# Athlete-opponent interdependency alters pacing and information-seeking behavior.

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#### ABSTRACT

**PURPOSE.** The influence of interdependency between competitors on pacing decision-making and information-seeking behavior has been explored. This has been done by only altering instructions, and thereby action possibilities, while controlling environment (i.e. competitor behavior) and exercise task. **METHODS.** Twelve participants performed a 4-km time-trial on a Velotron cycle ergometer in a randomized, counterbalanced order alone with no virtual opponent (NO), against a virtual opponent with no restrictions (low athlete-opponent interdependency; OP-IND), or against a virtual opponent who the participant was permitted to overtake only once during the trial (high athlete-opponent interdependency; OP-DEP). Information-seeking behavior was evaluated using an SMI Eye tracker. Differences in pacing, performance and information-seeking behavior were examined using repeated-measures ANOVA (p<0.05). **RESULTS.** Neither mean power output (NO: 298±35W; OP-IND: 297±38W; OP-DEP: 296±37W) nor finishing time (NO: 377.7±17.4sec; OP-IND: 379.3±19.5sec; OP-DEP: 378.5±17.7sec) differed between experimental conditions. However, power output was lower in the first kilometer of OP-DEP compared to the other experimental conditions (NO: 332±59W; OP-IND: 325±62W; OP-DEP: 316±58W; both p<0.05), and participants decided to wait longer before they overtook their opponent (OP-IND: 137±130sec; OP-DEP: 255±107sec; p=0.040). Moreover, total fixation time spent on the avatar of the virtual opponent increased when participants were only allowed to overtake once (OP-IND: 23.3±16.6sec; OP-DEP: 55.8±32.7sec; p=0.002). CONCLUSION. A higher interdependency between athlete and opponent altered pacing behavior in terms of in-race adaptations based on opponent's behavior, and induced an increased attentional focus on the virtual opponent. Thus, in the context of exercise regulation, attentional cues are likely to be used in an adaptive way according to their availability and situational relevance, consistent with a decision-making framework based on the interdependence of perception and action.

KEYWORDS: pacing strategy, attentional focus, gaze analysis, sport performance

### 1 1. INTRODUCTION

Paragraph Number 1 - As energy resources are limited in human beings, exercisers are required to decide continuously about how and when to use their available amount of energy (1). In this pacing decision-making process, the interaction between the athlete and their surroundings appears to be crucial (1–3). In this sense, although there are multiple external variables that present social invitations for action to an athlete, opponents are arguably one of the most crucial ones in competitive sports (2). Previously, experimental studies have already shown that a virtual opponent could improve performance (4–8), and alter initial pace (7).

Paragraph Number 2 - It is also well known that pacing behavior varies between event 9 10 types. Specific demands of a sport, such as favorable positioning, competing for the optimal line, and minimizing fall risk, could draw athletes away from the energetically favorable 11 12 strategies from individual perspective without taking into account the context around this 13 individual and may alter the relevant external cues (2). That is, paying close attention to external cues is likely an important aspect of reading a competitor or a competitive situation. A main 14 15 underlying mechanism behind these differences in pacing behavior and external attentional focus between competitive sports could be a varying interdependency between the competitors. 16 For example, the possibility of drafting, and the magnitude of associated energy-saving effects 17 18 of drafting, appeared to be an important determinant for pacing behavior and tactical decisionmaking in competitive sports (2, 9, 10). These energy-saving effects of drafting could in fact be 19 perceived as a higher interdependency between athlete and opponent. 20

Paragraph Number 3 - The present study explored the influence of interdependency between competitors on the decision-making process involved in pacing. This has been done by only altering instructions, and thereby action possibilities, while controlling the environment (e.g. competitor behavior) and exercise task. In addition, the analysis of gaze behavior provided a novel opportunity to analyze the information-seeking behavior of exercisers and the relation

to pacing decisions. Up until now, eye-tracking technology to examine gaze and pacing 26 behavior has only been used during individual time trial exercise (11), but not yet in a scenario 27 involving competitors. Therefore, we examined in this study whether the same opponent, but a 28 29 different interdependency between the athlete and the opponent, affected exercise regulation and information-seeking behavior in laboratory-controlled conditions. It was hypothesized that 30 a higher interdependency between athlete and opponent would evoke different pacing decisions, 31 in response to the opponent's pacing behavior, and would alter the information-seeking 32 behavior of the exerciser. We hypothesized an increased focus on the competitor, at the cost of 33 attentional focus on other external information such as velocity, cadence or time, when 34 interdependency between competitors is higher. This would indicate that exercisers use 35 different external information in order to pace themselves based on the competitive situation. 36

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#### 38 2. METHODS

## 39 2.1 Participants

Paragraph Number 4 - 12 participants with at least two years of cycling experience 40 with training at a moderate to high intensity (age: 45.8±7.0 years; body mass: 78.7±10.4 kg; 41 height: 176.6±7.4 cm) participated in this study. All participants were moderately to highly 42 physically active (two or more moderate to high-intensity training sessions per week) and 43 familiar with pacing their exercise. All participants gave prior written informed consent and 44 completed a health screening questionnaire (Physical Activity Readiness Questionnaire (12)). 45 The study was approved by the ethical committee of the University of Essex in accordance with 46 the Declaration of Helsinki. 47

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## 49 *2.2 Experimental procedures*

**Paragraph Number 5** - Participants attended the laboratory on five different occasions, 50 51 completing a 4-km cycling time trial each visit. Each 4-km time trial was preceded by a 5-min warm-up at a fixed load of 150 W, followed by a 4-min inactive recovery period before starting 52 the time trial. The first two 4-km time trials were used as familiarization trials (FAM1 and 53 FAM2). In the third to fifth visit participants had to perform one of the three experimental 4-54 km time trials in a randomized, counterbalanced order. The experimental time trials consisted 55 56 of a 4-km time trial without virtual opponent (NO), a 4-km time trial with virtual opponent, without further instructions (low athlete-opponent interdependency; OP-IND), and a 4-km time 57 trial with virtual opponent including the instruction that the opponent could only be overtaken 58 59 once by the participant (high athlete-opponent interdependency; OP-DEP).

Paragraph Number 6 - The same opponent was used for both OP-IND and OP-DEP. This opponent was constructed based on the fastest familiarization trial of the participant. In order to maximize the chances the opponent would be in front of the participant directly after the start, yet preventing a too big initial gap between participant and opponent, the opponent was set to adopt an initial pace that led to a 1-second lead after 250 m compared to the fastest familiarization trial of the participant. Hereafter, the opponent adopted a pace of 95% of the power output as achieved in the fastest familiarization trial.

67 **Paragraph Number 7** - Before every time trial, participants were instructed to provide maximal effort. No verbal coaching or motivation was given to the participants during any of 68 the trials. Participants were told that their opponent would be of similar level of performance to 69 simulate a competitive situation where participants perceived their chances of success to be 70 71 realistic. Time trials were completed at the same time of the day ( $\pm 2$  hours) to minimize circadian variation (13, 14), and 3-7 days apart to limit training adaptations. Participants were 72 asked to maintain normal activity and sleep pattern throughout the testing period. In addition, 73 participants were asked to refrain from any strenuous exercise and alcohol consumption in the 74

preceding 24 hours, and from caffeine and food consumption respectively, four and two hours before the start of the test. Participants were informed that the study was examining cycling performance during 4-km time trials. To prevent any pre-meditated influence on preparation or pre-exercise state, the specific feedback presented for each trial was only revealed immediately before the start of the time trial. All trials were conducted in ambient temperatures between 18-21°C.

82 2.3 Apparatus

Paragraph Number 8 - Time trials were performed on an advanced cycle ergometer 83 84 (Velotron Dynafit, Racermate, Seattle, USA), a reliable and valid device for measuring cycling performance and pacing behavior. Using the Velotron 3D software, a flat 4-km time trial course 85 with no wind was programmed and projected onto a large screen in front of the participants for 86 87 all trials. The cycle ergometer was positioned such that screen itself was offset to the right of the natural forward field of vision of the cyclists. Offsetting the screen in this way required 88 participants to rotate their neck to look at the projected information, thus adding confidence that 89 the eye-tracking measurements constituted deliberate attempts to acquire information, rather 90 than information glances just because it happened to fall naturally within participant's forward 91 92 field of vision. Notwithstanding minor projector repositioning variances, the projected screen size was 2.1 m wide by 1.5 m high with the bottom border of the projection running 1 m above 93 and parallel to the floor. The cycle ergometer was positioned such that the handlebar stem riser 94 95 was 3 m perpendicular to the plane of the screen. An A0 sized RPE scale was also displayed to 96 the left of the projector screen clearly visible to the participants while sitting on the cycle ergometer. Prior to the start of each time trial, participants gave a confirmatory answer when 97 asked if all displayed information was clearly visible for them while sitting on the cycle 98 ergometer. Incorporated into the projection beneath the simulated time-trial video, were five 99

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fields of real-time feedback information which, presented from left to right, were speed (km.hr-100 1), elapsed distance (km), pedaling cadence (r.min-1), heart rate (b.min-1) and gearing. In 101 addition, elapsed time (min:sec) was displayed right above the gearing field (see Figure 1). 102 103 Furthermore, in all time-trials a virtual avatar of the participant was projected onto the screen. In OP-IND and OP-DEP a virtual avatar of an opponent was projected onto the screen as well. 104 105 The virtual opponent was in this case always visible on the left side of the road, while the virtual 106 avatar of the participant itself was projected onto the right side of the road. This was also clearly communicated to the participants prior to the time trial. The course was projected in helicopter 107 view (see Figure 1) to ensure both virtual avatars were visible to the participant throughout the 108 109 whole trial, regardless whether the participant was riding in front or behind. Angular separation of the information fields was well beyond the manufacturer-defined eye-tracker spatial 110 111 resolution of 0.1° and gaze position accuracy within the nearest degree. The separation of the 112 projected information blocks therefore facilitated clear differentiation in eye-tracker measurements. 113

Paragraph Number 9 - Participants started every trial in the same gear but were free to change their gear ratio throughout the time trial. Power output, velocity, distance, cadence, and gearing were recorded continuously during each trial (sample frequency=4 Hz). In addition, heart rate was monitored every second (Polar M400, Polar Inc.). Rating of perceived exertion (RPE) on a Borg-scale of 6-20 (15) was asked after the warm-up, after each kilometer during the time trial, and directly after passing the finish line.

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#### 121 2.4 Information-seeking behavior

Paragraph Number 10 - All participants wore a glasses-based mobile binocular eye tracking device (SensoMotoric Instruments SMI eye-tracking glasses; Sensomotoric
 Instruments, Tetlow, Germany) during the experimental time trial conditions to capture their

eye movements during the time trial. The system tracks eye movements using pupil and corneal reflex so that each participant's point of regard can be superimposed onto the recorded scene, thus enabling timed measurements to be made of eye fixations. The SMI eye-tracking glasses were calibrated using a 3-point calibration before starting to record. Eye position was recorded at 60 Hz, which was then down-sampled to 30 frames per second for the resulting scene videos.

Paragraph Number 11 - SMI BeGaze Analysis Software was used to code eye 130 131 fixations on objects of interest during NO, OP-DEP and OP-IND. The eye-tracking videos for these trials were reviewed and manually coded by the first author using SMI Semantic Gaze 132 Mapping. This procedure allowed us to determine the periods of time spent inspecting each of 133 134 the regions of interest, in which eye fixation times were recorded in milliseconds against eleven predetermined categories. Six of the categories related to information feedback that were speed, 135 elapsed distance, cadence, heart rate, gearing, and elapsed time. Eye fixation times were also 136 137 recorded for the rating of perceived exertion poster, the video simulation of the time-trial course that was projected onto the wall (excluding the cycling avatars), the virtual cycling avatar 138 representing the participant itself, and the virtual cycling avatar of the virtual opponent. A final 139 category was created to capture all other objects of regard not corresponding to the other ten 140 categories, for example, when participants looked at the laboratory floor or at laboratory 141 equipment. Only fixations were included into the analyses. This procedure allowed detailed 142 coding of point of regard for the whole length of the time trial, however whereas periods of 143 blinks and saccades where excluded out of the analyses, time trial duration does not equal total 144 145 fixation time spent. In order to evaluate the total fixation time over the time-trial and between conditions a Total variable was created representing the sum of all of the above-mentioned 146 147 categories. For all categories both time fixation spent in seconds as well as the total number of fixations were determined for the whole time trial and for each kilometer segment. 148

Paragraph Number 12 - Directly after finishing OP-DEP, a retrospective think aloud protocol was used to gather qualitative information on the participants intents and reasoning around the overtake of the virtual competitor. This involved the 30 seconds prior to and 30 seconds after the overtake. A video replay of the projected screen in this minute was shown to the participant as a visual reminding stimulus, and participants were instructed to recall as much information as possible from this period.

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156 *2.5 Data analysis* 

Paragraph Number 13 - Mean power output, cadence, heart rate and finish time were 157 determined in order to examine performance. Differences in performance between conditions 158 were assessed using a repeated-measures ANOVA. To assess differences in pacing behavior 159 between the conditions, average power output, cadence, heart rate and split times for each 1-160 161 km segment were calculated, and differences were tested using a two-way repeated-measures ANOVA (condition  $\times$  segment). Post-hoc tests with Bonferroni correction were performed 162 when significant results were found. Information-seeking behavior was assessed using the total 163 fixation time and the total number of fixations for each object of interest over the whole time 164 trial and per kilometer. Differences in information-seeking behavior were tested using a two-165 way repeated-measures ANOVA (condition × segment). All analyses were performed using 166 SPSS 19.0, and significance was accepted at P<0.05. 167

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169 3. RESULTS

170 *3.1 Performance analysis* 

Paragraph Number 14 - Mean (±SD) finishing time, power output, heart rate, and
cadence for the three experimental time trial conditions are shown in Table 1. No main effects

were found for finishing time (F=0.428; p=0.569), power output (F=0.384; p=0.605), heart rate
(F=0.389; p=0.682), or cadence (F=0.509; p=0.608).

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176 *3.2 Pacing analysis* 

Paragraph Number 15 - Mean power outputs per kilometer are shown in Figure 2. A 177 178 main effect for segment (F=8.3; p=0.003), but not for condition (F=0.4; p=0.605) was found. An interaction effect for condition  $\times$  segment (F=2.3; p=0.042) was revealed, indicating 179 differences in pacing profile between conditions. Post hoc analysis revealed a higher power 180 output during the first kilometer in NO compared to OP-DEP (p=0.015), and a higher power 181 182 output during the first kilometer in OP-IND compared to OP-DEP (p=0.042). No differences in pacing were shown between NO and OP-IND. During OP-IND power output of the participants 183 in the initial 250 meters was on average 9.8% above the mean power output of the trial. During 184 185 OP-DEP this was on average 5.6%.

186Paragraph Number 16 - A main effect of segment on heart rate (F=196.1; p<0.001),</th>187but neither a main effect for condition (F=0.4; p=0.682) nor an interaction effect condition  $\times$ 188segment (F=0.7; p=0.521) were observed. No main effect for cadence for condition (F=0.5;189p=0.608) or segment (F=1.8; p=0.195), and no interaction effect for condition  $\times$  segment190(F=1.0; p=0.397) was found.

191**Paragraph Number 17** - Mean RPE scores per kilometer for each experimental192condition are shown in Table 1. A main effect for segment (F=297.1; p<0.001) was reported,</td>193but no main effect for condition (F=0.8; p=0.448) was found. In addition, an interaction effect194for condition × segment (F=2.2; p=0.038) was revealed. Post hoc analysis indicated a higher195RPE score after three kilometer in NO compared to OP-DEP (p=0.003), and a higher RPE score196after three kilometer in OP-IND compared to OP-DEP (p=0.023). No differences in RPE were197found between NO and OP-IND.

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# 199 *3.3 Information-seeking analyses*

Paragraph Number 18 - Mean fixation time spent and the number of fixations in total 200 201 and per categorized variable per experimental condition over the whole trial are shown in Table 2. Analysis revealed a main effect of condition on the mean fixation time spent on the Rider 202 (F=9.8; p=0.005) and the Opponent (F=15.5; p=0.002), as well as on information about 203 Velocity (F=5.7; p=0.010) and Cadence (F=5.2; p=0.014), and Total (F=5.7; p=0.010). Post-204 hoc analysis revealed an increased focus on the avatar of the rider during OP-IND compared to 205 NO (p=0.013), and during OP-DEP compared to NO (p<0.001), but no difference between OP-206 207 DEP and OP-IND (p=0.870). Time fixating on the virtual opponent was much higher in OP-DEP compared to OP-IND (p=0.002). Participants showed a decreased focus on the velocity 208 feedback during OP-IND compared to NO (p=0.028), and during OP-DEP compared to NO 209 210 (p=0.014). A decreased amount of time was spent fixating on the cadence feedback in OP-DEP compared to NO (p=0.007). Finally, when taking all variables together total fixation time spent 211 212 over the whole trial was higher in OP-DEP compared to NO (p=0.008), and in OP-DEP compared to OP-IND (p=0.031). No effect for condition was reported for any of the other 213 categories. 214

215 **Paragraph Number 19** - A main effect for segment was revealed for Rider (F=4.4; p=0.024), Opponent (F=23.1; p<0.001), Velocity (F=6.5; p=0.023), Cadence (F=3.7; p=0.021), 216 Gearing (F=6.4; p=0.014), RPE (F=12.0; p<0.001), Other (F=4.5; p=0.034), and Total (F=21.8; 217 p<0.001). Post-hoc analysis revealed a decline in the time spent fixating on all these variables 218 over the race, except Other and RPE. Time spent fixating on Other increased per kilometer, 219 while time spent fixating on RPE is higher from the 1<sup>st</sup> until the 3<sup>rd</sup> kilometer, likely related to 220 the moment of asking RPE after each kilometer. No effect for segment was found for any of 221 the other categories. 222

**Paragraph Number 20** - An interactive effect for condition × segment was revealed 223 for Opponent (F=6.0; p=0.002), and Screen (F=4.7; p<0.001). Yet, participants still spent more 224 time fixating on the opponent in every kilometer during OP-DEP compared to OP-IND (all 225 p<0.05; e.g. 1<sup>st</sup> km: OP-IND=7.8±3.9 and OP-DEP=17.4±8.4 sec; 4<sup>th</sup> km: OP-IND=3.7±3.9 sec 226 and OP-DEP=7.7±6.9 sec). In addition, the number of fixations on Opponent showed a steady 227 decline per kilometer during OP-IND, while in OP-DEP there is only a decline in the number 228 of fixations in the 4th kilometer compared to the 3th kilometer. Finally, participants spent less 229 time fixating on the screen (excluding avatars) in the first two kilometers of OP-DEP compared 230 to NO (p=0.041 and p=0.024, respectively). No interaction effect was found for any of the other 231 232 categories.

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## 234 *3.4 Overtaking analysis and outcomes talk aloud procedure*

235 Paragraph Number 21 - 9 out of 12 participants were able to overtake their opponent in both OP-IND and in OP-DEP, while 2 participants only overtook their opponent in OP-IND 236 237 and 1 participant only overtook his opponent in OP-DEP. In this sense, all participants proved to be able to overtake (and beat) their opponent at least once. The average number of overtakes 238 was 0.9±0.3 in OP-IND and 0.8±0.4 in OP-DEP (p=0.586). Participants decided to wait longer 239 before they first overtook their opponent in OP-DEP (overtake at 67±28% of race completion) 240 compared to OP-IND (overtake at 36±34% of race completion; p=0.040). Mean fixation time 241 spent per categorized variables prior and after the overtake took place, normalized for duration 242 in percentages, can be found in Figure 3. The information-seeking behavior during the 10 243 seconds prior to the overtake of the virtual opponent in OP-DEP can be found in Table 3. 244

Paragraph Number 22 - The retrospective talk aloud procedure revealed that velocity,
(remaining) distance, and the virtual opponent were the most important cues of information for
participants regarding the overtaking decision. In this respect, 9 out of 10 participants who

overtook their virtual opponent in OP-DEP mentioned that they decided to overtake their opponent when they perceived themselves capable to cover the remaining distance without significant deceleration.

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#### 4. DISCUSSION

Paragraph Number 23 - The present study examined how a difference in the 253 254 interdependency between the athlete and the opponent would affect exercise regulation and information-seeking behavior. It appeared that cyclists adopted a slower initial pace and 255 decided to wait longer before overtaking their opponent when they became more dependent on 256 257 their competitor. Furthermore, a difference in information-seeking behavior was revealed. That is, participants were looking for different information in OP-DEP, mainly due to an increased 258 focus on the avatars of themselves and their opponents, while focusing less on their velocity 259 260 and cadence feedback.

Paragraph Number 24 - These outcomes highlight the importance of one's perceived 261 action possibilities in pacing decision-making, whereas a rather simple alteration in instructions 262 impacting on perceived interdependency already alters pacing behavior. In this respect, many 263 traditional theoretical frameworks about pacing regulation have argued that athletes use RPE 264 265 and the endpoint information to make pacing-related decisions (16, 17). The analysis of gaze behavior provides a novel opportunity to analyze the actual information-seeking behavior of 266 exercisers and its relation to pacing regulation (11). This has revealed in the present study that 267 268 attentional cues are used in a much more adaptive way according to their availability, relevance to their position in the race and relevance to what it is they are trying to achieve (i.e. to beat a 269 270 competitor, to get a particular position, to simply finish, to achieve a PB etc.) than previously has been suggested in the decision-making process involved in pacing (18). 271

**Paragraph Number 25** - In line with previous research (6, 11, 19–21), our findings 272 273 suggest a decline in attentional focus on external information over the race, indicated by the reduction in total fixation time spent and the number of fixations over the race for most of the 274 275 variables. A notable exception in this case is the increase in number of fixations at the distance feedback in the final kilometer compared to prior in the race. A similar finding was reported by 276 Whitehead et al. (21) using a think aloud procedure, showing an increased number of 277 278 verbalizations related to distance in the last quartile of 16.1 km cycling time trials. In this study the deliberate decision was made to not include power output as source of external information, 279 despite the fact that power output can be a potential valuable source of external information for 280 281 cyclists. This decision was made because the authors wanted to make sure that each provided source of external information would be clearly different from the others. As such, in the given 282 experimental situation we felt that velocity and power output would give a similar type of 283 284 information to our participants. The decision to include velocity rather than power output was made due to the expectation that all our participants would likely be familiar with velocity 285 feedback in the context of cycling. 286

Paragraph Number 26 - The presence of a virtual competitor led to an increased focus 287 on the avatar of the participant itself, and decreased attentional focus on the velocity feedback. 288 289 In contrast, the manipulation of the interdependency between athlete and opponent mainly affected the attentional focus on the virtual opponent. That is, when participants became more 290 dependent on their opponent the total fixation time at this virtual opponent increased drastically. 291 This finding highlights the importance of perception in relation to action possibilities, whereas 292 the environment and athlete did not differ between OP-DEP and OP-IND. In addition, an 293 increase in the number of fixations, but not in total fixation time spent, on the avatar of the 294 participant itself is noted in the high interdependency condition (OP-DEP), suggesting many 295 glances rather than fewer and longer fixations. This is likely an indication of frequent 296

monitoring of the distance between the avatar of the participant and the avatar of the opponent
during the time trial. In addition, time spent fixating on the avatar of the opponent decreased
after the overtake compared to prior in OP-DEP, but not in OP-IND.

300 Paragraph Number 27 - The instruction to allow only one overtake of the virtual opponent in OP-DEP created a recognizable and similar decision-making moment in time for 301 302 all the participants. In this sense, the time period right before the overtake may provide insight 303 into the information that is used leading to the decision to overtake the other competitor. According to the eye tracking analysis, the most frequently searched information sources in the 304 ten seconds prior to the overtake were both avatars, in combination with the distance feedback. 305 306 This is supported by the retrospective talk aloud procedure, in which 9 out of 10 participants mentioned that they decided to overtake their opponent when they perceived themselves 307 308 capable to cover the remaining distance without significant deceleration.

309 Paragraph Number 28 - In addition to alterations in information-seeking behavior, manipulation of the interdependency between competitors also altered the pacing behavior of 310 311 the participants. Comparable effects are likely be seen in observational studies looking into pacing strategies during real-life competitions (2). For example, the pacing strategies of athletes 312 are similar to the optimal pacing strategies as predicted in modelling studies when the 313 314 performance of the individual athlete is relatively independent of the other competitors, such as in time trial sports (22, 23), or sports in which individuals compete in separate lanes (24–27). 315 In contrast, exercisers tend to adjust their pacing behavior based on their competitors when 316 317 competing in the same lane (9, 10, 28–31). This effect becomes even more apparent when the interdependency between competitors is further increased, for example via the aerodynamic 318 beneficial effect of drafting behind an opponent (e.g. in cycling/speed skating; (9, 29)), or 319 during important events such as the Olympic Games (32). In this perspective, our findings 320 support the hypothesis that the interdependency between competitors could be a crucial 321

promotor for these differences in chosen pacing behavior between different competitive sports.
Nevertheless, more research is still needed in this respect in regard to the generalizability of our
findings to different ages, levels of fitness and levels or experience.

325 Paragraph Number 29 - Finally, the presence of a virtual opponent has been shown in previous studies to improve time trial performance (5–8, 33). However, in the present study no 326 327 such effect was found. This lack of an effect might be related to the received feedback by the 328 participants during the time trials. In particular the timer feedback may have evoked a competitive environment in which the participants were able to start competing against their 329 own previous performance, as they were aware of their own finishing times. Schiphof et al. 330 331 (unpublished data) showed that the performance effect when riding against a virtual opponent diminished indeed when the same feedback without the timer was presented to trained cyclists. 332 In addition, the constructed virtual avatar in this study was set up to be slightly slower compared 333 334 to the participant's best familiarization trial (ca. 2-3 seconds) in order to make sure participants were able to overtake their opponent in normal conditions. As a result, simply beating the virtual 335 opponent would not have led to an improvement in performance compared to riding alone. 336 However, in this perspective, previous research has indicated that indicate that the performance 337 level of the competitors does not affect one's own performance (34). Interestingly, the faster 338 339 initial pace of the opponent did not evoke a noticeable response in the participants when no restrictions were provided to the participant, in contrast to previous findings (7). Again, this 340 finding could likely be related to the received feedback during the time trials in general, and the 341 342 timer feedback in particular. Interestingly, RPE was lower after the third kilometer in OP-DEP compared to the other experimental conditions. This could be related to the slower initial pace 343 344 in OP-DEP, however, also the increased attentional focus on external sources in OP-DEP could have affected reported RPE. 345

Paragraph Number 30 - Participants were not explicitly asked if they believed they were competing against an actually opponent or an avatar. Nevertheless, based on the experiences of the experimenter during the data collection, there were strong indications that the participants did believe that the pacing and performance of the avatar was based on a "reallife" performance, despite being aware that what they saw on the screen was a virtual avatar (i.e. we did not attempt in any way to create an illusion that a second person was cycling at the same time behind a curtain or in a different room).

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## 354 5. CONCLUSION

355 Paragraph Number 31 - Our findings highlight that the pacing and informationseeking behavior of exercisers during time trial exercise depends on the circumstances in which 356 the exerciser has to act, which is consistent with the adaptive cue utilization and decision-357 358 making processes previously suggested (2, 3, 18). The presence of competition, and even the relationship between the competitors in this competition, could affect which information one 359 360 would like to present to the exerciser. Furthermore, not only the opponent's behavior, but also the interdependency between the athlete and the opponent appeared to be crucial in the decision-361 making process involved in pacing, highlighting the importance of athlete-environment 362 interactions in the context of pacing. That is, attentional cues are likely to be used in a much 363 more adaptive way in the context of pacing than previously suggested in many of the existing 364 theories about pacing regulation, according to their availability and situational relevance, and 365 366 consistent with a decision-making framework based on the interdependence of perception and action. 367

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371

# 372 Conflicts of Interest and Source of Funding

- 373 No funding was received for the present study. The authors declare no conflicts of interest. The
- results of the present study do not constitute endorsement by ACSM. The authors declare that
- the results of the study are presented clearly, honestly, and without fabrication, falsification, or
- inappropriate data manipulation.

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## 470 FIGURE CAPTIONS

Figure 1. Overview of the projected screen set-up during the time-trial. Projected information
included speed, elapsed distance, pedaling cadence, heart rate, gearing, and elapsed time.
Furthermore, the video simulation of the time-trial course, the virtual cycling avatar
representing the participant itself, and the virtual cycling avatar of the virtual opponent (only in
OP-DEP and OP-IND) were projected onto the wall.

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- Figure 2. Mean ( $\pm$  SD) power output per kilometer segment for each experimental condition
- 480 (NO, OP-IND, and OP-DEP).
- 481 <sup>A</sup> Difference between NO and OP-DEP (P < 0.05); <sup>B</sup> Difference between OP-IND and OP-DEP (P < 0.05).





Figure 3. Mean  $\pm$  SD of the fixation time spent per categorized variables prior and after the overtake took place, corrected for duration of the segment (%).

487 <sup>A</sup> difference between OP-IND and OP-DEP in fixation time spent (p < 0.05), <sup>B</sup> difference between pre-overtake

and post-overtake in fixation time spent (p < 0.05), <sup>C</sup> difference between pre-overtake and post-overtake between
OP-IND and OP-DEP in fixation time spent (p < 0.05)</li>

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<sup>A</sup> difference between OP-IND and OP-DEP in fixation time spent (p < 0.05), <sup>B</sup> difference between pre-overtake and post-overtake in fixation time spent (p < 0.05), <sup>C</sup> difference between pre-overtake and post-overtake between OP-IND and OP-DEP in fixation time spent (p < 0.05).

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	NO	OP-IND	OP-DEP
<b>Completion Time</b> (sec)	377.7 ± 17.4	$378.9 \pm 19.7$	$378.5 \pm 17.7$
Power Output (W)	$297.5\pm47.2$	$296.7\pm47.3$	$296.0\pm44.3$
Heart Rate (bpm)	$162.5\pm13.8$	$162.1 \pm 15.4$	$161.3\pm15.1$
Cadence (rpm)	$101.3\pm12.5$	$100.5\pm10.2$	$99.7 \pm 8.3$
Rating of Perceived Exert	<b>ion</b> (6-20)		
TT-1 km	$13.7\pm1.8$	$14.0 \pm 1.7$	$13.3\pm2.0$
TT-2 km	$15.8 \pm 1.5$	$16.2\pm1.6$	$15.5\pm1.6$
TT-3 km <sup>A,B</sup>	$17.8 \pm 1.1$	$17.7\pm1.4$	$16.5 \pm 1.4$
TT-Finish	$19.5\pm0.7$	$19.2\pm0.8$	$19.0\pm0.9$

**Table 1.** Mean  $\pm$  SD values for the time trial performance variables completion time, power output, heart rate and cadence per experimental condition, and RPE scores of the participant per experimental condition per kilometer, and directly after finishing.

<sup>A</sup> Difference between NO and OP-DEP (P < 0.05), <sup>B</sup> Difference between OP-IND and OP-DEP (P<0.05).

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	NO	)	OP-IN	ND	OP-D	E <b>P</b> 497
	Fixation	No of	Fixation	No of	Fixation	Not 98
	time spent	fixations	time spent	fixations	time spent	fixa <b>499</b> s
						500
<b>Rider.</b> <sup>A,B,D,E,F</sup>	7.4 ±5.3	24 ±14	38.6 ±12.9	88 ±38	37.4 ±12.1	123 <u>+</u> 48 501
<b>Opponent.</b> <sup>C,F</sup>	NA	NA	23.3 ±16.6	65 ±30	55.8 ±32.7	130 <b>5-05</b> 1
Screen	$28.6\pm\!\!37.7$	52 ±35	$12.6 \pm 16.7$	34 ±28	11.3 ±9.2	39 <b><u>5</u>93</b>
Velocity. <sup>A,B,E</sup>	31.1 ±29.8	55 ±37	19.7 ±21.1	38 ±28	15.7 ±28.4	504 31 ±35 505
Distance	32.5 ±36.3	69 ±34	23.4 ±16.1	59 ±22	19.1 ±13.2	54 ±24 506
Cadence <sup>B</sup>	13.7 ±9.8	37 ±25	9.1 ±8.0	31 ±22	6.4 ±4.6	25 ±13 507
Heartrate	3.5 ±2.8	14 ±7	3.1 ±2.1	13 ±7	2.5 ±2.3	10 ±7 508
Gearing	1.3 ±1.1	6 ±4	1.6 ±1.1	6 ±5	$1.0 \pm 1.9$	5 ±4 509
Time	9.8 ±7.4	27 ±14	8.1 ±7.8	21 ±14	7.3 ±6.0	21 ±13 510
RPE <sup>E</sup>	3.1 ±1.6	7 ±3	3.2 ±3.3	6 ±5	2.9 ±2.0	4 ±2 511
Other	$18.2 \pm 16.8$	28 ±21	$15.6 \pm 18.0$	23 ±21	15.0 ±24.2	21 ±27
Total <sup>B,C,D,E,F</sup>	149.1 ±51.5	318 ±94	161.6 ±49.4	389 ±85	174.6 ±42.0	512 462 ±98
						513

**Table 2.** Mean  $\pm$  SD values for the total fixation time spent (in seconds) and number of fixations per categorized variable per experimental condition over the whole transfer

<sup>A</sup> difference between NO and OP-IND in fixation time spent (p < 0.05), <sup>B</sup> difference between NO and OP-DEP in fixation time spent (p < 0.05), <sup>C</sup> difference between OP-IND and OP-DEP in fixation time spent (p < 0.50 Å. <sup>D</sup> difference between NO and OP-IND in number of fixations (p < 0.05), <sup>E</sup> difference between NO and OP-DEP in number of fixations (p < 0.05), <sup>F</sup> difference between OP-IND and OP-DEP in number of fixations (p < 0.05), <sup>F</sup> difference between OP-IND and OP-DEP in number of fixations (p < 0.05).

**Table 3.** The information-seeking behavior during the 10 seconds prior to the overtake of the virtual opponent in OP-DEP (N=10).

<b>OP-DEP - 10 seconds prior to overtake</b>				
	Fixation time spent (in sec)	Number of fixations		
Rider.	$1.3 \pm 0.9$	$5\pm 2$		
Opponent	$1.6 \pm 0.8$	$5\pm 2$		

Screen	$0.4 \pm 0.4$	$1 \pm 1$
Velocity	$0.4 \pm 0.8$	$1\pm 2$
Distance	$0.6 \pm 0.7$	$2\pm 2$
Cadence	$0.2 \pm 0.2$	$1 \pm 1$
Heartrate	$0.1 \pm 0.2$	$0\pm 0$
Gearing	$0.0 \pm 0.1$	$0\pm 0$
Time	$0.3 \pm 0.7$	$0 \pm 1$
RPE	$0.0 \pm 0.0$	$0\pm 0$
Other	$0.1 \pm 0.3$	$0 \pm 1$
Total	$5.0 \pm 1.4$	$16 \pm 3$