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“Time May Change me, but you Can’t Trace Time”: The (In)Stability of Psycho-Social Doping  
Profiles among Adolescent Athletes

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## 1 Abstract

2 The Adolescent Sport Doping Inventory (ASDI; Nicholls, Levy, et al., 2019) was one of the first  
3 questionnaires designed specifically to measure psycho-social doping constructs among  
4 adolescent athletes. Little is known about the reliability of this scale, and nor the stability of the  
5 psychosocial variables that the ASDI assesses. The aim of this paper was to assess the reliability  
6 of the ASDI, along with the extent to which key psychosocial constructs are stable, and whether  
7 there was variance across four clusters. Three independent samples of athletes were recruited.  
8 Athletes completed the ASDI one week apart (Sample 1), 8 weeks apart (Sample 2), and 16  
9 weeks apart (Sample 3). Findings revealed that the ASDI is a robust and reliable measure. While  
10 there was little within-subject variance in the data assessed one week apart (Sample 1) and 8  
11 weeks apart (Sample 2), correlation coefficients in Sample 3 were markedly lower than Samples  
12 1 or 2. The data also revealed that there was movement between cluster profiles for the eight-  
13 and 16-week gap, but not the one-week gap. In the short-term, psychosocial variables such as  
14 attitudes doping and susceptibility towards doping are relatively stable among adolescent  
15 athletes, although there is some movement between doping clusters. This could infer that  
16 ongoing anti-doping education is required to prevent undesirable changes in these important  
17 factors on a regular basis within adolescence.

18 **Keywords:** Adolescence; Attitudes; **Psycho-social questionnaire**; Susceptibility

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1 "Time May Change me, but you Can't Trace Time": The (In)Stability of Psycho-Social  
2 Variables Associated with Doping among Adolescent Athletes

3 According to World Anti-Doping Agency's (WADA, 2021) code, there are 11 different  
4 anti-doping rule violations. These include: (1) the presence of a prohibited substance in an  
5 athlete's sample, (2) using or attempting to use a banned substance or method, (3) evading,  
6 refusing, or failing to provide a sample, (4) failure to declare whereabouts, (5) tampering or  
7 attempting to tamper with any aspect of doping control, (6) possession of a banned substance or  
8 method, (7) trafficking or attempting to traffic banned substances or methods, (8) administering a  
9 banned substance or method to another athlete, (9) complicity or attempted complicity, (10)  
10 prohibited associate by an athlete, and (11) discouraging or retaliating against a person who  
11 reports doping.

12 According to Weiss and Bredemeier (1983), adolescence refers to individuals who are  
13 aged between 12 and 18 years of age. Worryingly, there is evidence that adolescent athletes take  
14 performance enhancing drugs (PEDs) either intentionally (e.g., Lucidi et al., 2013; Mallia et al.,  
15 2013) or inadvertently by consuming contaminated nutritional supplements (e.g., Tsarouhas et  
16 al., 2018). Understanding more about the underpinning psycho-social constructs that predict  
17 doping behaviour (i.e., attitudes towards doping) and how these may change for young athletes,  
18 is important for informing how often doping education may be needed among this population.  
19 Although researchers have created models to explain doping among adult athletes, adolescents  
20 have featured much more sparingly in the doping literature. This is somewhat surprising, given  
21 that the former director of WADA, stated that WADA are most worried about young athletes  
22 given the temptation they may have to dope (Howman, 2015).

1           Three models have attempted to explain why young athletes take PEDs. These are the  
2 Integrated Model of Doping Behavior (IMDB; Lazuras et al., 2015), the Social-Cognitive Model  
3 (Zelli et al., 2010), and the Sport Drug Control Model for Adolescent Athletes (SDCM-AA;  
4 Nicholls et al., 2015). The Integrated Model of Doping Behavior (IMBD; Lazuras et al., 2015),  
5 includes both proximal predictors of doping intentions (e.g., outcome expectancy beliefs, social  
6 norms, and self-efficacy beliefs) and distal (e.g., achievement goals, motivational regulations,  
7 and moral orientations), predicted 57.2% of the variance in doping intentions. Furthermore,  
8 social norms, self-efficacy beliefs, doping attitudes added 34.4% of the variance in intentions.  
9 The Social Cognitive Model (SCM; Zelli et al., 2010) predicts that several factors (e.g., doping  
10 attitudes, subjective norms, perceived behavioural control, doping self-regulatory efficacy, and  
11 doping moral disengagement) influence doping intentions, which predicts doping behavior. Zelli  
12 et al. (2010) found support for this model, as intentions to dope at Time 1 predicted doping use  
13 4-5 months later. **Additionally, Girelli et al. (2020) found partial support for the SCM (Zelli et**  
14 **al.), as attitudes towards doping and doping moral disengagement positively predicted intention**  
15 **to use PEDs. These authors, however, did not assess doping behavior so the model could not be**  
16 **fully tested. Interestingly, this study included participants from Italy, Romania, and Turkey. No**  
17 **differences in attitudes towards doping among the participants from different countries were**  
18 **observed.**

19           The SDCM-AA (Nicholls et al., 2015; 2020) was adapted specifically for adolescent  
20 athletes from the original Sport Drug Control Model (SDCM; Donovan et al., 2002). The SDCM  
21 (Donovan et al.) integrates three different behavioural science frameworks (i.e., threat/fear  
22 appeals, instrumental and normative approaches, and social cognition). Donovan and colleagues  
23 proposed that doping attitudes was the key factor that influenced whether an athlete would dope

1 or not. In turn, doping attitudes are influenced by six different constructs (i.e., benefit appraisals,  
2 threat appraisals, reference group opinions, personality, legitimacy, and morality). Benefit  
3 appraisals relates to the athlete considering gains that can potentially occur from doping (e.g.,  
4 fame, increased earnings, fame, or selection to national teams). Threat appraisals include either,  
5 or both, the likelihood of being caught taking banned substances or the negative health effects  
6 from doping. Reference group opinion relates to the extent that significant others (e.g., coaches,  
7 parents, or friends) can influence they can exert upon athletes and how they view doping.  
8 Personality was also believed to influence attitudes towards doping in Donovan's SDCM, and  
9 there is evidence to support this, as Nicholls, Madigan, et al. (2017; 2019) reported that the Dark  
10 Triads of personality were linked to doping attitudes. Legitimacy relates to the extent to which  
11 anti-doping organisations, such as WADA, are valid and can identify athletes who dope. Finally,  
12 morality relates to whether athletes believe doping is right or wrong, while legitimacy is about  
13 how athletes perceive organizations that police doping. **Three** studies have quantitatively  
14 examined the SDCM (**García-Grimau et al., 2021**; Gucciardi et al., 2011; Jalleh et al., 2014).  
15 With a sample of 670 elite athletes from Australia, Gucciardi et al. (2011) reported that morality  
16 (cheating), threat appraisals, and benefit appraisals were strongly associated with doping  
17 attitudes. Self-esteem, legitimacy, and reference group opinion, however, were not associated  
18 with doping attitudes. In support of Gucciardi et al. (2011), Jalleh et al. (2014) found that  
19 morality, reference group opinion, and legitimacy were associated with attitudes towards doping.  
20 **García-Grimau et al. reported that morality and reference group opinion were the strongest**  
21 **predictors of attitudes towards doping. Further, García-Grimau and colleagues also found that a**  
22 **favorable attitude towards doping was associated with high susceptibility towards doping. These**  
23 **three studies provide empirical support for the SDCM (Donovan et al.).**

1           Nicholls et al. (2015) interviewed 11 coaches and performance directors regarding the  
2 applicability of the original SDCM (Donovan et al., 2002) to adolescent athletes. Nicholls et al.  
3 (2015) found support for the original SDCM, in that attitudes were key factors that would shape  
4 doping behaviour. The importance of doping attitudes among adolescent athletes mirrors the  
5 findings from research predominantly with adult athletes. In a meta-analysis (Ntoumanis et al.,  
6 2014) and systematic review (Nicholls, Cope, et al., 2017), researchers reported that attitudes  
7 were one of the most important factors that predict doping behaviour. Adolescence is the time in  
8 which attitudes are typically formed and take shape. As such, it is a period on one's life in which  
9 attitudes change (Cieciuch et al., 2016; Döring et al., 2015; Kjellström et al., 2017). At the  
10 present time, however, little is known about stability of doping attitudes among either adolescent  
11 or adult athletes. This is somewhat surprising given the importance of this construct in relation to  
12 doping for both adolescents (e.g., Nicholls, Cope, et al., 2017) and adult athletes (Ntoumanis et  
13 al., 2014). Given that attitudes change and are formed during adolescence (Cieciuch et al., 2016;  
14 Döring et al., 2015; Kjellström et al., 2017), it could be argued that it is important to understand  
15 the longer-term stability of attitudes, particularly when seeking to quantitatively assess them,  
16 because this has implications for anti-doping education and potentially how often athletes receive  
17 this form of education and when athletes first receive anti-doping education.

18           A construct within the SDCM-AA (Nicholls et al., 2015) that was not included in  
19 Donovan's SDCM (2002) was doping susceptibility. Although susceptibility was not included in  
20 the original SCDM (Donovan et al., 2002), the coaches in the Nicholls et al. (2015) study  
21 believed that doping susceptibility was a key predictor of doping behaviour. Gucciardi et al.  
22 (2010) defined doping susceptibility as "the absence of a firm resolve not to engage in doping  
23 activities or to give any consideration at all to an offer to do so" (p. 481). In support of this

1 construct being included in the SDCM-AA, scholars have reported that doping susceptibility was  
2 a proxy for doping behaviors, particularly if it is associated with positive attitudes towards  
3 doping (Barkoukis et al., 2014; Blank et al., 2016).

#### 4 **The Adolescent Sport Doping Inventory**

5       Based on the SDCM-AA (Nicholls et al., 2015), Nicholls, Levy, et al. (2019) developed  
6 the Adolescent Sport Doping Inventory (ASDI) to assess key constructs linked to doping among  
7 adolescent athletes. **The ASDI was created because there was no valid questionnaire designed to**  
8 **specifically assess psycho-social doping constructs among adolescent athletes. Although scholars**  
9 **had used the Performance Enhancement Attitude Scale (PEAS; Petróczy & Aidman, 2009) to**  
10 **assess doping attitudes among adolescent athletes (e.g., Madigan et al., 2017), the PEAS is not a**  
11 **suitable questionnaire for this age group, because it demonstrated a poor fit among adolescent**  
12 **athletes (Nicholls, Madigan, et al., 2017). As such, the results derived among adolescents from**  
13 **using the PEAS may be questionable.** The ASDI (Nicholls et al.) measures nine factors that are  
14 linked to doping among adolescents, such as doping attitudes, doping susceptibility, threat,  
15 benefit, esteem, cheating, legitimacy, reference group opinion, and stress. Although Nicholls et  
16 al. reported that the ASDI is a valid tool, they did not report its test-retest stability.

17       The ASDI (Nicholls, Levy, et al., 2019) was also used to formulate distinct clusters  
18 among adolescent athletes. That is, 2,208 adolescent athletes aged between 12 and 18 years of  
19 age completed the ASDI (Nicholls et al.) and four distinct profiles of athletes emerged in the  
20 Nicholls et al. (2020) study. These were the Susceptibles, Chancers, Pragmatists, and Fair  
21 Players. Susceptibles identified with the benefits of doping, were willing to cheat, were highly  
22 influenced by their reference group, viewed little threat, did not value the legitimacy of testing,  
23 and were below average in self-esteem. Chancers also identified with the benefits of doping,

1 scored high on willingness to cheat, and were highly influenced by their reference group, but had  
2 an average score for threat, self-esteem, and legitimacy. The Pragmatists did not engage with any  
3 aspects of doping but were more susceptible than the fair players. Finally, Fair Players were  
4 unwilling to cheat, viewed doping as a threat to their health and being caught, and were not  
5 unduly influenced by their reference group.

6       The purpose of this study was to assess test-retest stability of the ASDI (Nicholls, Levy,  
7 et al., 2019), with measurements been taken one week apart. The second purpose of this study  
8 was to assess longer-term changes in the variables assessed within the ASDI among the four  
9 clusters identified by Nicholls et al. (2020). To do this, we applied a test-retest design to two  
10 other independent groups at eight- and 16-weeks apart, respectively. In total, three independent  
11 samples of athletes involved in competitive sport, were recruited to avoid over-burdening the  
12 participants with having to complete the ASDI too many times. It has been suggested that  
13 adolescence is a period in which attitudes changes (Cieciuch et al., 2016; Döring et al., 2015;  
14 Kjellström et al., 2017), but very little is known about how attitudes towards doping may change  
15 over time, among adolescent athletes. Based on data from other studies, we hypothesised that  
16 attitudes would change at eight and 16 weeks (e.g., Cieciuch et al.; Döring et al.; Kjellström et  
17 al.). These time periods were selected because they allow time for attitudes to change among the  
18 sample.

## 19   Method

### 20       Participants

21               Three independent samples were collected. Sample 1 contained 92 participants (male  $n$   
22 = 55, female  $n = 37$ ) aged 17-18 ( $M = 17.96$ ,  $SD = 0.21$ ). Participants represented 17 different  
23 sports from four countries (UK  $n = 79$ , Australia  $n = 10$ , US  $n = 2$ , Malaysia  $n = 1$ ), which were



1 performed at beginner ( $n = 8$ ), club – amateur ( $n = 67$ ), club – semi-professional ( $n = 10$ ),  
2 county/state ( $n = 4$ ), and international ( $n = 3$ ) level. On average, participants had been playing  
3 their sport for 9.24 years ( $SD = 3.84$ ). Sample 2 contained 134 participants (male  $n = 82$ ,  
4 female  $n = 52$ ) aged 14-18 ( $M = 17.09$ ,  $SD = 1.42$ ). Participants represented 20 different sports  
5 from the UK. On average, participants had been playing their sport for 8.51 years ( $SD = 3.66$ ).  
6 Sample 3 contained 86 participants (male  $n = 58$ , female  $n = 28$ ) aged 14-17 ( $M = 14.83$ ,  $SD =$   
7  $0.87$ ). Participants represented 17 different sports from the UK. On average, participants had  
8 been playing their sport for 6.70 years ( $SD = 2.90$ ).

### 9 **Measure**

10 *Adolescent Sport Doping Inventory (ASDI)*. The ASDI (Nicholls, Levy, et al., 2019), is  
11 a 43-item questionnaire that assesses psycho-social variables linked to doping. The ASDI  
12 contains the following nine subscales: attitudes (e.g., “Legalizing PEDs would benefit my  
13 sport”), threat (“I would suffer serious health complications if I took PEDs”), benefit (e.g.,  
14 “Taking PEDs could help me keep my place in the team or training squad”), self-esteem (e.g.,  
15 “I am worth being in the team/squads that I am currently play for”), cheating (e.g., “I would  
16 cheat if I knew I won’t get caught”), legitimacy (e.g., “Drug tests are very thorough”),  
17 reference group opinion (e.g., “What other people think about PEDs influences my decision on  
18 whether I would ever take them or not”), stress (e.g., “Competing in sport makes me feel  
19 anxious or worried”), and susceptibility (e.g., “I would be tempted to take PEDs, if I knew they  
20 would increase my performance”). Questions are answered on a 7-point Likert-type scale,  
21 anchored at 1 = ‘Strongly Disagree’ and 7 = ‘Strongly Agree.’ Nicholls et al. reported a good  
22 confirmatory factor analysis model fit for the ASDI:  $\chi^2(824) = 1440.403$ , CFI = .954, TLI =  
23 .950, SRMR = .039, RMSEA = .035 (90% CI = .032, .038). Further, Nicholls et al. provided

1 support for the convergent validity of the ASDI, as psycho-social doping variables were  
2 associated with honesty and humility, maturation, situational temptation, motivational climate,  
3 stress, coping, achievement goals, the coach-athlete relationship, stress, coping, achievement  
4 goals, and coach behavior.

## 5 **Procedure**

6 Participants completed the ASDI (Nicholls, Levy, et al., 2019) twice with no  
7 intervention in-between. Sample 1 had a gap of one week between tests, Sample 2 had a gap of  
8 8 weeks between tests, and Sample 3 had a gap of 16 weeks between tests.

9 The one-week gap was designed to examine the test-retest stability of the ASDI  
10 (Nicholls, Levy, et al., 2019). A study using health status self-report measures by Marx et al.  
11 (2003) found no difference in stability coefficients if the retest was conducted two days or two  
12 weeks apart, so any point within this time frame appeared appropriate. Deviations in scores  
13 within this period can be considered as negatively reflecting on the stability of the  
14 measurement. **It was not possible to continue to test this sample over a longer period. Using**  
15 **independent samples therefore, we sought to examine the stability of the constructs over eight**  
16 **weeks and 16 weeks rather than further test-retest stability of the ASDI.**

## 17 **Data Analysis**

18 Preliminary analyses tested for outliers, univariate normality, **and internal consistency.**  
19 To examine **scale** stability, item-level and subscale-level correlations were conducted on data  
20 collected one-week apart from Sample 1. As Samples 2 and 3 were not direct examinations of  
21 scale stability, these were only tested at subscale level. The most common method of  
22 quantifying the test-retest stability of a scale is the use of correlation, with Pearson's  $r$  scores  $>$   
23  $.80$  considered stable (Anastasi & Urbina, 1997; Kline, 1993). Paired sample  $t$ -tests were

1 conducted to test for no difference, calculating  $p$ -values and 95% bootstrapped confidence  
2 intervals. Following the recommendations of Nevill et al. (2001) and Lane et al. (2005), the  
3 percentage of responses within ( $\pm 1$ ) for were calculated for Sample 1, examining change at item  
4 level. At least 80-90% of tests retest responses  $\pm 1$  was considered as supportive of temporal  
5 stability.

6 Nicholls et al. (2020) suggested that ASDI respondents could be associated with one of  
7 four categories based on their cluster analysis: pragmatists, fair players, chancers, or  
8 Susceptibles. To determine the extent to which these remained stable, we examined the  
9 proportion of participants that moved from one cluster to another within the two time points in  
10 each sample. Using data obtained from 2,208 participants who completed ASDI previously in  
11 the Nicholls et al. (2020) study to identify cut-offs for each cluster membership, we  
12 determined the cluster for which each participant in each sample would lie, relative to the  
13 normative sample. Movement between clusters was then examined using through chi-square  
14 analyses. Data that support the findings of this study are available from the corresponding  
15 author, [AN], upon reasonable request.

## 16 **Results**

17 Preliminary analysis demonstrated no issues with outliers or normality in any sample, as  
18 all items and subscales presented acceptable skewness ( $< 2$ ) and kurtosis ( $< 2$ ) estimates.

19 McDonald's omega point estimates confirmed internal consistency in each of the samples at  
20 each data collection point (Tables 2, 3, & 4).

### 21 **Sample 1: One-week gap**

22 Item level relationships are presented in Table 1, while subscale level relationships are in  
23 Table 2. All items and subscales demonstrated a significant ( $p < .001$ ) relationship between test

1 and retest in all correlations. Typically, this was moderate to strong. A very similar pattern  
2 emerged for item-level correlational analyses. Only three of the 43 items produced a statistically  
3 significant  $t$ -value, as did one of the six subscales (reference group). The percentage of responses  
4 ( $\pm 1$ ) for each item ranged from 77.17% to 95.65% for all items and 80.43% to 95.65% for  
5 subscales.

6 To determine the magnitude of the difference in legitimacy, we used the  
7 recommendations of Ferguson (2009) for minimum practical effect size for Cohen's  $d \geq 0.41$ .  
8 Here,  $d = 0.23$ . As such, the effect size is small to negligible in the only subscale that reported  
9 any effect.

10 Finally, we explored the extent to which cluster membership changed between the first  
11 and second data point. Overall, cluster size remained stable (Figure 1). Cross-tabulation  
12 suggested no significant movement between cluster ( $\chi^2(9) = 2.86, p = .97$ ).

### 13 **Sample 2: Eight-week gap**

14 Subscale analysis for Sample 2 is presented in Table 3. Only reference group presented a  
15 statistically significant change over time, but with a negligible effect size ( $d = 0.17$ ). Overall,  
16 results remained stable over an eight-week period with no intervention.

17 Cluster membership indicated a statistically significance change between time points  
18 ( $\chi^2(9) = 152.46, p < .001$ ). Specifically, this was brought about by participants moving equally  
19 between the Pragmatists cluster and the Fair Players cluster, with 19.36% of participants moving  
20 from the former to the latter and 24.39% moving in the opposite direction. Susceptibles largely  
21 remained in their cluster (86.11%), while Chancers demonstrated the most pliable cluster  
22 membership (61.54% remained, 15.39% moved to Susceptibles, 11.54% moved to Pragmatists,  
23 and 11.54% moved to Fair Players).

### 1 **Sample 3: 16-week gap**

2           Subscale analysis for Sample 3 is presented in Table 4. Only esteem presented a  
3 statistically significant change over time, but short of minimum practical effect ( $d = 0.36$ ). The  
4 correlation estimates however highlight a substantive decrease from the estimates in Sample 2,  
5 suggesting that there is variance over a 16-week period without intervention.

6           Cluster membership indicated a statistically significance change between time points  
7 ( $\chi^2(9) = 21.59, p = .010$ ). Movement between Pragmatists and Fair Players was again shown to  
8 be likely, with 33.33% moving from the former to the latter and 29.03% moving in the opposite  
9 direction. Only 45.46% of Chancers remained in their cluster. With 27.27% becoming  
10 Pragmatists, and 22.73% becoming Susceptibles. Timepoint 1 had only identified 13  
11 Susceptibles in this sample, but seven of those (53.85%) had become Chancers by the second  
12 time point.

### 13 **Discussion**

14           Firstly, test-retest stability, as examined in Sample 1, where the ASDI (Nicholls, Levy, et  
15 al., 2019) was completed twice with a one-week gap, was supported at item and subscale level.  
16 Researchers can use the ASDI with confidence that it has consistency over a short period. As  
17 such the ASDI is now a valid (Nicholls, Levy, et al.) and a reliable tool to assess the psycho-  
18 social constructs associated with doping among adolescents. Although other questionnaires have  
19 been used to assess doping attitudes among adolescents (e.g., PEAS; Petróczi & Aidman, 2009),  
20 the PEAS demonstrated a poor fit among adolescent athletes (Nicholls, Madigan, et al., 2017).  
21 The ASDI appears a more appropriate questionnaire to assess attitudes towards doping among  
22 athletes.

1           The second purpose of this study was to examine the extent to which the psycho-social  
2 variables assessed in the ASDI (Nicholls et al., 2019) were stable over an 8- and 16-week period.  
3 There was little within-subject variance in over the 8-week measurement period, indicating that  
4 the psycho-social constructs assessed by the ASDI are relatively stable. The correlation  
5 coefficients, however, across the 16-week measurement period were markedly lower in  
6 comparison to the 8-week measurement period. This finding would imply researchers could  
7 consider this when assessing psycho-social constructs to gauge the effectiveness of anti-doping  
8 interventions. It could be argued that scholars could carefully match control and intervention  
9 groups. One way of doing this would be matching athletes by adopting the normative values to  
10 generate clusters, as reported by Nicholls et al. (2020). By carefully matching the control group  
11 with the experimental group, researchers can be more confident that changes were caused by the  
12 intervention, as opposed to changes in the psycho-social doping that seem to occur with time.

13           Interestingly, the movement between clusters among the sample infers that these are not  
14 fixed and that athletes can change clusters in becoming more in favor or more against  
15 performance enhancing drugs. It appears that the Chancers are most likely to move clusters and  
16 appear to vulnerable to joining the Susceptibles cluster. From an education perspective, the  
17 notion that adolescents can change clusters over a relatively short period of time is both a cause  
18 for concern and optimism, in equal measures. It is a concern, because an adolescent athlete could  
19 move from a less risky doping cluster to a much riskier doping cluster, such as going from the  
20 Pragmatists to the Chancers, and then the Susceptibles. It is also a source of optimism because it  
21 infers that clusters are not fixed, indicating that exposure to anti-doping education may prevent  
22 Chancers moving into the Susceptibles cluster and may help them become either Pragmatists or  
23 Fair Players. Research is required to assess this assertion. In applied terms, national anti-doping

1 organizations or sport federations who deliver anti-doping education could focus on trying to  
2 change the profiles of athletes and worry less about specific scores. That is, an intervention could  
3 be judged a success if there are fewer Susceptibles and Chancers at the end of an education  
4 intervention, in comparison to the start.

5       A limitation of this study is that three independent samples were used rather than a  
6 sample measured several times over a lengthy period. As individual differences are not  
7 accounted for, some samples could be more pre-disposed to change than others. This was a  
8 pragmatic decision to ensure sufficient sample sizes. A further limitation is that the athletes in  
9 Sample 3 were younger than Sample 1 or Sample 2. This might have contributed to the lower  
10 correlation coefficients at 16 weeks, in comparison to the eight-week period among Sample 2.  
11 This is because attitudes are actively formed during early adolescence (Cieciuch et al., 2016;  
12 Döring et al., 2015; Kjellström et al., 2017). It would be interesting to monitor the psycho-social  
13 variables across older adolescents and for a longer period. Although this research was conducted  
14 with adolescents, it might be worthwhile assessing the stability of attitudes and susceptibility  
15 towards doping among adults too. Results pertaining to the movement between clusters should  
16 also be treated with some caution, as sample sizes are relatively small and therefore, such  
17 analysis is likely to exaggerate the volatility of cluster membership, but the finding that seven  
18 athletes moved from being a Susceptible to a Chancer in 16 weeks is still concerning, given that  
19 these seven athletes are much more at risk of committing a doping offence. Cluster membership  
20 has excellent applied potential but requires further empirical research. Researchers could recruit  
21 athletes based on cluster membership to ensure that enough athletes are recruited in each cluster  
22 and then monitor change in cluster membership over time. It would be also interesting to see the  
23 extent to which education programmes influence cluster membership too.

1           The findings that key psycho-social doping variables are less stable over time among  
2 adolescent athletes has implications for the delivery of anti-doping interventions that target  
3 constructs such as attitudes and susceptibility towards doping. Although interventions have been  
4 successful at reducing favorable attitudes towards doping among adolescent athletes (e.g.,  
5 Nicholls et al., 2020), the effectiveness of such interventions might waiver over time, given the  
6 changing nature over time. Furthermore, adolescence is a period of a person’s life when he or  
7 she is susceptible to peer pressure. Indeed, peer pressure accounts for why people may engage in  
8 delinquent or risky behavior (Simons-Morton et al., 2005), such as taking banned substances.  
9 Some adolescent athletes may dope to impress their friends, as Moffitt (1993) found that one of  
10 the main reasons why adolescents engage in delinquent behavior is to impress their peers.  
11 Regularly providing adolescent athletes with anti-doping education could circumvent any  
12 negative influences and address any changes in attitudes, should they occur.

13           The adolescent athletes in this study were all involved in competitive sport. Doping  
14 among young people is not solely confined to competitive sport, as there is evidence of doping  
15 within recreational sport. That is, Christiansen et al. (2023) examined doping prevalence among  
16 7, 260 individuals who participate in recreational sport and found that 10.4% reported using  
17 over-the-counter medications to enhance their performance and that 6.9% of participants  
18 involved in games (e.g., football, tennis, volleyball) doped. Whether individuals are involved in  
19 competitive or recreational sport, the United Kingdom Anti-Doping (2021) report suggested that  
20 doping is a ‘public health timebomb.’ PEDs are associated with very serious side effects such as  
21 liver and kidney disease, cancer, heart disease, mood disorders, and suicide ideation and attempt,  
22 and early and preventable mortality (Lindqvist et al. 2013; McNamee, 2015; Piacentino et al.,  
23 2022). The costs to treating illnesses cause by doping places a burden on healthcare services by



1 increasing the demand for treatment along with these associated costs (McVeigh et al., 2021).  
2 For these reasons, it appears important to offer people involved in competitive and recreational  
3 sport education about PEDs.

#### 4 **Conclusion**

5         The ASDI (Nicholls, Levy, et al., 2019) is reliable measure of assessing key psycho-  
6 social variables that are linked to doping behavior, particularly over shorter periods of time. It  
7 appears that psycho-social variables towards doping, such as attitudes and susceptibility are less  
8 stable over a period of 16 weeks, certainly among young adolescent athletes, but that athletes can  
9 move cluster profiles, with those in the Chancer cluster being vulnerable to moving into the  
10 Susceptibles cluster. This could infer that an adolescent athlete would require repeated anti-  
11 doping education rather than just receiving one intervention.

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**Table 1.**

**The minimum and maximum test-retest differences, means and standard deviations per item per test, *t* statistic, product-moment correlations (*r*), intraclass correlations (ICC), and percentage of participants with differences within (±1) for Sample 1**

Item	Test 1				Test 2				<i>t</i>	<i>r</i> (95% CI)	ICC (95% CI)	% (±1)
	Min	Max	Mean	SD	Min	Max	Mean	SD				
1	1.00	5.00	2.01	1.29	1.00	6.00	2.00	1.33	.13	.80*** (.67, .90)	.89 (.83, .93)	93.48
2	1.00	5.00	2.52	1.49	1.00	6.00	2.45	1.49	.82	.82*** (.70, .91)	.90 (.85, .94)	93.48
3	1.00	6.00	2.23	1.44	1.00	6.00	2.23	1.43	.00	.86*** (.76, .93)	.92 (.88, .95)	95.65
4	1.00	6.00	2.47	1.55	1.00	7.00	2.58	1.60	-1.18	.84*** (.75, .92)	.92 (.87, .94)	89.13
5	2.00	7.00	4.82	1.56	2.00	7.00	4.65	1.56	1.27	.69*** (.51, .82)	.81 (.72, .88)	83.70
6	1.00	7.00	4.86	1.42	2.00	7.00	4.84	1.60	.16	.61*** (.46, .75)	.75 (.63, .84)	80.43
7	2.00	7.00	4.93	1.40	1.00	7.00	4.65	1.54	2.12* <sup>1</sup>	.63*** (.46, .77)	.77 (.65, .85)	81.52
8	1.00	7.00	4.93	1.41	2.00	7.00	4.89	1.41	.35	.64*** (.50, .75)	.78 (.66, .85)	82.61
9	1.00	7.00	2.77	1.60	1.00	7.00	2.80	1.65	-.20	.55*** (.35, .73)	.71 (.55, .81)	77.17
10	1.00	6.00	2.66	1.63	1.00	7.00	2.83	1.63	-1.24	.70*** (.56, .81)	.82 (.73, .88)	82.61
11	1.00	7.00	2.77	1.67	1.00	7.00	2.60	1.60	1.12	.58*** (.41, .74)	.74 (.60, .83)	77.17
12	1.00	6.00	2.62	1.54	1.00	7.00	2.52	1.52	.80	.71*** (.57, .82)	.83 (.74, .89)	80.43
13	1.00	6.00	2.23	1.47	1.00	6.00	2.14	1.41	.71	.66*** (.51, .81)	.80 (.69, .87)	81.52
14	1.00	7.00	4.95	1.61	1.00	7.00	4.76	1.55	1.83	.81*** (.72, .89)	.90 (.84, .93)	88.04
15	1.00	7.00	5.02	1.50	2.00	7.00	4.88	1.39	1.31	.75*** (.65, .84)	.85 (.78, .90)	90.22
16	1.00	7.00	5.07	1.52	2.00	7.00	4.91	1.45	1.69	.83*** (.73, .90)	.91 (.86, .94)	92.39
17	2.00	7.00	5.14	1.52	2.00	7.00	5.07	1.32	.87	.83*** (.72, .91)	.91 (.86, .94)	94.57
18	2.00	7.00	4.60	1.33	2.00	7.00	4.66	1.31	-.61	.70*** (.55, .82)	.82 (.73, .88)	89.13
19	1.00	6.00	2.53	1.45	1.00	6.00	2.62	1.54	-.78	.75*** (.58, .88)	.85 (.78, .90)	88.04
20	1.00	5.00	2.46	1.47	1.00	7.00	2.63	1.52	-1.43	.70*** (.53, .85)	.82 (.73, .88)	86.96
21	1.00	5.00	2.09	1.29	1.00	6.00	2.10	1.36	-.14	.85*** (.74, .94)	.92 (.87, .95)	95.65
22	1.00	7.00	2.47	1.59	1.00	6.00	2.46	1.54	.13	.86*** (.79, .93)	.93 (.89, .95)	94.57
23	1.00	7.00	2.67	1.69	1.00	7.00	2.55	1.65	.99	.76*** (.60, .89)	.86 (.79, .91)	90.22



24	2.00	7.00	4.67	1.45	1.00	7.00	4.42	1.41	1.93	.62*** (.45, .77)	.77 (.64, .84)	83.70
25	1.00	7.00	4.77	1.45	1.00	7.00	4.58	1.26	1.56	.61*** (.45, .76)	.75 (.63, .84)	83.70
26	2.00	7.00	4.79	1.33	1.00	7.00	4.65	1.35	1.25	.67*** (.52, .80)	.81 (.71, .87)	83.70
27	2.00	7.00	4.59	1.26	1.00	7.00	4.55	1.30	.29	.65*** (.49, .76)	.79 (.68, .86)	88.04
28	1.00	7.00	4.53	1.42	1.00	7.00	4.72	1.39	-1.38	.58*** (.37, .78)	.74 (.60, .83)	86.96
29	1.00	7.00	2.93	1.63	1.00	7.00	2.57	1.65	2.29* <sup>1</sup>	.58*** (.37, .77)	.74 (.60, .82)	79.35
30	1.00	7.00	2.67	1.60	1.00	6.00	2.53	1.59	1.16	.73*** (.57, .87)	.84 (.76, .90)	86.96
31	1.00	7.00	2.50	1.50	1.00	7.00	2.37	1.49	1.14	.73*** (.55, .88)	.84 (.76, .90)	90.22
32	1.00	7.00	2.65	1.61	1.00	7.00	2.34	1.48	2.44* <sup>1</sup>	.68*** (.51, .83)	.81 (.71, .87)	84.78
33	1.00	7.00	2.60	1.55	1.00	6.00	2.42	1.43	1.58	.75*** (.58, .88)	.86 (.78, .91)	90.22
34	1.00	7.00	3.63	1.37	1.00	6.00	3.42	1.41	1.53	.57*** (.36, .73)	.72 (.58, .82)	82.61
35	1.00	7.00	3.11	1.50	1.00	7.00	3.02	1.44	.63	.60*** (.40, .77)	.75 (.62, .83)	82.61
36	1.00	7.00	3.15	1.54	1.00	6.00	3.21	1.43	-.36	.54*** (.34, .71)	.70 (.54, .80)	76.09
37	1.00	7.00	3.32	1.48	1.00	7.00	3.35	1.49	-.25	.65*** (.46, .79)	.79 (.68, .86)	83.70
38	1.00	6.00	3.45	1.44	1.00	7.00	3.35	1.46	.79	.67*** (.52, .79)	.80 (.70, .87)	80.43
39	1.00	7.00	2.13	1.44	1.00	7.00	2.13	1.44	.00	.77*** (.55, .92)	.87 (.80, .91)	93.48
40	1.00	7.00	2.17	1.40	1.00	6.00	2.16	1.30	.11	.74*** (.52, .90)	.85 (.77, .90)	94.57
41	1.00	7.00	2.35	1.54	1.00	7.00	2.30	1.49	.41	.78*** (.59, .92)	.87 (.81, .92)	92.39
42	1.00	6.00	2.33	1.50	1.00	6.00	2.30	1.36	.28	.87*** (.80, .92)	.93 (.89, .95)	95.65
43	1.00	7.00	2.24	1.51	1.00	6.00	2.14	1.33	.89	.73*** (.54, .87)	.84 (.76, .89)	90.22

Notes: \*Statistically significant at  $p < .05$ , \*\* $p < .01$ , \*\*\* $p < .001$ . <sup>1</sup>95% bootstrapped confidence interval does not include zero

**Table 2.**

**Means and standard deviations per subscale per test, *t* statistic, product-moment correlations (*r*), and intraclass correlations (ICC) for Sample 1**

Subscale	Test 1					Test 2					<i>t</i>	<i>r</i> (95% CI)	ICC (95% CI)	% (±1)
	Min	Max	Mean	SD	$\omega$	Min	Max	Mean	SD	$\omega$				
Attitudes	1.00	5.25	2.31	1.28	.91	1.00	6.25	2.31	1.35	.94	-.09	.90*** (.83, .95)	.95 (.92, .96)	94.57
Threat	2.50	7.00	4.89	1.24	.87	2.00	7.00	4.76	1.35	.91	1.40	.77*** (.66, .87)	.87 (.81, .92)	83.70
Benefit	1.00	5.60	2.61	1.39	.93	1.00	6.40	2.58	1.38	.93	.32	.74*** (.60, .85)	.85 (.78, .90)	81.52
Esteem	2.00	7.00	4.95	1.35	.94	2.60	7.00	4.86	1.23	.93	1.42	.87*** (.78, .94)	.93 (.90, .95)	94.57
Cheating	1.00	5.20	2.44	1.27	.90	1.00	6.00	2.47	1.34	.93	-.49	.91*** (.85, .96)	.95 (.93, .97)	95.65
Legitimacy	1.80	7.00	4.67	1.08	.83	1.00	7.00	4.59	1.22	.89	1.04	.73*** (.61, .84)	.85 (.77, .90)	85.87
Reference Group	1.00	7.00	2.67	1.42	.94	1.00	6.60	2.45	1.40	.95	2.24* <sup>1</sup>	.77*** (.58, .92)	.87 (.80, .91)	90.22
Stress	1.20	6.20	3.33	1.18	.87	1.00	5.80	3.27	1.22	.90	.60	.67*** (.49, .81)	.80 (.70, .87)	80.43
Susceptibility	1.00	6.00	2.24	1.35	.95	1.00	5.80	2.21	1.27	.95	.46	.85*** (.68, .95)	.92 (.87, .94)	93.48

Notes: \*Statistically significant at  $p < .05$ , \*\* $p < .01$ , \*\*\* $p < .001$ . <sup>1</sup>95% bootstrapped confidence interval does not include zero

**Table 3.**

**Means and standard deviations per subscale per test, *t* statistic, and product-moment correlations (*r*) for Sample 2**

Subscale	Test 1					Test 2					<i>t</i>	<i>d</i>	<i>r</i> (95% CI)
	Min	Max	Mean	SD	$\omega$	Min	Max	Mean	SD	$\omega$			
Attitudes	1.00	6.50	2.56	1.42	.91	1.00	7.00	2.75	1.63	.95	-1.12	-0.10	.48*** (.34, .60)
Threat	1.00	7.00	4.59	1.48	.95	1.00	7.00	4.45	1.61	.96	1.06	0.09	.51*** (.37, .63)
Benefit	1.00	6.60	2.87	1.56	.96	1.00	6.40	3.03	1.46	.96	-1.44	-0.12	.61*** (.49, .71)
Esteem	1.20	7.00	5.26	1.40	.94	1.40	7.00	5.12	1.34	.93	1.44	0.13	.66*** (.56, .75)
Cheating	1.00	7.00	2.62	1.43	.93	1.00	6.20	2.62	1.46	.95	-0.05	-0.00	.68*** (.58, .76)
Legitimacy	1.00	7.00	4.81	1.19	.85	1.00	7.00	4.70	1.26	.91	1.13	0.10	.59*** (.47, .69)
Reference Group	1.00	7.00	2.56	1.54	.95	1.00	6.60	2.37	1.40	.95	2.02* <sup>1</sup>	0.17	.72*** (.62, .79)
Stress	1.00	6.40	3.25	1.27	.86	1.00	5.80	3.28	1.28	.90	-0.34	-0.03	.63*** (.51, .72)
Susceptibility	1.00	7.00	2.37	1.48	.96	1.00	6.60	2.43	1.46	.98	-0.59	-0.05	.71*** (.62, .79)

Notes: \*Statistically significant at  $p < .05$ , \*\* $p < .01$ , \*\*\* $p < .001$ . <sup>1</sup>95% bootstrapped confidence interval does not include zero

**Table 4.**

**Means and standard deviations per subscale per test, *t* statistic, and product-moment correlations (*r*) for Sample 3**

Subscale	Test 1					Test 2					<i>t</i>	<i>d</i>	<i>r</i> (95% CI)
	Min	Max	Mean	SD	$\omega$	Min	Max	Mean	SD	$\omega$			
Attitudes	1.00	7.00	2.36	1.56	.94	1.00	7.00	2.47	1.55	.97	-0.50	-0.05	.18 (-.03, .38)
Threat	1.00	7.00	4.56	1.67	.95	1.00	7.00	4.25	1.72	.94	1.27	0.14	.09 (-.12, .30)
Benefit	1.00	7.00	3.28	1.76	.97	1.00	7.00	3.21	1.54	.98	0.31	0.03	.29** (.08, .47)
Esteem	2.80	7.00	6.13	0.86	.77	1.40	7.00	5.64	1.34	.93	3.33* <sup>1</sup>	0.36	.31** (.10, .49)
Cheating	1.00	7.00	2.89	1.83	.94	1.00	7.00	2.77	1.66	.96	0.51	0.05	.25* (.04, .44)
Legitimacy	1.00	7.00	5.06	1.46	.92	1.00	7.00	4.76	1.45	.93	1.78	0.19	.20 (-.02, .40)
Reference Group	1.00	7.00	2.34	1.69	.94	1.00	7.00	2.50	1.56	.95	-0.77	-0.08	.31** (.10, .49)
Stress	1.00	7.00	3.11	1.46	.89	1.00	6.20	3.04	1.38	.89	0.46	0.05	.36*** (.16, .53)
Susceptibility	1.00	7.00	2.54	1.78	.96	1.00	7.00	2.49	1.57	.96	0.56	0.06	.31** (.10, .49)

Notes: \*Statistically significant at  $p < .05$ , \*\* $p < .01$ , \*\*\* $p < .001$ . <sup>1</sup>95% bootstrapped confidence interval does not include zero

**Figure 1:**  
**Cluster membership within each data point for all three samples.**

