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Does self-paced exercise depend on executive processing? A narrative review of the current evidence

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Abstract

Self-paced exercise is any physical activity in which the effort has to be distributed along the time in order to achieve the objective of the event. Hence, self-paced aerobic exercise is a goal-directed behaviour towards an objective that involves several cognitive processes. The aim of the present review is to ask the extent to which self-paced exercise might rely on executive functions and the empirical evidence of top-down processing on self-paced exercise. We discuss the evidence from different experimental manipulations showing a potential link between self-paced exercise and executive processing. We finally point out some gaps in the literature and possible factors that might mediate the role of executive processing and self-paced exercise. Self-paced exercise is likely to be a highly complex process, in which a multitude of factors non-related to executive functions can also contribute to the ultimate decision to upregulate or downregulate exercise intensity.

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1. Introduction

Self-paced exercise, like running a marathon, refers to any physical activity in which the effort has to be distributed over time, in order to achieve the objective of the exercise. In our marathon example, this would correspond to completing the set distance as fast as possible; other cases exist in which athletes are expected to complete the greatest possible distance in a given time as in the cycling "Hour record". In all cases, it is of the essence to complete the set goal without reaching premature exhaustion (Edwards & Polman, 2013). During such self-paced exercises, athletes have to continually process information in order to achieve an optimal level of performance (Pageaux, 2014). Self-pacing requires to control and monitor the afferent feedback from the muscular and cardiopulmonary systems to various brain structures, which may affect directly or indirectly effort regulation (Roelands, De Koning, Foster, Hettinga, & Meeusen, 2013). Once this information is processed, athletes have to make continuous decisions to adapt the pace according to the demands of the event and remaining distance to cover or duration (St Clair Gibson et al., 2006). Moreover, athletes choose their pacing strategy based on the objective of the event as well as their previous experience. Greater experience should facilitate the choice of the adequate strategy (Brick, MacIntyre, & Campbell, 2015). Therefore, self-paced exercise, given its aim to adequately distribute effort along the time period of the event to avoid premature fatigue, heavily rests on goal-directed behaviour. In doing so, it engages cognitive processes and in particular, executive functions.

Executive functions refer to a series of interrelated top-down processes which are needed for behavioral control, from selecting to monitoring behaviours in the service of goals achievement (Adele Diamond, 2014). There is a common agreement that executive functions are composed of three core components: working memory, inhibitory control and cognitive flexibility (Adele Diamond, 2014; Friedman & Miyake, 2017). Working memory involves the storage of information for a short period of time after it has been experienced. It is also at play when translating instructions into action plans or updating one's plan as one calculates or considers other alternatives. Inhibitory control is crucial to stop automatic behaviours, as when a road cyclist does not react to an opponent's attack while in the final climb. Inhibitory control is also central to selecting among many different possible choices the best memory representations, as when choosing the correct "breakaway" in a cycling peloton. Indeed, inhibitory control can be exercised at different levels, from self-control and discipline (inhibition at the level of behaviour), to concentration and attention (suppression of unattended perceptual information) to cognitive inhibition (inhibition of thoughts or memories) (Diamond & Ling, In press). Finally, cognitive flexibility corresponds to the ability to switch between goals or modes of thinking, as when switching between tasks or considering multiple alternatives in a complex situation (whether to respond to that opponent's attack or to stay in the group and close the gap helped by members of the team).

This review asks the extent to which self-paced exercise engage and rely on executive functions. First, we summarize the role of executive functions on self-paced exercise. Second, we highlight the empirical evidence of the top-down processing on self-paced exercise, together with the currents models to explain the role of executive functions in self-paced exercise. We then discuss the empirical evidence

from experimental manipulations with an eye toward possible causal links. Some studies have manipulated, before or during exercise, aspects of executive functions such as attentional focus, mental/cognitive fatigue and cognitive load to measure the impact on self-pacing. Other studies have asked whether self-paced exercise performance would be improved if executive functions were enhanced, whether through pharmacological drugs, brain stimulation, or cognitive training. Taking stock of the available literature, we argue for the role of executive functions on self-paced exercises.

2.Current models on the role of executive functions on self-paced exercise

The current models on self-paced exercise have focused mainly on the neural basis of this goal-directed behaviour, with a particular interest in the prefrontal cortex (although there is little empirical evidence on this matter).

The prefrontal cortex might indeed play a key role on self-paced exercise, given its interconnection with other brain areas such as the anterior cingulate cortex and orbitofrontal cortex (Aron, Behrens, Smith, Frank, & Poldrack, 2007), premotor cortex and supplementary motor area, involved in the processing of sensorimotor information (Lutz, 2018). Robertson and Marino (Robertson & Marino, 2016) have proposed that the prefrontal cortex may act as a control structure which integrate information encountered during exercise, both centrally and peripherally, exerting a top down control (Robertson & Marino, 2015). The prefrontal cortex would be responsible for integrating afferent signals provided by the anterior cingulate cortex and the orbitofrontal cortex, which have been related to motivational and emotional processing (Pollatos, Gramann, & Schandry, 2007). Once these signals are integrated, the prefrontal cortex would respond consequently by increasing, decreasing or maintaining exercise pace, or ultimately stopping the exercise. Therefore, the costs and benefits analysis central to self-paced exercise would be mediated by the prefrontal cortex in concert with the anterior cingulate cortex and the orbitofrontal cortex (Cohen, Heller, & Ranganath, 2005). If the cost overcomes the benefits, inhibitory control over typical stopping mechanisms will be lifted so that the exercise pace can be down-regulated (Hilty, Langer, Pascual-Marqui, Boutellier, & Lutz, 2011). Likewise, McMorris and colleagues proposed a similar interpretation to that of Robertson and Marino's model (McMorris, Barwood, & Corbett, 2018). They proposed that regulation of endurance exercise is based on interoception and motivation, but in this case is the ventrolateral prefrontal cortex, which integrates the information from the supplementary motor area and the premotor motor cortex, which ultimately sets whether to continue, slow-down or stop the exercise. These authors also highlight the importance of the anterior insula cortex (that receives feedback from lamina I lateral spinothalamic and nucleus tractus solitarii medullo-thalamic pathways during exercise (McMorris, Barwood, & Corbett, 2018)) which reacts to changes of exercise intensity and perception of effort (Williamson et al., 1997). This feedback would be compared with the information stored in the memory in order to generate a new current status of awareness.

Although these two models are conceptually appealing, they are supported by only a few studies, all of which used externally-paced exercise instead of self-paced exercise. For example, the model of Robertson and Marino (Robertson & Marino, 2015) is based on the report that EEG activity assumed to arise from the dorsolateral and ventrolateral prefrontal cortex (note the poor spatial resolution of EEG)

begins to decrease when exercise intensity overcomes the ventilatory threshold. It was inferred that these brain areas may exert a potential role on motor inhibition process. The authors argued that reduced brain activity in top-down control areas may favour the processing of unwanted stimuli which in turn, would lead to reduce the pacing or even stopping the exercise. Following the same logic, Enders and collaborators (Enders & Nigg, 2015) found an increased prefrontal activity which matched with onset of force production and the transition from flexion to extension in the pedalling cycle. The authors suggested that the supplementary motor area received higher order from the prefrontal cortex, with its increased activation resulting in enhanced executive control, motor planning and execution (Enders et al., 2015).

Executive functions are also relevant to the psychobiological model of endurance performance (McCormick, Meijen, & Marcora, 2015; Pageaux, 2014). This model emphasis five different cognitive factors related to self-paced exercise: 1) perception of effort; 2) potential motivation; 3) knowledge of the distance/time to cover; 4) knowledge of the remaining distance/time; and 5) previous experience of perception of effort during exercise. The model suggests that to overcome fatigue, the prefrontal cortex should exert inhibitory influences on the cingulate and insula cortices, both of which seem to be activated in proportion to the degree of subjective physical and mental fatigue (Cohen et al., 2005). Therefore, according to the psychobiological model, the key variable on self-paced performance is the perception of effort (McCormick et al., 2015; Pageaux, 2014).

Only limited evidence supports the psychobiological model of endurance exercise, with all studies manipulating mental fatigue prior to exercise. For example, Brownsberger et al. (Brownsberger, Edwards, Crowther, & Cottrell, 2013) and Pires et al. (Pires et al., 2018) found that cyclists with an induced state of mental fatigue presented an increased EEG brain activity in the prefrontal cortex. In Brownsberger' et al. study, twelve participants completed two consecutive self-paced cycling exercises at RPE of 11 or 15, after completing a 90 min mental fatigue task or watching a documentary. The authors found that participants produced less power output during the self-paced exercise in the mental fatigue condition compared to the control condition, and it was related to a higher beta activation in the electrode position F3 for the mental fatigue condition. The authors suggested that the higher beta activation in F3 might be related to prefrontal activity. Meanwhile, Pires' et al. study showed that a group of eight trained cyclists with an induced state of mental fatigue presented a higher theta activation during a 20km cycling time trial than in the control condition. Moreover, cyclists in the mental fatigue condition completed the 20km time-trial slower than in the control condition and the authors suggested that increase theta power might reflect their lower ability to preserve adequate inhibitory control and attentional allocation during exercise, which subsequently led to impaired performance (Pires et al., 2018). Nonetheless, due to the small sample sizes of these studies (less than 15 participants), the level of participants (recreational athletes), and that Pires et al. only placed one electrode to record EEG activity, these results should be interpreted with caution.

Finally, it is also worth mentioning the new perspective that has emerged to overcome the apparent oversimplification of the complex psychophysiological construct of exercise based mainly on the perceived exertion. Venhorst et al. (Venhorst, Micklewright, & Noakes, 2018) proposed that self-paced

exercise is based on a construct of three-dimensional categories. First, perceived mental and physical strain are the main components of exercise which reflect the sensory-discriminatory process necessary to match the planned objective with the physiological state. Second, core affect has a mediatory role in the regulation of effort since its two dimensions, hedonic and arousal, reflect behaviour of approaching or avoidance. Third, cognitive flexibility is of the essence to weigh between further pursuit of the goal and goal disengagement, according to the boundaries set by homeostasis. Unfortunately, no study has investigated the neural basis of these proposed mechanisms, yet.

In summary, notwithstanding the discrepancies on the main focus between these models of self-paced (endurance) performance, all of them consider executive functions and the prefrontal cortex, its associated neural mediator, as determinant for self-paced aerobic exercise. However, as we summarize here, few empirical studies have tested the neural mechanisms of self-paced aerobic exercise. In addition, we are still far from understanding the connection between brain areas recruitment and exercise as it unfolds, let alone the possible mediating role of executive functions.

2.1. Role of executive functions on perceived exertion during self-paced exercise

Self-paced exercise involves several cognitive processes, such as perception and memory, as well as executive functions, such as inhibition and working memory (Hyland-Monks, Cronin, McNaughton, & Marchant, 2018; Jacobson & Matthaeus, 2014a; Smits, Pepping, & Hettinga, 2014). Stimulation from internal organs (e.g., muscle, lungs, heart) and from environmental factors (e.g., competitors, public, road surface) need to be processed and integrated requiring athletes to select relevant sources of information and suppress potential distractions (Vickers & Williams, 2017). For example, based on their breathing sensation, athletes can rate how they perceive a given physical effort. However, accurate perception of effort builds on mental template that have been previously defined through experience (Baron, Moullan, Deruelle, & Noakes, 2011). Indeed, athletes might perceive a given effort lighter or more strenuous depending on, not only the exercise intensity and the estimated duration until ending the exercise, but also their prior knowledge about these types of exercises (de Koning et al., 2011). A common measure of effort in exercise performance is the rate of perceived exertion (RPE). Briefly, RPE in sports is often described as the cognitive feeling associated to physical effort (Pageaux, 2016). Importantly, RPE has been linked to several executive processes, such as working memory, inhibition, self-control and attention.

As we mentioned before, during self-paced exercise, athletes have to continuously update their initial plan according to the current demands of the exercise. If the current performance is under or over the desired goal, athletes will have to calculate or consider new alternatives, and switch motor plans accordingly (Baron et al., 2011). In other words, when athletes assess their current RPE, they rely on key executive functions of working memory, inhibition and cognitive flexibility.

Moreover, the RPE also relies on inhibitory process related to the self-paced exercise (Flood, Waddington, Keegan, Thompson, & Cathcart, 2017). During self-paced exercise, the adequate management of sensation leads to achieve an optimal level of performance, as the regulation of effort is associated with the ability to tolerate and inhibit discomfort raised during exercise. Maintaining an exercise despite

feeling fatigue or pain in some part of the body (Verhoeven et al., 2011) and/or hard environmental conditions (Davies et al., 2016) implies that the urge of stopping or reducing the exercise intensity must be inhibited (Audiffren & André, 2015; Verhoeven et al., 2011). Therefore, inhibitory process, such as focused attention or self-control (Brick et al., 2015; Adele Diamond, 2014), help to regulate self-paced exercise.

We now turn to, arguably, the most widespread practice in the literature which is to look for manipulations that have an effect on executive functions, with the end goal of measuring how exercise performance may improve or worsen as a result of such manipulations. In the following section, we summarize the evidence from experimental studies whose aim were to study the influence of executive functions over self-paced aerobic exercise performance. The effect of exercise over executive functions has been discussed previously (Ludyga, Gerber, Brand, Holsboer-Trachsler, & Pühse, 2016; McSween et al., 2019; Tomporowski, 2003).

3. Experimental manipulations affecting executive functions and self-paced performance

3.1. Attentional focus

During self-paced exercise athletes have to allocate their attentional resources only toward relevant stimuli from the myriad of inputs (internal and external) that reach the central nervous system. Accordingly, attentional focus during self-paced exercise has been a topic of interest for sport scientists (Brick, MacIntyre, & Campbell, 2014). It is generally accepted that athletes can choose among two different attentional strategies - associative or dissociative - along two separate dimensions of information - internal or external (Stevinson & Biddle, 1998). On the one hand, within the associative strategy, athletes can focus their attention towards relevant aspects of the exercise, either internal (i.e., focusing on internal body aspect of the task such as breathing, heart rate, etc.) or external (i.e., focusing on monitoring the competition such as pace, power output, remaining distance, etc.). On the other hand, in the dissociative strategy, athletes divert their attention to irrelevant aspects of the exercise, such as irrelevant daydreams or math puzzles (internal dissociation) or in the scenery or other competitors (external dissociation). Therefore, when athletes adopt different focus of attention, they will mainly call upon inhibitory process such as inhibition of thoughts or selective attention.

The logic of the attentional focus theory is that focusing on the task or diverting the attention away from the task might affect (mainly) subjective indexes of exercise performance, and consequently affect physical performance (Brick et al., 2014). For example, Connolly and Janelle, 2003, (Experiment 1) studied the effect of an associative versus dissociative strategy on self-paced rowing performance. In the associative strategy, participants (n= 9) completed more distance than in dissociative strategy, although there was no difference in RPE levels between conditions. In their second experiment, they tested the two dimensions of associative and dissociative strategies with respect to internal or external information. In five separate visits, participants completed a 2000m self-paced rowing exercise using internal/external associative or dissociative strategies and a control condition (Connolly & Janelle, 2003). An associative strategy, internal or external, induced higher RPE levels than a dissociative strategy or the control condition during a self-paced exercise. However, the higher RPE found in Connolly and

Janelle's study might be better explained by the better physical performance in the associative strategy, rather than the associative strategy itself calling for further controls.

Williams et al. (Williams et al., 2015) suggested that focusing attention on external aspects of a self-paced exercise improves physical performance. Williams et al. used a cyclists' avatar, which simulated a competitor with higher power output than the participant at baseline, to reduce the internal associative focus during a self-paced 16.1km time-trial compared to a neutral or no avatar condition. On average, participants (n=15) completed the cycling time-trial 1.4% faster and increased the average power output on 2.8% compared to the baseline. The higher performance was achieved by an altered pacing strategy throughout the time-trial, as the external (dissociative) focus might have allowed athletes to reduce negative sensation of fatigue and pain (Williams et al., 2015). According to the authors' conclusion, the external focus helped to inhibit the rise in RPE during exercise since participants paid less attention to the RPE. In a separate study, Williams et al. (Williams et al., 2016) found that enforcing a slower initial pace during the first 4km of a 16-km cycling time-trial reduced the internal association focus compared to a fast or a neutral start. Although cyclists started slower than normal pace, the positive psychological responses during the initial phase of the time-trial reduced the RPE, but it did not affect the overall time-trial performance compared to fast and baseline start.

Robinson et al. (Robinson, Cloak, Lahart, & Lane, 2018) asked nine active adults to match the 80% of a 3-min all-out test, during a 3-min cycling self-paced exercise by using an internal associative strategy or external dissociative strategy. They found that using an associative strategy, participants completed the test at their 75.9% of the average power output obtained in 3-min all-out test performance, whereas with the dissociative strategy participants were only able to achieve 70.9% of their performance. They argued that in novice participants, distracting the attention from performance can slow down the pacing, and therefore an internal (associative) focus strategy might help to maintain a more consistent performance throughout a self-paced event (Robinson et al., 2018).

In conclusion, there are only a few self-paced exercise studies in which the attentional focus has been manipulated externally and the results are somewhat mixed. An associative strategy might increase RPE, but it might be mediated by an increased performance (Connolly & Janelle, 2003; Robinson et al., 2018). Yet, a dissociative strategy might improve exercise performance (Robinson et al., 2018; Williams et al., 2015) without increasing RPE (Williams et al., 2016), at least in more proficient athletes. It is indeed important to acknowledge that previous experience in self-paced activities may also alter the nature of the optimal strategy (see below level of expertise section).

3.2. Cognitive load during self-paced exercise

Despite being a topic of interest, few studies evaluate the effect of cognitive load on self-paced exercise performance. Under the umbrella of cognitive load, we refer to those interventions aiming to induce different levels of cognitive (executive) load during a self-paced aerobic exercise. For instance, Epling et al. (Epling, Blakely, Russell, & Helton, 2016) found that performing a word recall task involving working memory, while participants completed a self-paced outdoor running exercise, increased the mental workload (measured with the NASA-TLX scale) compared to running without performing any

cognitive task. However, they did not find that the cognitive task performed during a 5-min self-paced run affected the distance covered by the 12 athletes. Likewise, Blakely et al. (Blakely, Kemp, & Helton, 2016) examined the impact of cognitive load (tone counting with two levels of difficulty) on a group running on an even surface and on a group running on an uneven (trail) surface. In Blakely' study, participants reported higher mental workload and feelings of being mentally exhausted with the more demanding cognitive task. Nonetheless, they only found a linear trend in both groups for a worsening physical performance as cognitive task difficulty increased.

In contrast to the above-mentioned studies, Holgado et al. (Holgado, Zabala, & Sanabria, 2019) found that performing simultaneously a n-back task, which involves working memory and inhibition, did not affect exercise performance during a 20-min self-paced cycling exercise in 28 trained cyclists. The results of the study did not show enough evidence to support the idea that completing a challenging cognitive task (2-back) compared to the less challenging task (1-back) affected the average power output achieved. In addition, the results of the study showed that, despite the higher cognitive demands of the 2-back condition, RPE was not affected by the cognitive load. Similarly, to this finding, Daniels and Newel (Daniels & Newell, 2003) did not find an increase in the RPE while participants completed a hard math task during a self-paced running exercise.

Walking, when performed with a specific goal (e.g., to cover a given distance in a certain amount of time) can be considered a self-paced exercise. To determine the effect of cognitive load on walking a growing body of literature has investigated the changes in gait parameters under different levels of cognitive load. For example, Malcolm et al. (Malcolm, Foxe, Butler, Molholm, & De Sanctis, 2018) found that increasing the cognitive load (using a go/no-go response inhibition task) while participants walked on a treadmill modified the gait pattern during the more challenging task compared to the control condition. In contrast, Schaefer et al. (Schaefer, Jagenow, Verrel, & Lindenberger, 2015) did not find that the cognitive load (2-back vs. 3-back) affected walking patterns at a self-selected speed in healthy young adults. Although walking (gait) exercise is beyond the scope of this review, these examples clearly reflect that the effect of cognitive load in healthy adults in a less complex self-paced exercise, such as walking, is neither solid.

In conclusion, the current evidence does not allow one to reach any firm conclusion on the effects of cognitive load on self-paced exercise performance, as the published studies remain scarce and greatly vary in the methodology. This being said, the current evidence does not support the idea that performing simultaneously a challenging cognitive task during self-paced exercise impairs exercise performance and is regulated by top-down processing. As mentioned above and discussed below (expertise section), it is plausible that other factors, such as level of expertise, may modulate or even mask the effect of cognitive load on self-paced exercise.

3.3. Mental fatigue before self-paced exercise

It is commonly believed that performing a long and challenging cognitive task involving executive functions (e.g., inhibitory control, cognitive control, etc.) before exercise might increase the RPE in a subsequent exercise due to an induced state of mental fatigue (Englert, 2017). In this state of mental

fatigue, athletes would select a lower self-selected exercise intensity, as they would find it harder to inhibit unpleasant stimuli related to successful exercise performance (Englert, 2017; Evans, Boggero, & Segerstrom, 2016). It is hypothesized that the state of mental fatigue is caused by an accumulation of adenosine within the brain regions recruited by the demanding cognitive task (Pageaux, Lepers, Dietz, & Marcora, 2014). Adenosine might have two effects: first it would increase the RPE and second, it would reduce motivation towards the exercise. However, this hypothesis has not been tested in experimental studies yet and therefore, it remains speculative whether RPE increases as a consequence of an accumulation of adenosine within active regions of the brain (Martin, Meeusen, Thompson, Keegan, & Rattray, 2018).

The literature on the effects of performing a challenging cognitive task before self-paced aerobic exercise remains somewhat inconsistent and scarce. For example, Pageaux et al. (Pageaux et al., 2014) found that performing a 30 min inhibitory control cognitive task (Stroop task) induced a higher RPE and reduced the physical performance on a 4km self-paced running exercise in 12 physically active participants compared to performing the same exercise without the initial inhibitory task. Similarly, but using a 30 min sustained attention cognitive task before exercise, Pires et al. (Pires et al., 2018) showed that the cognitive task induced a higher RPE and participants spent more time to complete a 20km timetrial in a group of 8 recreational active participants in comparison to a control condition (seated for 30 min). However, contrary to Pageaux et al. (Pageaux et al., 2014), Penna et al. (Penna et al., 2018) did not find that the same cognitive inhibitory task affected the RPE in 16 highly trained swimmers, although it impaired their performance in a 1500m self-paced swimming exercise. Likewise, Martin et al. (Martin et al., 2016), using the same task and duration as in Pageaux's and Penna's studies, did not find any effect of prior mental fatigue on the RPE levels of professional cyclists (n= 11) and recreational cyclists (n=9). However, the group of recreational cyclists impaired their physical performance in a 20 min cycling time-trial, whereas no changes were shown in the group of professional cyclists. Martin et al. concluded that professional riders might be more resilient to mental fatigue and have a superior inhibitory control (Martin et al., 2016). Contrary to the findings of Martin's et al. study, Clark et al. (Clark et al., 2018) reported similar self-paced performance (6-min cycling time-trial) after completing a Stroop task or a neutral task independently of whether participants were competitive cyclists (n= 10) or untrained (n=10).

Other studies have induced mental fatigue through longer cognitive task. However, even longer cognitive tasks do not seem to induce consistent detrimental effects on RPE or physical performance. For example, Staiano et al. (Staiano, Bosio, Piazza, Romagnoli, & Invernizzi, 2018) asked 13 young elite kayakers to perform a 60 min Stroop task before a 2000m self-paced kayaking time-trial. Participants were indeed impaired in the self-paced exercise (time to complete the 2000m) probably due to a higher RPE in the mental fatigue condition as compared to the control condition. In contrast, Filipas et al. (Filipas, Mottola, Tagliabue, & La Torre, 2018) did not find that the same task and duration affected RPE or physical performance in prepubertal kayakers' athletes before completing a 1500m time-trial. Performing the AX-CPT task, which involves sustained attention, working memory, response inhibition, and error monitoring, during 90 min affected neither RPE nor physical performance on a sample

of 8 recreational cyclists before a 4km cycling time-trial (Silva-Cavalcante et al., 2018). In contrast, the same cognitive task impaired 3km running performance on 20 recreational runners, even though participants did not rate their RPE higher (MacMahon, Schücker, Hagemann, & Strauss, 2014).

In summary, the above evidence points out that performing a cognitive task which involve executive functions prior to self-paced exercise might at worse have a detrimental effect on RPE and self-paced exercise performance, and at best no effect. The mixed results in the literature do not provide a strong evidence to support a systematic detrimental impact of mental fatigue on self-paced exercise. In addition, these results should be interpreted with caution for the following reasons: first, sample sizes are generally low (less than 20 participants) which may lead to overestimation of effect sizes; second, the experimental and control conditions usually varied in several components, such as the duration of the interventions (Martin et al., 2016) or performing a cognitive task versus doing nothing in the control condition (Martin et al., 2016; Penna et al., 2018; Pires et al., 2018; Silva-Cavalcante et al., 2018; Staiano et al., 2018). According to McMorris et al. (McMorris, Barwood, Hale, Dicks, & Corbett, 2018) and Holgado et al. (Holgado, Sanabria, Perales, & Vadillo, 2019) and given this state of affair, the effect of mental fatigue on exercise might be more likely due to random variations or publication bias rather than a real effect of mental fatigue on exercise.

4. Interventions to enhance self-paced performance by improving executive functioning.

The proposal that executive functions have a role in the self-regulation of endurance performance has led some authors to hypothesize that enhanced executive functions would result in improved self-paced aerobic exercise. In this section, we will discuss those interventions which may have the potential to improve self-paced exercise performance by acting, directly or indirectly, on executive functions. These interventions include, but are not limited to, cognitive training, non-invasive brain stimulation or pharmacological substances (Enriquez-Geppert, Huster, & Herrmann, 2013).

Whether cognitive training or brain stimulation, the logic of the existing studies is straightforward: any change in areas associated with executive functions should affect self-paced exercise, to the extent that self-paced exercise rely on executive functions. Thus, cognitive training in sport has been mostly targeting those executive functions, such as working memory or inhibition, that should transfer to enhanced sport performance in real-world situations (Walton, Keegan, Martin, & Hallock, 2018). Yet, given that cognitive training typically results in near transfer effect or improvements on the trained task with only limited generalization to other tasks, the possibility that cognitive training improves a sport specific task, which would be a typical case of far transfer, remains controversial. Even if this is a topic of great interest, there is not enough evidence showing a positive effect of cognitive training in self-paced exercise (Harris, Wilson, & Vine, 2018). The limited evidence to date comes mainly from studies supported by commercial companies rather than peer-reviewed ones (Walton et al., 2018). Therefore, it seems too early to recommend cognitive training for athletes due to the time-cost balance.

Transcranial direct current stimulation (tDCS) is the main non-invasive brain stimulation technique used in Sports science in order to improve exercise performance. Although tDCS is branded as enhanc-

ing executive functions, few studies have used self-paced exercise to test the effects of tDCS on performance. As far as we know, only few studies have tested the effect of anodal tDCS on a self-paced aerobic exercise. The results do not support the idea that tDCS is an effective tool to improve performance. Anodal tDCS applied before exercise did not improve performance compared to the sham condition in a 16km self-paced time-trial in male trained cyclists (Barwood et al., 2016), or during a 20km time-trial in healthy men (Simpson, MIchael W, 2017), or during a 20 min time-trial on male trained cyclists (Holgado, Zandonai, et al., 2019) or in an 800m swimming test in elite triathletes (Valenzuela et al., 2018). Moreover, stimulating the prefrontal cortex for 20 min did not elicit any change in oscillatory brain activity either at baseline or during exercise (Holgado, Zandonai, et al., 2019). Hence, the current evidence available does not support the claim that tDCS is able to improve self-paced performance. Despite the general belief that tDCS is an effective tool to improve exercise performance, the pooled effect size of the tDCS' studies on objective and subjective measures of exercise performance or muscle strength do not provide much evidence for its ergogenic effect. Indeed, the effect might be mainly driven by studies with low quality and by publication bias (Holgado, Vadillo, & Sanabria, 2018; Machado et al., 2018). As with cognitive training for exercise, companies with commercial interests have been promoting tDCS without solid evidence of its effects on exercise performance (Reardon, 2016).

Finally, it is worth mentioning that there has been a trend for athletes from all levels to use pharmacological drugs (e.g., analgesics or opioids). Athletes might be using these drugs in order to inhibit process related to exercise induced pain or discomfort (Holgado, Hopker, Sanabria, & Zabala, 2018). Some of these pharmacological drugs are, for example, paracetamol or tramadol. Paracetamol might inhibit pain sensation by decreasing the activation of the anterior cingulate or prefrontal cortices, which are involved in pain and cognitive/ affective processing. For instance, Mauger et al. (Mauger, Jones, & Williams, 2010) found that paracetamol ingestion increased the average power output and reduced the time required to complete a 16.1km self-paced cycling exercise, although the RPE remained unchanged. Likewise, tramadol, might reduce the ability of the brain to respond to sensory inputs by inhibiting serotonin and norepinephrine reuptake. It is therefore possible that tramadol could improve exercise performance via its effect on central brain areas associated with perception of effort. Holgado et al. (Holgado, Zandonai, et al., 2018) conducted the first study, to the best of our knowledge, to test the hypothesis that tramadol improves self-paced performance. In their first experiment, they showed that tramadol allowed trained cyclists to achieve greater mean power during a self-paced exercise without modifying brain electrical activity or RPE. In contrast, in a second experiment aimed to replicate the first experiment and to test the hypothesis that tramadol might have an effect on sustained attention during exercise, tramadol did not improve physical performance or affect sustained attention at the behavioral level compared to the placebo condition (Holgado, Zandonai, et al., 2018). These authors found, though, that tramadol caused a lower brain activity (i.e., greater suppression with respect to the baseline) in the alpha frequency band linked to stimulus processing (relevant to the task) in the condition of tramadol compared to placebo which might suggest a detrimental impact of tramadol on stimulus processing. In any case, more research is warranted to establish the effect of tramadol on self-pacing exercise at the physical, cognitive and brain levels. For further discussion on the effect of pharmacological substance on

exercise performance see the reviews by Lundberg and Howatson (Lundberg & Howatson, 2018) and Holgado et al., (Holgado et al., 2018).

5. Level of expertise

There is some rationale to think that the level of expertise in a given skill might be fundamental to explain the extent to which skills rely or not on the use of executive functions. It is plausible that through deliberate practice many of the exercise skills or movements might be performed, for example, with little or no reliance on executive functions (Smits et al., 2014). Given that the use of executive functions is effortful and that cognitive resources are limited, exercise expertise would be valuable in reaching an automatic mode in order to divert effortlessly resources where and when they are needed. According to some models, learning new skills go through different stages (Schaefer, 2014). In a first stage, movements are performed consciously by investing large amounts of cognitive resources. In the next stage, movements are executed in a blend of aware and automatized control strategies. Finally, some athletes reach an autonomous stage, in which the use of executive functions is reduced as movements are performed efficiently. Neuroimaging studies corroborate this idea, as prefrontal cortex activity is seen to decrease from the initial phase of learning a new skill to once the skill becomes more automatized (Erickson et al., 2007; Floyer-Lea & Matthews, 2005). These studies show that with increasing automaticity of movements, control demands are reduced and activity in participating control brain areas decline (Erickson et al., 2007; Floyer-Lea & Matthews, 2005). Hence, with a high level of automaticity, processes are more efficient, rapid, smooth and require lower levels of control capacity (Debarnot, Sperduti, Di Rienzo, & Guillot, 2014).

Athletes with a higher level of expertise would therefore rely to a lesser extent on executive functions while exercising. For example, when athletes achieve a high level of automaticity, movements are better adjusted and require less energy expenditure and cognitive effort (Neubauer & Fink, 2009; Schmidt & Lee, 2014). Experts might also require less cortical activity to perform the same task compared to novices. For instance, Ludyga et al (Ludyga, Gronwald, & Hottenrott, 2015) found that cyclists with higher fitness level had less brain cortical activity in comparison to a group of lower fitness level cyclists, during a 30 min submaximal cycling exercise below the ventilatory threshold. We acknowledge that the exercise intensity in this study was fixed, and therefore the results might not extrapolate to a self-paced aerobic exercise. Note also that higher fitness might not directly be linked to a higher expertise in an physical exercise.

An example closer to self-paced aerobic exercise, as noted above, comes from the gait literature. There is evidence that different steady state walking speeds do not considerably affect prefrontal activation (Meester, Al-Yahya, Dawes, Martin-Fagg, & Piñon, 2014; Suzuki et al., 2004). As gait is a skill that has been automatized throughout life, prefrontal activity (with respect to rest) remains relatively stable even at different comfortable speeds. Similarly, experts' athletes through deliberate practice over the years may have developed the ability to execute their skill free of much frontal cortex participation. Although gait and many self-paced aerobic exercises might be considered similar tasks (i.e., cyclical

and continuous activities), we cannot directly extrapolate these results to these more complex self-paced (higher intensity) exercises.

Interestingly enough, the study of Martin et al. (Martin et al., 2016), which we discussed above, concluded that professional cyclists showed better inhibitory control and were more resistant to the negative effect of a high mental fatigue. In Martin et al.'s study, the group of professional cyclists did not display impaired performance in a 20 min time-trial after completing a 30 min Stroop task compared to a 10 min seated control condition. However, the group of recreational cyclists displayed impaired physical performance in the mental fatigue condition and made more errors in the Stroop task. Likewise, Cona et al. (Cona et al., 2015) found that faster ultra-distance runner had better inhibitory control in a go/no go task than slower runner before an ultra-marathon running race. Furthermore, Jacobson and Matthaeus found that self-paced athletes outperformed both externally-paced athletes and non-athletes in a task involving inhibitory control (Jacobson & Matthaeus, 2014b), which supports the conclusion of Ludyga et al.'s study (Ludyga et al., 2015) suggesting that high fit cyclists might have a better inhibitory control.

Additional evidence for the influence of expertise level on the link between executive functions and self-paced exercise comes from attentional focus strategy studies. For example, experts (or those athletes with better performance), adopt different attentional strategies during self-paced exercise compared to novice athletes. For example, Silva and Appelbaum (Silva & Appelbaum, 1989), found that top finishers in a marathon race spent more time using an internal associative focus of attention compared with the slower finishers. These observations are consistent with those of Morgan and Pollock (Morgan & Pollock, 1977), who determined that high-level performers runners also utilized internal associative strategy, whereas non-elite runners appealed more often to an external attentional focus strategy. This is further supported by Stevinson and Biddle (Stevinson & Biddle, 1998), as they found a correlation between the use of an internal dissociative attentional focus strategy in non-elite marathon runners and "hitting the wall" in a marathon race compared with those participants that they did not use primarily this strategy. They suggested that the internal dissociation (i.e., focusing in internal aspect not relevant to the task such as daydreaming) is a hazardous strategy to achieve an optimal level of performance during a self-paced event. Meanwhile Brick et al. (Brick et al., 2015) interviewed elite endurance runners, also reporting the predominant use of an internal associative attentional focus strategy. Finally, the outcome of Ouvrard et al.'s (Ouvrard, Groslambert, & Grappe, 2018) study supports Brick et al.'s findings, this time in a sample of French elite cyclists. They studied the relationship between pacing strategies and attentional focus in elite cyclists during a time-trial championship. In the sample of 9 elite cyclists, thoughts related to active self-regulation of the performance (i.e., internal associative focus) or thought related to outward monitoring of the competition (i.e., external associative focus) were correlated with an optimal performance during a 49.3km cycling time-trial corresponding to the national championships.

In summary, the scant evidence suggests that skilled athletes could have automatized processes related to effort regulation in their field of expertise and may need fewer resources to perform the same activity, i.e., they might be more efficient at the time of processing stimuli (Ciria et al., 2019). Although there is

not much evidence on this, it is plausible that after many years of deliberate practice, expert participants could have already automatized a pacing strategy (in their respective sports) and they would not require to continuously use working memory capacity in order to update the initial plan (Daniels & Newell, 2003; Englert, 2017; Evans et al., 2016). Moreover, athletes involved in self-paced sports might have better inhibitory control (Jacobson & Matthaeus, 2014b), and hence they would be able to inhibit thoughts unrelated to exercise performance, allowing them to invest more resources or to focus on other relevant aspects of self-paced exercise (i.e., using an associative strategy). However, this issue remains speculative, as studies which aimed to investigate the cognitive/neural factors related to experts and novices only provide a snapshot of the two endpoints of a continuum (Debarnot et al., 2014). Furthermore, although elite and non-elite athletes might differ in key cognitive processing, little is known of the psychological characteristics of elite performance (Spindler, Allen, Vella, & Swann, 2018).

6. Perspective

The present review identifies some gaps in the literature about the role of executive functions in self-paced exercise. The literature from sports science hypothesizes that the prefrontal cortex plays a key role in exercise, because when exercise intensity increases, brain activity in prefrontal areas increases progressively until the ventilatory threshold; upon reaching this point, prefrontal activity appears to decrease (Robertson & Marino, 2015, 2016). This reduction has been hypothesized to reflect a reduced role of prefrontal areas in sustaining goal-directed behaviour, and in particular in pacing one's activity when performing high intensities exercises (Robertson & Marino, 2016). However, this is a naïve and simplistic vision of brain function, since interpreting any prefrontal cortex involvement is further complicated by the recurrent finding in cognitive neuroscience that prefrontal activity tends to diminish as participants becomes expert at the performed skills. Therefore, rather than a single brain area or determinant cognitive function having a key role on exercise regulation, it exists a interconnectivity and overlapping between different areas and cognitive functions which optimize the process of exercise regulation.

It is fundamental to reaffirm at this point that self-paced aerobic exercise is likely to be a highly complex process, in which a multitude of factors non-related to executive functions can also contribute to the ultimate decision to upregulate or downregulate exercise intensity. Other brain areas via different mechanisms have a role on exercise regulation. For example, brain areas related to interoceptive and motivational process (e.g., the insula and anterior cingulate cortex) are linked to exercise regulation. On the one hand, enhanced interoception (which entails the processing of body signals) in experience athletes might give rise to a better perception of internal cues from peripheral body systems (e.g., muscular and cardiopulmonary (Faull, Cox, & Pattinson, 2018)). This implies that interoceptive abilities might facilitate self-paced exercise regulation and to better tolerate fatigue. On the other hand, highly motivated athletes might perceive temptations of stopping exercise as less salient stimulus, which makes goal progress smoother (Taylor, Boat, & Murphy, 2018). This view implies that motivated athletes will see performance-related discomfort as a less prominent barrier to successful performance, relative to athletes less motivated or with less experience to assess these salient, negative stimuli.

In relation to the role of the cognitive load during exercise, a key point to consider is the task characteristics. For example, we consider crucial to include (at least) two conditions with different levels of cognitive load to guarantee that any effect on exercise performance is a consequence of the cognitive load and not due to the effect of performing a single task compared to dual-tasking. Moreover, the presence of a single task condition without cognitive activity may result in a change in participants' focus of attention, which in turn it might even be more mentally demanding. Furthermore, the duration and difficulty of the cognitive task and exercise should be considered according to the expertise on the physical test performed by participants. For instance, an athlete might self-regulate correctly for a 5km race, but not for a marathon race even if she/he had a high level of fitness. In summary, self-paced exercise is a goal-directed behaviour that has been related to both bottom-up and top-down processing. As such, self-paced exercise might be seen as an effortful cognitive task involving body motion that places high demands on several brain areas related to emotional, motivational, interoception and executive processing. Athletes with high level of proficiency or expertise are likely to process these brain signals in a different way than less experienced athletes, but only if it is related to its field of expertise (i.e., being a good at self-pacing in running do not guarantee being good at cycling). Therefore, when we aim to study the mechanisms of self-paced exercise regulation in future studies, we should consider the level of expertise (as well as the other factors mentioned in this review) for determining the effect of these intervention which we have described in this review and for determining which brain areas have a role of exercise regulation.

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