# Motor learning methods that induce high practice variability reduce

kinematic and kinetic risk factors of non-contact ACL injury

#### 1 Abstract

2 The prevention of non-contact anterior cruciate ligament (ACL) injuries often involves movement 3 training, but the effectiveness of different motor learning methods has not been fully investigated. 4 The purpose of this study was therefore to examine the effects of linear pedagogy (LP), nonlinear pedagogy (NLP) and differential learning (DL) motor learning methods on changing kinetic and 5 6 kinematic factors during expected sidestep cutting related to non-contact ACL injuries. These methods primarily differ in the amount and type of movement variability they induce during 7 practice. Sixty-six beginner male soccer players  $(27.5 \pm 2.7 \text{ years}, 180.6 \pm 4.9 \text{ cm}, 78.2 \pm 4.6 \text{ kg})$ 8 9 were randomly allocated to a group that trained for 12 weeks with either a LP, NLP or DL type of 10 motor learning methods. All participants completed a biomechanical evaluation of side-step cutting before and after the training period. Analysis of covariance was used to compare post-11 12 testing outcomes among the groups while accounting for group differences in baseline performance. Changes in all kinematic and kinetic variables in NLP and DL groups were 13 significantly higher compared to the LP group. Most comparisons were also different between 14 NLP and DL group with the exception of vertical ground reaction force, the knee 15 extension/flexion, knee valgus, and ankle dorsiflexion moments. Our findings indicate that 16 17 beginner male soccer players may benefit from training programs incorporating NLP or DL versus LP to lower biomechanical factors associated with non-contact ACL injury, most likely because 18 of the associated increased execution variability during training. We discuss that practitioners 19 20 should consider using the NLP or DL methods, and particular the NLP, during which variability 21 is induced to guide search, when implementing training programs to prevent ACL injuries in 22 soccer.

23 Keywords: anterior cruciate ligament injuries, motor learning strategy, beginner, soccer

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26	Highlights
27	Motor learning methods are effective in reducing kinetic and kinematic risk factors of non-contact
28	ACL injury among beginner footballers
29	Increasing movement variability during training is an effective factor in reducing ACL injury
30	Nonlinear pedagogy and differential learning methods both resulted in larger joint flexions and
31	reduced vertical ground reaction force
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#### 43 **1.0 Introduction**

Injuries to the knee are most prevalent in soccer (Chomiak, Junge, Peterson, & Dvorak, 2016). The 44 most common knee ligament injury is to the anterior cruciate ligament (ACL), which originates in 45 46 about 70% from non-contact actions or situations such as cutting and rotational movements (Chomiak et al., 2016; Johnston et al., 2018). Although females maintain ACL injuries at higher 47 48 rates, the number of ACL injuries in males may be similar with greater participation in physical activity (Sanders et al., 2016). There is also evidence to suggest that beginners are more likely to 49 be injured in sports such as soccer (Chomiak et al., 2016). ACL weaknesses and injury are 50 51 associated with reduced static and dynamic stability of the knee and lower extremities, hampering defective sensory feedback in the injured knee. This can lower the overall function of the knee 52 53 joint and cause secondary injuries, such as osteoarthritis or meniscus rupture, as well as mental 54 and psychological problems (Caraffa, Cerulli, Projetti, Aisa, & Rizzo, 1996; Petushek, Sugimoto, Stoolmiller, Smith, & Myer, 2019). The results of a meta-analysis revealed only 55% of non-elite 55 56 athletes who sustained an ACL injury return to competitive level sport (Ardern, Taylor, Feller, & Webster, 2014). Thus, it is essential to try to better understand and address factors associated with 57 ACL injury (Caraffa et al., 1996; Johnston et al., 2018). 58

Sidestep cutting is a common action associated with non-contact ACL injury in a number of sports (Montgomery et al., 2018; Olsen, Myklebust, Engebretsen, & Bahr, 2004; Waldén et al., 2015). During sidestep cutting high knee joint loads are generated (i.e., anterior shear force, external abduction and rotation moments) (McLean, Su, & van den Bogert, 2003) that increase ACL strain (Shin, Chaudhari, & Andriacchi, 2009, 2011). Several kinematic and kinetic factors such as increased lateral trunk flexion over the support leg, less knee flexion at initial contact and during the support phase, greater initial knee abduction angle, greater lateral plant leg distance and greater initial hip internal rotation and abduction have been found to associate with greater peak knee
abduction moments (Havens & Sigward, 2015; Jones, Herrington, & Graham-Smith, 2015). These
knee abduction moments are often used as a surrogate measure of non-contact ACL injury risk.
Thus, attention to addressing side-step cutting technique (movement [re-]training) based on the
abovementioned findings provides an opportunity to reduce knee joint loads and potentially
mitigate non-contact ACL injury risk (Dos'Santos, McBurnie, Comfort, & Jones, 2019; P A Jones,
Barber, & Smith, 2015).

Movement (re-)training is an important ACL injury prevention strategy. Traditionally, greater 73 74 overall flexion is desirable, such that impact forces are reduced and more of the load during weight acceptance is carried by muscular contraction rather than by ligaments. Also limiting non-sagittal 75 plane motion such as the dynamic knee valgus motion (combined internal hip rotation, knee 76 abduction & external rotation) would be desirable (Benjaminse, Otten, Gokeler, Diercks, & 77 Lemmink, 2017; Crenshaw, Pollo, & Calton, 2000; Hewett et al., 2005). This movement (re-78 )training relies on effective motor learning approaches. Methods that allow for training- and 79 teaching-induced variability are proposed to facilitate adaptive movements, as practice variability 80 increases the number of degrees of freedom (DOF) incorporated in movement control (Dhawale, 81 82 Smith, & Ölveczky, 2017; Newell & McDonald, 1994). Increased DOF improves functionality by allowing adaptation to the dynamic environment, which is expected to reduce injury risk (Bartlett, 83 Wheat, & Robins, 2007). A method that facilitates variability can help increase joint flexion so 84 85 that impact forces are distributed across the muscles and overall ground reaction forces reduced, leaving the ligaments less at risk of getting damaged from excessive forces. Several perspectives 86 87 and methods about inducing variability during training are distinguished (see also, Ranganathan 88 & Newell, 2013): linear pedagogy (LP, e.g., Adams, 1971), which considers execution and task

goal variability as noise and thus undesirable; and nonlinear pedagogy (NLP, e.g., Chow, 2013)
and differential learning (DL, e.g.,Schollhorn, Hegen, & Davids, 2012), which both consider
variability as functional, with DL being the more extreme in not only encouraging execution
variability during training, as proposed by NLP, but also task goal variability.

The LP strives for a universal, ideal movement pattern for everyone, ignoring differences in 93 individual learners' action systems and learning histories. It uses models, instructions and feedback 94 and repetitive practice to instill the ideal movement pattern. Variability, as deviations from the 95 ideal movement pattern, is considered as noise and thus needs to be reduced (Adams, 1971; Fitts 96 97 & Posner, 1967; Schmidt, Lee, Winstein, Wulf, & Zelaznik, 2018). In contrast, in NLP and DL methods, inducing variability is considered necessary for learning. In these methods, variability is 98 critical for allowing performers to find their individual flexible movement patterns to become 99 adaptive in an ever changing environment (Chow, 2013; Ranganathan & Newell, 2013). Yet, 100 although both NLP and DL emphasize the critical importance of variability for learning, they 101 conceive the type and role of variability differently. Within NLP variability is induced in the 102 103 performance to guide the learner' search for individual movement solutions, as such, variability is semi-structured (i.e., colored noise). By contrast, within DL variability serves to add random 104 fluctuations (i.e., white noise) to the performance to experience as many as possible movement 105 solutions. Mostly, DL methods are prescriptive in terms of an instructor being present who 106 provides the performer with many different ways (maximum variation) to achieve the task goal, 107 108 preferably ensuring that no attempt will be alike the previous ones. The instructor mostly tells the actor what to do with no feedback provided, although also environmental and task constraints can 109 be manipulated (Schollhorn et al., 2012; Savelsbergh, Kamper, Rabius, De Koning, & Schöllhorn, 110 2010). NLP is typically less prescriptive and allows a more active self-regulated search from the 111

112 performer by manipulating situational constraints (i.e., both adding and taking away). The aim of increasing variability not to maximize it for the performer to experience as many solutions as 113 possible, as per DL, but to encourage and guide the performer to actively explore multiple 114 movement solutions. This active self-regulated exploration leads to finding multiple individual 115 movement patterns or degeneracy, making performance adaptive and smooth (Chow, 2013; 116 Ranganathan & Newell, 2013). In other words, DL focuses more on emulating a random and large 117 as possible variety of movement patterns (also going beyond current task goals), while NLP 118 focuses more strongly on guiding learners to adapt to specific task and environmental constraints 119 (Gray, 2020; Schollhorn et al., 2012; Ranganathan & Newell, 2013). To make sure, both NLP and 120 DL fundamentally differ in enlarging movement variability during practice, while LP aims to 121 reduce this variability in order to achieve a universal, golden standard. For as far as we are aware, 122 123 it remains to be seen which of these motor learning methods are more helpful for changing kinematic and kinetic risk factors of non-contact ACL injury during side-step cutting. 124

The effectiveness of other types of motor learning methods in preventing ACL injury (reduction 125 126 of ground reaction force and change of joint angles during landing and cutting) has been investigated previously. For example, it has been shown that the use of external instead of internal 127 focus of attention can help prevent ACL injury in basketball and rugby (for overview see 128 Benjaminse et al., 2017; Widenhoefer, Miller, Weigand, Watkins, & Almonroeder, 2019). 129 However, as suggested by Gokeler, Neuhaus, Benjaminse, Grooms, & Baumeister, (2019), new 130 131 motor learning methods (such as NLP and DL) can also be effective in this regard. DL and NLP are two methods derived from ecological psychology and the dynamic systems approach. 132 Coordination from this combined approach describes the integration of the individual degrees of 133 freedom into functional units (Newell & McDonald, 1994). Functional variability in the movement 134

system is expected to play a role in preventing ACL injury (van Emmerik & van Wegen, 2000).
In the context of both performance and acute injury in team sports, a certain level of coordinative
variability may be desirable to evade an opponent and distribute joint loading (Weir, van Emmerik,
Jewell, & Hamill, 2019). In the present study, we examine if DL and NLP, which both aim to
increase movement variability during, can reduce kinetic and kinematic risk factors during exercise

140 compared to more traditional LP methods.

The purpose of this study was to examine the effect of motor learning method (LP, NLP and DL) 141 on changes in kinetic and kinematic factors related to non-contact ACL injuries during expected 142 143 sidestep cutting. We hypothesized that in athletes who trained using according to NLP or DL methods, the knee, trunk and hip flexion would increase more and vertical ground reaction force 144 (VGRF) would decrease more, compared with athletes who trained using the LP method. We 145 146 believe that our findings potentially provide valuable insights into how using the most appropriate motor learning method may enhance the effectiveness of motor learning programs designed for 147 ACL injury prevention. 148

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#### 150 **2.0 Methods**

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A randomized controlled trial design was used to complete the objective of this study. Upon enrollment, participants were randomly allocated to one of three groups. Participants in all of three groups completed testing before (pretest) and after (post testing) completion of a 12-week soccer training program using LP, NLP or DL method. During testing sessions participants completed running and anticipated sidestep cutting.

157 **2.1 Participants** 

158 A total of 66 collegiate males participated in this study (22 participants per group). The rationale 159 for 66 participants was to allow potential 11 vs. 11 game formats as part of the program when required. Participation was voluntarily. All participants were beginners in soccer, and their skill 160 161 level was determined in a soccer game based on expert opinion (someone who has a history of playing soccer and coaching at different levels). Participants had to be:  $(1) \ge 18$  years old, and have 162 163 (2) no experience in soccer or sports similar to soccer such as futsal, (3) no medical problems that can affect the results, such as restricted vision, (4) no history of ACL injury and were (5) no 164 physical education students. The participants' age, body mass, and height, are provided in Table 165 1. One-way ANOVAs did not reveal differences between groups in terms of their demographics 166 167 (see Table 1). The study was approved by the Institutional Review Board, and participants were informed of the benefits and risks of the investigation before signing an institutionally approved 168 169 informed consent document to participate in the study. All athletes were aged 18 years or older, so parental consent was not required. 170

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#### <<Insert Table 1 near here>>

#### 172 **2.2 Procedure**

Prior to any testing, the pre-designed training environment and test procedure were explained to 173 all participants and were shown to the participants. For the test procedure participants had to run a 174 5 m path, then rapidly change the direction of their path by 45 degrees with the dominant leg (leg 175 176 which participant would have preferred to perform the cutting on), and continue running for 177 another 5 m (Benjaminse et al., 2017; Anne Benjaminse, Welling, Otten, & Gokeler, 2018). Kinematics were recorded using a 10-camera motion capture system sampling at 200 Hz [Motion 178 179 Analysis (Raptor E), Software=Cortex 7.0, USA], and kinetics using two force plates embedded 180 in the lab floor [AMTI (AccuGait-O, 1000 HZ), USA] sampling at 1000 Hz. For further guidance

181 to the participants, all paths were marked with white lines (against the vellow ground color). 182 Approach speed was set between 4.5 and 5.5 m/s based on recommendations from previous research (Vanrenterghem, Venables, Pataky, & Robinson, 2012). To control the participants speed, 183 one person measured the speed of an approach with a chronometer recording time over a 5 m 184 approach distance and thus, ensuring the trial had an average approach speed of between 4.5 to 5.5 185 186 m/s; otherwise, the participant was allowed another attempt. In addition, approach speed was checked retrospectively, through calculating the speed of the PSIS markers in the anterior-posterior 187 direction. If the average speed was between 4.5 and 5.5 m/s, the trial was deemed acceptable and 188 189 retained for further analysis.

190 Participants had 21 reflective markers of 14 mm in diameter placed according to the Vicon Plugin-Gait marker set and model (Benjaminse et al., 2017; Anne Benjaminse et al., 2018). This was 191 192 followed by a static calibration. Participants wore only swimming trunks to enable bony landmarks to be seen and enable accurate marker placement. All participants conducted a 15-minute warm 193 up and were allowed practice trials of the side-step cutting task as part of the warm-up. For each 194 participant three (Franklyn-Miller et al., 2017) correct trials (speed within the specified range, 195 turning angle approximately 45 degrees, and continued running 5 m after changing direction) were 196 197 recorded. Pre- and post-tests were performed in a laboratory under similar conditions before and 198 after the intervention. The investigators who completed pre- and post-testing were blinded to the athletes' group allocation. 199

#### 200 2.3 Interventions

All interventions lasted 12 weeks with two one and a half hour sessions each week. Overall, one session consisted of 15 minutes of warm-up, 45 minutes of practice and half an hour of play, which included cooling off at the end. The LP group practiced on Saturdays and Mondays, the DL group 204 trained on Sundays and Tuesdays and the NLP group on Wednesdays and Fridays to avoid 205 contamination between groups. Each group was trained by a separate instructor, and all three of them had a master's degree in physical education. They had at least five years of coaching 206 207 experience in soccer schools and sports teams. Each instructor was experienced with the selected training method. If due to circumstances more than two persons of a group were absent, the session 208 was cancelled and postponed to the next day in another stadium. The soccer skills practiced 209 included mostly shooting, dribbling, receiving, crossing, defending, and passing. For each skill, 210 the instructor tried to consider a practice form that involved some cutting aspect. For example, in 211 212 a shooting drill, the player ran in a straight path, then redirected through a side-step cut before shooting, or in a receiving drill, a player moved from the left or right via a side-step cut after 213 214 receiving the ball.

215 LP

In this method, the instructor first introduced the skill (such as a pass), then he explained that 216 217 verbally, and in the next stage showed participants the correct way to do that. Participants were then asked to practice the skill, and at each stage with augmented feedback sought to improve the 218 skill. The instructor changed the skill as the group average progressed, and several times 219 220 demonstrated the correct execution if a participant did not do the desirable movement. In this 221 method, feedback decreased as the participants progressed, and with reaching the optimal pattern, variability and errors reduced (Schmidt et al., 2018). The instructor encouraged the players to 222 practice a skill over a fixed distance for many times. However, he would then allow them to practice 223 224 the same skill in the same way but from another fixed distance (limited and structured variability, 225 Ranganathan & Newell, 2013).

226 NLP

227 In the nonlinear method, the instructor did not verbally provide explicit augmented instructions or 228 feedback regarding an 'ideal' movement pattern (the 'how to do it'). Instead, he provided 'broad statements' that acted as boundary constraints on the skills practiced by the learners. So, the 229 230 instructor did not address specific movement components in terms of how to coordinate limb segments and joints in achieving the task goals, but manipulated tasks and environmental 231 constraints to encourage the player to search and find their own solutions for reaching the goal. By 232 repeatedly promoting search under similar constraints, variable solutions are explored, allowing 233 players their individual adaptive solution(s) (Moy, Renshaw, & Davids, 2016; Ranganathan & 234 235 Newell, 2013; Renshaw, Chow, Davids, & Button, 2015). When the participants were able to achieve the desired outcome, the environment and/or task constraints were further manipulated to 236 provide a new challenge (Chow et al., 2007; Moy et al., 2016; Moy, Renshaw, Davids, & Brymer, 237 2019; Renshaw, Oldham, & Bawden, 2012; Renshaw et al., 2015). In this group, the instructor 238 considered the skills of each of the participants (not based on group average) and adjusted the task 239 and environment constraints according to their skill level and individual characteristics to help 240 241 them learn the skill. However, the instructor was not allowed to tell the participant how to perform the skill. 242

243 DL

In this method, participants were never meant to perform the same pattern, hence instructions and exercises were never identical nor was feedback about an executed movement pattern provided. The required movement patterns were verbally instructed ( as in Santos et al., 2018). Thus, every trial came together with a new prescription of how to move to achieve the task goal. In the DL, the instructor determined how to kick. For example, he would say to the participant, "You have to kick with the inside of the foot" (this move was only demonstrated once and not repeated). The participant did not receive corrective feedback about the executed movement pattern. In this method to benefit from the variability, different ways of training, such as kicking with the inside of the foot, outside of the foot, or other techniques, from different distances was practiced in an random or unstructured way (Ranganathan & Newell, 2013). More details about the characteristics and the differences between methods LP, NLP and DL can be found in Table 2.

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Insert Table 2 near here

#### 256 2.4 Data processing

All data from the test measures were analyzed in MATLAB (Mathworks Matlab R2019b 257 258 v9.7.0.1190202). Marker and force data from the side-step cutting trials were filtered using a fourth 259 order, zero-lag, and recursive Butterworth filter. A cutoff frequency of 15 Hz was used for the marker data, and a cutoff frequency of 50 Hz was used for the force plate data (as. Ghanati, 260 261 Letafatkar, Almonroeder, & Rabiei, 2020). A trunk and lower extremity 6 degrees of freedom kinematic model was created for each participant from a standing trial. This model consisted of a 262 trunk, pelvis, thighs, shanks and feet and used to quantify the motion of the trunk, and at the hip, 263 knee and ankle using the Cardan angle sequence (Grood & Suntay, 1983). The model utilized a 264 CODA pelvis orientation to define the location of the hip joint center (Bell, Brand, & Pedersen, 265 266 1989). Knee and ankle joint centers were defined as the mid-point of the line between lateral and medial markers. Joint moments were determined using an inverse dynamics approach (Winter, 267 268 2009) and reported as external moments. GRFs and joint moments were normalized to body 269 weight.

All dependent variables were determined at the instant of the peak impact of the vertical component of the GRF of the plant foot during side-step cutting maneuver. This point in time was used to evaluate the angles and moments because it represented the greatest point of impact loading. Kinematic variables determined at this moment were trunk flexion angle (TFA), hip
flexion angle (HFA), knee flexion angle (KFA), knee valgus angle (KVA), ankle dorsiflexion
angle (ADA), hip ROM (HROM), knee ROM (KROM), ankle ROM (AROM) [ range of motion
from initial contact to the point of peak vGRF], peak hip flexion (HFR), and peak knee flexion
(KFR). Kinetic dependent variables determined were peak VGRF and knee extension/flexion
moment (KEFM), knee valgus moment (KVM), and ankle dorsiflexion moment (ADM) at the
point of peak impact vertical GRF.

#### 280 **2.5 Statistical analysis**

Data were analyzed in SPSS for Windows version 24 (Chicago, Ill). Normality of each kinematic 281 and kinetic variable was assessed using visual inspection of histograms in conjunction with a 282 Kolmogorov-Smirnov test (P > 0.05). For those variables showing non-normal distributions 283 Johnson-transformation was applied. Raw continuous variables that were normally distributed 284 were reported as means and standard deviations (SDs), whereas normalized continuous variables 285 286 (not normally distributed) were reported as median and interquartile range. One-way analysis of covariance (ANCOVA) with a between-factor of group (LP, NLP, and DL), and pretest scores 287 included as a covariate, was used to determine if there were group differences in the dependent 288 variables at post testing. This analysis approach (i.e., posttest performance as the outcome with 289 baseline performance as a covariate) allowed us to compare post testing outcomes while 290 accounting for potential baseline group differences (Van Breukelen, 2006). An alpha of 0.05 was 291 used for all statistical tests. For effects size, partial eta squared are reported, with 0.14, 0.06 and 292 293 0.01 referring to large, moderate and small effect size, respectively. Post hoc comparisons were 294 made using LSD tests.

#### 295 **3.0 Results**

All participants who completed the pre-test also returned for post testing. The participants' kinetic and kinematic scores are presented in Table 3. The results for the ANCOVA tests for kinematic, and kinetic variables are reported in Table 4.

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#### <<Insert Tables 3 and 4 near here>>

Post hoc tests showed significant difference between groups NLP and LP, as well as, between 300 groups DL and LP (p < 0.05). That is, for all the kinetic and kinematic variables, both NLP and 301 DL groups performed better than the LP group (i.e., more flexion at joint angles, increase moments 302 and less vGRF). As well as, a significant difference was observed between NLP and DL groups in 303 304 most kinematic variables (i.e., TFA, HFA, KFA, KVA, ADA, HROM, KROM, AROM, HFR, KFR) (p's < 0.05). However, for the VGRF (p = 0.44), KFEM (p = 0.19), KVM (p = 0.17), 305 and ADM (p = 0.09) no significant differences between NLP and DL groups were found. In sum, 306 the NLP group showed better performance for most of the kinetic and kinematic variables 307 compared to the two groups, while DL group in turn showed better performance than the LP group 308 309 (see Figure 1, 2, and 3).

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<<Insert Figure 1, 2, and 3 near here>>

#### 311 4.0 Discussion

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The purpose of this study was to investigate the effects of LP, NLP and DL on kinetic and kinematic variables related to ACL injury risk during anticipated sidestep cutting. Our main hypothesis was confirmed: In the NLP and DL methods, the joint angles increased more and the 316 VGRF decreased more than in the LP method. This shows the advantage of enhancing variability317 rather than reducing variability during training.

Accordingly, in our study NLP and DL methods were proven to be more effective methods in 318 319 modifying risk factors of ACL injury, that is, joint flexion angles were increased more and vGRF 320 was reduced more. When the amount of flexion in joints increases, the flexibility and adaptability 321 in the joint increases, and this reduces the force applied to ligaments by the muscles (Benjaminse et al., 2017; Crenshaw et al., 2000; Hewett et al., 2005; Onate, Guskiewicz, & Sullivan, 2001). 322 Importantly, the NLP group also appears to perform better than the DL group, although the VGRF 323 324 and moments (KFEM, KVM, and ADM) did not differ significantly (yet, numerically also here an advantage for the NLP method might be seen). Therefore, NLP may be the more effective strategy 325 for modifying risk factors of ACL injury than DL, while both are clearly more effective than LP 326 327 in this regard.

In the present study, LP was identified as the weakest method in the prevention of ACL injury. We 328 argue this is due to the reduced execution variability during training associated this method 329 330 (Bartlett et al., 2007; Bernstein, 1967; Orth, van der Kamp, Memmert, & Savelsbergh, 2017; Ranganathan & Newell, 2013). In fact, our findings suggests that variability in practice best allows 331 332 the person to search and choose a more appropriate solution in accordance with the constraints of the task and the environment, increasing the person's adaptability to the environment (Dhawale et 333 al., 2017; Newell & McDonald, 1994; Vereijken, Emmerik, Whiting, & Newell, 1992). Increased 334 335 variability during practice is thus considered functional. It provides the performer with a more degenerate movement coordination repertoire, increasing adaptiveness to the dynamic 336 environment and presumably reducing injury risk (Bartlett et al., 2007; Gokeler, Benjaminse, Seil, 337 338 Kerkhoffs, & Verhagen, 2018; Gokeler et al., 2019).

339 One may derive from the present results that the NLP may be the best of three methods (LP, NLP) 340 and DL) for reducing key risk factors for ACL injury. Yet, further research is needed to statistically verify this especially for the vertical ground reaction force and moments (KFEM, KVM, and 341 342 ADM). Nonetheless, this advantage for NLP relative to DL, suggest that a factor additional to merely increasing the variability is effective in modifying risk factors of ACL injury. This factor 343 344 may be the active, self-regulated exploration or search that is especially promoted in NLP method, unlike DL where variability seems more externally imposed. Ranganathan & Newell, (2013) 345 argue that intrinsic variability (finding solutions to constraints of the environment and the task), 346 347 which is a feature of the NLP method, is more effective in exploration and reinforcement learning than externally imposed variability (i.e., prescribed instructions and feedback), which is a feature 348 of the DL method. Also, manipulation in NLP allows the assessment of another component of 349 350 motor learning, namely, flexibility. In other words, participants can quickly find alternative solutions when a well-practiced solution is no longer feasible. So, self-regulated exploring 351 solutions to perform a task could have two effects on learning: 1) it can lead to the emergence of 352 353 a more individual adaptive solutions for a task because there is a search or exploration of the task solution space; and 2) it can also improve degeneracy, that is, the ability to instantaneously adapt 354 355 in multiple ways to the local dynamics. In prescribed imposed exploration of the solution space, this adaptation and degeneracy to the task constraints gets less prioritized, since attention is 356 directed toward emulating the prescribed movement pattern or solution also beyond the task space. 357 358 This flexibility makes a person more apt or prepared to adapt to (unexpectedly) changing conditions and constraints, and to move with greater skill and fluency. This will likely also protect 359 360 the individual against situations in which high stresses are placed on the musculoskeletal system

from having to achieve the desirable movements forcefully, eventually reducing for example therisk of a non-contact ACL injury.

The strengths of this study were the use of three training methods, the observation of a carefully 363 standardized cutting task in a laboratory environment, and a soccer-related intervention in the 364 participants' natural environment. An important limitation of the present study was that only male 365 366 novice participants could be included. As a result, we have to be careful generalize our findings to other groups. In particular, female have been shown to respond differently to varying types of 367 motor learning strategies to prevent ACL (Benjaminse et al., 2017). Also, further research is 368 369 needed to reveal whether our findings can be extrapolated to other kinematic and kinetic risk 370 factors of ACL injury in other tasks, such as landing.

#### 371 5.0 Conclusions

The results of this study highlight the role that training induced variability can play in soccer training for prevention of ACL injuries. Both NLP and DL training methods resulted in greater increase in knee flexion and greater reduction in VGRF than a LP training method. Additionally, the current study is suggestive in participants benefitting most from the NLP method. Tailoring training environments based on careful manipulation of constraints that maximally exploit movement variability and exploration, instead of direct and prescriptive instructions, are advised for reducing non-contact ACL injury risk.

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- 522

	All N=66 mean±SD	Linear (group 1) N=22 mean±SD	Nonlinear (group 2) N=22 mean±SD	Differential (group 3) N=22 mean±SD	F	Р
Age (years)	27.5±2.7	26.9±2.7	27.7±2.6	27.9±2.8	0.9	0.41
mass (kg)	78.2±4.6	78.9±4.8	77.8±4.5	77.9±4.6	041	0.66
Height (cm)	180.9±4.9	181.1±5.5	180.3±4.8	180.4±4.4	0.18	0.83
BMI (kg/m2)	23.7±0.4	23.1±0.6	23.9±0.4	23.9±0.4	0.13	0.87

523 Table 1. Demographic information of participants

525 Table 2. Key characteristics of the different motor learning strategies.

Teaching	LP	NLP	DL
Rules			
Target	The task goal was explicitly defined	The task goal was explicitly and it was	Task goal may be absent, but
	and it was important to achieve it.	important to achieve it.	how the action was executed was
			important.
Pattern	There was a prescribed ideal pattern	There was no prescribed ideal pattern.	There were many prescribed
	and the participants were attending to	Participants produced a pattern based on their	patterns, and the participants
	it.	own characteristics, and tasks and	were attending to it.
		environmental constraints.	
Description	The task goal and movement pattern	The task goal was identified but the movement	Each movement pattern and task
	were fully described.	patterns were not described.	goal was described.
Prescription	Prescription was encouraged.	Prescription was not allowed.	Prescription was encouraged.
Repeat	Repetition was encouraged.	Repetition was allowed.	Repetition was not allowed.

Variability	Minimized with modest structured	Semi-structured variability was encouraged	Random variability was
	variability (e.g., changing distance)	using manipulation of task and environment	encouraged by prescribing
	being allowed, but participant's	constraints. Participant's attention was directed	different movement patterns and
	attention was toward prescribed	to search adaptive solutions.	also manipulations of task and
	movement.		environmental constraints was
			allowed. Participants attended to
			prescribed motor pattern.
Feedback	Feedback on the movement pattern	Feedback on the movement pattern was not	Feedback on the movement
	was encouraged.	allowed.	pattern was not allowed.
Instructions	Instructions were encouraged to	Instructions were allowed to manipulate task	Instructions were encouraged to
msuuetions	instructions were cheouraged to	instructions were anowed to manipulate task	instructions were encouraged to
	convey the ideal movement pattern.	constraints.	prescribe always differing

movement patterns.

526

527 Table 3. The participants' kinetic and kinematic scores

		All	LP	NLP	DL
		N=66	N=22	N=22	N=22
		mean±SD	mean±SD	mean±SD	mean±SD
TFA <sup>a(°)</sup>	Pre-test	0.16±1.58	0.16±1.71	0.21±1.76	0.12±1.00
ΙΓΑ	Post-test	$0.14 \pm 1.36$	-1.17±1.45	$0.73 \pm 1.62$	$0.26 \pm 0.69$
HFA <sup>a(°)</sup>	Pre-test	$-0.24 \pm 1.50$	$0.01{\pm}1.78$	$-0.10 \pm 1.44$	-0.46±1.03
ΠΓΑ	Post-test	-0.13±1.36	-0.83±1.51	$0.63 \pm 1.24$	$-0.22 \pm 0.85$
KFA <sup>a(°)</sup>	Pre-test	38.37±4.33	38.68±4.64	37.81±4.62	38.60±3.83
ΝΓΑ	Post-test	$48.07 \pm 6.24$	$43.90 \pm 4.44$	52.31±5.93	47.99±5.33
KVA <sup>(°)</sup>	Pre-test	$-2.09\pm0.71$	-2.06±0.64	-2.17±0.82	-2.04±0.68
<b>Λ</b> ۷ Α 🖓	Post-test	-4.96±1.47	$-4.02 \pm 1.18$	-5.91±1.34	$-4.96 \pm 1.30$
ADA <sup>a</sup>	Pre-test	-0.07±1.31	0.10±1.38	-0.09±1.39	-0.09±1.49
(°)	Post-test	$0.04 \pm 1.37$	-0.74±0.70	$0.69 \pm 1.23$	$0.09 \pm 0.96$
HROM	Pre-test	-0.02±1.39	-0.27±1.41	0.19±1.29	$-0.07 \pm 1.43$
a(°)	Post-test	$0.01 \pm 1.50$	-0.81±1.27	$0.97{\pm}1.15$	$0.03 \pm 1.04$
KROM	Pre-test	$0.05 \pm 1.42$	$0.08 \pm 1.30$	$-0.008 \pm 1.35$	$0.22 \pm 1.48$
a(°)	Post-test	-0.13±1.37	$-0.64 \pm 0.67$	$0.94{\pm}1.08$	$-0.13 \pm 1.21$
AROM	Pre-test	-0.03±1.63	0.24±1.86	$-0.08 \pm 1.60$	-0.03±1.31
a(°)	Post-test	$-0.05 \pm 1.42$	$-0.72 \pm 1.28$	$0.76 \pm 0.99$	$-0.06 \pm 0.87$
HFR <sup>a</sup>	Pre-test	0.10±1.32	$-0.09 \pm 1.21$	0.44±1.49	0.007±1.34
(°)	Post-test	$-0.05 \pm 1.33$	$-0.98 \pm 1.05$	$0.66 \pm 0.95$	$0.07{\pm}1.09$

KFR <sup>a(°)</sup>	Pre-test	-0.07±1.41	-0.04±1.34	-0.28±1.46	0.15±1.39
	Post-test	$-0.01 \pm 1.45$	$-0.65 \pm 1.26$	$0.14{\pm}1.08$	$0.13 \pm 1.45$
VGRF	Pre-test	$0.15 \pm 1.42$	-0.43±1.50	0.31±1.33	0.15±1.38
a	Post-test	$-0.11 \pm 1.62$	$0.94{\pm}1.30$	$-0.33 \pm 1.44$	-0.26±0.74
<b>KEFM</b> <sup>a</sup>	Pre-test	$-0.06 \pm 1.36$	$-0.03 \pm 1.71$	$0.29 \pm 1.51$	$-0.26 \pm 1.25$
	Post-test	$0.08 \pm 1.34$	$-0.67 \pm 0.98$	$0.65 \pm 0.97$	$0.08 \pm 1.45$
KVM <sup>a</sup>	Pre-test	$0.16 \pm 1.34$	$0.05 \pm 1.77$	$0.006 \pm 1.35$	$0.21 \pm 1.42$
K V IVI "	Post-test	$0.14{\pm}1.53$	$-0.72 \pm 1.52$	$0.72 \pm 1.84$	$0.21 \pm 1.34$
<b>ADM</b> <sup>a</sup>	Pre-test	$0.09 \pm 1.32$	$0.24{\pm}1.24$	$0.09 \pm 1.23$	-0.23±1.38
	Post-test	-0.21±1.32	$-0.44 \pm 1.13$	$0.69 \pm 1.51$	$-0.09 \pm 1.05$

a=Outcome normalized through Johnson transformation and expressed in Median  $\pm$  interquartile range.

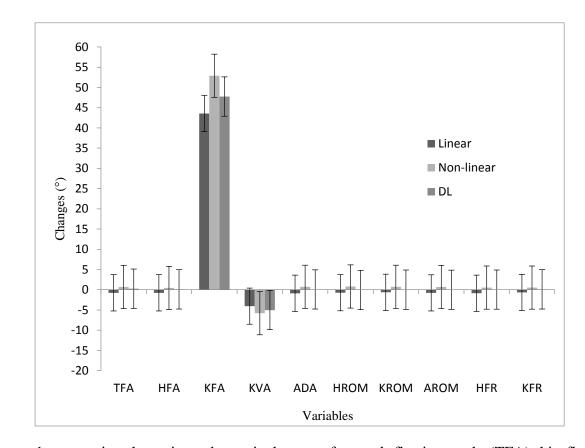
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529 Table 4. ANCOVA test results for each of the kinetic and kinematic variables

variables	$\mathrm{F}^{*}$	$\mathrm{DF}^*$	$\mathbf{P}^*$	Partial Eta Squared
trunk flection angle (TFA)	41.38	(2,62)	< 0.001	0.572
hip flexion angle (HFA)	48.82	(2,62)	< 0.001	0.612
knee flexion angle (KFA)	69.96	(2,62)	< 0.001	0.693
knee valgus angle (KVA)	25.87	(2,62)	< 0.001	0.455
ankle dorsiflexion angle (ADA)	32.17	(2,62)	< 0.001	0.509
hip ROM (HROM)	40.98	(2,62)	< 0.001	0.569
knee ROM (KROM)	19.43	(2,62)	< 0.001	0.385
ankle ROM (AROM)	25.10	(2,62)	< 0.001	0.447
Peak hip flection (HFR)	39.89	(2,62)	<0.001	0.563

Peak knee flexion (KFR)	25.87	(2,62)	<0.001	0.455
VGRF	21.10	(2,62)	< 0.001	0.405
knee extension/ flexion moment (KEFM)	22.08	(2,62)	< 0.001	0.416
knee valgus moment (KVM)	21.64	(2,62)	<0.001	0.411
ankle dorsiflexion moment (ADM)	30.93	(2,62)	<0.001	0.499

## 530 \*F = ANCOVA value, P = P value, DF = Degree of freedman

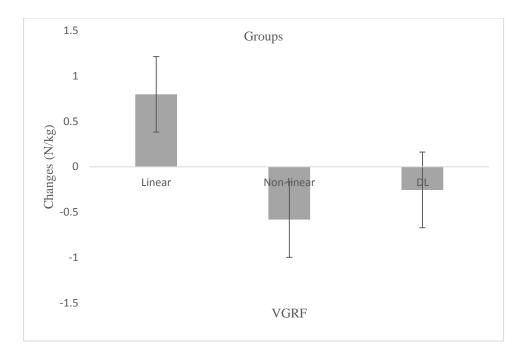


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Figure 1, comparing the estimated marginal means for trunk flection angle (TFA), hip flexionangle (HFA), knee flexion angle (KFA), knee valgus angle (KVA), ankle dorsiflexion angle

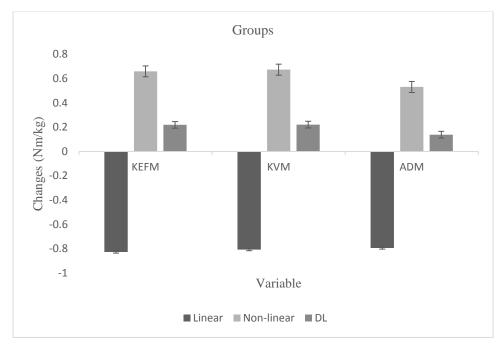
534 (ADA), hip ROM (HROM), knee ROM (KROM), ankle ROM (AROM), peak hip flection (HFR),

535 peak knee flexion (KFR)in all training methods.



537 Figure 2, comparing the estimated marginal means for vertical ground reaction force (VGRF).





- 540 Figure 3, comparing the estimated marginal means for Knee extension/ flexion moment (KEFM),
- 541 knee valgus moment (KVM), ankle dorsiflexion moment (ADM) in all training methods.

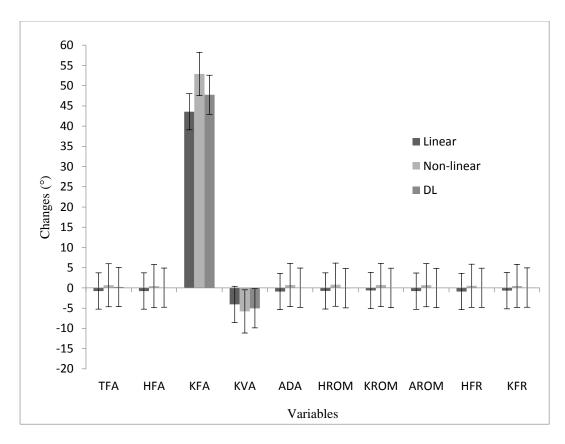


Figure 1, comparing the estimated marginal means for trunk flection angle (TFA), hip flexion angle (HFA), knee flexion angle (KFA), knee valgus angle (KVA), ankle dorsiflexion angle (ADA), hip ROM (HROM), knee ROM (KROM), ankle ROM (AROM), peak hip flection (HFR), peak knee flexion (KFR)in all training methods.

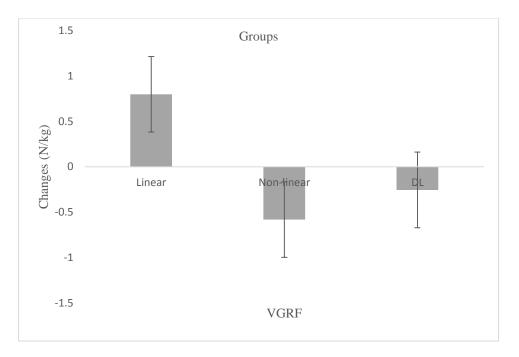


Figure 2, comparing the estimated marginal means for vertical ground reaction force (VGRF).

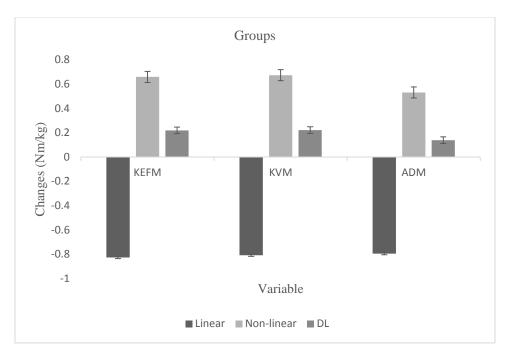


Figure 3, comparing the estimated marginal means for Knee extension/ flexion moment (KEFM), knee valgus moment (KVM), ankle dorsiflexion moment (ADM) in all training methods.

			Nonlinear	Differential	F	Р
	All	Linear (group 1)	(group 2)	(group		
	N=66	N=22	N=22	3)		
	mean±SD	mean±SD	mean±SD	N=22		
				mean±SD		
Age (years)	27.5±2.7	26.9±2.7	27.7±2.6	27.9±2.8	0.9	0.41
mass (kg)	78.2±4.6	78.9±4.8	77.8±4.5	77.9±4.6	041	0.66
Height (cm)	180.9±4.9	181.1±5.5	180.3±4.8	180.4±4.4	0.18	0.83
BMI (kg/m2)	23.7±0.4	23.1±0.6	23.9±0.4	23.9±0.4	0.13	0.87

## Table 1. Demographic information of participants

Teaching	LP	NLP	DL
Rules			
Target	The task goal was clear and it was important to achieve it.	The task goal was clear and it was important to achieve it.	Task goal may be absent, but how action was executed was important.
Pattern	There was a prescribed ideal pattern and the participants were attending to it.	There was no prescribed ideal pattern. Participants produced a pattern based on their own characteristics, and tasks and environmental constraints.	There were many prescribed patterns, and the participants were attending to it.
Description	The task goal and movement pattern were fully described.	The task goal was identified but the movement patterns were not described.	Each movement pattern and task goal were described.
Prescription	Prescription was encouraged.	Prescription was not allowed.	Prescription was encouraged.
Repeat	Repetition was encouraged.	Repetition was allowed.	Repetition was not allowed.
Variability	Modest structured variability (e.g., changing distance) was allowed, but participant's attention was toward prescribed movement.	Unstructured variability was encouraged using manipulation of task and environment constraints. Participant's attention was directed to discover adaptive solutions.	Unstructured variability was encouraged by prescribing different movement patterns and also manipulations of task and environmental constraints was allowed. Participants attended to prescribed motor pattern.
Feedback	Feedback was encouraged.	Feedback was not allowed.	Feedback was not allowed.
Instructions	Instructions were encouraged (to convey the ideal pattern).	Instructions were allowed (to manipulate task constraints).	Instructions were encouraged (to prescribe always differing movement patterns).

Table 2. Key characteristics of the different motor learning strategies.

		All	LP	NLP	DL
		N=66	N=22	N=22	N=22
		mean±SD	mean±SD	mean±SD	mean±SD
TFA <sup>a(°)</sup>	Pre-test	0.16±1.58	0.16±1.71	0.21±1.76	0.12±1.00
	Post-test	0.14±1.36	-1.17±1.45	0.73±1.62	0.26±0.69
HFA <sup>a(°)</sup>	Pre-test	-0.24±1.50	0.01±1.78	-0.10±1.44	-0.46±1.03
HFA <sup>ac</sup>	Post-test	-0.13±1.36	-0.83±1.51	0.63±1.24	-0.22±0.85
KFA <sup>a(°)</sup>	Pre-test	38.37±4.33	38.68±4.64	37.81±4.62	38.60±3.83
KFA	Post-test	48.07±6.24	43.90±4.44	52.31±5.93	47.99±5.33
KVA <sup>(°)</sup>	Pre-test	-2.09±0.71	-2.06±0.64	-2.17±0.82	-2.04±0.68
	Post-test	-4.96±1.47	-4.02±1.18	-5.91±1.34	-4.96±1.30
ADA <sup>a(°)</sup>	Pre-test	-0.07±1.31	0.10±1.38	-0.09±1.39	-0.09±1.49
	Post-test	0.04±1.37	-0.74±0.70	0.69±1.23	0.09±0.96
HROM <sup>a</sup> (°)	Pre-test	-0.02±1.39	-0.27±1.41	0.19±1.29	-0.07±1.43
	Post-test	0.01±1.50	-0.81±1.27	0.97±1.15	0.03±1.04
KROM <sup>a</sup> (°)	Pre-test	0.05±1.42	0.08±1.30	-0.008±1.35	0.22±1.48
	Post-test	-0.13±1.37	-0.64±0.67	0.94±1.08	-0.13±1.21
AROM <sup>a</sup>	Pre-test	-0.03±1.63	0.24±1.86	-0.08±1.60	-0.03±1.31
(°)	Post-test	-0.05±1.42	-0.72±1.28	0.76±0.99	-0.06±0.87
HFR <sup>a(°)</sup>	Pre-test	0.10±1.32	-0.09±1.21	0.44±1.49	0.007±1.34
	Post-test	-0.05±1.33	-0.98±1.05	0.66±0.95	0.07±1.09
KFR <sup>a(°)</sup>	Pre-test	-0.07±1.41	-0.04±1.34	-0.28±1.46	0.15±1.39
	Post-test	-0.01±1.45	-0.65±1.26	0.14±1.08	0.13±1.45
VGRF <sup>a</sup>	Pre-test	0.15±1.42	-0.43±1.50	0.31±1.33	0.15±1.38

	Post-test	-0.11±1.62	0.94±1.30	-0.33±1.44	-0.26±0.74
KEFM <sup>a</sup>	Pre-test	-0.06±1.36	-0.03±1.71	0.29±1.51	-0.26±1.25
	Post-test	0.08±1.34	-0.67±0.98	0.65±0.97	0.08±1.45
KVM <sup>a</sup>	Pre-test	0.16±1.34	0.05±1.77	0.006±1.35	0.21±1.42
	Post-test	0.14±1.53	-0.72±1.52	0.72±1.84	0.21±1.34
ADMª	Pre-test	0.09±1.32	0.24±1.24	0.09±1.23	-0.23±1.38
	Post-test	-0.21±1.32	-0.44±1.13	0.69±1.51	-0.09±1.05

a=Outcome normalized through Johnson transformation and expressed in Median ± interquartile range.

Table 4. ANCOVA test results for each of the kinetic and kinematic variables

variables	F*	$DF^*$	Ρ*	Partial Eta Squared
trunk flection angle (TFA)	41.38	(2,62)	<0.001	0.572
hip flexion angle (HFA)	48.82	(2,62)	<0.001	0.612
knee flexion angle (KFA)	69.96	(2,62)	<0.001	0.693
knee valgus angle (KVA)	25.87	(2,62)	<0.001	0.455
ankle dorsiflexion angle (ADA)	32.17	(2,62)	<0.001	0.509
hip ROM (HROM)	40.98	(2,62)	<0.001	0.569
knee ROM (KROM)	19.43	(2,62)	<0.001	0.385
ankle ROM (AROM)	25.10	(2,62)	<0.001	0.447
Peak hip flection (HFR)	39.89	(2,62)	<0.001	0.563
Peak knee flexion (KFR)	25.87	(2,62)	<0.001	0.455
VGRF	21.10	(2,62)	<0.001	0.405
knee extension/ flexion moment (KEFM)	22.08	(2,62)	<0.001	0.416
knee valgus moment (KVM)	21.64	(2,62)	<0.001	0.411
ankle dorsiflexion moment (ADM)	30.93	(2,62)	<0.001	0.499

\* F= ANCOVA value, P=P value, DF=Degree of freedman

#### **AUTHORSHIP STATEMENT**

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