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## **Neurocognitive errors are common in non-contact ACL injuries in professional male soccer players**

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1   **Title:** Neurocognitive errors are common in non-contact ACL injuries in professional male  
2   soccer players

3   **ABSTRACT**

4   **Context:** Evidence is emerging that core neurocognitive function such as working memory or  
5   inhibitory control (motor response inhibition, attention) are linked to ACL injury risk. Thus far,  
6   research has been conducted in laboratory settings and the contribution of neurocognition to  
7   actual ACL injuries under real world conditions is unknown.

8   **Objective:** We hypothesized that errors in motor response inhibition and attentional inhibition  
9   contribute to non-contact ACL injuries in professional soccer players. In addition, we  
10   hypothesized high inter-rater agreement for the neurocognitive assessment based on the video  
11   analysis.

12   **Design:** Case series

13   **Setting:** Soccer matches

14   **Patients or Other participants:** Professional male soccer players

15   **Main Outcome Measures:** Neurocognitive errors in inhibitory control were operationalized as  
16   1) motor response inhibition was scored when a player demonstrated poor decision making and  
17   approached the opponent with high speed which reduced the ability to stop or change the  
18   intended action; 2) an attentional error was scored in case the player shifted the selective  
19   attention away from the relevant task to irrelevant stimuli. Three independent reviewers  
20   evaluated each video.

21   **Results:** A total of 47 actual ACL injury videos were analyzed. Out of 47 non-contact ACL  
22   injuries, 26 were related to a pressing type injury and in 19 (73%) there was a deceiving action  
23   made by the opponent suggestive for poor inhibitory control of the defender. For the remaining

24 21 non-contact ACL injuries, 16 (76%) could be attributed to attentional errors. The agreement  
25 between the three raters was very good for all items, except for item poor decision making which  
26 showed fair to good agreement (0.71). Inter-rater reliability was excellent (ICC = 0.98-1.00).

27 **Conclusion:** The current student found that errors in motor response inhibitory control and  
28 attentional inhibition are common during non-contact ACL injury events in professional male  
29 soccer players. The inter-rater agreement to detect neurocognitive errors in general is very good.

30 **Abstract word count:** 300

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32 **Key words:** ACL; Soccer; Injury prevention; Neurocognition

33 **Key points**

- 34 • The most common non-contact ACL injury was related to pressing during there was a  
35 deceiving action made by the opponent suggestive for poor inhibitory control of the  
36 defender
- 37 • Attentional errors may cause temporal spatial unawareness of the direction of the player's  
38 movements, potentially compromising motor control and leading to ACL injury
- 39 • Soccer players should delay the response until sufficient kinematic cues emerge from the  
40 opponent in relation to the contextual information to reduce the risk to sustain an ACL  
41 injury

42

43

44 **INTRODUCTION**

45 An anterior cruciate ligament (ACL) rupture is a devastating injury for a professional  
46 soccer player resulting in significant time loss<sup>1</sup> and reduced career length.<sup>2</sup> Unfortunately, despite  
47 access to injury prevention programs, the rate of ACL injuries in professional soccer remains  
48 high.<sup>3</sup> Understanding the situations and mechanisms which lead to ACL injuries is crucial to  
49 design effective injury prevention programs to reduce the high incidence. Two studies using  
50 video analysis of ACL injuries in male and female professional soccer revealed that 44% and  
51 54% respectively, were non-contact in nature.<sup>4,5</sup> The main focus of these studies was the ACL  
52 injury mechanism based on a biomechanics perspective. Bahr and Krosshaug<sup>6</sup> proposed that  
53 studies on injury mechanism should not only include information about the biomechanical  
54 characteristics but also the behavior of the athlete and the opponent(s).

55 Stuelcken et al.<sup>7</sup> suggested a potential relationship between decision making and  
56 temporo-spatial constraints of ACL injuries in netball. Similar for soccer, the players are  
57 immersed in a rapidly changing, unpredictable, and externally paced environment. The challenge  
58 for the player is to get to particular locations on the pitch at specific times whilst making fast  
59 action decisions, such as staying close to an opponent, in response to moment-to-moment  
60 changes.<sup>8</sup> Thus, the mechanism of non-contact ACL injuries in soccer, especially for defensive  
61 injuries, may in part be explained by a high neurocognitive load.<sup>9–11</sup> Core neurocognitive  
62 functions control complex, goal-directed thought and behavior, and it involves multiple domains,  
63 such as inhibitory control, working memory and cognitive flexibility.<sup>12</sup>

64 In line with current research that entail the effect of decision making or selective attention  
65 paradigms on ACL injury risk biomechanics<sup>13–15</sup> the main focus of this study was to study  
66 inhibitory control. Inhibitory control involves the ability to control attention, behavior, thoughts

67 and/or emotions in order to cancel strong internal predispositions or external temptation, and  
68 instead act in a more appropriate way.<sup>12</sup> Two key cognitive processes that have been described  
69 under the rubric of inhibitory control are: (1) motor response Inhibition and (2) attentional  
70 inhibition.<sup>16</sup> Motor response inhibition refers to the ability to stop unwanted and incorrect motor  
71 actions.<sup>12</sup> Motor response inhibitory control blocks behaviors and stops inappropriate automatic  
72 reactions, changing one response for a better, more thought-out response adapted to the situation.  
73 For example, imagine a soccer player receives the ball from a teammate. Based on visual  
74 scanning of the pitch, the player decides to pass the ball to a teammate running towards an open  
75 space, but right at the moment of initiation to play the ball, the player recognizes that a defender  
76 anticipated the decision and closed the passing lane right in time. Successful inhibitory control is  
77 demonstrated if the player is able to cancel the execution of his passing action, to avoid  
78 interception of the ball by the opponent.<sup>17</sup>

79 Attentional inhibition refers to the ability to resist interference from stimuli in the external  
80 environment. In soccer, the unpredictable and constantly evolving sports environment presents  
81 players with a myriad of stimuli (e.g. visual, auditory).<sup>18</sup> However, attentional capacity is  
82 limited, and a player must differentiate between stimuli relevant to the task and those that can be  
83 neglected.<sup>19</sup> However, divided attention has been shown to impact lower extremity mechanics  
84 during changes of direction and landing unfavorably resulting in greater risk for ACL injury.<sup>20</sup>

85 Any deficit or delay in sensory or attentional processing may lead to potential coordination errors  
86 and result in high risk knee movements.<sup>21</sup> Although the influence of neurocognition on ACL  
87 injury risk has been demonstrated in cross sectional studies<sup>9</sup>, there is a need to improve our  
88 understanding of how neurocognitive factors contribute to the actual ACL injury mechanism.<sup>22</sup>

89 Thus, the primary aim of this study was to describe the possible neurocognitive errors involved

90 in non-contact ACL injury mechanisms. We hypothesized that errors in motor response  
91 inhibition and attention inhibition contribute to actual non-contact ACL injuries in professional  
92 soccer players. In addition, we hypothesized high inter-rater agreement for the neurocognitive  
93 assessment based on the video analysis on actual ACL injuries. Integrating neurocognition to the  
94 existing biomechanical and neuromuscular approach could enhance our understanding of the  
95 complexity of ACL injury mechanisms.

## 96 METHODS

97 This was a secondary analysis of a previously published video analysis study of ACL  
98 injuries in professional male soccer.<sup>4</sup> All non-contact ACL injuries from this study cohort (n=57)  
99 4 were included for the current study. Of these 57 injury videos, 47 were considered of sufficient  
100 quality for inclusion to identify possible neurocognitive errors. A detailed study flow chart is  
101 presented in Figure 1. Each video was downloaded to a personal computer and assessed with  
102 Kinovea (version 08.15; [www.kinovea.org](http://www.kinovea.org)). The video analysis methods used in the current  
103 study has been published previously<sup>4,5</sup> and is very similar to others.<sup>23,24</sup> Boden et al.<sup>25</sup> reported  
104 high reproducibility of ICC of 0.95 for the assessment of lower extremity kinematics based on  
105 video analysis with a frame rate of 30Hz. In sum, we feel that that high-quality 3D video analysis  
106 offers a promising advancement in our understanding of actual ACL injury mechanism.

107 In the first step, the reviewers documented all sequences independently to estimate the  
108 time of initial contact (IC) between the foot and the ground as well as the assumed moment of  
109 the ACL tear, referred to as the injury frame (IF). Based on previous findings we considered the  
110 estimation of the injury frame IF to be within 40 ms from initial contact (IC) but each reviewer  
111 gave an estimation of the IC and estimated IF.<sup>4,23</sup> The videos were independently evaluated by  
112 four different reviewers (XXX, XXX, XXX, XXX) all experienced in sports medicine and

113 orthopedic rehabilitation practice (PT/PhD, PhD, MD). A series of views were used to determine  
114 the injury mechanism and situational pattern. The category of injury mechanism used was a:  
115 non-contact, defined as an injury occurring without any contact (at the knee or any other level)  
116 prior to or at IF.<sup>4</sup> The situational patterns describe the situation leading to the injury. These can  
117 be divided in defensive and offensive situations. The analyses were done independently, with the  
118 reviewer blinded to the results of the other reviewers. The reviewers could move the video  
119 sequence in normal speed or slow motion back and forth, frame by frame, using the keyboard  
120 arrows.

121 Every ACL injury video was cut to approximately 12-15 seconds prior to, and 3-5  
122 seconds post the estimated IF to accurately evaluate the playing situation that preceded the  
123 injury.

124 For the second step, all videos were analyzed independently once more by the reviewers  
125 again using a checklist to determine whether neurocognitive errors were present or not. Prior to  
126 independent assessment of all videos, the reviewers met for a 2-day comprehensive consensus  
127 training session to discuss the neurocognitive error patterns regarding related to non-contact  
128 ACL injury. In the event of disagreement between reviewers, a group discussion was used to  
129 reach consensus.<sup>4,24</sup>

130 For the neurocognitive analysis we were interested in inhibitory control: motor response  
131 inhibition and attentional inhibition.<sup>12,16</sup> Motor response inhibition was defined as the ability to  
132 stop unwanted and incorrect motor actions.<sup>12</sup> There is however a delay between the presentation  
133 of a stimulus and generating an appropriate motor response.<sup>12</sup> Based on previous studies, we  
134 operationalized that a soccer player has a time frame of approximately 450-1200 ms to change  
135 the motor action (usually in response to a deceiving action).<sup>26-28</sup> A key feature in team ball sports

136 is that players hide information or provide misleading cues (deceptive action) about their current  
137 intentions regarding their own future actions.<sup>29</sup> Two commonly used types of deceptive actions  
138 are; a disguised action, is performed by a football player, who tries to hide cues for as long as  
139 possible, for example playing ball to right or left side of the field.<sup>29</sup> An example of misleading  
140 cues are fakes of the head, where a player passes to the right side, while simultaneously looking  
141 to the left side. To score this, an item on the checklist was added to determine whether a  
142 deceiving action occurred prior to injury. In that case, the delta between onset of deceiving  
143 action and IC was calculated. Good motor response inhibition includes early selection in which  
144 goal-relevant information is actively monitored to optimally bias attention, perception, and  
145 action systems to facilitate response inhibition.<sup>30</sup> Hence an error in motor response inhibition was  
146 scored when a player demonstrated poor decision making and approached the opponent with  
147 high speed which reduced the ability to stop or change the intended action. Top level male soccer  
148 players typically cover 10-13 km during a game<sup>31</sup> perform about 1200 discrete bouts of activity  
149 changing every 4-6 seconds<sup>32</sup>, 150-250 brief, intense actions<sup>33</sup>, and 200-400 meters of sprinting  
150 (distance covered over 7 m.s-1). They also perform numerous high intensity accelerations and  
151 decelerations (8-times as many accelerations as reported sprints per match).<sup>34</sup>  
152 Selective attention was defined as a player focusing on a particular situation on the field for a  
153 certain period of time.<sup>12</sup> An error in attentional inhibition was scored in case the player shifted  
154 the selective attention away from the relevant task to irrelevant stimuli to which the player had  
155 no direct influence like 1) the ball, 2) playing situation and 3) other. A relevant stimulus can aid  
156 in correct performance. A high-level player has the ability to block out irrelevant cues and pay  
157 selective attention to the cues that are deemed relevant. Any irrelevant cues can be termed as  
158 distraction and this relates to a loss in attentional focus which can lead to poor performance.

159 Specifically, to our study, loss of attention for the task at hand e.g. looking at the ball rather than  
160 allocating attention to landing from a jump may cause spatial unawareness and subsequently  
161 disturb neuromuscular control of the landing.

162 **Statistical analyses**

163 The response variables assessed were categorical and continuous variables. The analysis  
164 was done based on frequency (number) of injury events based on playing condition  
165 characteristics 1) playing position: offensive or defensive; 2) player action: pressing, heading,  
166 kicking, other; 3) deceiving action of opponent: yes, no. Frequency (number) of neurocognitive  
167 errors associated with inhibitory control: 1) motor response inhibition (number) injury events  
168 when approaching opponent with high speed; 2) attentional inhibition: number injury events  
169 when player shifted attention away from relevant task to irrelevant stimuli: ball, playing  
170 situation, other. Timing (ms) of events: 1) time of initial contact: 2) time of injury frame: 3) time  
171 of deceiving action.

172 For the inter-rater agreement, Fleiss' Kappa coefficients and intraclass correlation coefficients  
173 (ICCs, using a 2-way random model) were calculated for the categorical and continuous  
174 variables respectively. For the inter-rater agreement, Fleiss' kappa coefficients and 95%  
175 confidence intervals were calculated (CI). The interpretation of Fleiss Kappa was < 0.40 poor,  
176 0.41 –0.75 fair to good and 0.75 – 1.00 very good, with > 0.75 used as a cut off for clinically  
177 acceptable measure of inter-rater agreement.<sup>35</sup> Intraclass agreement coefficients (ICCs) using a  
178 2-way random model were calculated to determine inter-rater reliability. The ICC values were  
179 interpreted as poor (<0.50), moderate (0.50-0.74), good (0.75-0.89) or excellent (0.90-1.00).<sup>36</sup>  
180 An a priori statistically significant level of p<0.05 was used. Data was analyzed in SPSS (version  
181 26, IBM, Chicago).

182 **RESULTS**

183 In total 47 purely non-contact ACL injuries were included in the analysis. There were 26  
184 (55%) injuries to the right and 21 (45%) to the left ACL, with 36 primary injuries, 6 contralateral  
185 and 5 ipsilateral re-injuries. The situational pattern of ACL injuries was classified as “pressing”  
186 in 26 cases, “regaining balance after kicking” in 7 cases, “landing from high jump” in 4 cases  
187 and “other” in 10 additional cases.

188 **Neurocognitive factors**

189 The two neurocognitive factors assessed were response inhibition and selective  
190 attentional errors. Out of 30 ACL injury cases in which a defensive action was made, 26 were  
191 related to a pressing action. Out of those 26 cases, in 19 cases (73%) there was a deceiving action  
192 made by the opponent that led to the ACL injury for the defender suggestive of poor motor  
193 response inhibition. A common non-contact ACL injury pattern attributed to an error in motor  
194 response inhibition is presented in Figure 2. For 21 ACL injuries, an attentional inhibitory error  
195 was present in 16 (76%) cases, and this was related to an attentional error on the ball in 20 cases.  
196 In Figure 3, an example of an error in attentional inhibition is presented.

197 The average estimated time from IC to IF was  $46 \pm 15.4$  ms. The average time from the  
198 deceiving action to IC was 256 ms (40-560 ms) of which in 15 cases this interval was less than  
199 300 ms (Figure 4).

200 The Fleiss Kappa measure of agreement between the three raters was very good for all  
201 items, except for item poor decision making which showed fair to good agreement (0.71, 95%  
202 CI: 0.55-0.88). The other Kappa values were as follows: player situation before injury (1.00  
203 (95% CI 0.83 - 1.16)), player action before injury (0.95 (95% CI 0.85 - 1.05)), deceiving action  
204 opponent (1.00 (95% CI 0.83 - 1.16)) and external distraction (0.79 (95% CI 0.63 - 0.96)). Inter-

205 rater reliabilities were excellent. The ICC Chronbach's Alpha for initial contact was 1.00, for  
206 injury frame was 0.99, and for deceiving action was 1.00.

## 207 **DISCUSSION**

208 The main finding of this study suggests that neurocognitive errors may contribute to the  
209 events leading up to the actual ACL injury. Out of 47 non-contact ACL injuries, 26 were related  
210 to a pressing type injury and in 19 (73%) there was a deceiving action made by the opponent  
211 suggestive for poor inhibitory control of the defender. Twenty-one ACL injuries occurred during  
212 offensive (91%) or defensive actions (9%). In these cases, 15 players (76%) allocated their  
213 attention away from the playing situation suggestive of attentional inhibition. All neurocognitive  
214 errors were identified by the three raters with very good agreement. The findings of our study  
215 showed that errors in motor response inhibitory control and attentional inhibition are commonly  
216 observed during non-contact ACL injury events in professional male soccer players.

### 217 **Motor response inhibitory errors during pressing**

218 The current study expands our understanding outlining the contribution of neurocognitive  
219 errors for the most common non-contact ACL injury mechanism in soccer reported; pressing  
220 with a defensive action.<sup>4</sup> Error in motor response inhibitory control are mainly expected to occur  
221 during pressing situations. Pressing may be considered the proxy to trigger impulsive responses  
222 from the pressing defender. In support, in 19 (73%) cases a deceiving action by the opponent was  
223 a initiating factor that lead to a non-contact ACL injury. The delta between deceiving action and  
224 IC was 266 ms on average. These temporal-spatial demands suggest that neurocognitive load  
225 could be a contributing factor to ACL injuries. Elite soccer players are true masters in making  
226 deceptive movements and opponents must be able to predict the outcome of these deceptions.  
227 This means the defender must react very quickly, inhibit an already initiated response and plan

228 and execute a new movement, all within this short time window. In a meta-analysis it has been  
229 reported that unplanned actions may result in at-risk knee biomechanics.<sup>13</sup> More specifically, in  
230 movement laboratory studies the median time was 500 ms for the presentation of a stimulus  
231 indicating a change of direction. Compared to planned movements, the unplanned movements  
232 resulted in higher knee abduction and tibial internal rotation moments.<sup>13</sup>

233 The complexity and temporal pressure under real world conditions as assessed in our  
234 study is arguable higher when compared to these movement laboratory studies. Temporal  
235 pressure imposed on players can push them into making inaccurate decisions at a rate double that  
236 if demand is low.<sup>8</sup> The results from our study indicate that temporal pressure affects perceptual–  
237 motor processes. The extreme time constraints evident in soccer, coupled with the fact that an  
238 opponent can disguise his intentions or present deceptive information, and the contextual  
239 information highlight the complexity for a player when making judgments.<sup>37</sup>

240 It is well established that expert athletes are superior to novices at utilizing advance  
241 visual information – specifically, kinematic information emanating from an opponent’s motion –  
242 to inform their decisions.<sup>38</sup> In rugby with respect to perceptual skills, expert rugby players are  
243 more attuned to honest kinematic information that specify future running direction whilst novices  
244 are more attuned to deceptive signals.<sup>39</sup> However, players need not only to pay attention to the  
245 opponent as the playing situation contains more complexity. These include the use of postural  
246 cues, and pattern recognition and available contextual information.<sup>38</sup>

247 Perception of essential information from the rapidly changing playing environment is key  
248 for performance in soccer players and must then process this information correctly to select the  
249 most appropriate response. Any deficit or delay in sensory or attentional processing may

250 contribute to an inability to correct potential errors in complex coordination, resulting in knee  
251 positions that increase the ACL injury risk.<sup>40</sup>

252 It is not well understood whether or not top-level athletes exhibit enhanced ability in both  
253 proactive and reactive inhibitory control. These two components refer to distinct temporal  
254 dynamic modes of motor response inhibition.<sup>41</sup> Proactive inhibition refers to a form of early  
255 selection in which task-relevant information is actively monitored to optimally bias attention,  
256 perception, and action systems to facilitate response inhibition as needed; proactive inhibition is  
257 used to strategically restrain actions in preparation for stopping (slowing down while  
258 approaching an attacker in possession of the ball). By contrast, reactive inhibition is a late  
259 correction process, triggered by external stimuli (responding to the deceiving action of the  
260 opponent). Under proactive control, the change of movement direction is pre-activated, which  
261 makes the actual change easier when it is needed.<sup>30,41</sup> Thus, proactive inhibition might be key to  
262 the ability to refrain from behavioral tendencies in anticipating the need to stop, such as when an  
263 athlete has to adapt to cues signaling different levels of motor cautiousness.

264 **Attentional inhibition**

265 Of those ACL injuries related to attentional errors, 95% occurred whilst the player's  
266 attention was directed to the ball. This is similar to previous research in basketball where ACL  
267 injuries commonly occurred whilst the injured players attention was on the basketball rim,  
268 opposing player or ball.<sup>42</sup> This externally directed attention may have taken attention away from  
269 temporal spatial awareness of the direction of the injured players movements, potentially  
270 compromising motor control and leading to ACL injury. In support of this finding, athletes  
271 attending to a ball during the side-cut maneuver, demonstrated greater peak hip abduction and  
272 hip abduction at initial contact, greater peak knee flexion angle, and knee abduction moment.<sup>43</sup>

273 Soccer players need to determine which of the many stimuli in the complex environment  
274 requires selective or sustained attention, which allows them to ignore situations that are not  
275 important. Selective attention is defined as focusing on a particular situation on the field for a  
276 certain period of time.<sup>12</sup> Lacking the capability to redirect or sustain attention from one stimulus  
277 to the next may result in a loss of spatial awareness and disrupt motor control.<sup>44</sup> An attentional  
278 error occurs in case the player shifts the selective attention away from the task/goal. Expert  
279 soccer players show more flexible search strategies than novices depending on the nature and  
280 temporal constraints of the task and on the number of relevant information sources involved  
281 (individual or group offensive/ defensive plays).<sup>45</sup> Elite soccer players are better able to rapidly  
282 shift attention, coupled with gaze, to sequentially pick up information from several relevant  
283 sources.<sup>46</sup>

284 **Implications for ACL injury mechanism**

285 Sport performance is a combination of physical and perceptual-cognitive factors  
286 governing an athlete's ability to take appropriate actions to meet their goals in sport situations.<sup>47</sup>  
287 It is important to keep in mind two essential principles related to performance. First, human  
288 performance is constrained by the context and conditions in which it takes place (the situation)  
289 and, second, the perceptual-cognitive processes related to performance center on decision-  
290 making based on goal- directed coordination of controlled actions. This means that athletes'  
291 ability to accomplish goals and coordinate movements is shaped by the circumstances of the  
292 situation in which they perform.

293 Expert performance in sport is a combination of both physical and perceptual-cognitive  
294 skills that address the ability of an athlete to locate, identify, process this information, and  
295 coordinate appropriate actions (decision making).<sup>48</sup> The dual-system theory assumes there are

296 two decision-making systems: system 1 and 2.<sup>49</sup> System 1 is intuitive, and automatically  
297 modulates the perception and memory processes, thus generating an almost immediate response.  
298 Conversely, the deliberate thought process of System 2 is slower and requires a greater amount  
299 of time and cognitive effort for decision making.<sup>50</sup> The two systems are complementary. Thus, in  
300 soccer intuitive responses seem to allow players to make faster decisions with less cognitive  
301 effort in an environment where time is limited and a determining factor.<sup>46</sup> In this context, quick  
302 and intuitive decision making takes into account the ability to optimize visual search strategies  
303 (the perceptual process), and to prioritize neurocognitive skills for information processes and  
304 subsequent decision making.

305 Professional soccer players are frequently immersed in situations that require intuitive  
306 decision making often done at high speeds. These players have made such actions thousands of  
307 times throughout their career, indeed with any injury occurring from it. Usually athletes cope  
308 with sport-specific situational demands and adjust their attention to focus on the appropriate  
309 environmental cues, so they can plan movements accordingly. However, during high-speed,  
310 complex athletic maneuvers, cognitive capacities of athletes may be unable to reconcile the  
311 overabundant somatosensory information with the biomechanical demands of a rapidly changing  
312 physical environment. Unexpected joint loads during a sudden change occurring from an  
313 unplanned movement may be inconsistent with the brain's internal model of anticipated events.  
314 Such is the case for non-contact ACL injuries, due to incorrect, preprogrammed knee-stiffness–  
315 regulation strategies and subsequent movement errors as a potential consequence of  
316 neurocognitive errors.<sup>10</sup>

317 Also, high risk behavior may emerge in athletes as a result of poor inhibition. Athletes  
318 with poor motor response inhibition were found to overestimate their ability and more prone to

319 injury.<sup>51</sup> Also, athletes who have 1) low perception of risk<sup>52</sup>, or 2) high self-efficacy and  
320 overestimate themselves are more likely to attempt high risk behavior and therefore expose  
321 themselves to greater risk of injury.<sup>53</sup> These studies show that ACL injury risk is not only related  
322 to biomechanical and neuromuscular factors, but is also related to neurocognitive factors. ACL  
323 injury prevention programs are based on linear relationships between presence of risk factors and  
324 the actual occurrence of the ACL injury.<sup>54</sup> Recently, Bittencourt et al.<sup>55</sup> proposed a complex  
325 system approach to enhance the understanding of injury etiology. Briefly, this approach  
326 highlights a non-linear interaction between risk factors from different dimensions  
327 (biomechanical, psychological, neurocognitive, physiological and training characteristics) as a  
328 web of determinants, and how these may result in injuries.<sup>55</sup>

329         From an ACL injury prevention standpoint, the findings from the current study may  
330 suggest that soccer players should delay their response until sufficient kinematic cues emerge  
331 from the opponent in relation to the contextual information to reduce the risk to sustain an ACL  
332 injury. However, this could affect the performance of the player if actions are delayed. To  
333 optimize the balance between reducing injury risk whilst maintaining performance, it is  
334 suggested to include neurocognitive load to injury prevention exercises.

335         In sum, a growing body of literature suggests that neurocognitive factors may influence  
336 an athlete's risk of ACL injury.<sup>21,56-58</sup> Athletes have demonstrated alterations in lower extremity  
337 biomechanics with drop landing trials that incorporated temporal constraints on decision-making  
338 compared to standard drop landing trials.<sup>56,57</sup> Attending to a ball while sidestep cutting has been  
339 shown to result in more trunk extension and less lateral trunk flexion toward the cutting  
340 direction.<sup>59</sup> It has been demonstrated that that athletes' perceptual and decision-making ability

341 for agile maneuvers can be trained.<sup>60</sup> In other words, it has been shown that it is possible to  
342 develop an athlete's ability to identify kinematic cues from their opponents.<sup>60</sup>

343 **Limitations**

344 In the current study, only motor response inhibition and selective attention were inferred  
345 from video analysis of non-contact ACL injuries. This is a reduction of core executive functions.

346 Although not examined in this study, working memory may also play an important role in the  
347 injury mechanism as working memory is intricately related to inhibition. In complex situations  
348 certain players may not be able to clear the irrelevant from the relevant information.

349 Subsequently they clutter their capacity of the working memory and as a result may potentially  
350 affect their movement control.<sup>15</sup> In addition, we did not use eye tracking to assure where the  
351 attention of players was directed. However, point-of-gaze does not entirely reflect the athlete's  
352 allocation of attention, as covert attention to cues in the visual periphery is not picked up by eye  
353 movement registration systems.<sup>61</sup> Finally, cognitive function was not assessed with  
354 questionnaires or computerized tests. Nevertheless, our results may serve as a framework for  
355 future studies to determine an association between neurocognitive function and actual ACL  
356 injuries. Previous research indicated that athletes with lower baseline cognitive function are more  
357 likely to experience non-contact knee injuries during the season compared to those with higher  
358 cognition.<sup>56</sup>

359 **Conclusion**

360 ACL injury mechanisms have been primarily viewed from a biomechanical and  
361 neuromuscular perspective. Errors in motor response inhibitory control and attention inhibition  
362 are commonly observed during non-contact ACL injury events in professional male soccer  
363 players. The inter-rater agreement to detect neurocognitive errors in general is very good.

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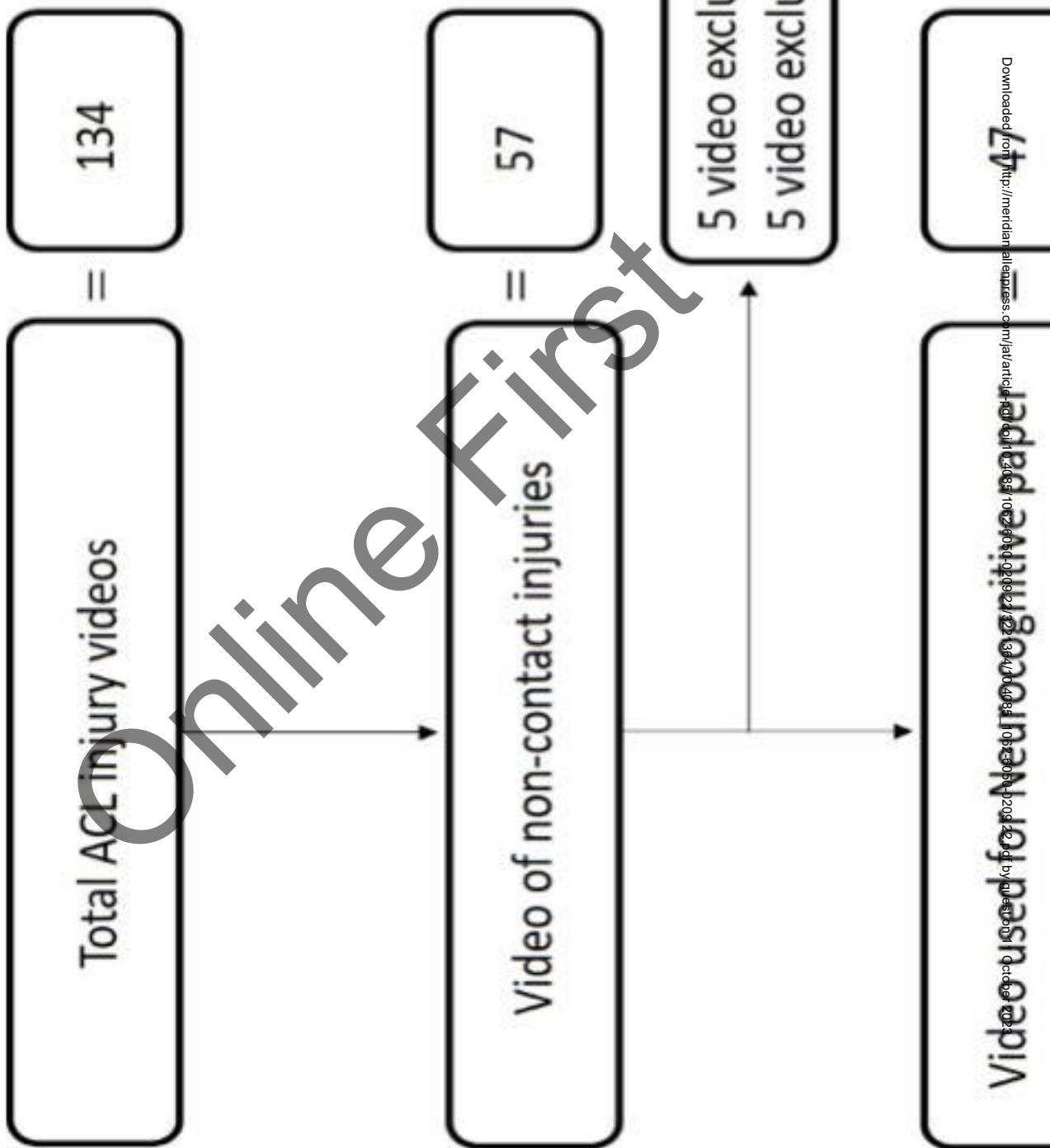
544                   **FIGURE LEGENDS**

- 545                   Figure 1. Detailed flowchart of the study. ACL, anterior cruciate ligament.
- 546                   Figure 2. Example of cascade of events leading to a non-contact ACL injury attributed to motor  
547                   response inhibition errors. D: deceiving action; IC: initial contact, IF: injury frame.

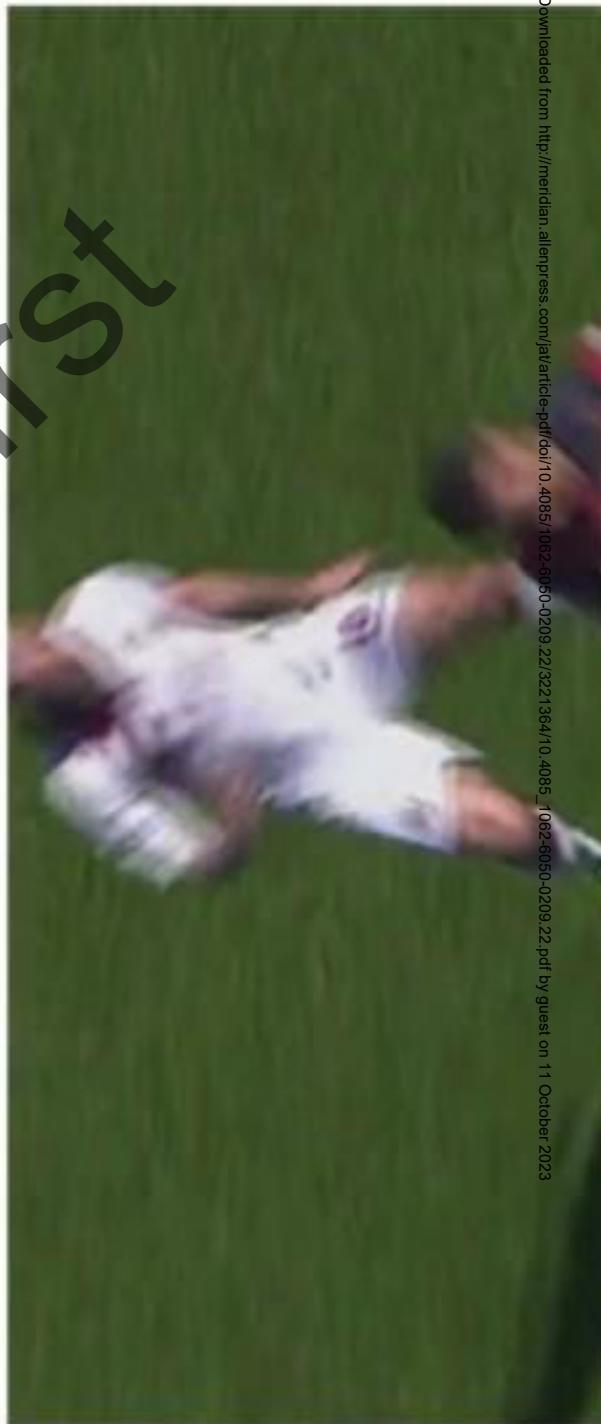
548 Figure 3. An example of an error in attentional inhibition. After the ball loss, the player focuses  
549 solely on the ball without paying sufficient attention on how to plant the left foot. The loss of  
550 spatial awareness disrupts motor control.

551 Figure 4. Scatterplots showing the time interval between the deceiving action and initial contact  
552 for all 19 players.

Online First



**Poor Inhibitory control and  
decision making  
(Aggressive presssing)**



**Attempt to pass  
defender**



**Ball intercepted by  
defender**

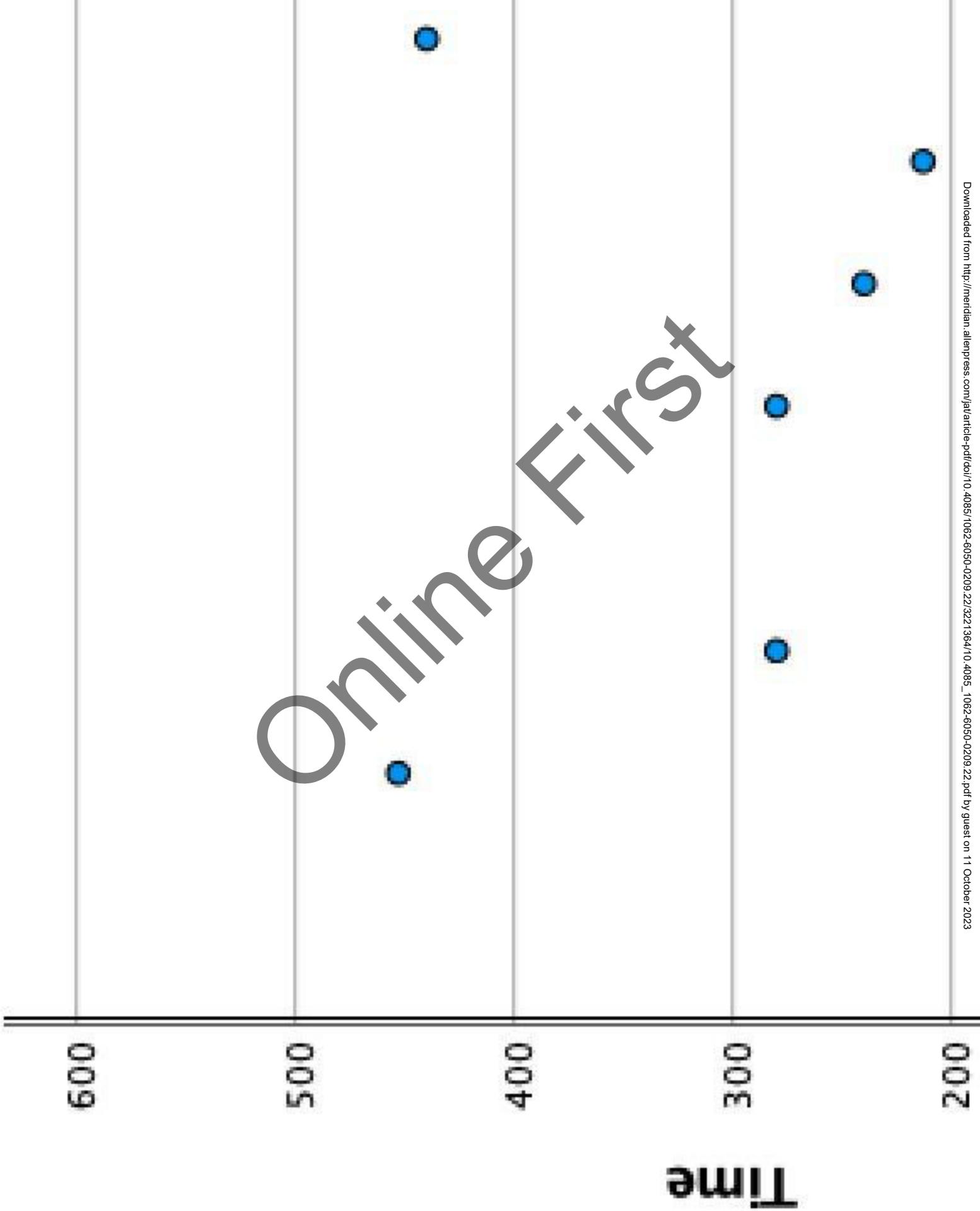


**Visual attention  
directed at ball and not  
at foot landing**



**Visual attention at  
moment of ACL injury**





**Table 1. Details of injury mechanism, situational pattern classification according to a predetermined checklist.**

	All non-contact ACL injuries (n=47)	Non-contact ACL injuries with possible error in motor response inhibition	Non-contact ACL injuries error with possible error in attentional inhibition
Playing phase n (%)	Defensive n=30 (64%); offensive n=17 (36%)	Defensive n=26 (100%)	Offensive n=17 (81%); Defensive n=4 (19%)
Poor decision making in relation to the context?	Yes n=43 (91%) No n=4 (30%)	Yes n=24 (92%); No n=2 (8%)	Yes n= 2 (9%); No n=19 (91%)
Deceiving action by the opponent prior to injury?	Yes n=20 (43%) No n=27 (57%)	Yes n=19 (73%); No n=7 (27%)	Yes n=1 (5%); No n=20 (95%)
Did the player shift his attention away from the playing situation before the injury?	Yes n=20 (42%) No n=26 (55%)	Yes n=4 (15%); No n=22 (85%)	Yes n=16 (76%); No n=5 (24%)
If yes where to what was the attention drawn?		Ball n=4 (100%)	Ball n=15 (94%); Other n=1 (6%)