

1 RUNNING HEAD: PHYSICAL EXERCISE AFFECTS DECISION MAKING

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3 **Attentional and perceptual capabilities are affected by high physical load in a simulated**

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soccer decision-making task

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Abstract

In a sport-specific decision-making task, we investigated whether different intensities of physical load have different effects on soccer players' decision making, visual attention, and perception. Under a rest condition as well as under physical exercise conditions of 70% (Moderate Load) and 90% (High Load) of their heart rate reserve, participants ($N = 30$) performed a soccer-related decision-making, a feature-recognition and an object-detection task in front of an immersive screen. Stimuli were displayed across a range of 0 to 180 degree visual angles. Results showed that decision-making performance decreased with increasing visual angles but was not negatively affected by physical demands. However, perceptual and attentional capabilities remained constant in the Moderate Load condition and deteriorated in the High Load condition compared to the rest condition. Furthermore, in the High Load condition, perceptual capabilities decreased more drastically with increasing visual angles compared to the other conditions. The findings show that high physical load affects attentional and perceptual capabilities more than moderate physical load, while decision-making performance does not differ in both conditions.

Keywords: object-detection; feature-recognition; physical load; sport expertise; training

47 cognitive performance often declines (e.g., Chmura, Nazar, & Kaciuba-Uscilko, 1994; McMorris
48 & Graydon, 2000; McMorris, Sproule, Turner, & Hale, 2011). Alternatively, arousal-based
49 models suggest that exercise increases arousal and when the physical load is too high, the
50 demand for resources is beyond the amount available and performance declines as a result
51 (Humphreys & Revelle, 1984; Lambourne & Tomporowski, 2010; Sanders, 1983). However, the
52 inconsistent results from studies makes it difficult to rule out any one model.

53 Inconsistent results from studies examining the effect of exercise on cognition have been
54 attributed to the type of task (for a review, see Tomporowski, 2003), exercise intensity (e.g.,
55 Labelle, Bosquet, Mekary, & Bherer, 2013), duration and mode (e.g., Lambourne &
56 Tomporowski, 2010) as well as sport-specific effects (e.g., McMorris & Graydon, 1997) and
57 expertise and fitness effects (e.g., Hüttermann & Memmert, 2014). Studies that have examined
58 the task performed have shown effects for simple detection tasks (e.g., McMorris and Keen,
59 1994), visual search tasks (e.g., Aks, 1998; Allard, Brawley, Deakin, & Elliot, 1989),
60 discriminative choice-response tasks (e.g., Arcelin, Brisswalter, & Delignières, 1997;
61 Delignières, Brisswalter, & Legros, 1994), and complex problem-solving tasks (e.g., McMorris
62 et al., 1999; Tenenbaum, Yuval, Elbaz, Gar-Eli, & Weinberg, 1993). For example, Lambourne,
63 Audiffren, and Tomporowski (2010) showed that a sensory detection task performance was
64 facilitated during 40 minutes of exercise at 90 % below ventilatory threshold compared to rest
65 performance. No change was found for a cognitive task during exercise. These results suggest
66 that steady state exercise at an intensity below ventilatory threshold influences sensory but not
67 central executive task function. Whilst these experimental designs offer experimental control,
68 they do not replicate the physical demands (i.e. intermittent exercise) of sports that require
69 complex decisions to be made.

70 There are some studies that have investigated physical exercise effects on cognition in
71 sport-specific situations. McMorris and Graydon (1996) investigated the impact of physical
72 exercise on a visual information processing and searching in a decision-making task in soccer.
73 Experienced soccer players exercised at 70 % or 100 % of their maximum power output and
74 made decisions in comparison to rest. They found that maximal exercise facilitated visual search
75 and speed of ball detection was faster during exercise. Additionally, Royal et al. (2006) found
76 that sport-specific tests of decision making during a very high fatigue (high exercise intensity)
77 condition facilitate decision making, but not motor performance, in water polo. Especially in
78 fast-paced team sports, such as water polo and soccer, well-developed visual and attentional
79 skills are required to enable players to make the right decisions under time pressure. In a recently
80 published study by Hüttermann, Smeeton, Ford, and Williams (2019), these visual and
81 attentional skills were examined in one sport-specific test. The authors developed a soccer-
82 specific task to examine decision making as a function of attentional and perceptual capabilities.
83 Stimuli in the form of pairs of soccer players were briefly presented across a range of visual
84 angles on a large immersive screen (radius of 3m). Participants were required to decide to whom
85 to pass the ball to while their perceptual and attentional skills on this task were assessed. Results
86 showed attentional performance was poorer than perceptual performance when stimuli were
87 presented across wider viewing angles (cf. Hüttermann, Ford et al., 2019 for similar results
88 concerning the same soccer-specific task as well as Hüttermann and Memmert, 2017 for a
89 general distinction between attentional and perceptual skills). What is unclear is how perceptual
90 and cognitive processes involved in sport-specific decision making are influenced by high
91 physical loads often experienced when playing sports.

92 The physical load of elite soccer players during games has been well-described (e.g.,
93 Sarmiento et al., 2014). Various studies included both acceleration and metabolic variables (e.g.,

94 Dalen, Ingebrigtsen, Ettema, Havard, & Wisløff, 2016; Osgnach, Poser, Bernardini, Rinaldo, &
95 Di Prampero, 2010; Russell et al., 2014). Soccer involves intermittent sprinting activity and,
96 whilst there are positional and time-of-game-specific differences, there are periods of high,
97 medium, and low intensity activity separated by active and passive recovery periods (Bradley et
98 al., 2009). The effect of subjecting athletes to physical loads with short duration periods on
99 decision making has not yet been examined in detail. The aim of the current study, therefore, was
100 to explore the effect of short duration periods of moderate and high physical loads on soccer
101 players' performance in the sport-specific decision-making task validated by Hüttermann,
102 Smeeton, and colleagues (2019). In this task, participants are required to judge two stimuli
103 equidistant to the centre of an immersive screen at their left and right body side with varying
104 visual angles between the stimuli. Each stimulus consists of a player configuration of one
105 teammate and a maximum of three opponent players. Participants then have to decide on whether
106 and where to pass the ball (decision-making task), they also have to perceive the movement
107 direction of their teammates (feature-recognition task), and they have to recognize the number of
108 opponent players surrounding their teammates (object-detection task). While the object-detection
109 task requires the differentiation between jersey colours (recognition of number of players
110 wearing white jerseys), the feature-recognition task requires the differentiation between colour
111 and shape of stimuli (recognition of players wearing black jerseys and assessment of their
112 running direction) thereby, demanding more visual attention (cf. Hüttermann, Ford et al., 2019).
113 In order to present the game situations in a realistic size in foveal and peripheral vision a 210°
114 immersive dome with a radius of 3m was used (cf. Klatt & Smeeton, 2019). Participants
115 performed the decision-making task at rest, at a moderate, and at a high physical load condition.
116 Based on previous findings showing a link between physical exercise, visual (e.g., McMorris &
117 Graydon, 1997) and attentional performance (e.g., Hüttermann & Memmert, 2014) as well as

118 decision making (e.g., Hepler, 2015; Paradis, Larkin, & O'Connor, 2016), we assumed that
119 athletes' perception (Lambourne et al., 2010), visual attention (Hüttermann & Memmert, 2014),
120 and decision making (Royal et al., 2006) in the soccer-specific task would be affected by
121 changes in the physical load. More precisely, we expected changes to task performance to be
122 seen between moderate exercise load (70% of heart rate reserve) and high exercise load (90% of
123 heart rate reserve), and compared to the rest condition.

124 **Method**

125 **Sample size estimation**

126 Based on previous research examining the attentional window and decision making in
127 sport (Hüttermann, Ford et al., 2019; Hüttermann, Smeeton et al., 2019; Klatt & Smeeton, 2020),
128 a minimum sample size of 28 was calculated using G*Power (Faul, Erdfelder, Buchner, & Lang,
129 2009). This calculation was based on the main effect of visual angle in these previous studies
130 having a median effect size (η^2) of .623 and a 50% attenuation of this variable under different
131 exercise loads being predicted.

132 **Participants**

133 Altogether, 30 participants (6 female) aged 19 to 28 years ($M_{\text{age}} = 23.97$ years, $SD = 2.34$
134 years) took part in the experiment. Data from three additional participants had to be excluded
135 because one had muscular problems restricting the exercise performance during the task, one had
136 circulatory problems, and one did not reach the chance level threshold for performance in any of
137 the tasks. According to self-reports, all other participants were healthy, and physically active.
138 Twenty-six participants were active soccer players and reportedly participated in competitions
139 regularly (e.g., in the English national league, national league south, southern league), the other
140 four also had previous experience in playing soccer for at least ten years. (Experiences in soccer
141 for at least ten years were provided in order to take part at the study.) Overall, participants had

142 played soccer for 12.00 years ($SD = 1.76$ years). At the time of the data collection, they trained
143 for an average of 9.87 hours ($SD = 2.08$ hours) on the soccer field per week. Twenty-three
144 players reported to usually prefer kicking with their right leg/foot and seven players with their
145 left leg/foot. Furthermore, participants reported normal or corrected-to-normal (with contact
146 lenses) vision—this was another prerequisite in order to take part. The study was carried out in
147 accordance with the Helsinki Declaration of 1975, and written informed consent was obtained
148 from each participant prior to testing. Approval was obtained from the lead institution’s ethics
149 board.

150 **Materials and Procedure**

151 Participants were tested individually in a laboratory room. They sat on a cycle ergometer
152 (Wattbike Pro Indoor Trainer®) at a distance of 3m from the centre of a 210° curved projection
153 screen (IGLOO, radius of 3m, height: 2.20m; see Figure 1). They wore a heart rate monitor
154 (Polar A300®), and their heart rate as well as cadence were continuously monitored during the
155 whole testing period. Participants carried out the soccer-specific decision-making task developed
156 by Hüttermann, Smeeton et al. (2019) at three different exercise loads in a randomized order:
157 rest, moderate, and high—i.e. one third started with the rest condition, one third with the
158 moderate, and one third with the high load condition. Instructions were delivered on the screen,
159 and participants were given the opportunity to ask questions prior to starting the experiment.

160 **Physical load.** Previous research has reported that the mean duration of each ‘purposeful’
161 movement in soccer lasts about 13s, while the mean time between ‘purposeful’ movements is
162 20s (all spent on a low intensity level). This finding demonstrated a mean ratio of 1:1.6. (Note
163 though that this ratio is not to be confused with the ‘physiological work: rest’ - ratio, because
164 some purposeful movements also included low intensity movements (Bloomfield, Polman, &
165 O’Donoghue, 2007)). In accordance with previous research examining the effects of moderate-

166 and high-intensity exercise on cognitive performance (e.g., Smith et al., 2016), we determined
167 the resting heart rate (HR_{rest}) as well as the maximum heart rate (HR_{max}) for each participant to
168 calculate 70 % and 90 % of the individual heart rate reserve (HRR) before the implementation of
169 the soccer task. HR_{rest} was obtained while the participant was lying down in a supine position
170 and wearing the heart rate monitor in a quiet room for 3 minutes. For male participants the HR_{max}
171 was estimated as 220 minus their age; for female participants the HR_{max} was estimated as 226
172 minus their age (Beashel, Sibson, & Taylor, 2001). Afterwards, we calculated HRR as the
173 difference between HR_{max} and HR_{rest} . Using the Karvonen formula (cf. Karvonen, Kentala, &
174 Mustala, 1957), we calculated the exercise heart rates at 70 % and 90 % target load (e.g.,
175 $Exercise\ HR = 70 (HR_{max} - HR_{rest}) + HR_{rest}$). Previous research has shown that this calculation
176 gives an exercise intensity that is equivalent to the desired percentage of VO_2R (maximal oxygen
177 uptake reserve, i.e. the difference between resting and maximal VO_2 ; Swain & Leutholtz, 1997).

178 The Borg's (1970) scale was used as an additional rating of perceived (subjective)
179 exertion (RPE) and was indicated by each participant after each of the three test conditions. It is
180 a scientifically validated method for estimating feelings of exertion. On this scale physical
181 exertion can be rated on a range that varies from 6 (no exertion at all) to 20 (maximal exertion).
182 Participants were asked to rate their perceived exertion based on the strain on and the fatigue of
183 their musculature as well as their breathlessness (or shortness of breath). In order to familiarise
184 the participants with the magnitude of the values on the RPE scale, they were given the
185 following verbal 'anchors' - number 9 corresponds with very light effort/exertion, for example,
186 normal walking at one's preferred pace - 13 on the scale indicates that the task is somewhat
187 exhausting, but one could continue the task at the current level of load rather easily - 15 is
188 strenuous and difficult, but one could still continue - 17 signifies that the level of physical load is
189 very exhausting and that continuation is still possible, but one would have to exert great effort

190 and would be fatigued within a short time. Participants were asked to indicate their RPE as
191 honest as possible and without pondering.

192 The increasing HR (70% and 90% of individual HRR) were achieved by incrementally
193 increasing the resistance of the cycle ergometer until participants reached their individually
194 required target heart rates. Participants warmed up for a period of 5min. After the respective
195 target heart rates were reached, the soccer task started while participants continued their exercise.
196 The experimenter constantly ensured that participants stayed at their predetermined target heart
197 rates during the presentation of the trials (+/- 3 bpm). In between the trials participants were
198 allowed to reduce the level of physical load, and therefore their heart rate, for a few seconds
199 (while ensuring that they would reach their required target heart rate after a maximum of 20
200 seconds—based on the previously described mean ratio between physical load and rest duration
201 in soccer games, see Bradley et al., 2009; a watch with a second hand was visible for the
202 participants), before they had to return to their target heart rate to judge the next game situation.

203 **Soccer-specific decision-making task.** The task was presented using Delphi XE 3. Participants
204 completed the soccer-specific task under each of the three different physical load conditions
205 (rest, moderate load, high load) in randomized order. In each of the three conditions, participants
206 performed 24 trials, preceded by 2 additional practice trials. A central fixation cross (1000ms)
207 appeared at the beginning of each trial. Two stimuli were subsequently presented for 300ms
208 equidistant from and on opposite sides of the fixation cross (see Figure 2). Stimuli were
209 randomly presented at one of eight horizontal visual angles from the participant's view (20°, 40°,
210 60°, 80°, 100°, 120°, 140°, 160°) and were equally likely to appear at each visual angle. Each
211 stimulus consisted of different player configurations (the players' height was approximately
212 30cm) including one teammate being randomly surrounded by zero, one, two, or three opposing
213 players. The teammates' body postures indicated the direction they were moving to (either

214 towards the centre of the pitch or towards the sideline, i.e. the centre or the outer end of the
215 screen, respectively). The opposing players always moved towards the respective teammate on
216 each of the participant's sides.

217 In each trial, participants were required to imagine they were the player in possession of
218 the ball and to decide whether it would be best to pass the ball to one of the teammates or to
219 stop/control the ball. The challenge was to only pass the ball to the left or right side if they
220 perceived a teammate who was running in their direction (towards the centre) and was not
221 surrounded by any opponent players. In contrast, participants should decide to not pass the ball
222 when a teammate was running towards the sideline and/or was surrounded by at least one
223 opponent player. Participants were asked to verbally report their decision (pass to the left, pass to
224 the right, no pass) as fast as possible, but at least within a time limit of 3sec (otherwise the trial
225 was considered a mistake). Afterwards, they had to specify the teammates' running directions for
226 each side and the number of opponent players surrounding each teammate. (Note: Each stimulus
227 had to be considered independently as the number of opponent players and the running direction
228 of teammates could differ for each side. In Figure 2, for example, teammates were surrounded by
229 two opponent players at both sides, but while the teammate at the left side was running towards
230 the center, the teammate at the right side was running towards the sideline.).

231 **Data analysis**

232 In total, we analysed main task performance (accuracy rate) by summing up the trials in
233 which all three subtasks were solved correctly (i.e. the decision-making task, the feature-
234 recognition task, and the object-detection task; performance was also calculated for each of the
235 three subtasks separately). For the main task and for each subtask we conducted an 8 x 3
236 repeated measures analysis of variance (ANOVA) with visual angle (20°, 40°, 60°, 80°, 100°,
237 120°, 140°, or 160°) and exercise load (rest, 70% of individual HRR, 90% of individual HRR) as

238 the within-participant factors and accuracy rate (performance) in the respective task as dependent
239 variable. When Mauchly's test revealed violations of the sphericity assumption for any of the
240 variables, we used adjusted degrees of freedom based on the Greenhouse-Geisser correction. In
241 the feature-recognition and object-detection task, responses were only treated as correct when
242 participants reported the correct answer for stimuli at both sides (left, right).

243 Results

244 **Physical load.** Overall, we measured a mean resting heart rate (HR_{rest}) of 64.37 bpm ($SD = 4.27$
245 bpm) and calculated a mean maximum heart rate (HR_{max}) of 197.30 bpm ($SD = 2.28$ bpm). Using
246 the Karvonen formula, we calculated a mean exercise heart rate of 157.42 bpm ($SD = 2.30$ bpm)
247 at 70 % target HR and of 184.01 bpm ($SD = 2.20$ bpm) at 90 % target intensity. The subjective
248 Borg rating was significantly different between the high ($M = 18.17$, $SD = 0.75$) and moderate
249 ($M = 13.87$, $SD = 0.90$) load levels, $t(29) = 23.842$, $p < .001$, $d = 4.353$.

250 **Total score.** The total percentage of correct responses, in which all three tasks (decision-making
251 task; feature-recognition task; object-detection task) were answered correctly, averaged across all
252 three exercise conditions, was 43.33% ($SD = 7.26\%$; see Figure 3)¹. The ANOVA revealed a
253 main effect of visual angle, $F(4.307, 124.902) = 36.011$, $p < .001$, $\eta^2 = .554$, $\epsilon = .615$ (Mauchly's
254 test of sphericity: $\chi^2(27) = 64.293$, $p < .001$), demonstrating that accuracy decreased with
255 increasing visual angles. There was a significant effect of exercise load (rest: $M = 44.86\%$, $SD =$
256 14.25% ; 70 % HRR: $M = 47.08\%$, $SD = 13.14\%$; 90 % HRR: $M = 38.06\%$, $SD = 9.95\%$),
257 $F(2, 58) = 4.193$, $p = .020$, $\eta^2 = .126$, $\epsilon = .631$; we performed follow-up comparisons (Bonferroni
258 corrected adjusted alpha of 0.017) indicating that participants performed better under moderate
259 exercise load, compared to the high load condition, $t(29) = 2.863$, $p = .008$, $d = .523$, with no
260 difference between moderate load and rest condition, $t(29) = 0.729$, $p = .472$, nor between the
261 rest and high load condition, $t(29) = 1.930$, $p = .063$. Furthermore, the ANOVA did not reveal a

262 significant interaction between visual angle and exercise load, $F(8.835,256.201) = 0.980, p =$
 263 $.456$ (Mauchly's test of sphericity: $\chi^2(104) = 135.677, p = .029$).

264 **Decision-making subtask.** In total, participants made the correct decision (pass to the left, no
 265 pass, pass to the right) in 91.16 % ($SD = 4.47$ %) of the trials averaged across all exercise loads.
 266 Decision-making performance decreased with increasing visual angles between the stimuli (or
 267 more specifically remained high until the visual angle was increased beyond a certain point),
 268 $F(3.282,95.174) = 34.748, p < .001, \eta^2 = .545, \epsilon = .469$ (Mauchly's test of sphericity: $\chi^2(27) =$
 269 $130.849, p < .001$). Participants performed comparably well under all three exercise loads,
 270 $F(2,58) = 1.962, p = .150$. We did not find a significant interaction between angle and exercise
 271 load, $F(6.020,174.566) = 1.586, p = .154, \epsilon = .430$ (Mauchly's test of sphericity: $\chi^2(104) =$
 272 $259.109, p < .001$).

273 **Feature-recognition subtask.** A correct response in a trial in the feature-recognition task
 274 required accurate reporting of the running direction of the teammates at both sides of the
 275 participant's visual field. In total, participants correctly identified the running direction of both
 276 teammates in 52.36 % ($SD = 6.10$ %) of all trials. The ANOVA revealed a significant main effect
 277 for visual angle $F(4.532,131.439) = 19.715, p < .001, \eta^2 = .405, \epsilon = .647$ (Mauchly's test of
 278 sphericity: $\chi^2(27) = 47.985, p = .008$), again indicating a decline of performance with increasing
 279 angles. In addition, participants differed in accuracy across the three exercise loads, $F(2,58) =$
 280 $4.352, p = .017, \eta^2 = .130$ (see Figure 4). In the feature-recognition task, participants attained
 281 highest success rates at moderate load ($M = 55.97\%, SD = 12.22\%$) compared to the high load
 282 condition ($M = 47.36\%, SD = 9.57\%$), $t(29) = 2.849, p = .008, d = .520$, with no difference
 283 between moderate and rest condition ($M = 53.75\%, SD = 12.10\%$), $t(29) = 0.731, p = .471$, nor
 284 between rest and high load condition, $t(29) = 2.110, p = .044$ (Bonferroni corrected adjusted
 285 alpha of 0.017). Furthermore, the ANOVA did not reveal an interaction effect for visual angle

286 and exercise load, $F(8.785,254.756) = 0.623, p = .773, \varepsilon = .627$ (Mauchly's test of sphericity:
287 $\chi^2(104) = 132.743, p = .042$).

288 **Object-detection subtask.** A response in a trial in the object-detection task was considered
289 correct only if participants reported the accurate number of opponent players for both sides. In
290 total, participants attained an accuracy rate of 78.29 % ($SD = 11.68$ %) across all trials. There
291 was a main effect for visual angle, $F(3.613,104.767) = 44.893, p < .001, \eta^2 = .608, \varepsilon = .516$
292 (Mauchly's test of sphericity: $\chi^2(27) = 67.992, p < .001$), pointing out that participants' accuracy
293 decreased from the centre to the periphery. Moreover, the ANOVA revealed a main effect of
294 exercise load, $F(2,58) = 12.622, p < .001, \eta^2 = .303$ (see Figure 5). Participants performed worse
295 under high load ($M = 69.17$ %, $SD = 8.93$ %), compared to moderate load ($M = 83.89$ %, $SD =$
296 17.39 %), $t(29) = -4.337, p < .001, d = .792$, and to the rest condition ($M = 81.81$ %, $SD =$
297 18.13 %), $t(29) = -3.518, p = .001, d = .642$, with no difference between moderate load and rest
298 condition, $t(29) = 0.869, p = .392$ (Bonferroni corrected adjusted alpha of 0.017). We found a
299 significant interaction between exercise load and visual angle, $F(7.593,220.185) = 11.046, p <$
300 $.001, \eta^2 = .276, \varepsilon = .753$ (Mauchly's test of sphericity: $\chi^2(104) = 195.736, p < .001$). The decline
301 in performance, as a result of increasing visual angles, became more pronounced in the high load
302 compared to the rest or moderate load conditions (see Figure 3).

303 **Discussion**

304 This study investigated the impact of physical load on soccer players' perceptual and
305 attentional capabilities as well as on their decision making in soccer game situations. In support
306 of our predictions, the total performance in the soccer-specific task (i.e., the conjunction of the
307 feature-recognition, object-detection, and decision-making tasks) confirms previous study
308 results, in that performance in complex tasks can be influenced through different physical loads
309 placed upon athletes (e.g., McMorris et al., 1999; Royal et al., 2006; Tenenbaum et al., 1993).

310 Whilst no differences in physical load condition were observed in the decision-making task,
311 there was a decline in feature-recognition performance at the high exercise load compared to the
312 moderate load condition and a decline in object-detection performance was found at the high
313 exercise load condition only when stimuli presentation exceeded 120 degrees of visual angle. It
314 is clear that when physiological arousal approaches a maximal level though performance
315 declines.

316 Apart from the total performance in the soccer-specific task, we analysed participants'
317 performances in the separate subtests (decision-making, feature-recognition, object-detection), in
318 order to understand how different dimensions of decision-making performance were influenced
319 by the physical load conditions. The results suggest that athletes' visual attention and perception
320 capabilities were affected by changes in physical exercise load. Overall, performances was
321 higher in the moderate (70 % of HRR) compared to the high load condition (90 % of HRR) but
322 not compared to the rest condition. This pattern of findings was consistent for attentional and
323 perceptual capabilities. However, the moderate load condition did not result in higher levels of
324 performance than the rest condition resulting in a performance-load curve that does not strictly
325 comply with an inverted-U shape.

326 But although athletes' attentional and perceptual capabilities were affected—at least
327 partially—by physical exercise loads, we did not find an impact on their sport-specific decision-
328 making performance. On the one hand, this result supports the findings of previous studies that
329 physical load does not impact the quality of the final decision (e.g., Hepler, 2015; Paradis et al.,
330 2016). It appears that while it is not possible to perceive all information in the peripheral field in
331 detail (e.g., the positioning or running direction of players), decision making is not negatively
332 affected (cf. Olde Rikkert et al., 2015) at least those decisions that have been required in the
333 decision-making task. However, on the other hand, there are also contradictory findings

334 reporting a positive effect of physical exercise on decision making (e.g., Royal et al., 2006;
335 Tenenbaum et al., 1993). For example, Tenenbaum and colleagues (1993) observed improved
336 accuracy of decision making in handball players during aerobic exercise (11-12 METS). It is
337 difficult to draw clear conclusions as to why there are contradictory findings because the exercise
338 protocols do not compare exactly across studies. However, findings may be attributed to
339 different psychological tasks used in the different studies and experiences in making decisions
340 during exercise. Tenenbaum et al. (1993) used generic tests of short-term memory general
341 intelligence, attentional style, and concentration. In the present study, sport-specific stimuli were
342 used and the decision-making task to choose the correct opponent to pass to, matched the
343 experience of the participants. In fact, sport specific experience improved psychological task
344 performance in the Tenenbaum et al. (1993) study. The answer to the question of why
345 improvements in performance were seen in Tenenbaum et al. (1993) and not here could be
346 attributed to order effects, which were not controlled for in the exercise condition in Tenenbaum
347 et al. (1993). Therefore, there may have been a warm-up effect on the psychological tasks
348 confounded performance in the exercise conditions. In this study, exercise load was
349 counterbalanced and tasks differed. However, it should be considered that attentional processes
350 in real soccer game situations are oftentimes more complex than the challenge to decide whether
351 to pass the ball to the left, to the right, or whether to control it/not pass at all. Considering these
352 and further factors, future studies should investigate the influence of physical load on the
353 decisional behaviour of athletes as a function of task specificity and complexity.

354 Differences in performance were found between the high and moderate load conditions in
355 the feature-recognition and object-detection task. The high load condition was chosen to extend
356 previous research by Hüttermann and Memmert (2014), who showed an inverted-U relationship
357 between the intensity of physical load and cognitive performance for non-athletes, and a linear

358 relation for athletes. However, intensities were 50, 60, and 70 % of the age-dependent predicted
359 maximal heart rate. The linear relationship between exercise intensity and visual attention was
360 explained by the fact that an intensity level of 70 % was rather a moderate than a high intensity
361 for trained athletes; and it was assumed that higher intensities may lead to a decline in
362 performance. Participants in the current study performed the decision-making task with 70 % and
363 90 % of heart rate reserve, as well as under rest. It was found that perceptual and attentional
364 performance declined at the highest load. As participants reported RPE values of 14 for 70 %
365 exercise HRR and 18 for 90 % exercise HRR on the Borg scale ranging from 6 (no exertion at
366 all) to 20 (maximal exertion), we can assume that the targeted intensity levels were reached. It
367 remains a task for future studies to test to what degree the performance in the soccer-specific task
368 can be influenced by different intensities of physical load as a function of the performance- and
369 fitness-levels of participating athletes. Further, the physical load ratios could be adapted
370 according to the divisions the athletes are active in.

371 An interaction between visual angle and physical load was found in the object-detection
372 subtask but not in the other subtasks. Performance in this task declined more rapidly in the 120
373 degree visual angle condition in the 90 % physical load condition than in the 70 % condition and
374 more rapidly in both 70 % and rest conditions for visual angles greater than 120 degrees. This
375 result was not expected, and any attempted explanation, therefore, has to be considered as a post-
376 hoc rationalisation. This finding supports the assumption that the object-detection subtask has
377 elements that are independent of the other two tasks because this interaction was not found in the
378 decision-making or the feature-recognition subtask. However, the authors are not aware of any
379 literature to help explain why exercise at a high load differentially affected the object-detection
380 subtask, but not the feature-recognition or decision-making subtasks. Potentially, this interaction
381 effect in the subtask might also be explained by increases in statistical power. Alternatively, in

382 contrast to decision-making or attentional processes, perceptual processes in the extremities of
383 the peripheral vision may be differently affected by exercising at high intensity than in other
384 parts of the visual field. However, systematic, hypothesis-driven, future research is needed to
385 provide an evidence-based explanation of this finding.

386 The current study does not come without limitations. To simulate the changing load
387 intensities found in soccer match-play (cf. Bloomfield et al., 2007), participants were required to
388 maintain their target heart rate from onset of the presentation of each trial until their
389 ratings/responses for the respective game situation. Subsequently, they were given a few seconds
390 to reduce the load at their own discretion (however, they had to continue pedalling), before
391 returning to their target heart rate and being presented with the next game situation. Participants
392 used the time between the trials in different ways, meaning some participants reduced the load
393 intensity more than others did. Even though load levels also vary among different players in real
394 soccer games, future studies should try to achieve a better comparability of results by
395 predetermining a standardized load level for the breaks between the trials. Nevertheless, it should
396 be noted here that a cessation of exercise of a few seconds (after the 20 seconds participants had
397 to reach the required target heart rate), in between the predetermined loads, is a relatively short
398 time period, during which no great changes in the participants' heart rates were seen compared to
399 the predetermined target heart rate.

400 In the current study, decision making was analysed as the accuracy of decisions, i.e., we
401 measured the quality of decisions, but not the speed of decision making. As previous studies
402 have found no impact of physical arousal on the quality but on the speed of decision making
403 (e.g., Hepler, 2015), the integration of a reaction time measure might be a potential avenue for
404 future research. Another potential avenue of investigation could involve further manipulations of
405 the task demands, such as the integration of dynamic game scenes (e.g., moving and looming

406 stimuli) instead of static pictures. In the current study, participants performed the decision-
407 making task while bicycling on an ergometer, although treadmill running would better
408 correspond to the natural demands on soccer players. (In addition, it took some time until every
409 participant was able to finally reach the 90 % exercise HRR using the bicycle ergometer.) Future
410 research should search for alternatives ensuring both the safety of the participants (this may
411 indeed be a problem using a treadmill) and the possibility of exercising at high intensities.

412 Although decision-making performance did not decrease with high exercise load, it
413 would be interesting to train the players' cognitive skills under physical load in future research in
414 order to investigate whether this training would have a positive effect on the players' decision
415 making in soccer (see Alder, Broadbent, Stead, & Poolton, 2019, for a study in badminton).
416 There is research demonstrating training approaches for visual attentional capabilities (e.g.,
417 Hüttermann & Memmert, 2018), perceptual attentional capabilities (e.g., Swart et al., 2012), and
418 decision making (e.g., Hepler, 2015) in sport athletes, however, future research might develop
419 specific programs integrating all of these cognitive skills/tasks in one training.

420 In summary, the findings of the current study suggest that different physical exercise
421 loads can temporarily affect attentional and perceptual capabilities of sport athletes, but they do
422 not positively or negatively affect their sport-specific decision making. Depending on the
423 complexity of the decision-making process, in future, training possibilities should not only be
424 considered for attentional and perceptual skills, but also, for sport athletes' decision-making
425 skills, in order to train the skills needed to meet the cognitive demands on sportspeople as
426 comprehensively as possible.

427

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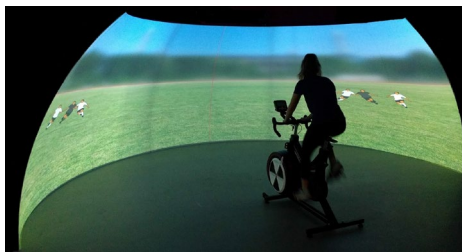
Footnotes

557 ¹Although this accuracy rate seems to be very low at first sight, it should be considered that a
558 trial was only evaluated as correct when participants made the correct decision and gave correct
559 answers in the feature-recognition and object-detection task—also including situations with
560 visual angles of up to 160°, i.e. lying outside the maximal shift of attention measured in previous
561 research (e.g., Hüttermann, Memmert, & Simons, 2014; Hüttermann, Memmert, Simons, &
562 Bock, 2013).

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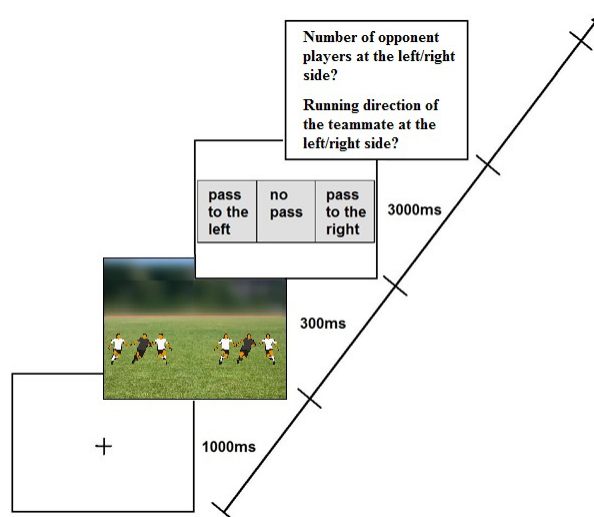
564 Figure legends

565 Figure 1. The figure shows the experimental setup with a subject sitting on the bicycle ergometer
566 in front of the 2.4 x 6.0m IGLOO dome.



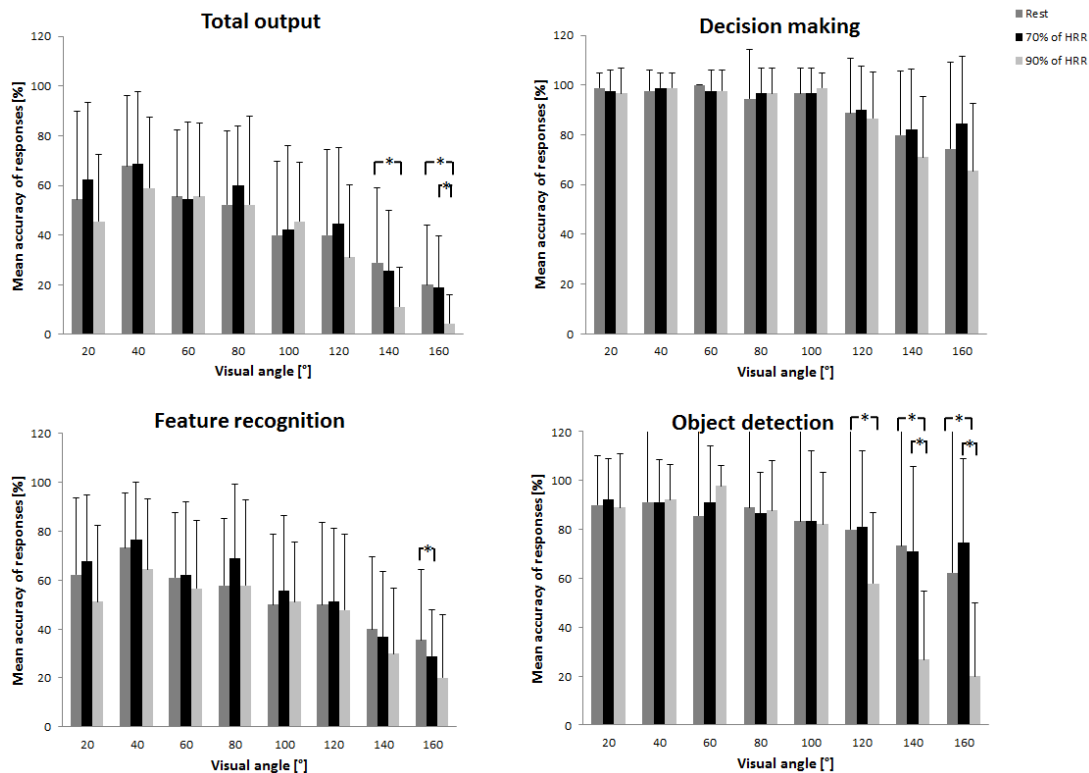
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568 Figure 2. Sequence of events in one exemplary trial.



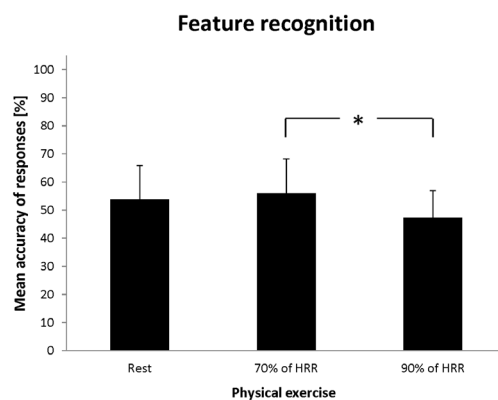
569

570 Figure 3. Percentage of participants' total accuracy rates, their decision making, the
571 identification rates of the teammates' running direction, and the identification rates of the
572 number of opponents in the soccer decision-making task, in degrees of visual angle as a function
573 of physical exercise intensity (rest, moderate, high). Symbols represent across-participant means,
574 and error bars show standard deviations. (Note: * $p < .017$; ** $p < .001$; Bonferroni corrected post-
575 hoc comparisons had an adjusted alpha of 0.017. Y-axis scale adjusted to 120 % to allow plotting
576 of error bars)



577

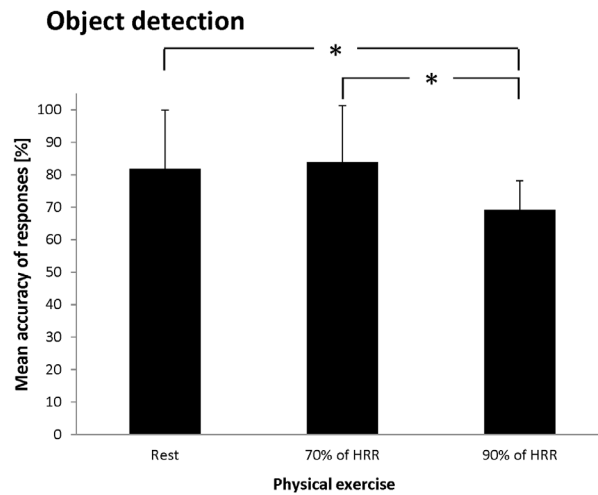
578 Figure 4. Percentage of participants' accuracy rates in the feature-recognition subtask
 579 (identification rate of the teammates' running direction) as a function of physical exercise
 580 intensity (rest, moderate, high). Symbols represent across-participant means, and error bars show
 581 standard deviations. (Note: $*p < .017$; Bonferroni corrected post-hoc comparisons had an adjusted
 582 alpha of 0.017.)



583

584 Figure 5. Percentage of participants' accuracy rates in the object-detection subtask (identification

585 rate of the number of opponents) as a function of physical exercise intensity (rest, moderate,
586 high). Symbols represent across-participant means, and error bars show standard deviations.
587 (Note: $*p < .017$; Bonferroni corrected post-hoc comparisons had an adjusted alpha of 0.017.)



588