

1 **Salivary Immunoendocrine and Self-Report Monitoring Profiles Across an Elite-Level**  
2 **Professional Football Season.**

3

4 **Original Investigation.**

5

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26 **Title**

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28 **Salivary Immunoendocrine and Self-Report Monitoring Profiles Across an Elite-Level**  
29 **Professional Football Season.**

30

31 **Short Title**

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33 Multivariate Monitoring Profiles in Football

34

35 **Abstract**

36

37 *Purpose*

38 This investigation examined the longitudinal changes and inter-relationships of salivary and  
39 self-report monitoring measures across a professional football season.

40 *Methods*

41 Measures were collected bi-weekly from 18 senior professional male players across a six-week  
42 pre-season and eight five-week in-season mesocycles and analysed using a linear mixed-effects  
43 model.

44 *Results*

45 Analysis identified a *small* ( $P=0.003$ ) cross-season suppression of salivary immunoglobulin-  
46 A, *small* reductions to salivary  $\alpha$ -amylase ( $P=0.047$ ) and salivary cortisol ( $P=0.007$ ), and  
47 *trivial* changes to salivary testosterone ( $P>0.05$ ). The testosterone:cortisol ratio typically  
48 responded inversely to changes in player workload. Self-report measures of fatigue ( $P=0.030$ ),  
49 sleep quality ( $P=0.003$ ) and muscle soreness ( $P=0.005$ ) improved ( $ES=small$ ) across the first  
50 half of the season. Fatigue and sleep measures were most consistently related to hormonal

51 measures ( $R^2 = 0.43$  to  $0.45$ ). For these relationships, increases in cortisol were associated with  
52 compromised self-report responses, whereas increases in testosterone:cortisol were associated  
53 with improved responses. Non-linear relationships were identified for fatigue with  
54 immunoglobulin-A ( $P=0.017$ ;  $ES=trivial$ ) and testosterone ( $P=0.012$ ;  $ES=trivial$ ); for sleep  
55 quality with testosterone ( $P<0.001$ ;  $ES=trivial$ ); for muscle soreness with testosterone  
56 ( $P=0.012$ ;  $ES=trivial$ ) and for the self-report inventory sum with testosterone ( $P=0.027$ ;  
57  $ES=trivial$ ). For these relationships, self-report responses were optimal at mean  
58 immunoglobulin-A and testosterone levels and very low levels ( $-2$  SD) exerted the most  
59 compromising effects.

### 60 **Conclusion**

61 Players can experience a chronic cross-season suppression of mucosal immunity. Salivary  
62 immunoglobulin-A, testosterone, cortisol and testosterone:cortisol measures relate to self-  
63 report measures of fatigue, sleep quality and muscle soreness. In-season reductions in  
64 testosterone, cortisol and testosterone:cortisol or increases in cortisol among elite football  
65 players could be used to indicate the need for reduced workload, which might lead to improved  
66 wellbeing.

67

### 68 **Key Words**

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70 Workload; Monitoring; Team Sports; Immunology; Endocrinology;

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76 **Introduction**

77

78 Professional Association Football (football) players are exposed to high workloads (1) and  
79 congested fixture schedules (2). Consequently, achieving a balance between workload and  
80 recovery is not always possible (3), which can lead to player stress, immune and hormonal  
81 imbalances (4-9) and subsequent increases in injury and illness risk (1, 3, 10, 11).

82

83 To mitigate injury and illness risk, the football training environment necessitates valid and  
84 reliable player monitoring methods with fast data availability (12). Athlete self-report measures  
85 (ASRM) of perceived fatigue, sleep quality, stress, mood and muscle soreness (13) are widely  
86 used in practice (12) because they correspond with changes in training load (8, 14) and can be  
87 deployed and analysed rapidly (12, 13). Biological fatigue markers are often used alongside  
88 ASRM to provide objective understanding of the workload-recovery relationship (12, 13, 15).  
89 Of these, salivary biomarkers are particularly popular (12) because samples can be easily  
90 obtained non-invasively (16) and results for entire squads (~ 25 players) can be available in ~  
91 30 min using point of care analysis systems (4-6, 12, 17-19).

92

93 Salivary immunoglobulin-A (s-IgA) and  $\alpha$ -amylase (s-AA) are antimicrobial proteins secreted  
94 by mucosal cells under sympathetic nervous system (SNS) control (20). Under normal  
95 circumstances, both are rhythmically secreted and play a role in mucosal immunity (7). Since  
96 SNS activity stimulates s-IgA and s-AA secretion, both are indicative of acute stress (7, 13,  
97 20) and can be used to track changes in workload in football players (5-7) and athletes (21-23).  
98 In response to prolonged 'stressful' stimuli, such as increased physical training demands,  
99 secretion of s-IgA and s-AA can be reduced, which is associated with an increase in upper  
100 respiratory tract infection (URTI) and symptom (URTS) risk in football players (19, 24).

101

102 Testosterone (T) and cortisol (C) are steroid hormones, detectable in saliva (s-T, s-C) (20), that  
103 reflect anabolic (s-T) and catabolic (s-C) balance when expressed as s-T:C (9). Previous  
104 research has reported acute increases in C, equivocal changes to T and a reduction in T:C post-  
105 match in football (9, 25), rugby (26-28) and Australian football (AFL) (29) cohorts, which  
106 manifests for ~ 24 - 72 hrs (9, 25-29). Longitudinal data in football indicate an increase in C  
107 during periods of increased workload (30) and a reduction in T:C towards the end of the season  
108 (31). However, previous longitudinal investigations are limited by infrequent data collection  
109 (30, 31) and short sampling periods (31), which reduce their capacity to sensitively describe  
110 seasonal changes to hormonal status.

111

112 Limited empirical data are available to describe the seasonal changes and inter-relationships of  
113 s-IgA, s-AA, s-T, s-C, s-T:C and ASRM measures in football players. This, despite consensus  
114 statements from both the American College of Sports Medicine (ACSM) (32) and the  
115 International Olympic Committee (IOC) (10, 11) recommending longitudinal multivariate  
116 monitoring in the support of elite athletes. Such data will help to refine monitoring methods in  
117 practice in football. Accordingly, the aims of this study were to investigate: a) the longitudinal  
118 changes; and b) the inter-relationships of s-IgA, s-AA, s-T, s-C, s-T:C and ASRM measures  
119 across an elite-level professional football season.

120

## 121 **Methods**

122

### 123 *Study design*

124 Eighteen senior professional male outfield players (age =  $24 \pm 3.8$  years; height =  $181 \pm 7.0$   
125 cm, body mass =  $72.4 \pm 5.2$  kg) from one English Championship (EC) team participated in the

126 investigation. Saliva samples and ASRM data were collected following recovery days across a  
127 complete 6-week preseason and 40-week (48-game) in-season period. An example of the  
128 typical training and sample collection schedule for the team is provided in Figure 2. In total,  
129 802 s-IgA, 785 s-AA, 795 s-T, 791 s-C and 697 ASRM measures were analysed. The in-season  
130 period was divided into eight 5-week mesocycles (M); of which M1 = games 1 – 5; M2: 6 –  
131 11; M3: 12 – 17; M4: 18 – 23; M5: 24 – 31; M6: 32 – 36; M7: 37 – 40 and M8: 41 – 48 (Figure  
132 1). Total player workload was recorded across the investigation using the CR-10-scale (33).  
133 CR-10 response was collected within 30 min of all training sessions and games and multiplied  
134 by session or game duration (min) to provide an arbitrary unit (AU) of workload. This method  
135 has been validated for use in elite professional football training previously (34). Informed  
136 consent was obtained from all participants prior to collection of any data used in this  
137 investigation. An ethics declaration (project approval number: 21995) was approved by the  
138 Edith Cowan University (AU) Human Research Ethics Office.

139

140 **\*\*\* *Insert Figure 1 Here* \*\*\***

141

### 142 ***Saliva Sampling and Athlete Self Report Measures***

143 Players reported to the team training facility between 09:00 and 09:30 on sample collection  
144 days. Players were asked to abstain from alcohol and caffeine consumption for 24 hrs and 12  
145 hrs (respectively) prior to sample collection. This was confirmed verbally with players at the  
146 point of sample collection. None of the players were smokers. Players were asked to sit quietly,  
147 swallow existing saliva in the mouth and to then place an oral fluid collector (OFC; SOMA  
148 Bioscience, Wallingford, UK) on the tongue. With the mouth closed, 0.5 ml of saliva was  
149 collected, as indicated by a volume adequacy indicator on the OFC. The OFC was then placed  
150 into 3 ml of buffer solution in a bespoke 10 ml container (OFC Buffer; SOMA Bioscience,

151 Wallingford, UK) and mixed gently by hand for 2 min (18). Players were then asked to  
152 complete an ASRM inventory (13), composed of five questions relating to: fatigue, sleep  
153 quality, muscle soreness, stress level and mood. Responses were scored on a Likert scale of 1-  
154 5, where 1, 2, 3, 4 and 5 = *very good, good, normal, bad* and *very bad*, respectively (13).

155

### 156 *Salivary IgA and Cortisol*

157 Two drops of the OFC sample were applied to two lateral flow immunochromatographic (LFI;  
158 SOMA Bioscience, Wallingford, UK) test strips: which captured s-IgA and s-C at test lines.  
159 After a five min incubation period, the LFI strips were inserted into a lateral flow device reader  
160 (LFD; SOMA Bioscience, Wallingford, UK), which used signal intensity to provide  
161 quantifiable values for s-IgA ( $\mu\text{g/ml}$ ) and s-C (nM) (35). Salivary IgA and s-C were determined  
162 using specifically programmed curves assigned to the LFI strips, provided by the manufacturer  
163 (SOMA Bioscience, Wallingford, UK). Analysis of s-IgA and s-C was conducted by the same  
164 researcher across the sample period. This method has been validated previously for s-IgA (18,  
165 36) and s-C (36, 37). Indeed, comparison of the LFD method with the enzyme-linked  
166 immunosorbent assay (ELISA) method indicates strong validity for s-IgA ( $r = 0.93$ ;  $P < 0.001$ )  
167 (18) and s-C ( $r^2 = 0.79$ ) (38). Repeated sampling indicates strong reliability for s-IgA (ICC  $r$   
168  $= 0.89$ ,  $P < 0.001$  and CV = 9.4%) (18) and s-C (CV = 6.8%) (38).

169

### 170 *Salivary $\alpha$ -Amylase and Testosterone*

171 The remaining OFC Buffer solution was sealed and taken to a private laboratory (SOMA  
172 Bioscience, Wallingford, UK), where s-AA ( $\mu\text{g/ml}$ ) and s-T (pg/ml) were measured by ELISA  
173 using enzyme immunoassay test kits (EIA; SOMA Bioscience, Wallingford, UK), and an  
174 automated analyser (Tecan Nanoquant, Tecan, Männedorf, Switzerland) as per manufacturers  
175 guidelines. Validity and reliability data are unavailable for these measures. Following analysis,

176 s-T was converted to its molar value to calculate s-T:C. All analysis was completed by the  
177 same laboratory technician. All samples were analysed within 24 hours of collection. The intra-  
178 and inter-assay CV for s-AA and s-T analysis using this method is 4.71% and 11.4%; and  
179 7.94% and 9.4% respectively (39).

180

### 181 ***Team Match, Training and Data Collection Schedule***

182 Saliva and ASRM data were collected bi-weekly following recovery days or days 'off'. Typical  
183 team training, match and data collection schedules are provided in Figure 2. Baseline saliva  
184 and ASRM measures were calculated as the mean of MD-2 data collected during single game  
185 weeks in mesocycle one (Figure 2). Mesocycle one was used as baseline for workload.

186

187 ***\*\*\* Insert Figure 2 Here \*\*\****

188

### 189 ***Statistical Analysis***

190 All estimations were made using the *lme4* package (40) with *R* (version 4.0.0, R Foundation  
191 for Statistical Computing, Vienna, Austria). Baseline saliva and ASRM data were used as the  
192 reference point to determine longitudinal changes across the season. A linear mixed-effects  
193 model was used to model the effect of season mesocycle on the dependent variables whilst  
194 adjusting for the baseline value for each player and total workload in each season phase. The  
195 random effects were player identity (differences between players' mean s-IgA, s-AA, s-T, s-C  
196 and s-T:C values), player identity  $\times$  season mesocycle (variability in the effect of season on s-  
197 IgA, s-AA, s-T, s-C and s-T:C values across players), and the residual. The *lmerTest* package  
198 (41) was used to conduct Bonferroni-adjusted pairwise comparisons for the main effect of  
199 saliva variables and season mesocycle, and their interactions. Data are presented as means and  
200 95% confidence intervals (CI), alongside Cohen's *d* effect sizes (42). Thresholds for ES were:



201 0.0-0.2 = *trivial*; 0.2-0.6 = *small*; 0.6-1.2 = *moderate*; 1.2-2 = *large*; >2 = *very large*. A linear  
202 mixed-effects model was also used to model the relationship between ASRM measures (as the  
203 dependent variable) and saliva variables (as the fixed effect), with total workload included as  
204 a covariate and player identity included as a random effect. Polynomial terms were included in  
205 the model to accommodate non-linear responses and were retained if statistically significant.  
206 Separate analyses were performed for each ASRM measure. The conditional R<sup>2</sup> value (which  
207 considers both fixed and random effects in the model) is provided as a goodness-of-fit measure  
208 for these relationships. Data for non-linear relationships is presented as means and 95% CI  
209 with estimated ASRM responses at typically very low (-2 SD), low (-1 SD), mean, high (+ 1  
210 SD) and very high (+2 SD) values of each salivary predictor variable (43).

211

## 212 **Results**

213

### 214 *Longitudinal Analysis of Salivary and ASRM Monitoring Variables*

215 Descriptive data of salivary and ASRM variables by season mesocycle are presented in Table  
216 1.

217

218 **\*\*\*Insert Table 1 Here\*\*\***

219

220 Relative to baseline, high workloads were observed in mesocycles two ( $P = < 0.001$ ; ES =  
221 *small*), four ( $P = 0.005$ ; ES = *small*), five ( $P = < 0.001$ ; ES = *small*), seven ( $P = < 0.001$ ; ES  
222 =*small*) and eight ( $P = < 0.001$ ; ES = *moderate*) and low workload was observed in mesocycle  
223 six ( $P = 0.047$ ; ES = *small*), (Figure 3, Panel A). Salivary IgA was lower than baseline across  
224 all mesocycles (ES = *trivial* to *small*) and lowest during mesocycle five ( $P = 0.003$ , ES = *small*),  
225 (Figure 3, Panel B). Salivary AA reduced to below baseline across mesocycles four to eight

226 (ES = *trivial* to *small*). This effect was significant for mesocycle eight ( $P = 0.047$ ; ES = *small*),  
227 (Figure 3, Panel C). Salivary C was highest during preseason ( $P = 0.006$ ; ES = *small*) and  
228 reduced to below baseline across mesocycles five to eight (ES = *trivial* to *small*). This effect  
229 was significant for mesocycle eight ( $P = 0.007$ ; ES = *small*), (Figure 3, Panel D). No significant  
230 changes were observed to s-T (Figure 3, Panel E). Salivary T:C was lowest during preseason  
231 (ES = *trivial*) and highest during mesocycles six ( $P = 0.011$ ; ES = *small*) and eight ( $P = <$   
232  $0.001$ ; ES = *small*), (Figure 3, Panel F).

233

234 **\*\*\*Insert Figure 3 Here\*\*\***

235

236 Perceived measures of fatigue, sleep quality and muscle soreness reduced to below baseline  
237 across the first half of the season and remained thereafter. This effect was significant for fatigue  
238 in mesocycle five ( $P = 0.030$ ; ES = *small*); for sleep quality in mesocycles four ( $P = 0.011$ ; ES  
239 = *small*), five ( $P = 0.003$ ; ES = *small*), six ( $P = 0.009$ ; ES = *small*), seven ( $P = 0.025$ ; ES =  
240 *small*) and eight ( $P = 0.040$ ; ES = *small*); for muscle soreness in mesocycles four ( $P = 0.017$ ;  
241 ES = *small*), five ( $P = 0.005$ ; ES = *small*), six ( $P = 0.007$ ; ES = *small*), seven ( $P = 0.021$ ; ES =  
242 *small*) and eight ( $P = 0.030$ ; ES = *small*) and for the ASRM total in mesocycles five ( $P = 0.008$ ;  
243 ES = *small*) and six ( $P = 0.019$ ; ES = *small*) (Figure 4, Panels A, B, C and F). No changes ( $P$   
244  $> 0.05$ ) were observed to perceived stress level or mood (Figure 4, Panels D and E).

245

246 **\*\*\*Insert Figure 4 Here\*\*\***

247

#### 248 ***Relationships Between Salivary and ASRM Monitoring Variables***

249 S-IgA shared a quadratic relationship with perceived fatigue ( $P = 0.017$ ; ES = *Trivial*), (Table  
250 2; Figure 5, Panel A). S-T shared quadratic relationships with perceived fatigue ( $P = 0.012$ ; ES

251 = *Trivial*), sleep quality ( $P = < 0.001$ ; ES = *Trivial*) muscle soreness ( $P = 0.012$ ; ES = *Trivial*)  
252 and ASRM Total ( $P = 0.027$ ; ES = *Trivial*), (Figure 5, Panels B, C, D and E). S-C shared linear  
253 relationships with perceived fatigue ( $P = 0.031$ ; ES = *Trivial* ↑) and sleep quality ( $P = 0.031$ ;  
254 ES = *Trivial* ↑) (Table 2). S-T:C shared linear relationships with perceived fatigue ( $P = 0.014$ ;  
255 ES = *Trivial* ↓) and sleep quality ( $P = 0.031$ ; ES = *Trivial* ↑) (Table 2).

256

257 \*\*\**Insert Table 2 Here*\*\*\*

258

259 \*\*\**Insert Figure 5 Here*\*\*\*

260

## 261 **Discussion**

262

263 The first aim of this study was to investigate the longitudinal changes to salivary and ASRM  
264 monitoring variables across a professional football season. Longitudinal changes were  
265 observed in all salivary variables, with s-IgA, s-C and s-T:C responding to changes in the  
266 workload of players across mesocycles. Improvements in ASRM measures were observed  
267 across the first half of the competitive season and were generally maintained thereafter. The  
268 second aim of this study was to investigate the interrelationships of salivary and ASRM  
269 measures. Relationships were identified between s-IgA and fatigue; s-T and fatigue, sleep  
270 quality and muscle soreness; s-C and fatigue and sleep quality and s-T:C and fatigue and sleep  
271 quality.

272

273 The most important finding of this investigation was the chronic cross-season suppression of  
274 s-IgA relative to baseline measures (Figure 3, Panel B). Salivary IgA is the most abundant  
275 antimicrobial protein in saliva and is indicative of mucosal immunological status (17). Indeed,

276 reductions in s-IgA are associated with an increased risk of URTI and URTS in elite level  
277 professional football players (19, 24). In the current investigation, baseline s-IgA was  
278 calculated as the average of values measured following a recovery day, during single game  
279 weeks in mesocycle one. We reasoned that this was the most appropriate representation of  
280 optimal player 'fitness' (i.e. following pre-season), when 'fatigue' was low (i.e. early in the  
281 competitive season, following a recovery day during single game weeks) and, thus, when  
282 holistic stress balance was optimal. Repeated exposure to training and match-play places  
283 significant stress on the SNS, and prolonged SNS activation is thought to reduce s-IgA  
284 secretion by reducing the availability of polymeric immunoglobulin receptors (p-IgR), which  
285 initiate the transit of s-IgA to saliva (17). Recent research has demonstrated cross-season  
286 reductions in s-IgA in AFL players (17) and reductions to s-IgA in response to high fixture  
287 densities (5) ( $> 1$  game per week) and workload (7) in football. Since baseline measures herein  
288 relate to the physiological status of players during single game weeks, the suppression of s-IgA  
289 likely reflects the supplementary effect that high fixture densities ( $> 1$  game per week) exert  
290 on s-IgA. Indeed, the EC has the highest fixture density of all the major European Leagues (2),  
291 and the current cohort were regularly exposed to fixture densities  $> 1$  game / week (Figure 1).  
292

293 The lowest s-IgA values were observed during mesocycle five (Figure 3, Panel B), which  
294 coincides with the Christmas fixture period (Figure 1). This mesocycle includes sequential  
295 double- and treble-game weeks, and has been shown to cause a transient reduction in s-IgA  
296 (5). Morgans and colleagues (5) reported that s-IgA returned to baseline  $\sim 10$  d after a return  
297 to regular match density ( $\leq 1$  game per week). Interestingly, we observed a similar trend for s-  
298 IgA recovery in mesocycle seven, when match density was lowest. Our results indicate that  
299 periods of intensified match load can suppress s-IgA, and that subsequent alleviations can  
300 mitigate this response. That s-IgA was low during preseason might reflect the low training

301 status and stress tolerance of players expected at this time (24). Indeed, an increase in s-C and  
302 a decrease in s-T:C were also observed during preseason training (Figure 3, Panels D and F).

303

304 Salivary C and s-AA followed similar transient reductions during the second half of the season  
305 (Figure 3, Panels C and D). Values were lowest in mesocycle eight, when workload (Figure 2,  
306 Panel A) and fixture density (Figure 1) were highest. Cortisol is secreted from the adrenal  
307 cortex via the hypothalamic pituitary adrenal axis (HPA) (21), and exerts catabolic effects to  
308 reduce protein synthesis and increase protein degradation (20). Salivary AA is secreted by  
309 mucosal cells via the sympathetic adrenal medullary (SAM) axis (21), and contributes to  
310 digestion and mucosal immunity (16). Owing to their reactivity to HPA and SAM axis  
311 stimulation, both are used as quantitative stress markers in athletes (21). Strong correlations  
312 are reported between s-C and total workload (4) and increases in cortisol are reported at the  
313 end of the competitive season (31) and during periods of increased workload (30) in football  
314 players. Similarly, s-AA is reported to increase during periods of intensified competition (22)  
315 and workload (23). Accordingly, our results contrast previous findings (4, 22, 23, 30, 31) and  
316 might indicate an adaptive training state across the season. Indeed, player ASRM responses  
317 during the second half of the season herein were consistent with adaptive training (13).  
318 Alternatively, recent research suggests hyposensitivity of the HPA axis and a reduced cortisol  
319 response to stress testing in overtrained athletes (44). Accordingly, it is also (conversely)  
320 possible that our result indicates maladaptive training. However, to date, there are no reports  
321 of this response in professional football players.

322

323 We observed negligible cross-season changes to s-T (Figure 3, Panel E), but an increase in s-  
324 T:C during mesocycle six (Figure 3, Panel F) when workload was low, resulting from a trivial  
325 increase in s-T (Figure 3 Panels D and E). Testosterone is a steroid hormone secreted from the

326 testes and adrenal glands via the hypothalamic pituitary gonadal (HPG) (testicular) and HPA  
327 (adrenal gland) axes (20). It exerts anabolic effects to increase protein synthesis and decrease  
328 protein degradation (20). Research to date indicates acute quantitative changes to T and C,  
329 signalling a catabolic state in relation to the intensity and duration of preceding workload (9,  
330 45, 46). Previous longitudinal investigations have reported equivocal changes to T and  
331 decreases in T:C at the end of the season and during periods of increased workload (30, 31).  
332 Accordingly, our finding for s-T is consistent with previous research (30, 31). That s-T:C  
333 appears to have increased in response to low workload is also consistent with previous research  
334 (30, 31) and indicates that mid-season reductions in workload can improve hormonal balance  
335 in players. The increase in s-T:C at the end of the competitive season is contrary to previous  
336 research (30, 31), and might be explained by differences in end of season game density, training  
337 loads and other inter-team factors between investigations. In the current investigation, this  
338 change was related to a concurrent reduction in both s-T and s-C in mesocycle eight, suggesting  
339 a maladaptive training state. This might be explained by increases in psychophysiological  
340 stress (20) related to the particularly high game density (Figure 1) and workload (Figure 3,  
341 Panel A) during this phase of the season.

342

343 Perceived player fatigue, sleep quality and muscle soreness improved across the first half of  
344 the season (Figure 4, Panels A, B and C). Equivocal changes were observed for perceived stress  
345 level and mood (Figure 4, Panels D and E). The ASRM used herein are typically sensitive to  
346 daily, within-weekly and seasonal changes in training load in English Premier League (EPL)  
347 and AFL players (14, 15, 47, 48) and correlate with daily training load during pre-season and  
348 in-season mesocycles (8, 14, 15). In the current investigation, fatigue, sleep quality and muscle  
349 soreness were worst during preseason, which might reflect the low training status expected at  
350 this time (24). However, in-season ASRM did not appear to respond to changes in workload

351 or game density. Previous scientific literature suggests that ASRM measures might not account  
352 for the effect of all (non-training related) stressors (49). As such, it is possible that non-training  
353 stressors during the in-season phase disguised ASRM changes related to workload and game  
354 demands, and might also explain the large standard deviations observed in the ASRM measures  
355 (Figure 4). As reported previously, it is also possible that players manipulated ASRM responses  
356 for their own benefit (i.e. team selection) during the in-season phase (12). However, in  
357 accordance with previous recommendations (12), we educated players regarding ASRM prior  
358 to the investigation. Accordingly, the temporal improvement in ASRM observed herein  
359 suggests an adaptive training state.

360

361 Salivary cortisol and s-T:C were linearly related to perceived fatigue. For these relationships,  
362 increases in s-C were associated with increased fatigue, whereas increases in s-T:C were  
363 associated with reduced fatigue (Table 2). Furthermore, s-T shared a quadratic relationship  
364 with perceived fatigue, whereby very low levels of s-T (- 2 SD) were associated with the most  
365 compromising effects (Figure 5, Panel B). To date, cortisol has demonstrated equivocal (46)  
366 or negative (21) effects on perceived fatigue in athletes and is associated with increases in  
367 anxiety and depressive state (20). Conversely, increases in testosterone and T:C have been  
368 reported to improve perceived fatigue (46). Accordingly, our results are consistent with  
369 previous research and indicate that s-C, s-T and s-T:C monitoring can objectively determine  
370 fatigue status in professional football players.

371

372 Sleep quality was linearly related to s-C and s-T:C (Table 2). Increases in s-C were associated  
373 with compromised sleep quality, whereas increases in s-T:C were associated with an improved  
374 response. Also, s-T shared a non-linear relationship with sleep quality, whereby very low levels  
375 of s-T (-2 SD) were associated with the most compromising effects (Figure 5, Panel C). Our

376 findings contrast recent research that demonstrated unclear relationships between s-C, s-T, s-  
377 T:C and sleep quality (50). Serpell and colleagues (50) used a wrist actigraphy measure of sleep  
378 quality across a short (4 d) pre-season rugby training camp. Our contrasting findings might  
379 relate to differences in the training and competition demands of rugby and football, differences  
380 in the relative fitness and fatigue profiles of the players at the point of data collection and / or  
381 the methods used to measure sleep quality. Notwithstanding, sleep quality is thought to share  
382 an intricate relationship with the HPA axis, and excessive HPA axis activation is thought to  
383 compromise sleep quality as a consequence of increases in systemic cortisol and catecholamine  
384 concentrations (51). Moreover, sleep quality is proposed to be an important mediator of  
385 testosterone, since most testosterone secretion occurs during night-time sleep (50). To that end,  
386 the negative association of s-C and the beneficial association of s-T with sleep quality herein  
387 are unsurprising. These findings support attempts to improve player sleep quality in practice  
388 (52), since sleep quality evidently relates to hormonal balance in professional football players.

389  
390 A quadratic relationship was observed between s-T and muscle soreness (Figure 5, Panel D),  
391 for which very low (- 2 SD) levels of s-T were associated with the most compromising effects.  
392 We also observed a trend for s-C to relate to muscle soreness (Table 2), for which increases in  
393 s-C were associated with a compromised response ( $P = 0.057$ ;  $ES = Trivial$ ). These  
394 relationships might reflect the positive anabolic effects of testosterone (20, 21) and the negative  
395 catabolic consequences of cortisol (20, 21) on muscular recovery following training and match  
396 play. Indeed, muscle recovery is augmented in anabolic as opposed to catabolic environments  
397 (53).

398  
399 We also observed a quadratic relationship between s-IgA and fatigue (Figure 5, Panel A)  
400 whereby very low (-2 SD) and very high (+2 SD) s-IgA were associated with compromised



401 fatigue. That low s-IgA was associated with compromised fatigue might be explained by  
402 reductions in s-IgA during periods of sustained, excessive SNS activation (17). Indeed, this is  
403 likely during prolonged periods of high workload (7) or game density (5), such as mesocycle  
404 five. That very high s-IgA was associated with compromised fatigue might be related to periods  
405 of high acute workloads inducing increases in SNS activity, s-IgA secretion (20) and player  
406 fatigue. Equally, it is also possible that incidences of very high s-IgA are explained by infection  
407 and that concurrent increases in perceptual fatigue are explained by increases in Interleukin-1  
408 (IL-1) as part of an infection-related immune response (54). Recent investigations indicate  
409 relationships between s-IgA and perceived player wellness, energy level, readiness to train, and  
410 muscle soreness in football players (55). To our knowledge, this is the first investigation to  
411 report the relationship between s-IgA and fatigue in professional football players.

412

### 413 **Limitations**

414

415 This investigation was conducted using a single homogenous sample but acknowledge that  
416 other cohorts might respond differently owing to situational, contextual and inter-team factors.  
417 We did not screen saliva samples for blood contamination and acknowledge that this is a  
418 limitation that could affect the accuracy and validity of the findings. Accordingly, we  
419 recommend that future research should screen saliva samples for blood contamination and  
420 control for behaviours that might induce saliva sample blood contamination (i.e. tooth  
421 brushing). We also acknowledge that the absence of a control group challenges the capacity to  
422 discern between workload-induced and normal seasonal variation in the salivary biomarkers.  
423 This should be considered when interpreting the results. Finally, we acknowledge that the in-  
424 house ELISA method employed herein lacks independent scientific validation, and thus advise  
425 the reader that some caution should be applied when interpreting the s-AA and s-T results.

426

## 427 **Practical Applications**

428

429 Our results indicate a chronic suppression of mucosal immunity and accordingly, practitioners  
430 should adopt practices to promote immune function. Practical recommendations to promote  
431 immune function in athletes have been provided previously (10).

432

433 Periods of high game density and workload exacerbated disturbances to mucosal immunity,  
434 whereas reductions mitigated the response. Accordingly, planned periods of reduced workload  
435 or squad rotation should be considered around demanding mesocycles to accommodate  
436 immunological and hormonal recovery. Our results indicate that this might be particularly  
437 important around the Christmas fixture period and towards the end of the season.

438

439 Our findings indicate merit in the use of s-IgA, s-T, s-C and s-T:C monitoring in professional  
440 football players. These measures responded to changes in game density and workload and  
441 related to perceived fatigue, sleep quality and / or muscle soreness. Practitioners should  
442 consider reducing player workload in cases where s-T and s-T:C measures are  $< -1$  SD below  
443 baseline or when s-C is  $> 1$  SD above baseline, since these values were associated with  
444 compromised wellbeing. Similar considerations should be afforded to players that present with  
445 particularly low ( $< -1$  SD below baseline) or high ( $> 1$  SD above baseline) s-IgA measures.

446

## 447 **Conclusion**

448

449 Football players can experience a chronic suppression of mucosal immunity and s-IgA, s-T, s-  
450 C and s-T:C measures are influenced by changes in workload and / or game density and relate  
451 to perceived measures of fatigue, sleep quality and muscle soreness.

452

### 453 **Conflict of Interest**

454

455 None. The results of the present study do not constitute endorsement by ACSM. The results of  
456 the present study are presented clearly, honestly, and without fabrication, falsification or  
457 inappropriate data manipulation.

458

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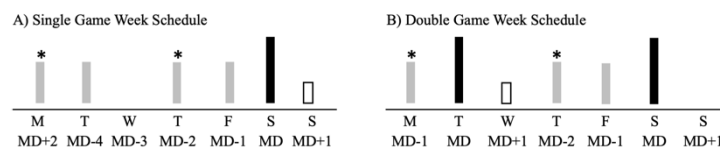
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**Figure 1.** Overview of the sample period showing game distribution and average game density (average number of games per week, per mesocycle) relative to in-season mesocycles and calendar month. Vertical lines indicate the distribution of competitive games. *PS*, *preseason*; *M*, *mesocycle*.

Season Phase	Pre-Season					In-Season																												Off-Season																		
Games	[Vertical lines representing game distribution]																																																			
Microcycle	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20	21	22	23	24	25	26	27	28	29	30	31	32	33	34	35	36	37	38	39	40	41	42	43	44	45	46	47	48	49	50	51	52
Mesocycle	PS					M1					M2					M3					M4					M5					M6					M7					M8											
Game Density	0					1					1.2					1.2					1.2					1.4					1.2					0.8					1.6											
Month	J	u	n	Jul	Aug	Sep	Oct	Nov	Dec	Jan	Feb	Mar	Apr	May	Jun																					Jun																

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688 **Figure 2.** Example data collection schedule relative to team match and training activities for  
 689 A) single and B) double game weeks across the investigation. Black bars, match day; Grey  
 690 bars, training day; Hollow bars, recovery session; Gaps, recovery day (off) and \*, saliva  
 691 sample and ASRM data collection.

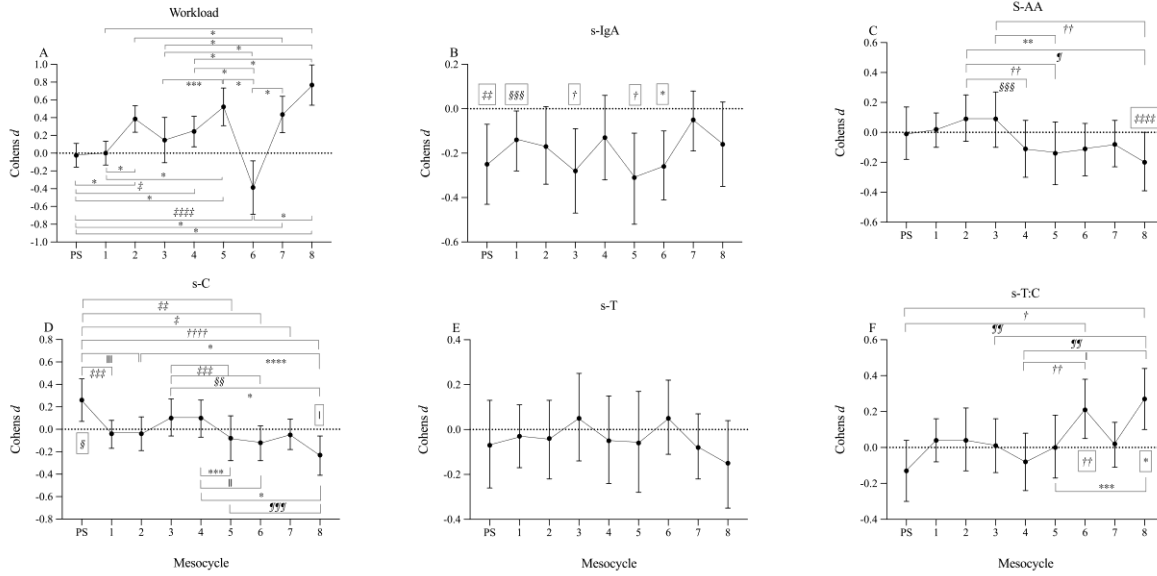


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694 **Figure 3.** Standardised changes to workload and salivary biomarkers across preseason (PS)  
 695 and eight six-week in-season mesocycles. *s-IgA*, salivary immunoglobulin-A; *s-AA*, salivary  
 696  $\alpha$ -amylase; *s-C*, salivary cortisol; *s-T*, salivary testosterone; *s-T:C*, salivary testosterone :  
 697 cortisol ratio. Boxed symbols indicate a difference between season phase and baseline  
 698 (salivary variables only). Horizontal lines indicate pairwise differences between season phases.  
 699 \*,  $P < 0.001$ ; †,  $P = 0.003$ ; ‡,  $P = 0.005$ ; §,  $P = 0.006$ ; |,  $P = 0.007$ ; ¶,  $P = 0.008$ ; \*\*,  $P =$   
 700  $0.009$ ; ††,  $P = 0.011$ ; ‡‡,  $P = 0.012$ ; §§,  $P = 0.017$ ; ||,  $P = 0.019$ ; ¶¶,  $P = 0.022$ ; \*\*\*,  $P =$   
 701  $0.025$ ; †††,  $P = 0.026$ ; ‡‡‡,  $P = 0.027$ ; §§§,  $P = 0.035$ ; |||,  $P = 0.036$ ; ¶¶¶,  $P = 0.042$ ; \*\*\*\*,  
 702  $P = 0.044$ ; ††††,  $P = 0.045$ ; ‡‡‡‡,  $P = 0.047$ .

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706 **Figure 4.** Standardised changes to perceived fatigue, sleep quality, muscle soreness, stress

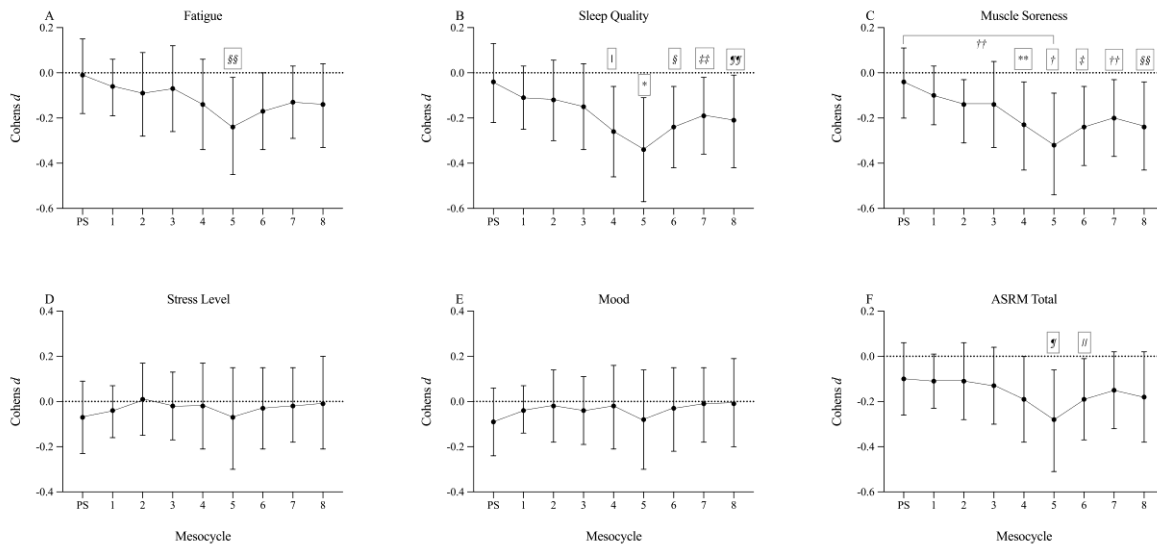
707 level, mood and athlete self-report measures total score (ASRM total) across pre-season (PS)

708 and eight six-week in-season mesocycles. Boxed symbols indicate a difference to baseline

709 measures. Horizontal lines indicate a difference between season phases. \*,  $P = 0.003$ ; †,  $P =$

710  $0.005$ ; ‡,  $P = 0.007$ ; §,  $P = 0.009$ ; |,  $P = 0.011$ ; ¶,  $P = 0.013$ ; \*\*,  $P = 0.017$ ; ††,  $P = 0.021$ ;

711 ‡‡,  $P = 0.025$ ; §§,  $P = 0.030$ ; ||,  $P = 0.038$ ; ¶¶,  $P = 0.040$ .

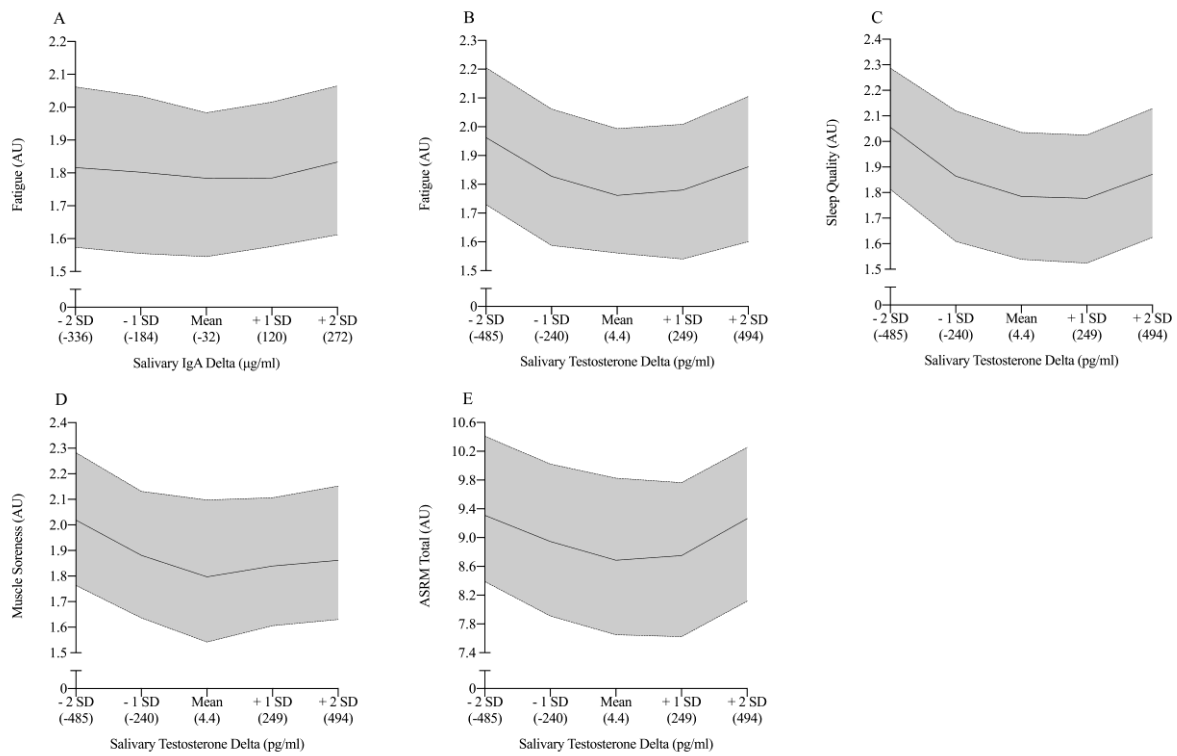


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713

714 **Figure 5.** Non-linear relationships between ASRM and salivary monitoring variables. Data are  
 715 presented as mean  $\pm$  95% CI bands, denoted by grey areas on the curve. Figures demonstrate  
 716 predicted player ASRM responses at very low (-2 SD), low (-1 SD), mean, high (+1 SD) and  
 717 very high (+2 SD) s-IgA (panel A) and s-T (panels B, C, D and E) levels. Model-predicted s-  
 718 IgA and s-T values at -2 SD, -1SD, mean, +1 SD and +2 SD are also provided in brackets on  
 719 the X-axis.

720



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