attitude and explicit doping attitude were negatively related to athletes' likelihood of reading the ingredients table of an unfamiliar food product, and positively related to athletes' vigilance toward unintentional doping. Neither attitude measures predicted avoidance of unintentional doping. Overall, the magnitude of associations by implicit doping attitude appeared to be stronger than that of explicit doping attitude.

Conclusions: Athletes with positive implicit and explicit doping attitudes were less likely to read the ingredients table of an unknown food product, but were more likely to be aware of the possible presence of banned substances in a certain food product. Implicit doping attitude appeared to explain athletes' behavioural response to the avoidance of unintentional doping beyond variance explained by explicit doping attitude.

Keywords: implicit association test; doping in sport; prohibited substances; performance enhancing drugs;

1 Introduction

2 Doping is prohibited in sport because it contravenes rules and is against the spirit of fair play.

3 The World Anti-doping Agency's (WADA) strict liability policy states that doping is a violation,

4 regardless of whether it is intentional or unintentional. Athletes found guilty of doping in sport

5 are often blamed for their intention to cheat by illegally enhancing their sport performance¹.

6 Of course, intentional doping does occur and anti-doping procedures are geared toward

7 identifying and sanctioning cheats, but research also indicates that athletes can dope

8 accidentally if they unintentionally or unwittingly take banned substances through the form of

9 food/drink, medication, and/or nutritional supplements¹. Accordingly, athletes and their

10 entourage (e.g., trainers, coaches, managers, and parents) need to be vigilant in ensuring

11 that the foods or substances consumed by the athletes do not contain ingredients that are

12 prohibited in sport. The issue of unintentional doping is increasingly complex given that

13 athletes often feign unintentional doping as a mitigating circumstance for failing a doping test.

14 Psychological research on doping has tended to assume that doping is intentional, and has

15 neglected the potential for unintentional doping and the psychological factors that may

16 determine its occurrence²⁻⁷. The present study examined whether athletes' attitude toward

17 doping, measured both explicitly and implicitly⁸, predicted athletes' awareness of

18 unintentional doping, as well as behaviours in relation to the avoidance of such doping.

19

20 In recent research, attempts have been made to understand factors that help athletes to

21 prevent unwitting consumption of banned performance-enhancing substances. To date,

22 research has identified a number of psychological factors (e.g., self-control, motivation) that

23 have been shown to align with athletes' intended or actual participation in behaviors related

24 to vigilance in avoiding unintentional doping (e.g., avoid taking or consuming unfamiliar

25 food/drink/supplement products, reading the ingredients table of unfamiliar foods and

26 supplements, being aware of the presence of banned performance-enhancing substances in

27 unfamiliar foods and supplements)^{2-4, 6, 7}. Studies have also indicated that individuals who

28 hold positive beliefs with respect to the avoidance of unintentional doping (i.e., perceiving

1 that the avoidance of doping is good for sport, morality, career, and health) are more likely to
2 report intentions to prevent unintentional doping⁴. Although positive doping attitudes have
3 consistently been shown to be a direct or indirect positive predictor of athletes' intention to
4 dope^{9, 10} and actual use of banned performance-enhancing substances¹¹, a negative
5 association between doping attitude and behaviours related to the avoidance of unintentional
6 doping cannot be assumed. For example, athletes may express positive attitudes towards
7 doping avoidance in self-report surveys but actually harbor positive attitudes for doping. This
8 is because expressing positive attitudes toward doping is likely to be considered undesirable
9 and socially unacceptable. As a consequence, athletes may explicitly express negative
10 doping attitudes, but covertly hold positive attitudes. Such opposing attitudes have also been
11 identified in other domains whereby overt expression of attitudes is considered distasteful or
12 socially unacceptable, such as sexism or racism^{12, 13}. Researchers in these domains,
13 including doping, have therefore employed measures to assess implicit attitudes as a means
14 to identify covertly-held attitudes and test their differential prediction of behavioural outcomes
15 alongside explicit measures from self-report questionnaires. The importance of investigating
16 athletes' doping attitude by both implicit measures and explicit measures is that implicit
17 measures capture an athlete's automatic evaluation, whereas explicit measures reflect
18 responses associated with conscious self-reflection^{14, 15}.

19

20 Although studies on *intentional* doping in sport have included both explicit^{10, 11, 16-18} and
21 implicit^{14, 19-21} measures of attitudes towards doping, there is a relative dearth of research
22 examining these attitudes in relation to *unintentional* doping. Specifically, the predictive
23 validity of implicit and explicit doping attitudes toward unintentional doping has not been fully
24 explored in terms of awareness of unintentional doping and pertinent behaviours related to
25 the avoidance of unintentional doping. The aim of the present study was to examine the
26 predictive validity of implicit doping attitude and explicit doping attitude on athletes'
27 behaviours related to the avoidance of unintentional doping. An implicit association test (IAT)
28 was used to measure athletes' implicit doping attitude in the current study. The IAT is a timed

1 sorting task aimed at measuring the relative strength of associations between a stimuli (i.e.
2 doping) and superordinate categories (i.e. good/bad) via participants' reaction times.
3 Naturally, a faster reaction time would signify a stronger relative association between the
4 categories. IAT measures have been widely used in social and health psychology to
5 measure individuals' implicit attitude toward numerous sensitive issues, such as prejudice
6 and racial bias^{8, 12, 13, 22}. Recently, the IAT has been adopted and modified to measure
7 athletes' implicit attitudes towards doping^{14, 19, 20, 23, 24}, and is believed to be an objective
8 assessment method less susceptible, but not completely free from, socially desirable
9 responses or "faking" responses compared to traditional self-report explicit measures^{8, 15}.
10 Prior research has demonstrated that athletes who have previously engaged in doping^{15, 20, 24}
11 through the use of nutritional supplements¹⁵, and those who supported the legalization of
12 doping in sport¹⁴, reported greater positive implicit doping attitudes relative to those who did
13 not^{14, 20}. However, the predictive power of implicit attitudes toward athletes' actual doping
14 behaviour, or, their behaviour in the avoidance of unintentional doping, has not yet been fully
15 scrutinised. Additionally, scores on previous studies that use the implicit attitude tests to
16 measure implicit attitude towards doping, such as the full-version IAT^{14, 19} or the brief-IAT^{15,}
17^{20, 24}, could be a confounding factor as the response latency (i.e., the interference/difference
18 IAT-score for doping attitude) is computed by comparing reaction time of doping-related
19 stimuli against responses towards a reference category, such as nutritional supplements^{14, 15,}
20^{19, 20} or non-doping words (e.g., 'clean', 'natural')²⁴. However, it has been proposed that
21 nutritional supplements (or even non-doping words) may not necessarily be the correct
22 reference category, and furthermore, it has been proposed that there is not a clear definitive
23 opposing category to 'doping substances'¹⁹. To resolve this problem, researchers in social
24 psychology have advocated the use of the *single-category* IAT²⁵, in which response latency
25 is computed by comparing the reaction-time between the focal ('doping' and 'I like') and non-
26 focal (e.g., 'doping' and 'I dislike') blocks. As such, no reference category is needed²⁵,
27 making the *single-category* IAT preferable over traditional IAT in the context of assessing
28 implicit attitudes toward doping. In this study, we introduce a *single-category* brief-IAT to

1 measure implicit attitude toward doping. Moreover, we evaluate its predictive power on
2 athletes' vigilance towards unintentional doping against that of a traditional measure of
3 explicit attitude toward doping. Based on prior research of the relationship between doping
4 attitude and athletes' behavioural responses to doping^{11, 17, 18} as well as the avoidance of
5 doping^{2, 4}, we hypothesised that (1) athletes' positive implicit and explicit doping attitudes are
6 negatively associated with; behaviours relating to their vigilance toward unintentional doping
7 (e.g., reading the ingredients table of food products, being aware of the risk of unintentional
8 doping prior to consumption, refusal to take or eat suspicious food products,) and to self-
9 reported behavioural adherence to unintentional doping avoidance behaviours. Furthermore,
10 (2) athletes' implicit doping attitude is expected to explain unique variance of the behavioural
11 outcomes related to the avoidance of unintentional doping beyond that of explicit doping
12 attitude.

13

14 Methods

15 Participants.

16 Athletes (N = 143; $M_{\text{age}} = 18.13$, $SD = 4.63$; female = 33.37%) competing in individual
17 (46.15%; athletics-track, athletics-field, badminton, gymnastics, swimming, and triathlon),
18 and team (54.86%; basketball, cricket, field hockey, rugby, soccer, and water polo) sports
19 volunteered to participate in the study. Participants classified their competitive level as
20 regional (25.90%), state (20.86%), national (39.57%), international (11.51%), and world-class
21 (2.16%). Participants had an average of 9.51 years ($SD = 3.55$) experience in their sport, and
22 spent an average of 12.59 hours ($SD = 6.73$) training per week. Participants did not report
23 any history of taking banned performance-enhancing substances.

24

25 Procedure.

26 The Research Ethics Committee of [university name redacted for masked review] approved
27 the research protocol (ref: HR30/2012), and a signed informed consent form was obtained
28 from each participant (and their parent or legal guardian if under the age of 18) prior to data

1 collection. Each participant received a \$15 inconvenience allowance for their participation,
2 paid in advance and non-contingent on study completion. They were asked to complete the
3 assessments of study variables in sequential order, including (1) implicit doping attitude,
4 explicit doping attitude, (2) self-reported behavioural adherence to the avoidance of
5 unintentional doping, and (3) behavioural vigilance toward unintentional doping (details about
6 the assessments below).

7

8 Measures.

9 Implicit attitude toward doping was measured using a computerised version of the brief
10 single-category IAT²⁵, modified to measure implicit attitudes toward doping. The single-
11 category IAT is a short, timed-sorting task that requires participants to make associations
12 between each presented stimulus and a superordinate category. Unlike previously developed
13 brief-IATs for doping attitude^{15, 20, 24}, our single-category IAT did not require a 'non-doping'
14 reference category. The superordinate category labels were presented on the top left and
15 right corners of the screen and the doping-related stimuli were presented in the center of the
16 screen. Participants were instructed to indicate which category closely encompassed the
17 stimuli, and to press the corresponding left ('p' key) or right ('q' key) response on the
18 keyboard. Doping-related stimulus words (*steroid, narcotics, stimulants, diuretics*) were
19 selected based on previously developed IATs of doping attitude^{14, 19, 20, 23}, and utilised
20 comments from six experts in the area from several explicit measures of doping. The
21 superordinate categories representing 'I like' (*freedom, love, happy, pleasure*) and 'I dislike'
22 (*crash, filth, stink, evil*) were taken from the traditional IAT by Greenwald et al.⁸ This current
23 version of the single-category brief IAT is similar to the traditional brief IAT^{15, 20, 24, 26}, which
24 also uses a standard four-step format consisting of 4 blocks with 20 trials in each block. Each
25 block comprises of a focal stimulus-category ('doping' and 'I like') which contrasts with a
26 single non-focal category (e.g., 'I dislike'). In alternating blocks, the focal categories change
27 (e.g., 'doping' and 'I like' in blocks 1 and 2; 'doping' and 'I dislike' in blocks 3 and 4). Block
28 order was counterbalanced between participants. Each participant completed two

1 counterbalanced practice trials prior to the experimental block to ensure understanding of the
2 task. Our scoring method followed the scoring algorithm of brief-IAT²⁶. More specifically,
3 error responses were accounted for and all responses less than 350ms and non-responses
4 were removed. The key dependent variable representing implicit attitudes toward doping is a
5 score (known as the D-score) based on the average response times in the critical blocks
6 from the single-category brief IAT. D-score was computed by dividing the difference of the
7 average reaction time between Blocks 2 and 4 by the standard deviation of the reaction
8 times of all correct responses in both blocks²⁵. As such, a higher positive score (i.e., D-score
9 > 0) indicated a stronger association strength between the target concept (i.e., 'doping') and
10 attribute (i.e., 'I like'), reflecting a greater positive implicit attitude towards doping. In contrast,
11 a lower negative score (i.e., D-score < 0) indicates a stronger association strength between
12 the target concept (i.e., 'doping') and attribute (i.e., 'I dislike'), reflecting a more negative
13 implicit attitude towards doping.

14
15 Explicit doping attitudes were measured using the 17-item Performance Enhancement
16 Attitude Scale (PEAS)^{10 27}. Participants rated the degree of agreement with the items (e.g.,
17 'Doping is not cheating since everyone does it.') on a six-point Likert-scale ranging from 1
18 (strongly disagree) to 6 (strongly agree). Higher scores on PEAS indicated a greater
19 favorability of attitude toward doping in sport. The internal consistency of the scale was
20 acceptable ($\alpha = .91$).

21
22 Athletes' behavioural vigilance in avoiding unintentional doping was measured using a
23 'lollipop' decision-making protocol developed in previous studies.^{3,6} The protocol simulates
24 the extent to which athletes check for unintentional doping when confronted with a social
25 situation where they are provided with an unfamiliar food or drink. A lollipop was chosen as it
26 resembled a 'daily life' situation, and was less likely to raise athletes' behavioural vigilance
27 towards its performance-enhancing effects compared to sports-associated food products
28 (e.g., energy bars or drinks), making it ideal to test the athletes' vigilance in everyday lives.³

1 In line with the protocol, participants were offered a free lollipop by the experimenter
2 ostensibly as a token of gratitude for their participation in the study. The lollipop did not
3 contain any banned performance-enhancing substances, but was a rare brand with which
4 none of the participants reported being familiar with. Each lollipop contained an ingredients
5 table clearly printed on the packaging. Participants then followed the study procedure for
6 completing the IAT and the questionnaire. At the end of the questionnaire, participants
7 responded 'yes' or 'no' to a brief survey asking whether or not they (1) refused to take the
8 lollipop (*not-taking*), (2) decided not to eat the lollipop (*not-eating*), (3) read the ingredients
9 table (*reading*), and (4) were aware of the risk of unintentional doping (i.e., checking if the
10 lollipop ingredients table contained prohibited substances; *awareness*). The experimenter
11 who delivered the lollipop then cross-checked the participants' self-reported answer with the
12 participants' behaviour (i.e. *not-taking* and *not-eating*) to ensure genuine responses. All "yes"
13 responses were coded as 1, and "no" was coded as 0. Previous research has found this
14 lollipop decision-making protocol to be an ecologically valid test of athletes' natural
15 behaviours and is indicative of behavioural vigilance associated with the avoidance of
16 unintentional doping in everyday situations^{3, 6}.

17
18 Self-reported behavioural adherence to the avoidance of unintentional doping was measured
19 using the adapted version of the Self-Reported Treatment Adherence Scale (SRTAS)²⁸⁻³⁰.
20 SRTAS is a reliable and valid psychometric inventory to measure individuals' self-reported
21 adherence to health behaviours (e.g., rehabilitation, injury prevention)²⁸⁻³⁰. It has been
22 adapted to reflect athletes' behavioural vigilance in avoiding unintentional doping^{2, 3}. Four
23 items assessed effort (e.g., 'How much effort do you put into avoiding being in a situation
24 where you might unintentionally take banned performance-enhancing
25 substances/methods?'), and three items assessed frequency (e.g., 'How often do you check
26 if your supplements or medications contain banned performance-enhancing
27 substances/methods in sport?') of behaviours associated with the avoidance of unintentional
28 doping. The behaviours are: raising awareness of doping, learning/updating knowledge

1 about doping, and seeking support from others regarding doping. Effort (1 = *minimum*; 7 =
2 *maximum*) and frequency (1 = *never*; 7 = *very often*) were evaluated on a seven-point scale.
3 The effort ($\alpha = .87$) and frequency ($\alpha = .90$) dimensions had acceptable internal consistency
4 and their average score were combined to a single dimension representing overall
5 adherence to behaviours for the avoidance of unintentional doping ($\alpha = .90$)^{2, 3}.

6

7 Data analysis.

8 Data was analysed using four separate hierarchical logistic multiple regression models for
9 categorical dependent variables (*not-taking*, *not-eating*, *reading*, and *awareness*), and
10 hierarchical linear multiple regression models for continuous dependent variables (*self-*
11 *reported* behavioural adherence to the avoidance of unintentional doping). Consistent with
12 previous studies on unintentional doping^{3, 6}, we controlled for the effects of age, gender, sport
13 type, and sport level in step 1. The explicit and implicit doping attitude variables were
14 subsequently entered in and tested in steps 2 and 3 of the analyses, respectively, to identify
15 their individual effectiveness in predicting variance in the behavioural outcomes beyond the
16 effects of the control variables.

17

18 Results

19 Data screening revealed that a non-random pattern of missing data was not apparent (0% for
20 implicit doping attitude; less than 4.2% for explicit doping attitude; less than 0.7% for
21 behavioural adherence; less than 2.8% for not-taking, not-eating, reading, and awareness);
22 all missing values were replaced using the expectation maximisation method. Shapiro-Wilk's
23 tests showed that the distributions of the continuous variables (i.e., implicit doping attitude,
24 explicit doping attitude, *self-reported* behavioural adherence) did not significantly deviate
25 from normality. Response patterns of the categorical variables appeared normal for *not-*
26 *taking* (31.91% refused to take the lollipop), *not-eating* (34.04% refused to eat the lollipop),
27 *reading* (84.17% read the ingredients table of the lollipop), and *awareness* (20.71% claimed
28 that they were aware of the potential for the ingredients of the lollipop to contain banned

1 substances). We screened the range of reaction-time in the brief-single category IAT, and
2 there were no response faster than 300ms or slower than 3,000ms, so no outliers were
3 eliminated from the computation of the implicit doping attitude scores. Table 1 displays the
4 means and standard deviations of the study variables, as well as Pearson correlations
5 between the variables.

6 Insert Table 1 about here

7 Parameter estimates, effect sizes, and confidence intervals of the hierarchical logistic
8 regression models predicting the variables related to athletes' vigilance toward unintentional
9 doping from the 'lollipop' protocol are reported in Table 2. In Step 1, the control variables did
10 not form any significant relationship with the dependent variables, but adding *explicit* doping
11 attitude in Step 2 and *implicit* doping attitude in Step 3 significantly increased the explained
12 variance in the *reading* (Total $R^2 = .20$) and *awareness* (Total $R^2 = .17$) variables. Explicit
13 (OR = .54, $p = .01$) and implicit (OR = .33, $p = .01$) doping attitudes were both significant
14 negative predictors of *reading*. Explicit (OR = 1.58, $p = .03$) and implicit (OR = 3.30, $p = .01$)
15 attitudes significantly and negatively predicted *awareness*. Neither of the attitude measures
16 predicted the *not-taking* and *not-eating* variables.

17 Insert Table 2 about here

18 Parameter estimates, confidence intervals, and effect sizes for the hierarchical linear multiple
19 regression analysis predicting behavioural adherence measure on the SRTAS are reported
20 in Table 3. Sport level in Step 1 was a significant positive predictor of self-reported
21 adherence to the avoidance of unintentional doping, but effects of explicit ($\beta = -.05$, $p = .54$)
22 and implicit ($\beta = .12$, $p = .13$) doping attitudes in Steps 2 (explicit) and 3 (implicit) were not
23 significant.

24 Insert Table 3 about here

25 Discussion

26 The aim of the current study was to examine whether implicit and explicit doping attitudes
27 would predict athletes' vigilance toward unintentional doping and self-reported behavioural

1 adherence to the avoidance of unintentional doping. It was hypothesised that both implicit
2 and explicit doping attitudes would negatively predict athletes' vigilance toward the
3 avoidance of unintentional doping indicated by their refusal to take or eat any suspicious
4 food/ drink product, their reading of the ingredients table, and their awareness of the
5 presence of banned performance-enhancing substances in the given food/drink product. We
6 also hypothesised that implicit doping attitude would have unique effects on behavioural
7 outcomes beyond that of explicit doping attitude. Findings partially supported our
8 hypotheses. Implicit and explicit attitudes toward doping significantly and independently
9 predicted some of the behavioural outcomes related to unintentional doping.

10
11 Consistent with our hypotheses, both implicit and explicit measures of doping attitude
12 significantly predicted two behavioural outcomes relevant to the avoidance of unintentional
13 doping: reading the ingredients table and conscious awareness of the potential presence of
14 banned performance enhancing substances in an unexpected, unmarked food product. Our
15 analysis indicated that athletes who held higher implicit or explicit doping attitudes were .33
16 times and .54 times, respectively, less likely to read the ingredients table of the unexpected,
17 unknown food product. This result supported our hypotheses regarding valence of prediction
18 for doping attitude and the predictive power of implicit doping attitude on athletes' vigilance
19 toward unintentional doping beyond that of explicit doping attitude. This is consistent with
20 prior research examining the relationship between doping attitude and athletes' behavioural
21 patterns of doping in sport^{10, 11, 17, 18, 24}. On the other hand, athletes with higher implicit doping
22 attitude or explicit doping attitude were 3.03 and 1.58 times, respectively, more likely to
23 report being aware of the risk of unintentional doping. Despite significant findings for
24 awareness, the direction of the effects were contrary to expectations given the negative
25 effect of doping attitude on athletes' vigilance towards unintentional doping. Such findings
26 may have important implications for anti-doping education. Athletes' vigilance of banned
27 performance-enhancing substances in their daily life, on one hand, could be an adaptive
28 behaviour as it may serve the purpose of identifying, and ultimately preventing unintentional

1 doping. On the other hand, it might also increase athletes' ability to identify, or even consider
2 seeking access to commonly available banned performance-enhancing substances⁵. It is
3 therefore important that anti-doping education focuses not only on increasing athletes'
4 knowledge of doping substances, but also on their beliefs, values, and self-regulation *against*
5 the use of doping substances or methods in sport, such as morality, sportspersonship, fair
6 play, self-control, and the negative health and career consequences of doping^{5, 6, 11}. Future
7 studies could further examine the relationship between vigilance of banned performance-
8 enhancing substances and behavioural consequences of doping (e.g., **intention¹⁸ or**
9 **susceptibility of doping¹⁶**), and whether implicit or explicit doping attitude moderate such
10 relationship.

11
12 We found no effect of implicit and explicit attitudes on the *not-taking* and *not-eating* variables,
13 and on self-reported adherence to unintentional doping. This implies that implicit and explicit
14 doping attitudes were only linked to certain behaviours related to unintentional doping, which
15 **is consistent with the findings of previous studies** that utilised the 'lollipop' decision-making
16 protocol^{3, 6}. Previous studies **utilising** the lollipop decision-making protocol found that athletes
17 with high self-control or those who felt they had to avoid unintentional doping via external
18 pressures (i.e., possessed controlled motivation) were more likely to refuse the lollipop⁶.
19 This suggests that self-compulsion or external pressure (i.e., athletes feeling they have to do
20 it), and resilience to temptation are more important, or **prominently featured**, in decisions to
21 engage in behaviours linked to unintentional doping than doping attitude⁶. An alternative
22 explanation could be the lack of correspondence between the measures of attitude, which
23 focused on doping in sport in general, and the behavioural measures, which focused on
24 unintentional doping. Finally, the measure of adherence **to the avoidance of unintentional**
25 **doping** (SRTAS) was self-reported, in that participants could answer the questionnaire
26 without directly, actively accessing their decisions with respect to doping avoidance. On the
27 other hand, it may also be that decisions regarding doping are automatic or non-conscious,
28 **consistent with dual-process models of behaviour**. Given that previous experience and habits

1 are strong determinants for behaviour³¹, it may be that the SRTAS was not fit-for-purpose as
2 a measure of unintentional doping due to a non-conscious, automatic process that occurs
3 beyond an individual's awareness. This explanation is congruent with previous studies that
4 suggest implicit attitude as an automatic or habitual processes^{22, 31}. It is therefore important
5 that future studies adopt measures of implicit attitudes towards unintentional doping and
6 examine their relationships with athletes' behavioural vigilance and non-conscious
7 behavioural responses.

8
9 The present study has a number of strengths and limitations. Firstly, research thus far has
10 lacked consistency regarding the methods and procedures used to measure implicit attitudes
11 towards doping. The implicit doping attitude assessed in prior research has been measured
12 with a traditional format IAT⁸, in which athletes' responses to doping substances have been
13 contrasted against legal nutritional supplements. As such, the D-score for these measures
14 could be confounded by athletes' general attitude towards legal nutritional supplements. The
15 current study overcame this problem by using a single-category IAT²⁵. This method has the
16 advantage of directly measuring the intended construct without the need for a reference
17 category (i.e., legal nutritional supplements). This is the first time this version of the IAT has
18 been applied to anti-doping behaviours in sport, and we have provided preliminary evidence
19 for its predictive validity in the current study. However, the concurrent and predictive validity
20 of the measure has not been fully explored. For example, the association between explicit
21 and implicit attitudes was not significant, although this finding is not alarming, given that
22 correlations have not been consistently established in previous research studies between
23 implicit and explicit measures^{14, 15, 19, 21, 24}. One explanation might be that implicit measures
24 have shown to be more resilient to response biases than explicit measures, especially for
25 athletes who deny doping¹⁵. A more effective evaluation could utilise multiple predictive tests
26 of the measure alongside behavioural and conceptually-related criterion variables to provide
27 converging evidence for its validity. For example, future studies could compare the predictive
28 validity of the measure against other existing measures developed in previous studies^{14, 19, 21}.

1 Second, social desirability and response bias apply to all measures used in the present
2 study, including the implicit and explicit doping attitude measures, and the measure of
3 behavioural adherence to the avoidance of unintentional doping¹⁶. Although the behavioural
4 measures regarding the awareness to unintentional doping (i.e., *not-taking*, *not-eating*) were
5 cross-checked by the experimenter, participants could still claim that they read the
6 ingredients table and were aware of the presence of banned performance-enhancing
7 substances, when in actuality they may have not. While the effect of social desirability is
8 unavoidable in self-report measures for psychological variables related to doping, future
9 studies could attempt to account for individual differences on social desirability scales, or
10 introduce other objective measures to monitor vigilance toward unintentional doping, such as
11 the use of closed-circuit television or eye-tracking devices. Third, in the study procedure, we
12 only randomised the order of the stimuli within the brief-IAT. We did not randomise the order
13 of different assessments (e.g., IAT, PEAS, SRTAS), so earlier assessments might have
14 affected participants' responses to later assessments (e.g., mere-measurement effect,
15 practice effect). A recent randomised controlled trial³² demonstrated that response order did
16 not significantly moderate factor correlation, at least for samples similar in size to that of the
17 current study. Therefore, the sequential response order may not have has a major impact on
18 our study results, yet future research should consider controlling for the response order effect
19 by counter-balancing the order of assessment. Finally, a strength of the current investigation
20 was that it accounted for both implicit and objective behavioural measures, but it was limited
21 by its cross-sectional correlational design. Therefore, we could not infer causal relations from
22 the current data. Future studies should adopt a longitudinal design or cross-lagged panel
23 designs to explore whether changing athletes' attitude towards doping would link to changes
24 in their vigilance in behaviourally avoiding unintentional doping. Developing future
25 interventions that reduce athletes' doping attitude would be highly meaningful for educational
26 campaigns aimed at promoting anti-doping.

27

28 Conclusions

1 The present study compared predictive powers of both implicit and explicit doping attitudes
2 on athletes' vigilance toward, and adherence to, behaviours in the avoidance of unintentional
3 doping. The findings supported the hypotheses that implicit and explicit doping attitudes
4 predict athletes' unintentional doping avoidance behaviours.

5

6 Practical Implications:

7

- 8 • Single category implicit association test of doping attitude developed in this study
9 might serve as an objective screening tool for athletes' vigilance to unintentional
10 doping

11

12

13 Acknowledgement:

14 This project **is funded** by World Anti-Doping Agency Social Science Research Grant awarded
15 to [author's name and affiliation masked for blind review] and the Australian Government
16 Anti-Doping Research Programme awarded to [author's name and affiliation masked for blind
17 review].

18

References

1. Chan DKC, Tang TCW, Yung PSH, Gucciardi DF, Hagger MS. Is unintentional doping real, or just an excuse? . *Br J Sports Med.* in press.
2. Chan DKC, Dimmock JA, Donovan RJ, Hardcastle S, Lentillon-Kaestner V, Hagger MS. Self-determined motivation in sport predicts anti-doping motivation and intention: A perspective from the trans-contextual model. *J Sci Med Sport.* 2015;18(3):315-22.
3. Chan DKC, Donovan RJ, Lentillon-Kaestner V, Hardcastle SJ, Dimmock JA, Keatley D, et al. Young athletes' awareness and monitoring of anti-doping in daily life: Does motivation matter? *Scand J Med Sci Sports.* 2014;25(6):e655-63.
4. Chan DKC, Hardcastle S, Dimmock JA, Lentillon-Kaestner V, Donovan RJ, Burgin M, et al. Modal salient belief and social cognitive variables of anti-doping behaviors in sport: Examining an extended model of the theory of planned behavior. *Psychol Sport Exerc.* 2015;16(2):164-74.
5. Chan DKC, Hardcastle SJ, Lentillon-Kaestner V, Donovan RJ, Dimmock JA, Hagger MS. Athletes' beliefs about and attitudes towards taking banned performance-enhancing substances: A qualitative study. *Sport, Exercise, and Performance Psychology.* 2014;3(4):241-57.
6. Chan DKC, Lentillon-Kaestner V, Dimmock JA, Donovan RJ, Keatley DA, Hardcastle SJ, et al. Self-control, self-regulation, and doping in sport: A test of the strength-energy model. *J Sport Exerc Psy.* 2015;37(2):199-206.
7. Chan DKC, Ntoumanis N, Gucciardi DF, Donovan RJ, Dimmock JA, Hardcastle SJ, et al. What if it really was an accident? The psychology of unintentional doping. *Br J Sports Med.* 2016;50:898-9.
8. Greenwald AG, McGhee DE, Schwartz JLK. Measuring individual differences in implicit cognition: The implicit association test. *J Pers Soc Psychol.* 1998;74(6):1464-80.
9. Ntoumanis N, Ng JYY, Barkoukis V, Backhouse S. Personal and psychosocial predictors of doping use in physical activity settings: A meta-analysis. *Sports Med.* 2014;44(11):1603-24.
10. Petroczi A, Aidman E. Measuring explicit attitude toward doping: Review of the psychometric properties of the Performance Enhancement Attitude Scale. *Psychol Sport Exerc.* 2009;10(3):390-6.
11. Jalleh G, Donovan RJ, Jobling I. Predicting attitude towards performance enhancing substance use: A comprehensive test of the Sport Drug Control Model with elite Australian athletes. *J Sci Med Sport.* 2013;17(6):574-9.
12. Cunningham WA, Preacher KJ, Banaji MR. Implicit attitude measures: Consistency, stability, and convergent validity. *Psychol Sci.* 2001;12(2):163-70.

- 1 13. Dovidio JF, Kawakami K, Gaertner SL. Implicit and explicit prejudice and interracial
2 interaction. *J Pers Soc Psychol.* 2002;82(1):62-8.
- 3 14. Petroczi A, Aidman EV, Nepusz T. Capturing doping attitudes by self-report
4 declarations and implicit assessment: A methodology study. *Substance Abuse Treatment
5 Prevention and Policy.* 2008;3(1):9.
- 6 15. Petroczi A, Uvacsek M, Nepusz T, Deshmukh N, Shah I, Aidman EV, et al.
7 Incongruence in doping related attitudes, beliefs and opinions in the context of discordant
8 behavioural data: In which measure do we trust? *PLoS One.* 2011;6(4).
- 9 16. Gucciardi DF, Jalleh G, Donovan RJ. Does social desirability influence the
10 relationship between doping attitudes and doping susceptibility in athletes? *Psychol Sport
11 Exerc.* 2010;11(6):479-86.
- 12 17. Lucidi F, Grano C, Leone L, Lombardo C, Pesce C. Determinants of the intention to
13 use do in substances: An empirical contribution in a sample Italian adolescents. *Int J Sport
14 Psychol.* 2004;35(2):133-48.
- 15 18. Lucidi F, Zelli A, Mallia L, Grano C, Russo PM, Violani C. The social-cognitive
16 mechanisms regulating adolescents' use of doping substances. *J Sports Sci.*
17 2008;26(5):447-56.
- 18 19. Brand R, Melzer M, Hagemann N. Towards an implicit association test (IAT) for
19 measuring doping attitudes in sports. Data-based recommendations developed from two
20 recently published tests. *Psychol Sport Exerc.* 2011;12(3):250-6.
- 21 20. Brand R, Wolff W, Thieme D. Using response-time latencies to measure athletes'
22 doping attitudes: the brief implicit attitude test identifies substance abuse in bodybuilders.
23 *Substance Abuse Treatment Prevention and Policy.* 2014;9(1):36.
- 24 21. Lotz S, Hagemann N. Using the implicit association test to measure athlete's attitude
25 toward doping. *J Sport Exerc Psy.* 2007;29:S183-S4.
- 26 22. Perugini M. Predictive models of implicit and explicit attitudes. *Br J Soc Psychol.*
27 2005;44:29-45.
- 28 23. Petróczi A, Aidman EV, Hussain I, Deshmukh N, Nepusz T, Uvacsek M, et al. Virtue
29 or pretense? Looking behind self-declared innocence in doping. *PLoS One.*
30 2010;5(5):e10457.
- 31 24. Whitaker L, Petroczi A, Backhouse SH, Long J, Nepusz T. The role of the Self in
32 assessing doping cognition: Implicit and explicit measures of athletes' doping-related
33 prototype perceptions. *Psychol Sport Exerc.* 2016;24:159-67.
- 34 25. Karpinski A, Steinman RB. The Single Category Implicit Association Test as a
35 measure of implicit social cognition. *J Pers Soc Psychol.* 2006;91(1):16-32.
- 36 26. Sriram N, Greenwald AG. The Brief Implicit Association Test. *Exp Psychol.*
37 2009;56(4):283-94.

- 1 27. Backhouse SH, Whitaker L, Petroczi A. Gateway to doping? Supplement use in the
2 context of preferred competitive situations, doping attitude, beliefs, and norms. *Scand J Med*
3 *Sci Sports*. 2013;23(2):244-52.
- 4 28. Chan DKC, Hagger MS. Trans-contextual development of motivation in sport injury
5 prevention among elite athletes. *J Sport Exerc Psy*. 2012;34(5):661-82.
- 6 29. Chan DKC, Hagger MS. Autonomous forms of motivation underpinning injury
7 prevention and rehabilitation among police officers: An application of the trans-contextual
8 model. *Motiv Emotion*. 2012;36(3):349-64.
- 9 30. Chan DKC, Lonsdale C, Ho PY, Yung PSH, Chan KM. Patient motivation and
10 adherence to post-surgery rehabilitation exercise recommendations: The influence of
11 physiotherapists' autonomy supportive behaviors. *Arch Phys Med Rehabil*. 2009;90:1977-82.
- 12 31. Hagger MS, Chan DKC, Protogerou C, Chatzisarantis NLD. Using meta-analytic path
13 analysis to test theoretical predictions in health behavior: An illustration based on meta-
14 analyses of the theory of planned behavior. *Prev Med*. 2016;89:154-61.
- 15 32. Chan DKC, Ivarsson A, Stenling A, Yang XS, Chatzisarantis NLD, Hagger MS.
16 Response-order effects in survey methods: A randomized controlled crossover study in the
17 context of sport injury prevention. *J Sport Exerc Psy*. 2015;37(6):666-73.
- 18
19
20

Table 1

Correlation matrix, mean, and standard deviation of the study variables.

	1	2	3	4	5	6	7
<u>Predictors</u>							
1. Implicit Doping Attitude	1						
2. Explicit Doping Attitude	.06	1					
<u>Behavioural Outcome</u>							
3. Not-Taking	.04	.02	1				
4. Not-Eating	.01	-.06	.79**	1			
5. Reading	-.23**	-.21*	.12	.05	1		
6. Awareness	.23**	.15	-.04	-.10	-.68**	1	
7. Behavioural Adherence	.18*	-.08	.04	.11	-.15	.18*	1
<u>Control Variables</u>							
8. Age	.15	.03	-.12	-.10	-.01	.01	.04
9. Gender	-.04	-.02	.05	.05	.10	-.11	.01
10. Type of Sport	.10	.02	.03	-.04	.01	.05	.05
11. Sport Level	.08	-.07	-.17	-.09	-.06	.04	.30**
Mean	-.07	2.39	.32	.34	.84	.21	3.42
SD	.56	1.08	.47	.48	.37	.41	1.63

* $p < .05$, ** $p < .01$

Note. Not-taking (0 = took the lollipop, 1 = refusing taking the lollipop); Not-eating (0 = ate or plan to eat the lollipop, 1 = did not eat or plan to eat the lollipop); Reading (0 = did not read the ingredients table printed on the lollipop, 1 = read the ingredients table printed on the lollipop); Awareness (0 = not being aware if the ingredients contained banned substances, 1 = being aware if the ingredients contained banned substances); Gender (1 = male, 2 = female); Type of sport (0 = individual sport, 1 = team sport); Sport level (1 = regional level, 2 = state level, 3 = national level, 4 = international level, 5 = world top 20).

Table 2*Results of multiple linear and linear logistic regression models*

Step	Independent Variables	Odds Ratio	(95% CI of <i>EXP(B)</i>)	Wald	χ^2	R ²	ΔR^2
<u>Dependent Variable = Not-Taking</u>							
1	Age	.93	(.85 to 1.02)	.05	7.68	.077	.077
	Gender	1.63	(.73 to 3.76)	.51			
	Sport Type	1.06	(.49 to 2.32)	.51			
	Sport Level	.70	(.77 to 1.23)	.05			
2	Explicit Doping Attitude	1.83	(.73 to 1.46)	.03	.03	.077	.00
3	Implicit Doping Attitude	1.50	(.75 to 2.97)	1.33	1.34	.090	.013
<u>Dependent Variable = Not-Eating</u>							
1	Age	.94	(.86 to 1.03)	1.78	4.35	.044	.044
	Gender	1.49	(.68 to 3.26)	.99			
	Sport Type	.85	(.40 to 1.81)	.18			
	Sport Level	.81	(.57 to 1.16)	1.31			
2	Explicit Doping Attitude	.88	(.62 to 1.25)	.49	.50	.048	.004
3	Implicit Doping Attitude	1.31	(.67 to 2.54)	.63	.63	.055	.007
<u>Dependent Variable = Reading</u>							
1	Age	.99	(.89 to 1.11)	.03	2.32	.029	.029
	Gender	2.10	(.68 to 6.45)	1.67			
	Sport Type	1.08	(.41 to 2.88)	.03			
	Sport Level	.82	(.52 to 1.28)	.79			
2	Explicit Doping Attitude	.54**	(.35 to .83)	7.81	8.15**	.129	.100
3	Implicit Doping Attitude	.33*	(.14 to .80)	6.02	6.44**	.203	.074
<u>Dependent Variable = Awareness</u>							
1	Age	1.01	(.92 to 1.13)	.11	2.91	.033	.033
	Gender	.53	(.20 to 1.41)	1.64			
	Sport Type	1.26	(.53 to 3.03)	.27			
	Sport Level	1.22	(.81 to 1.82)	.91			
2	Explicit Doping Attitude	1.58*	(1.08 to 2.31)	5.63	5.67*	.096	.063
3	Implicit Doping Attitude	3.03**	(1.35 to 6.80)	7.17	7.71**	.177	.081

Note. R² = Nagelkerke R-squared. 95%CI of *EXP(B)* = 95% confidence interval of the odds

ratio. * $p < .05$, ** $p < .01$

Table 3*Results of hierarchical linear multiple regression models*

Step	Independent Variables	β	(95% CI of B)	F	ΔF	R ²	ΔR^2
<u>Dependent Variable = SRTAS Behavioural Adherence</u>							
1	Age	.01	(-.06 to .07)	4.88**	4.88**	.127	.127
	Gender	-.02	(-.65 to .49)				
	Sport Type	.13	(-.12 to .98)				
	Sport Level	.36**	(.30 to .82)				
2	Explicit Doping Attitude	-.05	(-.32 to .17)	3.96**	.37	.130	.002
3	Implicit Doping Attitude	.12	(-.11 to .83)	3.71**	2.28	.144	.015

Note. SRTAS = Self-reported treatment adherence scale; 95% CI of B = 95% confidence

interval of unstandardised beta. * $p < .05$, ** $p < .01$