Peripheral-physiological and neural correlates of flow experience while playing video games: A comprehensive review

Shiva Khoshnoud ^{Corresp., 1}, Federico Alvarez Igarzábal ¹, Marc Wittmann ¹

¹ Institute for Frontier Areas of Psychology and Mental Health, Freiburg, Germany

Corresponding Author: Shiva Khoshnoud Email address: khoshnoud@igpp.de

The flow state is defined by intense involvement in an activity with high degrees of concentration and focused attention, and accompanied by a sense of pleasure. Video games are effective tools for inducing flow, and keeping players in this state is considered to be one of the central goals of game design. Many studies have focused on the underlying physiological and neural mechanisms of flow. Results are inconsistent when describing a unified mechanism underling this mental state. This paper provides a comprehensive review of the physiological and neural correlates of flow and offers an explanation of the relationship between the reported physiological and the neural markers of flow experience. Despite the heterogeneous results, it seems possible to establish associations between reported markers and cognitive and experiential aspects of flow, particularly regarding arousal, attention control, reward processing, automaticity, and self-referential processing.

- 1 Peripheral-physiological and neural correlates of flow
- ² experience while playing video games: a
- **3 comprehensive review**

4	
5	
6	Shiva Khoshnoud ^{1*} , Federico Alvarez Igarzábal ¹ , Marc Wittmann ¹
7	¹ Institute for Frontier Areas of Psychology and Mental Health, Freiburg, Germany
8	
9	
10	
11	
12	Corresponding Author:
13	Shiva Khoshnoud ¹
14	Wilhelm str. 3a, Freiburg, 79098, Germany
15	Email address: <u>khoshnoud@igpp.de</u>
16	
17	
18	
19	
20	
21	
22	
23	

24 Abstract

- 25 The flow state is defined by intense involvement in an activity with high degrees of
- 26 concentration and focused attention, and accompanied by a sense of pleasure. Video games are
- 27 effective tools for inducing flow, and keeping players in this state is considered to be one of the
- 28 central goals of game design. Many studies have focused on the underlying physiological and
- 29 neural mechanisms of flow. Results are inconsistent when describing a unified mechanism
- 30 underling this mental state. This paper provides a comprehensive review of the physiological and
- neural correlates of flow and offers an explanation of the relationship between the reported
- 32 physiological and the neural markers of flow experience. Despite the heterogeneous results, it
- 33 seems possible to establish associations between reported markers and cognitive and experiential
- 34 aspects of flow, particularly regarding arousal, attention control, reward processing,
- 35 automaticity, and self-referential processing.

36 Introduction

- 37 What makes everyday experiences genuinely satisfying? Why do we seek activities that make us
- 38 happy? Csikszentmihalyi (1975) introduced the concept of "flow" or "being in the zone" as an
- 39 optimal state in which complete absorption in an activity is reached and is accompanied by a
- 40 sense of enjoyment stemming from intrinsic motivation for that activity. During this state,
- 41 termed processing fluency, i.e. the ease with which information is processed, actions seem to
- 42 happen effortlessly, fluently, and almost automatically. According to this theory, the clearest
- 43 sign of flow is the merging of action and awareness in a way that "a person in flow is aware of
- his actions but not of the awareness itself" (Csikszentmihalyi, 1975, pp 38).Paradigmatic
- 45 examples of flow-inducing activities include the artist who is completely immersed in the
- 46 activity of creating a work of art or playing an instrument and the athlete or game player who
- 47 follows clear goals and perceives a match between demands and skills. The following factors
- 48 enable the flow experience, which in combination create a deep sense of enjoyment
- 49 (Csikszentmihalyi, 1975, 1990; Jackson & Eklund, 2004): 1) The balance between the level of
- skill and the challenges of the task, 2) clear goals of the activity, 3) clear immediate feedback of
- action results, 4) merging of action and awareness, 5) high concentration, 6) sense of control
- 52 over the activity, 7) loss of self-awareness, 8) loss of the sense of time, and 9) autotelic
- 53 experience.
- 54 Among the nine key dimensions of flow, the first three (balance between skills and challenges,
- 55 clear goals and immediate feedback) are antecedents or preconditions for flow, and the
- 56 remaining six items as components or characteristics of this subjective state. Optimal skill-
- 57 challenge balance is considered the main antecedent which facilitates entering in to the flow state
- 58 (Csikszentmihalyi & Csikszentmihalyi, 1992; Engeser & Rheinberg, 2008; Fong, Zaleski, &
- 59 Leach, 2015; Keller & Blomann, 2008). Whenever the challenge level of the activity outweighs
- 60 the skill level of the person performing it, the person will become frustrated and anxious. In
- 61 contrast, if the challenge level is lower than the skill level, the person will become bored (the

62 flow channel model; Csikszentmihalyi, 1975, 1990). Although skill-challenge balance is a perquisite for the flow experience, one should consider that it does not guarantee entering into 63 the flow state. Fong et al. (2015) showed that additional variables such as age, cultural 64 characteristics, domain of application (leisure or work/education contexts), and methodology 65 66 (how the skill-challenge balance has been evaluated) may distinctively influence the relationship between flow and skill-challenge balance. Engeser & Rheinberg (2008) showed that in important 67 activities flow was still high even when the demand was low. The moderating impact of 68 personality characteristics, such as action-state orientation, was investigated and it was revealed 69 that individuals with a strong habitual action orientation are more sensitive to modulations of the 70 71 skill-challenge balance (Keller & Bless, 2008). The likelihood of the ensuing flow experience 72 can also be altered by personality factors. A study by Ullén and colleagues reported a negative 73 correlation between flow proneness (understood as the individual propensity to experience flow) 74 and neuroticism (Ullén et al., 2012). De Manzano et al. (2013) suggested that lower trait 75 impulsivity could facilitate the propensity to experience flow. Flow and performance also seem to be closely related (Csikszentmihalyi, Abuhamdeh, & Nakamura, 2005; Engeser & Rheinberg, 76 2008; Jin, 2012; Keller & Bless, 2008; Landhäußer & Keller, 2012). High performance levels are 77 typically expected during the experience of flow, since frustration and boredom would lead to 78 diminished concentration and consequently to a poor performance. It is still unclear whether flow 79 influences performance or vice versa (De Kock, 2014; Landhäußer & Keller, 2012). Engeser and 80 Rheinberg (2008) found that the flow experience led to improved performance in participants 81 82 who played the game Pac-Man at three difficulty levels, while Jin (2012) reported that 83 successful performance resulted in a greater flow experience in participants who played the 84 games Call of Duty: world at war and Trauma Center: New Blood. 85 The concept of flow was initially investigated using the Experience Sampling Method (ESM) in naturalistic contexts (Csikszentmihalyi & Csikszentmihalyi, 1992). This method involves 86 signaling participants at random moments throughout the day and asking them questions about 87 the nature and quality of their experience (Csikszentmihalyi & Larson, 1983). Later studies 88 optimized the ESM and designed new questionnaires to evaluate the flow experience. Some of 89 90 these are the Flow State Scale (FSS, Jackson & Marsh, 1996) specific for the context of sports, the Flow Short Scale (FKS, Rheinberg & Vollmeyer, 2003) developed for different fields of 91 92 activity, the flow subscale of the game experience questionnaire (GEQ, IJsselsteijn, De Kort, 93 Poels, Jurgelionis, & Bellotti, 2007) designed for evaluation of the subjective gaming experience, 94 the virtual-course flow measure (Shin, 2006) developed for the context of online learning, the 95 flow state scale for occupational tasks (Yoshida et al., 2013), and the work related flow inventory (WOLF, Bakker, 2008) specific aimed at measuring the flow of employees. However, 96 97 assessment of the flow experience with these retrospective questionnaires interrupts the ongoing

- activity and probably disrupts the flow experience. Utilizing these self-reported post-task
- 99 questionnaires cannot provide information about characteristics of this experience like mean
- 100 duration or depth of flow either. Hence, it is very important to find non-disruptive objective
- 101 measures to evaluate the flow experience continuously. One way to assess this experience

102 without interrupting it is to find neural and electrophysiological correlates of this state, which in

103 turn might help to better understand the underlying physiological mechanisms.

Considering the easy establishment of game-based, flow-inducing paradigms in the laboratory, 104 video games are one of the best tools to elicit this experience. Games offer challenging tasks that 105 106 require training skills and provide clear goals, as well as immediate feedback (Alvarez Igarzábal, 107 2019; Salen & Zimmerman, 2003). An important driver of enjoyment in games comes from effectance motivation, a term coined by Nacke (2012), which is the feeling of empowerment in 108 players when they see the impact of their actions. This feeling of empowerment can be 109 110 experienced when the game's challenge matches the player's skills and goals and immediate feedback is provided. Inducing flow states under controlled laboratory conditions has been 111 112 considered difficult. The most popular experimental approach used for inducing flow is 113 manipulating the difficulty level of games to achieve the necessary skill-challenge balance. This 114 can be achieved either through the dynamic matching of the game's difficulty level to the player's skill level (Keller & Bless, 2008; Rheinberg & Vollmeyer, 2003) or by pre-testing the 115 participants' skills to individually assign appropriate matching challenge levels in the game 116 117 (Moller, Csikszentmihalyi, Nakamura, & Deci, 2007). This can in turn help to contrast three 118 experimental conditions of easy, optimal, and overwhelming. Using a self-selected level of difficulty (autonomy) is also suggested to be an important determinant of flow (De Sampaio 119 Barros et al., 2018; Moller, Meier, & Wall, 2010). Immersion - another mental state explored in 120 some studies – was described as the gradual process of transporting the player's mind into the 121 122 virtual world which is linked to factors like graphics, sound and gameplay (Nacke & Lindley, 123 2008, 2010). Despite similarities, immersion presents subtle structural differences from flow (Michailidis, Balaguer-Ballester, & He, 2018) and will not be explored in this review. Rheinberg 124 125 and Vollmeyer (2003) evaluated the impact of modulating the task difficulty on flow experience in two different video games: Roboguard and Pac-Man. The highest level of flow was reported 126 127 following those trials when the game's difficulty was set to a medium level (flow) rather than to a low (boredom) or high (anxiety) level. For the sake of consistency, given that different studies 128 label conditions in different ways, in the following we will refer to the overwhelming and easy 129 conditions as the "anxiety" and "boredom" respectively, and to the optimal condition as "flow." 130

The flow state is an experiential feature of altered states of consciousness which can lead to a 131 diminished sense of self and time (Wittmann 2015, 2018). Video games specifically making time 132 fly in a pleasant way which is one of the main aspects of the flow experience (Bisson, Tobin, & 133 Grondin, 2012; Tobin, Bisson, & Grondin, 2010). Distortions in the notions of the self and time 134 135 have been reported in many patient groups with psychiatric disorders (Khoshnoud, Shamsi, 136 Nazari, & Makeig, 2017; Vogel et al., 2019; Vogel, Krämer, Schoofs, Kupke, & Vogeley, 2018). The sense of self and time is overly represented in individuals with anxiety and depression, who 137 are stuck with themselves in time, feeling states that are the complete opposite of flow 138 139 (Liknaitzky, 2017). Inducing flow states in these individuals could potentially lower symptoms

140 of anxiety and depression. A study with the video game Boson X reported that playing it for six

141 weeks reduced self-rumination and enhanced cognitive capacities in individuals with depression

- 142 (Kühn, Berna, Lüdtke, Gallinat, & Moritz, 2018). The induction of flow states has been shown to
- 143 alter the sense of time (Sinnett, Jäger, Singer, & Antonini Philippe, 2020). By measuring flow
- 144 levels and temporal processing ability (through a temporal order judgment task, TOJ), Sinnett
- and colleagues identified that the higher the subjective flow experience of the sport or music
- 146 performance, the better the participant performed in the post- performance TOJ task compared to
- the pre-performance TOJ task. Considering the beneficial nature of flow on psychiatric
 symptoms, creating a flow experience might be a helpful remedy in clinical psychology¹.
- 149 Since flow is an enjoyable mental state, keeping the player in a flow state is considered to be one
- 150 of the most important goals for game designers (Chen, 2006; Salen & Zimmerman, 2003;
- 151 Schell, 2008). To address this, game designers and researchers attempt to maintain the player's
- 152 flow state through affect-based, dynamic difficulty-adjustment (DDA) techniques (Afergan et al.,
- 153 2014; Liu, Agrawal, Sarkar, & Chen, 2009; Park, Sim, & Lee, 2014). Finding neural and
- 154 electrophysiological indicators of this optimal mental state, which are objective and can be
- 155 measured without interrupting the experience, could enhance the dynamic difficulty adjustment.
- 156 Apart from these internal correlates, another promising approach would be the application of
- 157 techniques that indirectly measure the extent to which subjects experience flow by assessing
- 158 their levels of attention engagement. Here we provide an overview of all findings concerning the
- 159 physiological and neural correlates of the flow experience. To our knowledge, this is the first
- 160 review that combines physiological and neural correlates of flow in the context of video games.
- 161 Harris et al. (2017) conducted a review on neurocognitive mechanisms of flow with more
- 162 emphasis on sports as well as the role of attention suggesting attentional changes as the
- 163 fundamental mechanism for creation of flow state. However, in their review, the rule of
- 164 physiological arousal was not discussed in detail. In a recent systematic review conducted by
- 165 Knierim et al. (2018), only peripheral nervous system indicators of flow were explored in a
- broad range of tasks identifying increased level of arousal as a central approach to the
- 167 physiological measurement of flow. We believe that this paper makes a key contribution to the
- 168 field of flow in the context of video games by considering reflections of flow in the central and 169 peripheral nervous systems and integrating key physiological and neural mechanisms of the flow
- 169 peripheral nervous systems and integrating key physiological and neural mechanisms of the flor
- 170 experience. Based on the results of the reviewed studies, we make suggestions on how to
- 171 disentangle the internal phenomenon of flow from the external characteristics of the task.

172 Survey methodology

- 173 In this review, relevant academic articles were located in the Web of science and PubMed
- 174 databases using search term: [(flow OR absorption) AND (physiological OR electrophysiological

¹ This is the approach in the EU-funded project VIRTUALTIMES - Exploring and modifying the sense of time in virtual environments with the principal investigators Kai Vogeley (Cologne), Anne Giersch (Strasbourg), Marc Erich Latoschik, Jean-Luc Lugrin (Würzburg), Giulio Jacucci, Niklas Ravaja (Helsinki), and Xavier Palomer, Xavier Oromi (Barcelona).

- 175 OR neurophysiology OR brain activity OR neural activity) AND (game OR video game OR
- ameplay)]. This search provided a total of 215 citations. After removing duplicates, the set of
- 177 55 articles comprising of peer reviewed, empirical studies with the focus of physiological and
- 178 neural phenomenon of flow experience during playing video games without a-priori, publication
- 179 date restriction have been selected. By scanning the references listed in the body of literature
- 180 found in the initial search, additional 18 studies were identified. In a further attempt by applying
- the inclusion criteria to the full text of manuscripts, 35 articles including research with
- 182 exergames or multiplayer games are excluded, as they introduce other confounding factors.
- 183 Overall the set of 38 articles included in the review were presented in two sections: peripheral-
- 184 physiological and neural correlates of flow.

185 Peripheral-physiological correlates of flow

Before introducing the empirical work, however, it is first necessary to discuss the theoretical 186 187 background of peripheral-physiological correlates of flow. During the flow state, feelings of enjoyment along with high levels of concentration and focused attention are indicative of the 188 involvement of the emotional and attentional systems of the brain. Based on this line of thought, 189 several hypotheses have been proposed, which we will discuss in the following sections. First, 190 the experimental approach by Kivikangas, (2006) defined the flow experience as a state of 191 192 positive valence and heightened arousal. Later, de Manzano and colleagues described the physiology of flow as a combination of positive valence, heightened arousal, and effortless 193 attention that arises through the interaction between positive affect and focused attention (de 194 195 Manzano, Theorell, Harmat, & Ullén, 2010; Ullén, de Manzano, Theorell, & Harmat, 2010). 196 According to this hypothesis, flow is associated with parasympathetic modulation of the sympathetic branch of the autonomic nervous system (ANS). Ullén et al. (2010) argued that this 197 co-activation of the sympathetic nervous system (SNS) and the parasympathetic nervous system 198 (PNS) acts as a physiological coping mechanism for high demands of attention and can 199 distinguish between states of effortful and effortless attention. In contrast to effortless attention, 200 201 typical of the flow experience, some researchers postulated that a high degree of involvement along with the challenging nature of the task might result in greater mental effort (Keller, Bless, 202 Blomann, & Kleinböhl, 2011). Finally, by combining the stress-model with the flow-model, 203 Peifer et al. (2014) argued that the experience of flow induces a certain amount of stress (more 204 205 precisely, challenge) accompanied by heightened physiological arousal as indicated by increased activation of the SNS (fast reacting) and the hypothalamic-pituitary-adrenal (HPA) axis (slow 206 reacting). They suggested an inverted U-shaped relationship between flow experience and 207 208 physiological arousal, with a moderate arousal level during flow and lower and higher levels of 209 arousal for the boredom and anxiety conditions, respectively. Reported negative effects of exogenous cortisol dosage on experienced flow supports their recent proposition of an inverted 210 u-shaped relationship between cortisol and flow (Peifer, Schächinger, Engeser, & Antoni, 2015). 211 Empirical studies in this field (see Table 1) are presented in the following section. However, 212

- 213 inconsistent results during flow state show that the relationship between flow experience,
- arousal, and mental effort is highly dependent on the task.
- 215 ** INSERT TABLE 1 HERE **

216 Positive valence and heightened physiological arousal

217 One of the first studies that investigated correlations between valence, arousal, and flow was

- 218 conducted by Kivikangas (2006). The study assessed the participants' facial electromyographic
- (EMG) activity as an index of emotional valence (Lang, Greenwald, Bradley, & Hamm, 1993;
 Larsen, Berntson, Poehlmann, Ito, & Cacioppo, 2008) and electrodermal activity (EDA) as a
- sensitive measure of arousal (Boucsein, 2012) while they played the science-fiction computer
- 222 game *Halo: Combat Evolved*. The activity of corrugator supercilii muscle (CS, "frowning
- 223 muscle"), an index of negative valence, was negatively associated with the flow scores assessed
- by the FSS questionnaire, showing decreased negative valence during the experience of flow. No
- significant effects for the zygomaticus major (ZM, "smiling muscle") and orbicularis oculi (OO,
- 226 "eyelid muscle") muscle activities- indices of positive valence nor for EDA were found.
- 227 Chanel et al. (2008) employed physiological measures including cardiovascular activity and
- EDA to determine the three emotional states of boredom, flow, and anxiety, by modulating the
- 229 difficulty of the game Tetris. Cardiovascular activity is reflective of ANS activity, with heart rate
- 230 (HR) being stimulated by SNS and inhibited by PNS activity (Shaffer & Ginsberg, 2017). The
- behavioral results demonstrated that participants felt the highest positive valence and had a
- 232 medium arousal level in the flow condition in contrast to the boredom and the anxiety conditions.
- 233 Electrophysiological measures showed heightened arousal level as difficulty of the game
- 234 increased identified by increase in EDA, as well as increase in HR (increased SNS activity).
- 235 Utilizing a modified version of the first-person shooter (FPS) game *Half-Life 2* with specifically-
- designed levels, Nacke and Lindley (2008) assessed immersion along with boredom and flow by
- addressing their correlations with objective electrophysiological measures. The significantly
- highest mean ZM muscle activity and EDA values resulted during the flow game level.
- However, the flow experience was not evaluated by any questionnaire and it is not clear whether
- 240 participants experienced flow in the flow condition of the game. In a correlational study
- employing three FPS games, no significant correlation was reported between EDA activity and
- flow scores assessed by the flow dimension of the GEQ, while HR was reported to negatively
- 243 correlate with flow (Drachen, Nacke, Yannakakis, & Pedersen, 2010).
- Bian et al. (2016) presented a physiological evaluation model for the state of flow in the virtual
- reality (VR) game *Air Bombardment*. In contrast to the findings of the study by Nacke and
- Lindley, (2008), the authors reported no correlations between ZM activity and flow scores as
- 247 assessed by the FKS questionnaire (Bian et al., 2016). Using a mental arithmetic task, a study by
- 248 Ulrich and colleagues found an inverse U-shaped pattern for EDA with significantly greater
- values during the flow condition than during the boredom and anxiety conditions, highlighting

- 250 higher arousal levels during the experience of flow (Ulrich, Keller, & Grön, 2016). EDA was
- also assessed during playing *Blocmania 3D* game with three difficulty levels corresponding to
- boredom, flow, and anxiety (Tian et al., 2017). Difficulty manipulation was assessed with the
- 253 FSS questionnaire and the highest flow state which was reported during the flow condition of the
- game was associated with moderate EDA activity, which reflects moderate sympathetic arousal.
- 255 In a single case-study, Moreno et al.(2020) reported that a flow-like state in an expert gamer
- during playing the puzzle game *Portal*, coincided with increased EDA. It should be consideredthat in their study physiological assessment was conducted not during the moments of flow but
- that in their study physiological assessment was conducted not during the moments of flow b
- when individuals were goal-oriented during gameplay.

259 Co-activation of sympathetic and parasympathetic nervous system

Findings regarding the relation between the flow state and ANS are mixed, as both sympathetic 260 261 and parasympathetic activities have been shown to correlate with flow, both in combination and alone. De Manzano et al. (2010) argued that the flow state experienced while playing piano is 262 linked to increased parasympathetic modulation of sympathetic activity. Their study showed that 263 the flow reports of the players (as assessed by the FSS questionnaire) correlated with a decreased 264 heart period (HP, increased SNS activity), decreased heart rate variability (HRV, fluctuations in 265 266 the time intervals of adjacent heartbeats and an index of parasympathetic activity (Laborde, Mosley, & Thayer, 2017)), an increased LF/HF ratio (low frequency HRV/high frequency HRV, 267 reflecting autonomic balance between SNS and PNS), and larger respiratory depth (RD, 268 increased PNS activity) (de Manzano et al., 2010). Chanel et al. (2011), in contrast, reported less 269 270 low frequency heart rate variability (LF-HRV) power during the experience of flow compared to boredom and anxiety while playing *Tetris*. In a computerized knowledge task, with the three 271 levels of boredom, flow, and anxiety, Keller et al. (2011) reported lower HRV during the flow 272 condition as compared to boredom and anxiety, indicating lower parasympathetic activity. A 273 more detailed assessment of cardiovascular and respiratory responses was performed by Harmat 274 275 et al. (2015) during trials of *Tetris* gameplay in three conditions: boredom, flow, and anxiety. The flow condition was characterized by the highest levels of flow measured by the FSS 276 questionnaire, positive affect, and effortless attention. More flow was associated with larger 277 278 respiratory depth (reflecting increased parasympathetic activity) and lower LF-HRV (reflecting 279 both sympathetic and parasympathetic influences). Given the lack of a significant relation 280 between HF-HRV (high-frequency HRV, a direct measure of parasympathetic activation) and flow, their results could not clearly support the hypothesis that the flow state is linked to 281 activation of sympathetic, as well as to the parasympathetic nervous system (Harmat et al., 282 283 2015). Tian and colleagues (2017) also reported moderate HR and HRV along with increased 284 RD during the flow condition of playing the game, suggesting increased parasympathetic modulation of sympathetic activity during flow experience. In a FPS game called Unreal 285 Tournament 2004, lower HF-HRV was reported in players playing the game during the flow 286 287 condition compared to boredom and anxiety conditions (Kozhevnikov, Li, Wong, Obana, & Amihai, 2018). Given the lack of significant change in the LF-HRV values, authors argued that 288

- this pattern of reduction in parasympathetic activity is critical for reaching flow. Nonetheless, the
- flow experience was not assessed directly in their investigation and it is not clear whether
- subjects felt higher flow while playing the game during the flow condition as compared to the
- 292 other two conditions.
- 293 It is important to note that both HRV and HF-HRV are considered as sensitive indices of
- parasympathetic activity (Laborde et al., 2017; Malik et al., 1996; Shaffer & Ginsberg, 2017)
- which is reported to be causally involved in flow experience (Colzato, Wolters, & Peifer, 2018).
- 296 Nonetheless, the interpretation of LF-HRV is controversial, since it is considered as a marker of
- sympathetic modulation (Kamath MV, 1993), and both sympathetic and vagal influences
- 298 (Laborde et al., 2017; Malik et al., 1996; Shaffer & Ginsberg, 2017). A comprehensive literature
- review conducted by Reyes del Paso et al. (2013) challenged this interpretation that the LF and
- 300 LF/HF ratio reflect sympathetic activity and autonomic balance, respectively, and suggested that
- the LF component of HRV is mainly determined by the parasympathetic system.

302 Effortless or effortful attention

303 According to Ullén et al. (2010), the co-activation of SNS and PNS results from the interaction

- between positive affect and high attention, which leads to a state of effortless attention.
- 305 Nevertheless, the flow experience is characterized by heightened concentration and high degree
- 306 of attention. Specific patterns of activity like increased heart rate, decreased HRV, shallow
- 307 respiration, and increased facial EMG activity are signs of mental effort (Aasman, Mulder, &
- 308 Mulder, 1987; Backs & Seljos, 1994; Veltman & Gaillard, 1998; Waterink & van Boxtel, 1994), 309 which are distinctive from the observed results in studies concerned with flow. In contrast to the
- 310 idea of effortless attention, Keller et al. (2011) linked reduced HRV to increased mental effort
- 311 during the experience of flow in a computerized knowledge task. During simulation-based
- 312 training on the use of *enterprise resource planning software* with the three levels of boredom,
- 313 flow, and anxiety, Léger et al. (2014) reported less mental effort during the flow situation.
- 314 According to their results, participants who exhibited smaller variations in the EDA level (i.e.
- being more emotionally stable), lower HR, and higher HRV (indicative of less mental effort)
- were reported to be more likely to experience a cognitively absorbed state. Similarly, Peifer et al.
- 317 (2014) reported a positive linear relationship between HRV values (HF-HRV) and flow
- 318 experience in a computer task (Cabin Air Management System simulation). The participants'
- 319 stress level was manipulated via the Trier Social Stress Test (TSST) before they performed the
- task. After the task, their flow experience was evaluated with the FKS questionnaire. Flow was
- associated to increased HF-HRV and a decrease in mental effort. These results contradicted the
- findings by Keller and colleagues (Keller et al., 2011), who found a negative relationship
- between flow and parasympathetic activity. Apart from the small number of participants inKeller's study, these differences showed that during a difficult level of a computerized
- 325 knowledge task or game, participants are not likely to perceive as much stress and threat as they
- might experience during the TSST, which is designed to create considerable social anxiety.

- 327 Keller's study did not evaluate the correlation between physiological measures and the
- 328 experienced level of flow. Instead, the flow experience corresponded to the skill-challenge
- 329 balance condition.

330 Harris et al. (2016) explored whether concentration during flow is related to objective indices of 331 effortful attention processing in a simulated car-racing task with the three standard levels of 332 difficulty, namely boredom, flow, and anxiety. The FKS questionnaire was used for experimental 333 manipulation check. The authors reported significantly higher flow scores for the flow condition 334 of the game. The observed higher mental effort (lower HRV) and more focused attention (more 335 focused eye gaze) along with less self-reported subjective effort in the flow condition than in the anxiety condition suggested that the experience of flow is based on an efficient, but effortful, 336 337 engagement of attention. The link between attention and flow was examined by De Sampaio Barros et al. (2018) to see whether flow mobilizes attentional resources while playing two video 338 339 games, *Tetris* and *Pong*. In this case, the authors added an "autonomy" condition to the traditional boredom, flow, and anxiety. The authors argued that this capacity to determine the 340 difficulty level is an important factor for experiencing flow. However, the flow scores measured 341 342 by the FKS questionnaire in the flow (pre-selected) and autonomy (self-selected) conditions were 343 similar, albeit greater than in the boredom and anxiety conditions. HR significantly increased

- 344 with task difficulty, and HRV was lower during the autonomy level than during the other
- 345 conditions for both games, suggesting higher mental effort during autonomy.

346 Inverted U-shaped relationship between flow and activity of the stress system

- 347 A number of studies on the physiology of flow found associations between flow and
- 348 physiological activation of the stress system. Keller and colleagues (2011) reported that a state of
- 349 flow while playing a game involves high levels of tension reflected by higher salivary cortisol
- levels (increased HPA-axis activation). In the second experiment, the authors utilized *Tetris* in
 three conditions of boredom, flow, and anxiety to see whether strong involvement during the
- 352 flow experience is associated with increased salivary cortisol levels in the participants. Higher
- 353 cortisol levels were reported for the flow and anxiety conditions. By combining the stress-model
- with the flow-model, Peifer et al. (2014) suggested an inverted U-shaped curve between LF-
- 355 HRV and cortisol level on one hand; and the flow experience assessed by FKS questionnaire on
- 356 the other hand revealing moderate LF-HRV and cortisol levels in flow and low and high LF-
- 357 HRV and cortisol values during boredom and anxiety, respectively.
- 358 The functional association between HRV factors (LF-HRV and HF-HRV) and flow (measured
- 359 by the FKS questionnaire) was also assessed during a driving-simulation game (Tozman,
- 360 Magdas, MacDougall, & Vollmeyer, 2015). The task used was a driving simulator chosen from
- 361 the sporting-race, video-game package *Rfactor* with three fixed levels of difficulty representing
- 362 boredom, flow, and anxiety. An increase in task difficulty caused a decrease in the HF-HRV and
- 363 LF-HRV components. In contrast to the findings by Peifer et al. (2014), which showed an

inverted U-shaped relation between flow and HRV measures, there was a negative linear

- 365 connection between LF-HRV and flow when the conditions for flow were met (flow condition)
- and an inverted U-shaped relation between LF-HRV and HF-HRV, on the one hand, and flow,
- 367 on the other hand, when demands exceeded the skill level (anxiety condition) (Tozman et al.,
- 368 2015). In a VR game, Bian et al. (2016) reported similar results to the previous studies showing
- that increased HR, HRV, and respiratory rate (RR), as well as shorter inter-beat intervals (IBI),
 predict an increase in flow score assesses by the FKS questionnaire. An inverted U-shaped
- 370 predict an increase in now score assesses by the FKS questionnane. An inverted 0-shaped
 371 function between LF-HRV and HF-HRV, on the one hand, and flow on the other hand, was also
- 372 reported, highlighting moderate LF-and HF-HRV levels for high flow scores and both low and
- 372 reported, inginighting indefate L1 and III Tite viewers for high now scores and both low and 373 high values of LF- and HF-HRV for low-flow scores. The authors stated that the physiological
- 374 aspects of flow in VR games might be particularly affected by the VR environment (Bian et al.,
- 375 2016).

376 Neural correlates of flow states

377 There is still considerable conceptual ambiguity concerning the possible brain mechanisms

- involved in the flow experience. Here we are going to discuss the main hypotheses established in
- the literature. Given the effortlessness and automatic characteristics of flow, Dietrich (2004)
- argued that such an optimal performance state is controlled through an implicit rather than an
- 381 explicit information-processing system in the brain. The explicit system, which is associated with
- higher-order cognitive functions, is rule-based, can be verbalized, is connected to conscious
- awareness, and is supported by frontal-lobe activation. In contrast, the implicit system is skill based, cannot be verbalized, is inaccessible to conscious awareness, and is supported primarily
- based, calliot be verbalized, is inaccessible to conscious awareness, and is supported primary 385 by the basal ganglia. Dietrich proposed that inhibition of the explicit system and transient
- 386 hypofrontality is a necessary prerequisite for the experience of flow (Dietrich, 2004). The
- 387 synchronization theory of flow proposed by Weber et al. (2009) specifies neuropsychological
- 388 processes of the flow experience considering that it is characterized by intense concentration and
- **389** an autotelic activity. This theory is based on Posner's tripartite theory of attention involving
- 390 executive, alerting, and orienting networks (Posner, Inhoff, Friedrich, & Cohen, 1987).
- 391 Accordingly, the optimal and gratifying experience of flow results from synchronized activity of
- the attentional and reward networks under the balanced skill-challenge condition (Weber et al.,
- **393** 2009).
- 394 Csikszentmihalyi (1975) described the flow experience as "self-forgetfulness" or "loss of self-
- 395 consciousness," highlighting the fact that, when the demands of the activity require the allocation
- 396 of all attentional resources, attention is directed away from the self. Loss of self-awareness, as
- 397 one of the important components of flow, sheds light on another interesting line of research that
- investigated default mode networks (DMN) activity during the flow experience (Sadlo, 2016).
- 399 The activity of the DMN has been linked to self-referential thinking, and therefore declines in
- 400 task-focused and goal-directed actions (Goldberg, Harel, & Malach, 2006; Raichle et al., 2001).
- 401 During moments of flow, the activity of DMN decreases, highlighting less self-referential

402 processing (Peifer, 2012; Sadlo, 2016). Table 2 presents a set of articles exploring brain403 activation during the flow experience.

404 ** INSERT TABLE 2 HERE **

405 Transient Hypofrontality

The transient hypofrontality hypothesis proposed by Dietrich (2004) was addressed by a few 406 407 studies. Applying brain imaging techniques in a blocks of mental arithmetic task with the three 408 levels of task difficulty of boredom, flow, and anxiety. Ulrich et al. (2014, 2016) reported a relative decrease in the activity of the medial prefrontal cortex (MPFC). However, other studies 409 410 failed to further support this idea. In a functional near-infrared spectroscopy (fNIRS) study, 411 Yoshida et al. (2014) explored the activity of the prefrontal cortex (PFC) during flow while 412 playing a video game and failed to support the transient hypofrontality hypothesis. The task was performed under the two conditions of boredom and flow while playing Tetris. Flow score 413 assessed with the flow state scale for occupational tasks (Yoshida et al., 2013), was higher in the 414 flow than the boredom condition. Significantly higher activation of the left and right 415 ventrolateral prefrontal cortex (VLPFC) was reported during the last 30 seconds of flow than 416 417 throughout the entire flow condition, while the same trend was not seen during the boredom condition (Yoshida et al., 2014). Harmat et al. (2015) also failed to show an association between 418 419 flow while playing a video game and decreased activity in frontal brain regions. None of their 420 fNIRS analyses revealed associations between lower frontal cortical activation and flow, 421 suggesting that the neural substrates of flow may vary depending on the task (Harmat et al., 2015). De Sampaio Barros et al. (2018) recorded the cerebral hemodynamics of 20 volunteers 422 while they played *Tetris* and *Pong*. The flow and autonomy playing conditions not only led to 423 higher activation in the lateral PFC, but also led to higher deactivation in the MPFC compared to 424 the other conditions. 425

426 It seems that the neural signature of transient hypofrontality during flow is task dependent. In

427 tasks which need sustained attention, a deactivation of prefrontal areas seems to be unlikely.

428 Gold & Ciorciari (2019) investigated whether decreased excitability over the left dorsolateral

429 prefrontal cortex (DLPFC) and increased excitability in the right parietal cortex during gameplay

430 promotes an increased experience of flow measured by the FSS questionnaire. Transcranial

431 direct-current stimulation (tDCS, a non-invasive electrical stimulation technique that modulates

the activation of the cortical neurons under a probe electrode) was used to alter the excitability ofthe cortex. In the first experiment, they recruited trained gamers to play an FPS video game in

434 two sessions using active and sham tDCS stimulation. The second experiment was conducted

435 with untrained gamers playing *Tetris* in boredom, flow, and anxiety versions. Both trained FPS

436 and untrained *Tetris* players experienced significantly higher levels of flow after the active

437 stimulation compared to the sham condition. The authors argued that inhibiting the DLPFC and

- the disruption of explicit executive functions resulted in improved implicit information
- 439 processing and a more intense flow experience (Gold & Ciorciari, 2019).

440 Synchronization of attentional and reward networks

One of the first studies to assess the neural correlates of enjoyment during video-game play by 441 442 means of functional magnetic resonance imaging (fMRI) was conducted by Klasen and colleagues in 2008. The participants' brain activation was measured in relation to subjective 443 experience, which was assessed by having participants think aloud while they watched a replay 444 445 of their gameplay session with an FPS game (Counter-Strike: Source). Reported game pleasure was correlated with cerebro-thalamic motor-network and visual-network activity (Klasen, 446 Zvyagintsev, Weber, Mathiak, & Mathiak, 2008). In a subsequent study, Klasen et al. (2012) 447 focused on game events that contribute to the flow factors described by Csikszentmihalvi and 448 corresponding fMRI data were analyzed while participants played an FPS video game called 449 Tactical Ops: Assault on Terror. Somatosensory networks and motor areas were jointly activated 450 during flow-contributing events (Klasen et al., 2012). Authors discussed that this sensorimotor 451 activation reflects the stimulation of physical activity, suggesting deep involvement and 452 immersion in the game. The activation patterns of individual flow factors included the reward 453 454 system (putamen, caudate nucleus, and thalamus), error monitoring (anterior cingulate cortex; ACC), orbito-frontal cortex (OFC), temporal poles (TP), and motor system. Specifically, reward-455 system activation was detected during game events with a skill-challenge balance, i.e. during 456 moments when the player was able to master the challenges of the game and had a rewarding 457 458 experience. The involvement of the reward system along with motor areas in both studies was considered in line with the synchronization theory of Weber et al. (2009). Nonetheless, flow is a 459 highly subjective phenomenon, and the second study did not examine the actual flow experience, 460

- 461 but the situations with an enhanced probability of flow.
- 462 Ulrich et al.(2016, 2014) also found increased activity in the inferior frontal gyrus (IFG, an
- 463 executive attention structure) along with the left putamen (a region involved in reward
- 464 processing), the anterior insula, and posterior cortical regions in the flow condition of the mental
- 465 arithmetic task. Yoshida et al. (2014) observed a higher activation of the right and left VLPFC
- 466 during the flow condition of Tetris, which relates to reward and emotion processing in a state of
- 467 flow. Considering the involvement of VLPFC in top-down attention (Raz & Buhle, 2006), one
- 468 can interpret this as a co-activation of the attentional and reward networks during the flow
- 469 experience(Weber, Huskey, & Craighead, 2016). The results of the study by De Sampaio Barros
- 470 et al.(2018) showed a significant positive correlation between the self-reported measure of
- 471 attention and the average neural activation in the frontoparietal regions. Higher activation in the
- 472 lateral PFC was reported in the flow and autonomy playing conditions of *Tetris* and *Pong*
- 473 compared to the other conditions. In a custom-designed car game, Ju and Wallraven (2019)
- assessed the neural correlates of the flow experience with the flow subscale of the GEQ. Besides
- 475 a baseline driving condition with fixed structure, they designed three extra conditions in order to

- 476 modulate difficulty with one parameter (speed, obstacle, or tokens). Although no significant
- 477 differences in the flow subscale ratings were reported across conditions, the results of fMRI
- analysis showed positive correlations between the flow experience and brain activity in regions
- 479 related to visual (dorsal and ventral visual pathway) and spatial execution (middle and superior
- 480 temporal gyrus) as well as attentional processes (IFG, inferior and superior parietal lobule).

481 Self-referential processing

- 482 Relating existing theories of default mode networks to the feeling of selflessness during flow,
- 483 Peifer (2012) argued that the down regulation of task-irrelevant processes during the experience
- 484 of flow should lead to decreased activity in these resting state networks of the brain. First
 485 empirical evidence came from a magnetic resonance (MR)-based perfusion imaging study by
- 486 Ulrich et al. (2014), who found that a relative decrease of activity in the MPFC(an important
- 487 structure of self-referential processing), and the amygdala (AMY) accompany the experience of
- flow in a mental arithmetic task. The MPFC along with the precuneus, the amygdala, and the
- 489 posterior cingulate cortex (PCC) constitute the DMN (Raichle et al., 2001). A flow index that
- 490 was specifically computed to represent the individually experienced level of flow correlated
- 491 negatively with activity in the MPFC (less self) and the AMY. The higher the subjective
 492 experience of flow, the greater the decrease in neural activity in the MPFC and AMY. The
- 493 authors later explored the neural effects of flow experience at higher levels of temporal
- 494 resolution using an fMRI block design with blocks of activation as short as 30 seconds (Ulrich et
- al., 2016). This study yielded similar results as their previous study, with the addition of an
- 496 activation decrease in the PCC, which altogether were interpreted as deep concentration and less
- 497 self-referential processing along with less emotional arousal (reflected by down-modulation of
- 498 AMY) during the flow experience. In the flow and autonomy playing conditions of the study by
- 499 De Sampaio Barros et al. (2018), a decreased activity in the MPFC was also reported
- highlighting less self-referential processing during the experience of flow. Ju and Wallraven
 (2019) found negative correlations between the flow experience and activity in the brain regions
- 501 (2019) found negative correlations between the now experience and activity in the brain region 502 associated with the DMN in a car driving game. Authors argued that as player became more
- 503 engaged in the game, the DMN as a task-negative network became more deactivated. Also,
- 504 positive correlations between flow and activity in the insula in this study indicated less self-
- 505 awareness during moments of flow (Ju & Wallraven, 2019).
- 506 Ulrich and colleagues further explored the role of the MPFC in mediating flow experience using
- 507 tDCS technique to interfere with the MPFC's activation level by the modulation of cortical
- 508 excitability (Ulrich et al., 2018). During the above-mentioned mental arithmetic task, current
- 509 stimulation was applied over the frontal-central (Fpz) scalp position with three modulation types:
- 510 anodal (increase neuronal excitability), cathodal (decrease neuronal excitability), and sham
- 511 (baseline). Flow experience was assessed along with the implementation of (MR)-based
- 512 perfusion imaging while participants performed the task at three difficulty levels (boredom, flow,
- 513 and anxiety). There was no significant difference among stimulation types (sham, anodal, and

- 514 cathodal tDCS) and the measured flow index across all subjects. After splitting the subjects into
- 515 two groups based on the flow index in the sham condition (lower-flow and higher-flow), a
- 516 significant increase in the flow index in the lower-flow group under anodal tDCS stimulation
- 517 was reported. Correspondingly, anodal tDCS elicited a significantly stronger deactivation of the
- right AMY in this group compared to the higher-flow group (Ulrich et al., 2018).

519 Neural oscillations and flow

- 520 Nacke & Lindley (2010) proposed an affective ludology context referring to investigations of
- 521 affective player-game interaction. To address this issue, some studies have explored how the
- 522 information of electroencephalogram (EEG, assessment of cortical activity of the brain through
- electrodes placed on the scalp) signals can differentiate emotions from cognitive activity during
- 524 gameplay. Specific neural oscillations in four frequency bands of EEG (delta, theta, alpha, and
- beta) were investigated as underlying neurophysiological mechanisms of the experience of flow
- 526 (see Table 3). Nevertheless, studies were mostly explorative without specific background theory.
- 527 Some studies examined if verbal-analytic processing is reduced during flow, following the
- 528 notion of peak performance and automaticity characteristics of the flow experience (specifically
- 529 in motor responses in athletes) (Harris et al., 2017; Kramer, 2007; Wolf et al., 2015). Temporal
- alpha asymmetry has been shown to relate to peak performance, especially in athletes (Kerick,
- 531 Douglass, & Hatfield, 2004). According to Vernon (2005), higher left temporal cortex alpha
- activity (decreased cortical activity in this region), which is associated with improved
- 533 performance, represented reduced internal verbalizations and increased visual-spatial processing
- 534 (which is associated with right-hemispheric activity). Among frequency bands, frontal theta
- activity (specifically frontal mid-line theta) was of particular interest. Frontal mid-line theta has
- been linked to cognitive control and concentration (Brandmeyer, Delorme, & Wahbeh, 2019;
- 537 Cavanagh & Frank, 2014) and consequently may increase during the flow experience.
- 538 ** INSERT TABLE 3 HERE **

539 *Reduced verbal-analytic processing -* In a car-driving game, Kramer (2007) studied neural 540 correlates of peak performance (as associated with the state of flow) by exploring EEG signals' power information. Their results showed that a decrease in alpha power in the right temporal 541 lobe prior to a game trial predicted better game performance reflected by an increase in visuo-542 543 spatial processing. Greater mean left-temporal alpha power ten seconds before a game trial 544 resulted in improved performance. As in some other studies, the players' flow experience was not directly evaluated, but the high-performance intervals functioned as a proxy for the 545 subjective states. Later, Wolf et al. (2015) linked states of highly-focused attention in athletes 546 (one key component of flow experience) to reduced influence of verbal-analytical processes 547 reflected by stronger relative left-temporal-cortex alpha power. In this study, 35 expert and 548 549 amateur table-tennis players were asked to watch a 7-second-long video clip of a table-tennis player serving a ball and to imagine them reacting to it. A significant change towards lower T4-550

551 T3 alpha power (stronger right-temporal cortical activity) at the beginning of the movement

- 552 phase was reported in experts. This result, along with a positive correlation between T4-T3 alpha
- asymmetry and the flow score (measured by the FKS questionnaire) in the experts, was
- interpreted to reflect lower verbal analytic processing as associated with a higher degree of flow
- 555 in expert table tennis players.

Delta and Theta frequency bands- Chanel et al. (2011) classified the three emotional states of 556 boredom, flow, and anxiety induced by playing *Tetris* at three different challenge-skill levels. 557 Their EEG results indicated distinct theta power in some electrodes between conditions. The 558 559 investigation was a classification study, and there was no precise information about differences in theta power among conditions. In an exploratory EEG study, Nacke and colleagues probed the 560 impact of different difficulty levels of a game on brainwave activity (Nacke et al., 2011). The 561 authors did not use the methods of difficulty modulation for creating different levels of the 562 563 gameplay. Based on specific level-design guidelines (LDGs), three gameplay conditions (boredom, immersion, and flow) of the game Half-Life 2 were created. Theta and delta power 564 were significantly higher in immersion than in flow and boredom. Since the immersion condition 565

- of the game required navigating through landmarks, the authors argued that high theta activity in
- this level might be attributed to its architectural complexity.

568 In another study, EEG correlates of the flow state induced by playing a ping-pong video game

- 569 were investigated at two levels, slow as boring and fast as flow inducing (Metin et al., 2017).
- 570 EEG-frequency power evaluations revealed a higher mean theta power during the flow condition
- 571 for all regions of interest and a higher mean delta power in frontal, central, and parietal regions
- as compared to the non-flow condition. The regional theta and delta frequency bands correlated
 positively with the absorption, enjoyment, and intrinsic-motivation subscales of the Turkish
- positively with the absorption, enjoyment, and intrinsic-motivation subscales of the Turkish
 version of the FKS flow questionnaire. Regarding the two playing levels, a higher theta band was
- 575 not surprising, as theta activity has been linked to concentration, working memory, and sustained
- 576 attention, and these cognitive components would be higher at a higher difficulties. Katahira et al.
- 577 (2018) characterized the flow state by increased theta activity in the frontal areas. Employing a
- 578 mental arithmetic task used in the previous study (Ulrich et al., 2014) with three difficulty level,
- 579 theta activity in the frontal areas was reported higher during flow and anxiety condition of the
- task than in the boredom condition.

Alpha frequency band - Alpha power attenuation in the flow condition was reported as an
indicator that the subject had entered a flow state (Berta, Bellotti, De Gloria, Pranantha, &
Schatten, 2013). Using a four-electrode EEG (F7, F8, T5, and T6), they analyzed distinct userstates induced by a specifically designed plane battle video game with appropriate levels for

- boredom, flow, and anxiety. The main differences among the three conditions were reported in
 alpha and low-beta frequency-band powers with the lowest alpha and low-beta in the flow state.
- 587 There was no information regarding the region of observed distinct frequency power bands
- 588 among conditions. Self-assessed flow scores of the GEQ showed significantly different boredom

and anxiety levels, but failed to distinguish the flow level. Léger et al. (2014) explored the

- relationship between EEG and flow in a simulation-based training session with the three
- 591 difficulty levels of boredom, flow, and anxiety. Subjects with high alpha and low beta activity
- reported a higher cognitive absorption score. The authors argued that these results showed a
- 593 more relaxed and less vigilant state in the learners.

594 Beta frequency band - Wang & Hsu (2014) explored the state of flow during a computer-based instruction paradigm utilizing EEG to see whether the attention score captured by the EEG signal 595 is associated with the flow score assessed by the virtual-course flow measure. Participants 596 597 completed three lessons of computer-based instructions pertaining to Excel operations with easy (boredom), medium (flow), and difficult (anxiety) content. The EEG attention value—derived 598 599 from the beta wave of brain activity at Fp1 electrode—was reported to correlate with the flow dimensions of enjoyment, focused attention, involvement, and time distortion. However, the 600 601 correlation coefficient was small, and the authors argued that the attention value cannot exactly represent the flow experience and is only one component. Léger et al. (2014) found low beta 602 603 activity associated with a higher flow score, highlighting a less vigilant state in the learners. 604 Utilizing an adapted version of the WOLF questionnaire. De Kock (2014) evaluated the flow 605 experience of participants subjected to a continuous visuomotor computer game (Need for Speed *Carbon*). EEG signal activity at prefrontal, sensorimotor, parietal, and occipital regions was 606 compared between low-flow/low-performance and high-flow/high-performance groups. The 607 high-flow condition was associated with increased low-beta power in the sensorimotor cortex, as 608 well as low-beta synchronization among all cortical connections. The shift in low-beta power in 609 610 the sensorimotor area was connected to fluent and coordinated motion. Synchronized low-beta connections in all cortical regions in the high-flow condition indicated optimized transmission of 611 neural information throughout the brain, ensuring smooth, accurate, and effortless motor 612 execution (De Kock, 2014). Increased beta activity during flow-like states was also reported in a 613 single-case study by Moreno et al. (2020) highlighting higher cognitive engagement during 614 moments of flow. 615

616 Implementation of dual-task paradigms

- 617 Although the above-mentioned studies have provided neural signatures of the flow state, they all
- 618 face a similar limitation. Their methodology cannot discern between internal flow and the
- 619 external task conditions that facilitate the experience of flow. A skill-challenge balance is
- 620 considered a prerequisite to inducing flow, but alone it does not guarantee that an individual will
- 621 enter the flow state. It has been demonstrated that different factors, but especially the
- 622 methodology, can affect the association of skill-challenge balance and flow (Fong et al., 2015).
- 623 In some studies in which difficulty modulation was used for creating boredom, flow, and anxiety
- 624 conditions, the adaptive playing condition was considered as flow without any post-manipulation
- 625 check to see whether participants really experienced flow in their experimental set-up (e.g.
- 626 Chanel et al., 2011). This fact led to the application of techniques that indirectly measure the

- 627 extent to which subjects experience flow by assessing their levels of attention engagement.
- Based on the flow theory (Csikszentmihalyi & Csikszentmihalyi, 1992), focused attention during
- 629 the experience of flow leads to complete absorption in an activity to the extent that one does not
- allocate attentional resources to irrelevant external stimuli. During boredom or anxiety,
- attentional disengagement from the task makes it more likely that an individual will pay attention
- to irrelevant stimuli. These considerations led to an interesting line of research using dual-task
- 633 paradigms to indirectly measure electrophysiological correlates of the flow experience (see Table
- 634 4). Secondary-task reaction times were suggested as reliable and valid measures of available
- attentional resources (Weber, Alicea, Huskey, & Mathiak, 2018).

636 ** INSERT TABLE 4 HERE **

Castellar and colleageus utilized an auditory oddball paradigm as a secondary task to investigate 637 attention while subjects played a game as a primary task (Castellar et al., 2016). Participants 638 were requested to play the game Star Reaction in boredom, flow, and anxiety conditions while 639 simultaneously responding to a rare sound in the auditory oddball task. The larger the absorption 640 in the primary task, the slower the reaction times and more errors registered in the detection of 641 oddball sounds. Event-related potential (ERP) analysis showed that the maximal frontocentral 642 643 negative deflection after the response onset was significantly delayed during the flow condition compared to the other two conditions in the correct-responses trials, reflecting delayed attention 644 re-allocation to the primary task during flow. Significant midfrontal alpha power increase during 645 the flow condition may well indicate the intrinsic rewarding nature of the flow experience 646

647 (Castellar et al., 2016).

A study by Yun et al. (2017) extended the secondary-task idea by adding a passive random 648 beeping sound while subjects played an FPS game (Call of Duty : Modern Warfare 2). Complete 649 absorption in the game world was expected to lead to the neglect of the game-irrelevant sensory 650 stimulation from the real world, which is reflected by the suppression of auditory evoked 651 potentials (AEPs) of EEG signals elicited by random beeps. Due to the insufficient number of 652 trials and background noise, the typically detected AEPs were not observable, and the authors 653 instead analyzed event-related spectral perturbation (ERSP) suppression at low frequencies in the 654 flow trials. A significant correlation was reported between the suppressed evoked potential 655 derived from ERSP and the self-reported experience of flow. By utilizing source-localization 656 algorithms, the activation of the ACC and temporal pole was reported during flow trials only in 657 the beta-frequency range. Subjective flow ratings also positively correlated with activation in 658 659 these regions, suggesting a link between the flow experience and high concentration, focused attention, and less self-referential processing (Yun et al., 2017). Auditory oddball sounds were 660 also applied as a secondary task in a VR gaming context to explore attentional allocation during 661 662 the experience of flow (Bombeke, Dongen, Durnez, & Anzolin, 2018). Participants played a 663 shooter game Counter-Strike: Global Offensive under three conditions (boredom, flow, and 664 anxiety) both in a 2D and a VR set-up while they were simultaneously asked to respond to the

- oddball sounds. Their results did not replicate the results of the previous study by Castellar et al.
- 666 (2016) reporting higher reaction times and more errors in the flow condition. A smaller posterior
- 667 mid-line P300 amplitude was reported (marginally significant) in VR compared to playing on 2D
- during the flow condition. The flow ratings measured with the Flow Questionnaire (FQ, Sherry
- 669 et al.,(2006)) did not show significant differences among the different gaming conditions, and it
- 670 is unclear whether participants really experienced boredom, flow, and anxiety in this set-up.671 Through the application of a secondary-task reaction time (STRT) procedure while playing the
- Through the application of a secondary-task reaction time (STRT) procedure while playing the game *Asteroid Impact* at three levels of difficulty (boredom, flow, and anxiety), Huskey et al.
- 673 (2018) reported the greatest intrinsic reward (measured by the autotelic experience subscale of
- 674 the FSS questionnaire) and longer reaction times during the flow condition. Their results
- 675 revealed that the flow condition elicited significantly greater activity in the areas related to
- 676 cognitive control (DLPFC), orienting attention (superior parietal lobe; SPL), attentional alerting
- 677 (dorsal anterior insula, dAI), and reward networks (putamen). These results correlate well with
- 678 the synchronization theory of flow. The low-difficulty condition evoked activity in DMN
- 679 structures which was absent in the high-difficulty condition (Huskey et al., 2018).

680 **Discussion**

- 681 We conducted a comprehensive review of the current literature on the underlying
- 682 electrophysiological and neural mechanisms of the experience of flow. Although a number of
- 683 physiological and neural measures could potentially be seen as markers of flow, it is difficult to
- relate them to a unified mechanism that underlies this mental state. Flow is a complex state that
- requires the involvement of distinct cognitive subfunctions, which in turn necessitates the
- activation of different physiological and neural systems. Here we tried to categorize some of
- 687 these distinct physiological and cognitive subfunctions, which were addressed by most of the
- 688 studies.

689 State of positive valence and heightened arousal

- 690 Activity in the smiling (ZM, positive association) and frowning muscles of the face (CS,
- 691 negative association), and larger respiratory depth during flow states represent positive affect (de
- Manzano et al., 2010; Harmat et al., 2015; Kivikangas, 2006; Mauri, Cipresso, Balgera,
- 693 Villamira, & Riva, 2011; Nacke & Lindley, 2008). The pattern of arousal modulation, however,
- 694 is somewhat complex and varies in how studies used it to distinguish flow states from straining
- 695 experiences such as stress. Peifer and colleagues (2014) proposed an inverted U-shaped function
- 696 between flow experience and physiological arousal. If we consider the relationship between flow
- and performance (Csikszentmihalyi et al., 2005; Engeser & Rheinberg, 2008; Jin, 2012; Keller &
- 698 Bless, 2008; Landhäußer & Keller, 2012), this pattern aligns well with the classic Yerkes-
- 699 Dodson Law, which proposes an inverted U-shaped association between arousal and
- 700 performance (Yerkes & Dodson, 1908). Nevertheless, findings concerning the sympathetic and
- parasympathetic reflections of arousal are heterogeneous, given that both linear (Chanel et al.,

- 702 2011; de Manzano et al., 2010; De Sampaio Barros et al., 2018; Keller et al., 2011; Tian et al.,
- 2017) and inverted U-shaped (Bian et al., 2016; Peifer et al., 2014; Tozman et al., 2015)
- associations have been reported. On the other hand, EDA—a robust indicator of sympathetic
- arousal (Critchley & Nagai, 2013) —has been shown to positively correlate with flow, reflecting
- heightened sympathetic arousal during the moments of flow (Léger et al., 2014; Moreno et al.,
- 707 2020; Nacke & Lindley, 2010; Ulrich et al., 2016).

708 One possible explanation of obtaining a linear function between arousal and flow experience is

- that playing a game in a laboratory setting, even at a higher level of difficulty, might not be
- perceived as a threat and thus fails to elicit high arousal levels at high levels of difficulty.
- 711Building upon the biopsychosocial model of challenge and threat, Tozman and Peifer (2016)
- suggest using framing techniques in order to manipulate challenge appraisal in the game andcreate threat during gameplay. The question is how framing context affects flow experience.
- 714 given that external impositions such as threat, negative feedback, and deadline might negatively
- 715 influence intrinsic motivation and consequently the flow experience (Di Domenico & Ryan,
- 716 2017). Studies investigating the relationship between flow and salivary cortisol levels (Keller et
- al., 2011; Peifer et al., 2015, 2014) also suggested that this relationship is moderated by the type
- of intervention, personal characteristics, and interaction of both (Brom et al., 2014). It is also
- possible that the internal motivation for gameplay was adversely affected by the experimental
- setup, as players participated in the experiment not for the pleasure of the game, but for the
- 721 specific context. Being in an artificial experimental situation and receiving external rewards
- 722 (e.g., the monetary compensation for participation in the study) may suppress arousal. It is worth
- to mention that the LF-HRV which was considered as a marker of sympathetic activity in the
 study by Peifer and colleagues (2014), was determined mainly by the parasympathetic system's
- activity (Reyes del Paso et al., 2013). Future studies should consider more robust indicators of
- 726 sympathetic arousal for the evaluation of relationship between flow and physiological arousal.
- 727 The pre-ejection period of cardiovascular activity was suggested as a reliable indicator which
- 728 could clarify this inconsistency (Tozman & Peifer, 2016). In general, one can suggest that the
- simultaneous presence of heightened arousal and positive valence can distinguish flow from the
- 730 experiences of boredom and anxiety.

731 Joyous state of focused attention

- 732 Flow as a state of complete concentration during a skill-challenge balance condition also
- necessitates a high degree of attention that is understood to be effortless. Both flow and mental
- right reforming reases with the increased task difficulty (Tozman & Peifer, 2016), but the specific
- 735 pattern of ANS activity observed during the flow experience (e.g. decreased heart period with
- 736 deep respiration) is different from the pattern associated with mental effort (e.g. decreased heart
- 737 period, lower HRV along with fast and shallow respiration). Studies that found lower HRV in the
- flow condition explained this phenomenon in the light of higher mental effort during the
- rage experience of flow (De Sampaio Barros et al., 2018; Harris et al., 2016; Keller et al., 2011) and,

- in contrast, studies with observed higher HRV suggested lower mental effort (Bian et al., 2016;
- 741 Peifer et al., 2014). The inconsistencies of findings regarding mental effort and flow experience
- could be partly traced back to the imprecise measures used for assessing mental effort. Although
- HRV has been found to be a sensitive measure of mental effort (Aasman et al., 1987; Backs &
- 744Seljos, 1994; Waterink & van Boxtel, 1994), Veltman and Gaillard (1998) argued the opposite,
- as it can be affected by respiratory activity. For instance, during moments with more respiration,
- differences in mental effort measured by HRV might be overestimated. It is therefore necessaryto test more precise measures of the cardiovascular control system's suppression as a result of
- 747 to test more precise measures of the cardiovascular control system's suppression as a result 748 mental effort. Blood glucose and pupil dilation were suggested as sensitive measures for
- rie mental effort (Saproo, Shih, Jangraw, & Sajda, 2016; Tozman & Peifer, 2016) which
- 750 has not been investigated in the concept of flow.
- 751 Harris et al. (2016) demonstrated that felt and objective attentional effort might dissociate from
- each other. Focused eye gaze (increased attention) as well as lower HRV (higher mental effort)
- reported during the flow condition did not match the lower effort scores obtained through self
- report (Harris et al., 2016). Ullén et al. (2010) suggested that this may occur as a result of an
 interaction between positive valence and focused attention. In a state of positive affect, a task
- 756 with great attentional load might be experienced as less effortful. Observed co-activation of the
- 757 sympathetic (reflected by decreased HP) and parasympathetic systems (reflected by deep
- 758 respiration) align well with this suggestion. Considering the role of the PFC in attention and
- concentration, the experience of flow was displayed to associate with increased activity in this
- 760 integrative frontal area of the cortex (Klasen et al., 2012; Ulrich et al., 2016, 2014; Yoshida et
- al., 2014). Frontal midline theta activation has been linked to concentration, working memory,
- and sustained attention (Cavanagh & Frank, 2014). High theta activity reported during flow
- 763 (Katahira et al., 2018; Metin et al., 2017; Nacke et al., 2011) might therefore reflect focused
- attention. We argue that the flow state is accompanied by an efficient attentional effort and that
- the coupled activity of the sympathetic and parasympathetic nervous systems can be used to
- 766 distinguish this joyous state of focused attention from the pure effortful mental experience.

767 Synchronized activation of attentional and reward networks

- Flow is considered to be a state with focused attention which is intrinsically rewarding, as the
- 769 flow-inducing task is performed for its own sake. Some studies support the synchronization
- theory of flow (Weber et al., 2009) by showing the joint activation of frontoparietal attention
- 771 networks (e.g. IFG and inferior parietal lobe) and reward networks (e.g. putamen, thalamus)
- during the flow experience (Castellar et al., 2016; De Sampaio Barros et al., 2018; Huskey et al.,
- 773 2018; Ju & Wallraven, 2019; Klasen et al., 2012; Ulrich et al., 2016, 2014; Yoshida et al., 2014).
- A positive correlation between dopaminergic receptor availability in the striatum and putamen
- and flow proneness supports this theory and shows that the experience of flow is intrinsically
- rewarding (de Manzano et al., 2013).

777 Automaticity

Concerning the neural mechanisms underlying the experience of flow, inhibition of the explicit 778 system and the transient hypofrontality theory (Dietrich, 2004) received partial empirical support 779 (Gold & Ciorciari, 2019; Ulrich et al., 2016, 2014). Other studies failed to find transient 780 781 hypofrontality during the state of flow (Harmat et al., 2015; Yoshida et al., 2014). Fluent, smooth 782 and effortless motor performance were related to increased low-beta power in the sensorimotor 783 cortex, as well as low-beta synchronization among all cortical connections (De Kock 2014). We suggest that this hypothesis might be an oversimplification of the flow state or only related to 784 785 specific situations. During tasks with high demands of executive control, a decoupling of actions from conscious effort and controlled attention is unlikely to happen. It has been suggested that 786 the decrease in frontal functions is more likely to occur when the action becomes more automatic 787 (Harris et al., 2017). This means that transient hypofrontality might happen after prolonged 788 789 exercise.

790 Loss of self-awareness

A promising consistent outcome of neural research on flow experience is the deactivation of the 791 792 DMN, specifically the MPFC, which indicates less self-referential processing during the flow experience (De Sampaio Barros et al., 2018; Ju & Wallraven, 2019; Sadlo, 2016; Ulrich et al., 793 794 2016, 2014, 2018). It has been stated that during the performance of cognitively demanding task, 795 the activity of the central executive network and salience network increases whereas the DMN's 796 activity declines (Sridharan, Levitin, & Menon, 2008). Activity in the DMN is reported to be associated with a relaxed mind, mind-wandering, and self-referential thinking, which is reduced 797 in task-focused and goal-directed actions (Goldberg, Harel, & Malach, 2006; Raichle et al., 798 799 2001). Reduced activity was found in the DMN during focused sensory perception (Goldberg et al., 2006), which reflects the loss of self during the activity. Activation of DMN regions was also 800 801 reported during a boredom-induction task, suggesting a relation between mind wandering and DMN activity (Danckert & Merrifield, 2018). Several studies discussed the role of MPFC and its 802 relative decreased activity in self-referential processing (Goldberg et al., 2006; Gusnard, 803 Akbudak, Shulman, & Raichle, 2001; Raichle et al., 2001). This is strongly related to 804 Csikszentmihalvi's (1990) dimension of loss of self-awareness in flow theory. High 805 concentration and focused attention demanded by the task at hand restrict resource allocation for 806 task-irrelevant demands like body and self-awareness. Sridharan et al. (2008) stated that the 807 saliency network, including the VLPFC and the anterior insula (AI), is involved in shifts between 808 809 the DMN and cognitive executive networks acting as an outflow hub at the junction of both networks. This notion is further confirmed by the positive correlation between the flow 810 experience and the activity increase reported in the insular cortex, especially in the anterior 811 812 insula (Huskey et al., 2018; Ju & Wallraven, 2019; Ulrich et al., 2016). Consequently, higher 813 activity in the anterior insula might show disengagement of the task-irrelevant DMN regions during the experience of flow. On the other hand, activity in anterior and posterior parts of the 814

- 815 insula was linked to time perception (Wittmann, Simmons, Aron, & Paulus, 2010) and the
- anterior regions were shown to associate with the experience of bodily self-awareness (Craig,
- 817 2009). A study by Berkovich-Ohana et al. (2013) reported that timelessness in a meditation
- 818 practice is accompanied by higher theta activation in the right insula. Further investigations
- 819 should interrogate the rule of the anterior insula in the experience of flow.

820 Another important issue here is that lower self-referential information processing is associated

- 821 with decreased neural activity in the amygdala during flow (Ulrich et al., 2016, 2014, 2018).
- 822 Given the amygdala's mediating role in emotion perception (Morris et al., 1996), the reduced
- activity in AMY reflected a decreased emotional arousal associated with the experience of flow.
- 824 One might speculate that lowered self-awareness reduces the threat response and increase
- positive emotions (Sadlo, 2016; Ulrich et al., 2016). Reduced awareness of the self is also
- 826 reported to contribute to improved performance in athletics (Harris et al., 2017). The close
- relationship between flow experiences and performance (Engeser & Rheinberg, 2008; Jin, 2012;
- 828 Landhäußer & Keller, 2012) suggests that reduced self-awareness and, consequently, reduced
- 829 DMN activity is one of the underlying key features of the flow experience.

830 Task dependency

- 831 Some of the inconsistencies in results can be explained by different experimental designs used in
- 832 different research approaches. While some used continuous playing and correlational analysis,
- 833 others preferred a difficulty-modulation approach, where they designed three levels of the game
- corresponding to the boredom, flow, and anxiety categories of the flow model. The way the skill-challenge balance is operationalized in these studies directly influences flow. More frequently,
- studies used global flow scales like the FSS or the FKS questionnaires to measure the level of
- 837 flow in participants. Few studies just applied some individual items or subscales of these surveys
- to assess the subjective experience (Keller et al., 2011; Ulrich et al., 2016, 2014), and some
- others did not employ any measure for the evaluation of flow and considered the skill-challenge
- 840 balance condition as a flow state without further checking of the manipulation (e.g. Chanel et al.,
- 841 2011; Nacke & Lindley, 2008; Nacke et al., 2011). In a meta-analytic study, Fong et al. (2015)
- reported that the correlation between flow and optimal balance is higher when a global flow
- scale and one of its subscales of challenge-skill fit was used for operationalizing a skill-challenge
- 844 fit. The length of the experimental blocks, ranging from 30 seconds to 12 minutes, is another
- 845 limitation, which leads to strong variations in the strength of the flow experience. It has been
- stated that participants required a minimum of 25 minutes to get into the flow state (Bisson et al.,
- 2012; Tobin et al., 2010; Yun et al., 2017). The next concern is that different paradigms or games
 require the involvement of different cognitive functions, which in turn affect the physiological
- require the involvement of different cognitive functions, which in turn affect the physiologicand neural-activity outcome. Peifer (2012) argued that, as the physiological and cognitive
- demands of the flow-inducing activities are different, the neurophysiology of "optimal
- 851 functioning" differs between them. First-person shooters, like *Half-Life 2* (HL2) or *Counter-*
- 852 *Strike: Source* (CS:S), require more complex interactions than, for instance, *Tetris* or *Pong*.

853 Virtually anyone could pick up *Tetris* or *Pong* and play them right away, since the player only

- needs to use a few buttons. In FPSs, players typically control the character with a combination of
- 855 mouse and keyboard that takes practice to use. Moreover, there are differences between the
- 856 contents of the games used in the studies described above that would require players to use
- different cognitive functions while playing. FPSs are three-dimensional games in whichnavigation is crucial. At any given time, the player is only looking at a small portion of the total
- space, and challenges are often hidden from view until they are close to the player or in their line
- of sight. This category of games activates mental processes crucial for spatial navigation. In
- 861 contrast, *Tetris* and *Pong* are two-dimensional and belong to the category of single-screen
- 862 games, since all the relevant information is displayed simultaneously on the screen.

863 Remaining issues and future research considerations

864 It is important to note that most of the methodologies mentioned above cannot discriminate

between internal states of flow and the external conditions that help induce a flow experience.

866 Designing specific levels for the experiments (corresponding to boredom, flow, and anxiety) that

- are directly related to the amount of skill-challenge balance does not guarantee that people will
- 868 enter a flow state. The subjective experience of flow was not directly assessed in some studies,
- and it is therefore not clear whether the participants were able to enter a full flow state or not.
- 870 One could consider adding objective measures other than neural or physiological markers to
- isolate the state of flow. One type of objective measures was conceptually designed by applying
- 872 a secondary reaction-time task to assess the level of attention engagement during gameplay
- 873 (Bombeke et al., 2018; Castellar et al., 2016; Huskey et al., 2018; Yun et al., 2017). Longer
- 874 reaction times and more errors in the secondary task were reported to correlate with the 275 reaction times and more errors in the secondary task were reported to correlate with the
- subjective experience of flow (Castellar et al., 2016; Huskey et al., 2018).
- 876 The associations between performance and arousal (Yerkes & Dodson, 1908) and flow and
- arousal (Peifer et al., 2014) suggest a close relationship between flow experience and
- 878 performance. Nonetheless, the direction of this association has not yet been clearly investigated.
- 879 It has been demonstrated that flow as a state of high concentration and a sense of control could
- actually motivate subjects to improve their performance (Engeser & Rheinberg, 2008; Jin, 2012;
- Landhäußer & Keller, 2012). While the association between flow and optimal performance has
- been described in academic activities, music, and sports (Landhäußer & Keller, 2012), there
- 883 were few studies reporting a relationship in the gaming context (De Kock, 2014; Engeser &
- 884 Rheinberg, 2008; Jin, 2012; Keller & Bless, 2008; Yun et al., 2017). Some studies failed to find
- an association between flow and optimal performance (Harris et al., 2016; Katahira et al., 2018;
- Ulrich et al., 2016, 2014) reporting medium levels of performance for the flow condition. It is
- 887 noteworthy that the positive association was mostly reported in studies in which components of
- subjective flow were directly measured instead of assessing behavioral levels of challenge and
- skills (De Kock, 2014; Yun et al., 2017). More precisely, the causal relationship between flow
- 890 and performance cannot be tested in typical cross-sectional experimental paradigms using

- 891 difficulty manipulations. A longitudinal design is required to assess causality (Keller & Bless,
- 892 2008; Landhäußer & Keller, 2012). Considering this, performance might also be considered as
- an objective measure that, in combination with other measures (e.g. physiological and neural
- 894 indices, subjective self-reports, and secondary reaction times), could precisely capture the actual
- 895 emergence of flow. We argue that future studies should consider using objective measures beside
- subjective scales and self-reports to capture the actual emergence of flow.

897 Conclusions

- 898 This review provides an overview of physiological and neural findings during the flow
- 899 experience and integrates the empirical results to explain the underlying mechanisms of this
- 900 complex state. We sorted distinct physiological and cognitive subfunctions involved in the
- 901 experience of flow. We conclude that flow is a positive mental state characterized by heightened
- 902 arousal, focused attention, synchronized activity in the brain's attention and reward networks,
- and results in automatic action control with less self-referential processing. Combining objective
- 904 measures with retrospective questionnaires seems essential to capture the actual emergence of
- 905 flow. The important role of focused attention during moments of flow necessitates the
- 906 employment of dual-task paradigms to disentangle internal flow phenomena from external
- 907 situations inducing flow.

908 Acknowledgements

- 909 We want to thank all collaborators of our EU-funded project VIRTUALTIMES Exploring and
- 910 modifying the sense of time in virtual environments, namely the researchers in the following
- 911 groups with the principal investigators Kai Vogeley (Cologne), Anne Giersch (Strasbourg), Marc
- 912 Erich Latoschik, Jean-Luc Lugrin (Würzburg), Giulio Jacucci, Niklas Ravaja (Helsinki), Xavier
- 913 Palomer, Xavier Oromi (Barcelona).
- 914

915 **References**

- Aasman, J., Mulder, G., & Mulder, L. J. M. (1987). Operator effort and the measurement of
 heart-rate variability. *Human Factors*, 29(2), 161–170.
- Afergan, D., Peck, E. M., Solovey, E. T., Jenkins, A., Hincks, S. W., Brown, E. T., ... Jacob, R.
 J. K. (2014). Dynamic difficulty using brain metrics of workload. *Proceedings of the 32nd Annual ACM Conference on Human Factors in Computing Systems CHI '14*, 3797–3806.
 https://doi.org/10.1145/2556288.2557230
- 922 Alvarez Igarzábal, F. (2019). *Time and space in video games: A cognitive-formalist approach*.
 923 Transcript.
- Backs, R. W., & Seljos, K. A. (1994). Metabolic and cardiorespiratory measures of mental effort:
 the effects of level of difficulty in a working memory task. *International Journal of*Bruehophysiology, 16(1), 57–68
- 926 *Psychophysiology*, *16*(1), 57–68.

- Bakker, A. B. (2008). The work-related flow inventory: Construction and initial validation of the
 WOLF. *Journal of Vocational Behavior*, 72(3), 400–414.
- 928 WOLF. Journal of Vocational Benavior, 72(3), 400
- 929 https://doi.org/10.1016/j.jvb.2007.11.007
- Berkovich-Ohana, A., Dor-Ziderman, Y., Glicksohn, J., & Goldstein, A. (2013). Alterations in
 the sense of time, space, and body in the mindfulness-trained brain: A
- 932 neurophenomenologically-guided MEG study. *Frontiers in Psychology*, 4(DEC).

933 https://doi.org/10.3389/fpsyg.2013.00912

- Berta, R., Bellotti, F., De Gloria, A., Pranantha, D., & Schatten, C. (2013).
 Electroencephalogram and Physiological Signal Analysis for Assessing Flow in Games.
- 936 *IEEE Transactions on Computational Intelligence and AI in Games*, *5*(2), 164–175.
- Bian, Y., Yang, C., Gao, F., Li, H., Zhou, S., Li, H., ... Meng, X. (2016). A framework for
 physiological indicators of flow in VR games: construction and preliminary evaluation. *Personal and Ubiquitous Computing*, 20(5), 821–832. https://doi.org/10.1007/s00779-0160953-5
- Bisson, N., Tobin, S., & Grondin, S. (2012). Prospective and retrospective time estimates of
 children: A comparison based on ecological tasks. *PLoS ONE*, 7(3).
 https://doi.org/10.1371/journal.pone.0033049
- Bombeke, K., Dongen, A. Van, Durnez, W., & Anzolin, A. (2018). Do Not Disturb:
 Psychophysiological Correlates of Boredom, Flow and Frustration During VR Gaming. In *Augmented Cognition: Intelligent Technologies* (Vol. 10915, pp. 101–119).
 https://doi.org/10.1007/078.2.210.01470.1
- 947 https://doi.org/10.1007/978-3-319-91470-1
- 948 Boucsein, W. (2012). *Electrodermal activity*. Springer Science & Business Media.
- Brom, C., Buchtová, M., Šisler, V., Děchtěrenko, F., Palme, R., & Glenk, L. M. (2014). Flow,
 social interaction anxiety and salivary cortisol responses in serious games: A quasiexperimental study. *Computers and Education*, *79*, 69–100.
- 952 https://doi.org/10.1016/j.compedu.2014.07.001
- Castellar, E. P. N., Antons, J.-N., Marinazzo, D., & Van Looy, J. (2016). Being in the zone:
 Using behavioral and EEG recordings for the indirect assessment of flow. *PeerJ Preprints*,
 4, 1–30. https://doi.org/https://doi.org/10.7287/peerj.preprints.2482v1
- Cavanagh, J. F., & Frank, M. J. (2014). Frontal Theta as a Mechanism for Affective and
 Effective Control. *Psychophysiology*, *18*(8), 414–421.
- 958 https://doi.org/10.1016/j.tics.2014.04.012.Frontal
- 959 Chanel, G., Rebetez, C., Bétrancourt, M., & Pun, T. (2008). Boredom, engagement and anxiety
 960 as indicators for adaptation to difficulty in games. *Proceedings of the 12th International*961 *Conference on Entertainment and Media in the Ubiquitous Era MindTrek '08*, 13–17.
 962 https://doi.org/10.1145/1457199.1457203
- 963 Chanel, G., Rebetez, C., Bétrancourt, M., & Pun, T. (2011). Emotion Assessment From
 964 Physiological Signals for Adaptation of Game Difficult. *IEEE Transactions on Systems*,
 965 *Man, and Cybernetics-Part A: Systems and Humans*, 41(6), 1052–1063.
- 966 Chen, J. (2006). *Flow in games*. https://doi.org/10.1145/1232743.1232769
- 967 Colzato, L. S., Wolters, G., & Peifer, C. (2018). Transcutaneous vagus nerve stimulation (tVNS)
 968 modulates flow experience. *Experimental Brain Research*, 236(1), 253–257.
 969 https://doi.org/10.1007/s00221-017-5123-0
- 970 Craig, A. D. (2009). How do you feel now? The anterior insula and human awareness. *Nature* 971 *Reviews Neuroscience*, 10(1), 59–70. https://doi.org/10.1038/nrn2555
- 972 Critchley, H., & Nagai, Y. (2013). Electrodermal Activity (EDA). In Encyclopedia of Behavioral

- 973 Medicine (pp. 666–669). https://doi.org/10.1007/978-3-642-28753-4 100709 974 Csikszentmihalyi, M. (1975). Beyond boredom and anxiety. Jossey-Bass. Csikszentmihalyi, M. (1990). Flow: The psychology of optimal experience. New York 975 976 (HarperPerennial). 977 Csikszentmihalyi, M., Abuhamdeh, S., & Nakamura, J. (2005). Flow. In Handbook of 978 competence and motivation. (pp. 598-608). https://doi.org/10.1007/978-94-017-9088 979 Csikszentmihalyi, M., & Csikszentmihalyi, I. S. (1992). Optimal experience: Psychological 980 studies of flow in consciousness. https://doi.org/10.7551/mitpress/9780262013840.003.0010 Csikszentmihalyi, M., & Larson, R. (1983). Validity and Reliability of the Experience-Sampling 981 982 Method. In Flow and the Foundations of Positive Psychology (pp. 35–54). https://doi.org/10.1007/978-94-017-9088-8 3 983 Danckert, J., & Merrifield, C. (2018). Boredom, sustained attention and the default mode 984 985 network. Experimental Brain Research, 236(9), 2507-2518. https://doi.org/10.1007/s00221-016-4617-5 986 De Kock, F. G. (2014). The neuropsychological measure (EEG) of flow under conditions of peak 987 performance. Retrieved from http://uir.unisa.ac.za/handle/10500/14359 988 989 de Manzano, Ö., Cervenka, S., Jucaite, A., Hellenäs, O., Farde, L., & Ullén, F. (2013). Individual 990 differences in the proneness to have flow experiences are linked to dopamine D2-receptor 991 availability in the dorsal striatum. NeuroImage, 67, 1-6. 992 https://doi.org/10.1016/j.neuroimage.2012.10.072 993 de Manzano, Ö., Theorell, T., Harmat, L., & Ullén, F. (2010). The Psychophysiology of Flow 994 During Piano Playing. Emotion, 10(3), 301-311. https://doi.org/10.1037/a0018432 995 De Sampaio Barros, F., M., Araújo-Moreira, F., M., Trevelin, L., C., & Radel, R. (2018). Flow experience and the mobilization of attentional resources. Cognitive, Affective and 996 997 Behavioral Neuroscience, 18(4), 810-823. https://doi.org/10.3758/s13415-018-0606-4 998 Di Domenico, S. I., & Ryan, R. M. (2017). The Emerging Neuroscience of Intrinsic Motivation: 999 A New Frontier in Self-Determination Research. Frontiers in Human Neuroscience, 1000 11(March), 1-14. https://doi.org/10.3389/fnhum.2017.00145 1001 Dietrich, A. (2004). Neurocognitive mechanisms underlying the experience of flow. 1002 Consciousness and Cognition, 13(4), 746–761. 1003 https://doi.org/10.1016/j.concog.2004.07.002 1004 Drachen, A., Nacke, L. E., Yannakakis, G., & Pedersen, A. L. (2010). Correlation between heart 1005 rate, electrodermal activity and player experience in first-person shooter games. 1006 Proceedings of the 5th ACM SIGGRAPH Symposium on Video Games - Sandbox '10, 1007 475(3), 49-54. https://doi.org/10.1145/1836135.1836143 Engeser, S., & Rheinberg, F. (2008). Flow, performance and moderators of challenge-skill 1008 balance. Motivation and Emotion, 32(3), 158-172. https://doi.org/10.1007/s11031-008-1009 1010 9102-4 1011 Fong, C. J., Zaleski, D. J., & Leach, J. K. (2015). The challenge-skill balance and antecedents of flow: A meta-analytic investigation. Journal of Positive Psychology, 10(5), 425-446. 1012 https://doi.org/10.1080/17439760.2014.967799 1013 1014 Gold, J., & Ciorciari, J. (2019). A Transcranial Stimulation Intervention to Support Flow State 1015 Induction. Frontiers in Human Neuroscience, 13(August), 1–8. 1016 https://doi.org/10.3389/fnhum.2019.00274
- Goldberg, I. I., Harel, M., & Malach, R. (2006). When the Brain Loses Its Self: Prefrontal
 Inactivation during Sensorimotor Processing. *Neuron*, 50(2), 329–339.

- 1019 https://doi.org/10.1016/j.neuron.2006.03.015
- Gusnard, D. A., Akbudak, E., Shulman, G. L., & Raichle, M. E. (2001). Medial prefrontal cortex
 and self-referential mental activity: Relation to a default mode of brain function.
- Proceedings of the National Academy of Sciences of the United States of America, 98(7),
 4259–4264. https://doi.org/10.1073/pnas.071043098
- Harmat, L., Manzano, Ö. De, Theorell, T., Högman, L., Fischer, H., & Ullén, F. (2015).
 Physiological correlates of the flow experience during computer game playing.
- 1026 International Journal of Psychophysiology, 97(1), 1–7.
- 1027 https://doi.org/10.1016/j.ijpsycho.2015.05.001
- Harris, D. J., Vine, S. J., & Wilson, M. R. (2016). Is flow really effortless? The complex role of
 effortful attention. *Sport, Exercise, and Performance Psychology*, 6(1), 103–114.
 https://doi.org/10.1037/spy0000083
- Harris, D. J., Vine, S. J., & Wilson, M. R. (2017). Neurocognitive mechanisms of the flow state.
 In *Progress in Brain Research* (1st ed., Vol. 234).
- 1033 https://doi.org/10.1016/bs.pbr.2017.06.012
- Huskey, R., Craighead, B., Miller, M. B., & Weber, R. (2018). Does intrinsic reward motivate
 cognitive control? a naturalistic-fMRI study based on the synchronization theory of flow. *Cognitive, Affective and Behavioral Neuroscience, 18*(5), 902–924.
 https://doi.org/10.3758/s13415-018-0612-6
- IJsselsteijn, W., De Kort, Y., Poels, K., Jurgelionis, A., & Bellotti, F. (2007). Characterising and
 Measuring User Experiences in Digital Games. *International Conference on Advances in Computer Entertainment Technology*, 620, 1–4. https://doi.org/10.1007/978-1-60761-580-4
- Jackson, S. A., & Eklund, R. C. (2004). *The Flow Scales Manual*. Fitness Information
 Technology.
- Jackson, S. A., & Marsh, H. W. (1996). Development and Validation of a Scale to Measure
 Optimal Experience: The Flow State Scale. *Journal of Sport and Exercise Psychology*, *18*(1), 17–35. https://doi.org/10.1123/jsep.18.1.17
- Jin, S. A. A. (2012). "Toward Integrative Models of Flow": Effects of Performance, Skill,
 Challenge, Playfulness, and Presence on Flow in Video Games. *Journal of Broadcasting and Electronic Media*, 56(2), 169–186. https://doi.org/10.1080/08838151.2012.678516
- Ju, U., & Wallraven, C. (2019). Manipulating and decoding subjective gaming experience during
 active gameplay: a multivariate, whole-brain analysis. *NeuroImage*, *188*, 1–13.
 https://doi.org/10.1016/j.neuroimage.2018.11.061
- Kamath MV, F. EL. (1993). Power spectral analysis of heart rate variability: a noninvasive
 signature of cardiac autonomic function. *Crit Rev Biomed Eng*, 21(3), 245–311.
- 1054 Katahira, K., Yamazaki, Y., Yamaoka, C., Ozaki, H., Nakagawa, S., & Nagata, N. (2018). EEG
 1055 correlates of the flow state: A combination of increased frontal theta and moderate
 1056 frontocentral alpha rhythm in the mental arithmetic task. *Frontiers in Psychology*, 9(MAR),
- 1057 1–11. https://doi.org/10.3389/fpsyg.2018.00300
- Keller, J., & Bless, H. (2008). Flow and regulatory compatibility: An experimental approach to
 the flow model of intrinsic motivation. *Personality and Social Psychology Bulletin*, 34(2),
 196–209. https://doi.org/10.1177/0146167207310026
- 1061 Keller, J., Bless, H., Blomann, F., & Kleinböhl, D. (2011). Physiological aspects of flow
- experiences: Skills-demand-compatibility effects on heart rate variability and salivary
 cortisol. *Journal of Experimental Social Psychology*, 47(4), 849–852.
- 1064 https://doi.org/10.1016/j.jesp.2011.02.004

- 1065 Keller, J., & Blomann, F. (2008). Locus of control and the flow experience: An experimental
- analysis. *European Journal of Personality*, 22(7), 589–607. https://doi.org/10.1002/per.692
- Khoshnoud, S., Shamsi, M., Nazari, M. A., & Makeig, S. (2017). Different cortical source
 activation patterns in children with attention deficit hyperactivity disorder during a time
 reproduction task. *Journal of Clinical and Experimental Neuropsychology*, 40(7), 633–649.
 https://doi.org/10.1080/13803395.2017.1406897
- 1071 Kivikangas, J. (2006). *Psychophysiology of flow experience: an explorative study, Master's thesis*. University of Helsinki.
- 1073 Klasen, M., Weber, R., Kircher, T. T. J., Mathiak, K. A., & Mathiak, K. (2012). Neural
 1074 contributions to flow experience during video game playing. *Social Cognitive and Affective*1075 *Neuroscience*, 7(4), 485–495. https://doi.org/10.1093/scan/nsr021
- 1076 Klasen, M., Zvyagintsev, M., Weber, R., Mathiak, K. A., & Mathiak, K. (2008). Think aloud
 1077 during fMRI: Neuronal correlates of subjective experience in video games. *Lecture Notes in*1078 *Computer Science*, *5294 LNCS*(January), 132–138. https://doi.org/10.1007/978-3-5401079 88322-7-13
- Knierim, M. T., Rissler, R., Dorner, V., Maedche, A., & Weinhardt, C. (2018). The
 Psychophysiology of Flow: A Systematic Review of Peripheral Nervous System Features.
 In *Lecture Notes in Information Systems and Organisation* (Vol. 25, pp. 109–120).
 https://doi.org/10.1007/978-3-319-67431-5 13
- Kozhevnikov, M., Li, Y., Wong, S., Obana, T., & Amihai, I. (2018). Do enhanced states exist?
 Boosting cognitive capacities through an action video-game. *Cognition*, 173(January), 93–
 105. https://doi.org/10.1016/j.cognition.2018.01.006
- 1087 Kramer, D. (2007). Predictions of Performance by EEG and Skin Conductance. *Indiana* 1088 Undergraduate Journal of Cognitive Science, 2, 3–13.
- Kühn, S., Berna, F., Lüdtke, T., Gallinat, J., & Moritz, S. (2018). Fighting depression: Action
 video game play may reduce rumination and increase subjective and objective cognition in
 depressed patients. *Frontiers in Psychology*, 9(FEB), 1–10.
 https://doi.org/10.3389/fpsyg.2018.00129
- Laborde, S., Mosley, E., & Thayer, J. F. (2017). Heart rate variability and cardiac vagal tone in
 psychophysiological research Recommendations for experiment planning, data analysis,
 and data reporting. *Frontiers in Psychology*, 8(FEB), 1–18.
- 1096 https://doi.org/10.3389/fpsyg.2017.00213
- Landhäußer, A., & Keller, J. (2012). Flow and its affective, cognitive, and performance-related
 consequences. In *Advances in flow research* (pp. 65–85). Springer.
- Lang, P. J., Greenwald, M. K., Bradley, M. M., & Hamm, A. O. (1993). Looking at pictures:
 Affective, facial, visceral, and behavioral reactions. *Psychophysiology*, *30*(3), 261–273.
 https://doi.org/10.1111/j.1469-8986.1993.tb03352.x
- Larsen, J. T., Berntson, G. G., Poehlmann, K. M., Ito, T. A., & Cacioppo, J. T. (2008). The
 Psychophysiology of Emotion. In *HANDBOOK OF EMOTIONS* (pp. 180–195).
 https://doi.org/10.1249/00005768-200405001-00432
- 1105 Léger, P. M., Davis, F. D., Cronan, T. P., & Perret, J. (2014). Neurophysiological correlates of
 1106 cognitive absorption in an enactive training context. *Computers in Human Behavior*, 34,
 1107 273–283. https://doi.org/10.1016/j.chb.2014.02.011
- 1108 Liknaitzky, P. (2017). The hyper-ordinary depression hypothesis, and mechanisms of cognitive
- rigidity in depression (or zen and art of reducing depressive cycle maintenance). Doctoral
 Dissertation of the University of Melbourne.

- Liu, C., Agrawal, P., Sarkar, N., & Chen, S. (2009). Dynamic difficulty adjustment in computer
 games through real-time anxiety-based affective feedback. *International Journal of Human- Computer Interaction*, 25(6), 506–529. https://doi.org/10.1080/10447310902963944
- Malik, M., Camm, A. J., Bigger, J. T., Breithardt, G., Cerutti, S., Cohen, R. J., ... Singer, D. H.
 (1996). Heart rate variability. Standards of measurement, physiological interpretation, and
 clinical use. *European Heart Journal*, *17*(3), 354–381.
- 1117 https://doi.org/10.1093/oxfordjournals.eurheartj.a014868
- Mauri, M., Cipresso, P., Balgera, A., Villamira, M., & Riva, G. (2011). Why Is Facebook So
 Successful? Psychophysiological Measures Describe a Core Flow State While Using
 Facebook. *Cyberpsychology, Behavior, and Social Networking*, *14*(12), 723–731.
 https://doi.org/10.1089/cyber.2010.0377
- Metin, B., Goktepe, A., Kaya, B., Serin, E., Tas, C., Dolu, F., & Tarhan, N. (2017). EEG
 findings during flow state. *The Journal of Neurobehavioral Sciences*, (14), 1.
 https://doi.org/10.5455/JNBS.1496152464
- Michailidis, L., Balaguer-Ballester, E., & He, X. (2018). Flow and immersion in video games:
 The aftermath of a conceptual challenge. *Frontiers in Psychology*, 9(SEP), 1–8.
 https://doi.org/10.3389/fpsyg.2018.01682
- Moller, A. C., Csikszentmihalyi, M., Nakamura, J., & Deci, E. (2007). Developing an
 experimental induction of flow. *Poster Presented at the Society for Personality and Social Conference*. Memphis, TN.
- Moller, A. C., Meier, B. P., & Wall, R. D. (2010). Developing an Experimental Induction of
 Flow : Effortless Action in the Lab. In *Effortless attention: a new perspective in the cognitive science of attention and action* (pp. 191–204).
- 1134 https://doi.org/10.7551/mitpress/9780262013840.003.0010
- Moreno, M., Schnabel, R., Lancia, G., & Woodruff, E. (2020). Between text and platforms: A
 case study on the real-time emotions & psychophysiological indicators of video gaming and
 academic engagement. *Education and Information Technologies*, 25(3), 2073–2099.
 https://doi.org/10.1007/s10639-019-10031-3
- Morris, J. S., Frith, C. D., Perrett, D. I., Rowland, D., Young, A. W., Calder, A. J., & Dolan, R. J.
 (1996). A differential neural response in the human amygdala to fearful and happy facial
 expressions. *Nature*, 383(6603), 812–815. https://doi.org/10.1038/383812a0
- 1142 Nacke, L. E. (2012). Flow in Games : Proposing a Flow Experience Model. *Proceedings of the*1143 Workshop on Conceptualising, Operationalising and Measuring the Player Experience in
 1144 Videogames at Fun and Games. Toulouse, France: ACM.
- 1145 Nacke, L. E., & Lindley, C. A. (2008). Flow and immersion in first-person shooters: Measuring
 1146 the player's gameplay experience. *International Academic Conference on the Future of*1147 *Game Design and Technology, Future Play: Research, Play, Share*, 81–88.
- 1148 https://doi.org/10.1145/1496984.1496998
- Nacke, L. E., & Lindley, C. A. (2010). Affective Ludology, Flow and Immersion in a FirstPerson Shooter: Measurement of Player Experience. *ArXiv Preprint, arXiv:1004*. Retrieved
 from http://arxiv.org/abs/1004.0248
- 1152 Nacke, L. E., Stellmach, S., & Lindley, C. A. (2011). Electroencephalographic Assessment of
 1153 Player Experience. *Simulation & Gaming*, 42(5), 632–655.
- 1154 https://doi.org/10.1177/1046878110378140
- 1155 Park, S., Sim, H., & Lee, W. (2014). Dynamic Game difficulty Control by Using EEG-based
- emotion recognition. *International Journal of Control and Automation*, 7(3), 267–272.

- 1157 https://doi.org/10.14257/ijca.2014.7.3.26
- Peifer, C. (2012). Psychophysiological correlates of flow-experience. In *Advances in flow research* (pp. 139–164). Springer.
- Peifer, C., Schächinger, H., Engeser, S., & Antoni, C. H. (2015). Cortisol effects on flow experience. *Psychopharmacology*, *232*(6), 1165–1173. https://doi.org/10.1007/s00213-014 3753-5
- Peifer, C., Schulz, A., Schächinger, H., Baumann, N., & Antoni, C. H. (2014). The relation of
 flow-experience and physiological arousal under stress Can u shape it? *Journal of Experimental Social Psychology*, *53*, 62–69. https://doi.org/10.1016/j.jesp.2014.01.009
- Posner, M. I., Inhoff, A. W., Friedrich, F. J., & Cohen, A. (1987). Isolating attentional
 mechanisms: A cognitive-anatomical analysis. *Psychobiology*, 15(2), 107–112.
- Raichle, M. E., MacLeod, A. M., Snyder, A. Z., Powers, W. J., Gusnard, D. A., & Shulman, G.
 L. (2001). A default mode of brain function. *Proceedings of the National Academy of Sciences*, 98(2), 676–682. https://doi.org/10.1073/pnas.98.2.676
- 1171 Raz, A., & Buhle, J. (2006). Typologies of attentional networks. *Nature Reviews Neuroscience*, 7(5), 367–379. https://doi.org/10.1038/nrn1903
- 1173 Reyes del Paso, G. A., Langewitz, W., Mulder, L. J. M., van Roon, A., & Duschek, S. (2013).
 1174 The utility of low frequency heart rate variability as an index of sympathetic cardiac tone: A
 1175 review with emphasis on a reanalysis of previous studies. *Psychophysiology*, *50*(5), 477–
 1176 487. https://doi.org/10.1111/psyp.12027
- 1177 Rheinberg, F., & Vollmeyer, R. (2003). erschien 2003 in Zeitschrift für Psychologie, 4, 161-170.
 1178 Zeitschrift Für Psychologie, 4, 4, 161–170.
- Sadlo, G. (2016). Towards a Neurobiological Understanding of Reduced Self-Awareness During
 Flow: An Occupational Science Perspective. In *Flow Experience: Empirical Research and Applications* (pp. 375–388). https://doi.org/10.1007/978-3-319-28634-1
- Salen, K., & Zimmerman, E. (2003). *Rules of Play: Game Design Fundamentals*. The MIT
 Press.
- Saproo, S., Shih, V., Jangraw, D. C., & Sajda, P. (2016). Neural mechanisms underlying
 catastrophic failure in human-machine interaction during aerial navigation. *Journal of Neural Engineering*, *13*(6). https://doi.org/10.1088/1741-2560/13/6/066005
- 1187 Schell, J. (2008). The art of game design: A book of lenses. Elsevier/Morgan Kaufmann.
- 1188 Shaffer, F., & Ginsberg, J. P. (2017). An Overview of Heart Rate Variability Metrics and Norms.
- 1189 Frontiers in Public Health, 5(September), 1–17. https://doi.org/10.3389/fpubh.2017.00258
- Sherry, J.L., Rosaen, S., Bowman, N., Huh, S. (2006). Cognitive skill predicts video game
 ability. *Annual Meeting of the International Communication Association., Dresden.*Dresden.
- Shin, N. (2006). Online learner's "flow" experience: An empirical study. *British Journal of Educational Technology*, *37*(5), 705–720. https://doi.org/10.1111/j.14678535.2006.00641.x
- Sinnett, S., Jäger, J., Singer, S. M., & Antonini Philippe, R. (2020). Flow States and Associated
 Changes in Spatial and Temporal Processing. *Frontiers in Psychology*, *11*(March), 1–13.
 https://doi.org/10.3389/fpsyg.2020.00381
- 1199 Sridharan, D., Levitin, D. J., & Menon, V. (2008). A critical role for the right fronto-insular
- 1200 cortex in switching between central-executive and default-mode networks. *Proceedings of*
- *the National Academy of Sciences of the United States of America*, *105*(34), 12569–12574.
- 1202 https://doi.org/10.1073/pnas.0800005105

- 1203 Tian, Y., Bian, Y., Han, P., Wang, P., Gao, F., & Chen, Y. (2017). Physiological signal analysis 1204 for evaluating flow during playing of computer games of varying difficulty. Frontiers in 1205 *Psychology*, 8(JUL), 1–10. https://doi.org/10.3389/fpsyg.2017.01121 1206 Tobin, S., Bisson, N., & Grondin, S. (2010). An ecological approach to prospective and 1207 retrospective timing of long durations: A study involving gamers. *PLoS ONE*, 5(2), 16–18. 1208 https://doi.org/10.1371/journal.pone.0009271 1209 Tozman, T., Magdas, E. S., MacDougall, H. G., & Vollmeyer, R. (2015). Understanding the 1210 psychophysiology of flow: A driving simulator experiment to investigate the relationship 1211 between flow and heart rate variability. Computers in Human Behavior, 52, 408–418. 1212 https://doi.org/10.1016/j.chb.2015.06.023 Tozman, T., & Peifer, C. (2016). Experimental paradigms to investigate flow-experience and its 1213 1214 psychophysiology: Inspired from stress theory and research. Flow Experience: Empirical 1215 Research and Applications, 329-350. https://doi.org/10.1007/978-3-319-28634-1 20 1216 Ullén, F., de Manzano, Ö., Almeida, R., Magnusson, P. K. E., Pedersen, N. L., Nakamura, J., ... 1217 Madison, G. (2012). Proneness for psychological flow in everyday life: Associations with 1218 personality and intelligence. Personality and Individual Differences, 52(2), 167–172. 1219 https://doi.org/10.1016/j.paid.2011.10.003
- Ullén, F., de Manzano, Ö., Theorell, T., & Harmat, L. (2010). The Physiology of Effortless
 Attention: Correlates of State Flow and Flow Proneness. In *Effortless attention: a new perspective in the cognitive science of attention and action* (pp. 205–218).
 https://doi.org/10.7551/mitpress/9780262013840.003.0011
- Ulrich, M., Keller, J., & Grön, G. (2016). Neural signatures of experimentally induced flow
 experiences identified in a typical fMRI block design with BOLD imaging. *Social Cognitive and Affective Neuroscience*, 11(3), 496–507. https://doi.org/10.1093/scan/nsv133
- 1227 Ulrich, M., Keller, J., Hoenig, K., Waller, C., & Grön, G. (2014). Neural correlates of
 1228 experimentally induced flow experiences. *NeuroImage*, *86*, 194–202.
 1229 https://doi.org/10.1016/j.neuroimage.2013.08.019
- Ulrich, M., Niemann, J., Boland, M., Kammer, T., Niemann, F., & Grön, G. (2018). The neural correlates of flow experience explored with transcranial direct current stimulation. *Experimental Brain Research*, 236(12), 3223–3237. https://doi.org/10.1007/s00221-018-5378-0
- Veltman, J. A., & Gaillard, A. W. K. (1998). Physiological workload reactions to increasing
 levels of task difficulty. *Ergonomics*, 41(5), 656–669.
- 1236 https://doi.org/10.1080/001401398186829
- 1237 Vogel, D., Falter-Wagner, C. M., Schoofs, T., Krämer, K., Kupke, C., & Vogeley, K. (2019).
 1238 Interrupted Time Experience in Autism Spectrum Disorder: Empirical Evidence from
 1239 Content Analysis. *Journal of Autism and Developmental Disorders*, 49(1), 22–33.
- 1240 https://doi.org/10.1007/s10803-018-3771-y
- 1241 Vogel, D., Krämer, K., Schoofs, T., Kupke, C., & Vogeley, K. (2018). Disturbed Experience of
 1242 Time in Depression—Evidence from Content Analysis. *Frontiers in Human Neuroscience*,
 1243 *12*(February), 1–10. https://doi.org/10.3389/fnhum.2018.00066
- 1244 Wang, C. C., & Hsu, M. C. (2014). An exploratory study using inexpensive
- 1245 electroencephalography (EEG) to understand flow experience in computer-based
- 1246 instruction. Information and Management, 51(7), 912–923.
- 1247 https://doi.org/10.1016/j.im.2014.05.010
- 1248 Waterink, W., & van Boxtel, A. (1994). Facial and jaw-elevator EMG activity in relation to

- changes in performance level during a sustained information processing task. *Biological Psychology*, 37(3), 183–198. https://doi.org/10.1016/0301-0511(94)90001-9
- Weber, R., Alicea, B., Huskey, R., & Mathiak, K. (2018). Network dynamics of attention during
 a naturalistic behavioral paradigm. *Frontiers in Human Neuroscience*, *12*(May), 1–14.
 https://doi.org/10.3389/fnhum.2018.00182
- Weber, R., Huskey, R., & Craighead, B. (2016). FLOW EXPERIENCES AND WELL-BEING :
 A Media Neuroscience Perspective. In *Handbook of media use and well-being: International perspectives on theory and research on positive media effects.* Routledge.
- Weber, R., Tamborini, R., Westcott-Baker, A., & Kantor, B. (2009). Theorizing flow and media
 enjoyment as cognitive synchronization of attentional and reward networks. *Communication Theory*, 19(4), 397–422. https://doi.org/10.1111/j.1468-2885.2009.01352.x
- Wittmann, M. (2015). Modulations of the experience of self and time. *Consciousness and Cognition*, 38, 172–181. https://doi.org/10.1016/j.concog.2015.06.008
- Wittmann, M. (2018). Altered States of Consciousness: Experiences Out of Time and Self. MIT
 Press.
- Wittmann, M., Simmons, A. N., Aron, J. L., & Paulus, M. P. (2010). Accumulation of neural activity in the posterior insula encodes the passage of time. *Neuropsychologia*, 48(10), 3110–3120. https://doi.org/10.1016/j.neuropsychologia.2010.06.023
- Wolf, S., Brölz, E., Keune, P. M., Wesa, B., Hautzinger, M., Birbaumer, N., & Strehl, U. (2015).
 Motor skill failure or flow-experience? Functional brain asymmetry and brain connectivity
 in elite and amateur table tennis players. *Biological Psychology*, *105*, 95–105.
 https://doi.org/10.1016/j.biopsycho.2015.01.007
- Yerkes, R. M., & Dodson, J. D. (1908). The relation of strength of stimulus to rapidity of
 habit-formation. *Journal of Comparative Neurology and Psychology*, 18(5), 459–482.
- Yoshida, K., Asakawa, K., Yamauchi, T., Sakuraba, S., Sawamura, D., Murakami, Y., & Sakai,
 S. (2013). The flow state scale for occupational tasks: Development, reliability, and
- 1275 validity. *Hong Kong Journal of Occupational Therapy*, 23(2), 54–61.
- 1276 https://doi.org/10.1016/j.hkjot.2013.09.002
- Yoshida, K., Sawamura, D., Inagaki, Y., Ogawa, K., Ikoma, K., & Sakai, S. (2014). Brain
 activity during the flow experience: A functional near-infrared spectroscopy study. *Neuroscience Letters*, *573*, 30–34. https://doi.org/10.1016/j.neulet.2014.05.011
- 1280 Yun, K., Doh, S., Carrus, E., Wu, D., & Shimojo, S. (2017). Being in the zone : Flow state and
- the underlying neural dynamics in video game playing. *ArXiv [Preprint]., arXiv:1711,* 1–
 31.
- 1283

Table 1(on next page)

Table1: Studies on peripheral-physiological correlates of the flow state

Ref.	N subjects	Age mean/ range	Sample	Experiment type	Design	Measure	Peripheral-physiological correlates of flow
Kivikangas (2006)	32(m)	17-34	Healthy students	FPS game: Halo: Combat Evolved	40 minutes gameplay	Facial EMG & EDA	Negative correlations between CS activity and flow
Chanel et al. (2008)	20 (7f)	27	Healthy participant	Game Tetris	5 minutes Boredom/ Flow/ Anxiety	EDA, BP, Res, & T	Increase in EDA & HR with increasing difficulty
Nacke & Lindley (2008)	25(m)	19-38	Healthy students	Game Half-Life 2	10 minutes Boredom/ Immersion/ Flow	Facial EMG & EDA	Highest ZM activity & EDA values for flow
Drachen et al. (2010)	16		—	FPS Games: Prey, Doom3, & Biochock	20 minutes gameplay	EDA, HR	Negative correlation between HR & flow subscale score
Chanel et al. (2011)	20(7f)	27	Healthy participant s	Game Tetris	5 minutes Boredom/ Flow/ Anxiety	EDA, BP, Res, T, & EEG	Least LF-HRV during flow
Keller et al. (2011)	8(4f) 61(m)		Healthy students	Computerized knowledge task & game Tetris	Boredom/ Flow/ Anxiety	HRV & Cortisol	Lower HRV & higher cortisol during flow condition
Peifer et al. (2014)	22(m)	20-34	Healthy students	Cabin Air Management System software	60 minutes performance	ECG & Cortisol	Inverted U-shaped relationship of LFHRV & cortisol level with the flow experience & positive linear relationship between parasympathetic activation & flow
Leger et al. (2014)	36	_	Healthy students	Enterprise Resource Planning software	Boredom/ Flow/ Anxiety	ECG, EDA, & EEG	Smaller variation of EDA & lower HR & higher HRV for flow condition
Harmat et al. (2015)	77(40f	27	Healthy subjects	Game Tetris	6 minutes Boredom/ Flow/ Anxiety	fNIRS, ECG, & Res	Larger RD & lower LF-HRV during flow condition

Ref.	N subjects	Age mean/ range	Sample	Experiment type	Design	Measure	Peripheral-physiological correlates of flow
Tozman et al. (2015)	18(6f)	19	Healthy students	Sporting race game package Rfactor	6 minutes Boredom/ Flow/ Anxiety	ECG	Negative linear relationship between LF-HRV & flow in flow condition & Inverted U- shaped relation between LF- HRV / HF-HRV & flow in anxiety condition
Bian et al. (2016)	36(16f)	20-27	Healthy adults	VR game: Air Bombardment	6 minutes gameplay	ECG, Res, & Facial EMG	Inverted U-shaped relationship between LFHRV & HFHRV & flow
Harris et al. (2016)	33(10f)	20	Healthy students	Simulated car racing game	Boredom/ Flow/ Anxiety	ECG & eye gaze position	Lower SD of horizontal gaze position & Lower HF-HRV in flow condition
Ulrich et al. (2016)	23(m)	24	Healthy students	Mental arithmetic task	30 seconds Boredom/ Flow/ Anxiety	fMRI & EDA	Greater EDA during flow
Tian et al. (2017)	40(27f)	17-24	Healthy students	Game Blocmania 3D	6 minutes Boredom/ Flow/ Anxiety	ECG, Res, & EDA	Faster respiratory rate, increased RD, moderate HR, moderate HRV, & moderate EDA
De Sampaio Barros et al. (2018)	20 (7f)	26	Healthy adults	Games Tetris & Pong	3 minutes Boredom/ Flow/ Anxiety / Autonomy	ECG, Res, & NIRS	Lower HRV during autonomy condition
Kozhevnikov et al. (2018)	56(17f)	_	Healthy students	Game Unreal Tournament 2004	30 minutes Boredom/ Flow/ Anxiety	ECG	Lower HF-HRV during playing at flow condition
Moreno et al. (2020)	1	27	Expert gamer	Game Portal	45 minutes gameplay	EDA, EEG	Increased EDA during moments of goal attainment

Table 1: Studies on peripheral-physiological correlates of the flow state

ECG = electrocardiography; EEG = electroencephalography; EMG = electromyography; EDA = electrodermal activity; BP = blood pressure; T = temperature; HR= heart rate; HP= heart period; ZM = zygomaticus major; CS = corrugator supercilii; HRV = heart rate variability; LF-HRV = low frequency heart rate variability ; HF-HRV = high frequency heart rate variability; Res = respiration; RD = respiratory depth; fNIRS = functional near-infrared spectroscopy; NIRS = near-infrared spectroscopy; fMRI = functional magnetic resonance imaging; FPS = first person shooter; SD = standard deviation; m = male; f = female



Table 2(on next page)

Table 2: Studies on neural correlates of the flow state: brain imaging investigations

1

Table 2: Studies on neural correlates of the flow state: brain imaging investigations

Ref.	N subjects	Age mean/ range	Sample	Experiment type	Design	Measure	Neural correlates of flow
Klasen et al. (2008)	18	_	_	FPS game: Counter Strike	12 minutes gameplay	fMRI	Correlation between game pleasure & cerebro-thalamic motor & visual network activity
Klasen et al. (2012)	13(m)	18-26	Healthy students	FPS game : Tactical Ops: Assault on Terror	12 minutes gameplay	fMRI	Activation of somatosensory networks & motor areas during situations with enhanced probability of flow
Ulrich et al. (2014)	27(m)	23	Healthy students	Mental arithmetic task	184 seconds Boredom/ Flow/ Anxiety	Perfusion MRI	Increased activity in the left IFG, left putamen, & posterior cortical regions as well as decrease in MPFC and AMY during flow
Yoshida et al. (2014)	20(10f)	21–25	Healthy students	Game Tetris	4 minutes Boredom & Flow	fNIRS	Higher activation in VLPFC during flow condition
Harmat et al. (2015)	77(40f)	27	Healthy subjects	Game Tetris	6 minutes Boredom/ Flow/ Anxiety	fNIRS, ECG, & Res	No association between frontal cortical oxygenation & flow
Ulrich et al. (2016)	23(m)	24	Healthy students	Mental arithmetic task	30 seconds Boredom/ Flow/ Anxiety	fMRI & EDA	Increased activity in the left IFG, left putamen, & posterior cortical regions as well as decrease in MPFC, PCC and AMY during flow
De Sampaio Barros et al. (2018)	20 (7f)	26	Healthy adults	Games Tetris & Pong	3 minutes Boredom/ Flow/ Anxiety/ Autonomy	ECG, Res, & NIRS	Higher activation in lateral PFC & deactivation in MPFC in Autonomy condition
Ulrich et al., (2018)	22(m)	24.9	Healthy students	Mental arithmetic task	170 seconds Boredom/ Flow/ Anxiety	Perfusion MRI & tDCS	Increase in the flow index of lower-flow group under anodal midfrontal tDCS stimulation & stronger deactivation of AMY

26

Ref.	N subjects	Age mean/ range	Sample	Experiment type	Design	Measure	Neural correlates of flow
Gold & Ciorciari (2019)	11(m) 21(11f)	29-31	Trained & untrained gamers	FPS game: Counter Strike: Global Offensive or Battlefield 4 & game Tetris	20 minutes & 3 minutes Boredom/ Flow/ Anxiety	tDCS	Higher level of flow after the active tDCS over DLPFC & right parietal cortex
Ju & Wallravan (2019)	31(m)	24.8	Healthy students	Car driving game	3 minutes blocks of gameplay	fMRI	Positive correlations between the flow experience and brain activity in regions related to visual and spatial execution as well as attentional processes & negative correlations with the DMN's activity

Table 2: Studies on neural correlates of the flow state: brain imaging investigations

fMRI = functional magnetic resonance imaging; MRI = magnetic resonance imaging; fNIRS = functional near-infrared spectroscopy; NIRS = near-infrared spectroscopy; ECG = electrocardiography; EDA = electrodermal activity; tDCS = transcranial direct-current stimulation; FPS = first person shooter; Res = respiration; IFG = inferior frontal gyrus; PFC = prefrontal cortex; MPFC = medial prefrontal cortex; AMY= amygdala; VLPFC = ventrolateral prefrontal cortex; DLPFC = dorsolateral prefrontal cortex; PCC = posterior cingulate cortex; DMN = default mode m = male; f = female

Table 3(on next page)

Table 3: Studies on neural correlates of the flow state: neural oscillation investigations

1

Table 3: Studies on neural correlates of the flow state: neural oscillation investigations

Ref.	N subjects	Age mean/ range	Sample	Experiment type	Design	Measure	Neural correlates of flow
Kramer et al. (2007)	10 (5f)	18-24	Healthy students	Driving video game	Playing trials	EDA & EEG	Greater left temporal alpha predicted performance level
Chanel et al. (2011)	20(7f)	27	Healthy subjects	Game Tetris	5 minutes Boredom/ Flow/ Anxiety	EDA, BP, Res, T, & EEG	Distinct theta & beta power between conditions
Nacke et al. (2011)	25(m)	19-38	Healthy students	Game Half-Life 2	10 minutes Boredom/ Immersion/ Flow	EEG	Higher theta & delta power in immersion
Berta et al. (2013)	22 (5f)	26.3	Healthy students	Plane battle game	4 minutes Boredom/ Flow/ Anxiety	EEG	Lowest mean alpha & low- beta in the flow state
Wang & Hsu (2014)	20(10f)	19-27	Healthy students	Computer- based instruction	7-9 minutes Boredom/ Flow/ Anxiety	EEG	EEG attention value was related to overall flow and flow dimensions
De Kock (2014)	20(m)	16-45	Healthy subjects	Game: Need for Speed – Carbon	Low flow- performance/ High flow- performance	EEG	Increased low-beta power in the sensorimotor cortex as well as low-beta synchronization between all cortical connections for high- flow
Leger et al. (2014)	36	_	Healthy students	Enterprise Resource Planning software	Boredom/ Flow/ Anxiety	ECG, EDA & EEG	Higher alpha & lower beta during medium content
Wolf et al. (2015)	35 (9f)	<36	Table- tennis players	Motor imagery paradigm	7 seconds video clips	EEG	Positive correlation between T4-T3 alpha asymmetry & flow score in the experts

Table 3: Studies on neural correlates of the flow state: neural oscillation investigations

Ref.	N subjects	Age mean/ range	Sample	Experiment type	Design	Measure	Neural correlates of flow
Metin et al. (2017)	20(7f)	20-35	Healthy subjects	Ping-pong game	2 minutes Boredom/ Flow	EEG	Greater theta & delta power during flow condition
Katahira et al. (2018)	16(6f)	21.9	Healthy students	Mental arithmetic task	184 seconds Boredom/ Flow/ Anxiety	EEG	Increased theta activity in the frontal areas, moderate alpha activities in the frontal & central areas.
Moreno et al. (2020)	1	27	Expert gamer	Game Portal	45 minutes gameplay	EDA, EEG	Increased beta activity during moments of goal attainment

ECG = electrocardiography; EEG = electroencephalography; EDA = electrodermal activity; Res = respiration; BP = blood pressure; T = temperature; SD = standard deviation; m = male; f = female



Table 4(on next page)

Table 4: Studies on neural correlates of the flow state: dual-task paradigms

1

Table 4: Studies on neural correlates of the flow state: dual-task paradigms

Ref.	N subjects	Age mean/ range	Sample	Experiment type	Design	Measure	Neural correlates of flow
Castellar et al. (2016)	18(9f)	28.5	Healthy subjects	Game Star reaction & Auditory oddball detection	Boredom/ Flow/ Anxiety	EEG	Delayed maximal frontocentral negative deflection after the response onset during flow
Yun et al. (2017)	29(5f)	23.5	Healthy subjects	FPS game: Call of Duty & Random beeping sound	30 minutes Low challenge/ High challenge	EEG	Suppressed evoked potential derived from ERSP during self-reported experience of flow
Bombeke et al. (2018)	18(3f)	25	Healthy students	FPS game Counter- Strike: Global offensive & Auditory oddball detection	8 minutes Boredom/ Flow/ Anxiety	EEG	Mid-line P300 amplitude smaller in VR compared to playing in 2D during flow condition
Huskey et al. (2018)	18(m)		Healthy students	Game Asteroid Impact & Secondary reaction time	2 minutes Boredom/ Flow/ Anxiety	fMRI	Higher activity in DLPFC, SPL, DAI, & putamen during flow condition

EEG = electroencephalography; fMRI = functional magnetic resonance imaging; ERSP = event-related spectral perturbation; VR = virtual reality; DLPFC = dorsolateral prefrontal cortex; SPL= superior parietal lobe; DAI = dorsal anterior insula; m = male; f = female