

1 **Differential ratings of perceived match and training exertion in youth female soccer**

2 Original investigation

3 Matthew D. Wright¹, Francisco Songane¹, Stacey Emmonds², Paul Chesterton³, Matthew
4 Weston¹, Shaun J. McLaren^{2,4}

5

6 **Affiliations:** ¹Department of Exercise and Sport, Paramedic and Operational
7 Departmental Practice, School of Health and Social Care,
8 Teesside University, Middlesbrough, UK

9 ²Carnegie Applied Rugby Research Centre, Institute for Sport,
10 Physical Activity and Leisure, Leeds Beckett University, Leeds,
11 UK.

12 ³Department of Physiotherapy, Sports Rehabilitation, Dietetics
13 and Leadership, School of Health and Social Care, Teesside
14 University, Middlesbrough, UK

15 ⁴England Performance Unit, The Rugby Football League, Leeds,
16 UK.

17

18

19 Corresponding Author

20 Matthew Wright

21 Teesside University

22 Middlesbrough

23 United Kingdom

24 TS9 6 EB

25 m.wright@tees.ac.uk

26 +44 (0) 1642 34 2267

27

28 Running head: Differential RPE in girls soccer

29

30 Abstract word count: 250

31 Text only word count: 3619

32 Tables = 2 Figures = 2

33 **Abstract**

34

35 Purpose: To understand the validity of differential ratings of
36 perceived exertion (dRPE) as measure of girl's training and
37 match internal loads.

38 Methods: Using the centiMax scale (CR100[®]), session dRPE for
39 breathlessness (sRPE-B) and leg muscle exertion (sRPE-L) were
40 collected across a season of training (soccer, resistance, fitness)
41 and matches from 33 players (15 ± 1 years). Differences and
42 associations between dRPE were examined using mixed and
43 general linear models. Our minimal practical important
44 difference was 8 arbitrary units [AU].

45 Results: Mean (AU ± standard deviation ~16) sRPE-B and
46 sRPE-L were 66 and 61 for matches, 51 and 49 for soccer, 86
47 and 67 for fitness, and, 45 and 58 for resistance. Session RPE-B
48 was rated most likely harder than sRPE-L for fitness (19 AU;
49 90% confidence limits [CL]: ±7) and most likely easier for
50 resistance (-13; ±2). Match (5; ±4) and soccer (-3; ±2)
51 differences were likely to most likely trivial. The within-player
52 relationships between sRPE-B and sRPE-L were very likely
53 moderate for matches ($r = 0.44$; 90% CL: ±0.12) and resistance
54 training (0.38; ±0.06), likely large for fitness training (0.51;
55 ±0.22) and most likely large for soccer training (0.56; ±0.03).
56 Shared variance ranged from 14-35%.

57 Conclusions: Practically meaningful differences between dRPE
58 following physical training sessions coupled with low shared
59 variance in all training types and matches suggest that sRPE-B
60 and sRPE-L represents unique sensory inputs in girls soccer
61 players. Our data provide evidence for the face and construct
62 validity of dRPE as measures of internal load in this population.

63 Introduction

64 The English Football Association support girls soccer Regional
65 Talent Clubs (RTC) to develop elite players. There is an
66 abundance of research on the physical aspects of male soccer
67 (e.g., match analysis, fitness characteristics, and training
68 patterns) but as yet research on the female game is largely
69 confined to match analysis of elite senior competition and fitness
70 characteristics. The demands of RTC soccer have not been
71 previously captured, making it difficult for practitioners to
72 adequately plan effective training to prepare players for the
73 physical demands of matches. Using data from elite women¹ to
74 inform the training of developmental players is not ideal given,
75 for example, differences in maturity and fitness ².

76 Understanding the internal response to external loads placed
77 upon players is particularly relevant to practitioners. ^{3,4} Internal
78 response to training can be measured practically using session
79 ratings of perceived exertion (sRPE), which provide a valid
80 quantification of relative exercise intensity and internal load
81 across a range of exercise modalities. ^{5,6} Ratings of perceived
82 exertion are also cost- and time-effective, lending to girls RTC
83 programmes where resources can be limited. However, sRPE, as
84 a gestalt measure of internal load, may not adequately appraise
85 the entire range of exercise-induced perceptual sensations,
86 thereby lacking sensitivity.⁷ Differentiating between central and
87 peripheral inputs may be one solution to overcome this issue and,
88 provide a broader understanding of internal training load. ^{7,8}

89 An emerging body of evidence is available to suggest that
90 differential RPE (dRPE) are a worthwhile addition to internal
91 monitoring procedures in team sports, as athletes often perceive
92 a substantial difference between their central (i.e. breathlessness;
93 sRPE-B) and peripheral (i.e. leg muscle; sRPE-L) exertion when
94 this difference is theoretically known or expected (face and
95 construct validity). ⁹ For these reasons, dRPE have been
96 recommended as a suitable indirect alternative to measuring an
97 athlete's internal physiological (i.e. cardiovascular) and
98 biomechanical (i.e. neuromuscular) internal loads.¹⁰ This could
99 be useful to those responsible for the physical development of
100 female youth soccer players, as physiological and biomechanical
101 systems differ in rates of adaptation, recovery and
102 growth/development. ^{10,11}

103 In response to experimental evidence demonstrating no
104 difference between dRPE (from one another and from global
105 sRPE; ¹²⁻¹⁵), some authors have questioned the value in this
106 method. ^{14,16} Furthermore, it has been suggested that dRPE and
107 global sRPE are not mutually exclusive constructs, ¹⁶ meaning
108 that a change in one dimension will be met proportionately by
109 all others. This has implications for athlete monitoring, because
110 it would be inefficient to collect several highly correlated

111 measures of training load explaining the same information.¹⁷ As
112 such, there is a need for further research to understand if dRPE
113 provides added value in the measurement of internal load over
114 sRPE alone. For example, do dRPE provide different
115 information not only to one another but also when compared to
116 sRPE? Moreover, no research has yet evaluated dRPE in youth,
117 where research on adult populations may not be transferable
118 given the potential for cognitive development to influence the
119 accuracy of RPE.¹⁸

120 Our retrospective study was therefore designed with an
121 overarching aim of providing a comprehensive understanding of
122 dRPE and its validity in girls RTC soccer. Subsequently, the
123 objectives were to: 1) quantify differences in ratings (global and
124 differential) following training and match-play as a means of
125 assessing validity via known groups differences, and 2) provide
126 the first examination of the within-player associations between
127 each dRPE and global sRPE for matches, soccer and, resistance
128 training.

129

130 **Methods**

131 *Participants*

132 Thirty-three girls' soccer players (age 15 ± 1 years, stature 163
133 ± 7 cm, body mass 55 ± 9 kg, maturity offset 1.8 ± 1.1 years from
134 peak height velocity) representing an FA Regional Talent Club,
135 participated in this retrospective observational research.
136 **Maturation, expressed as years from peak-height velocity was**
137 **estimated using the players' mass, sitting and standing stature**
138 **with chronological age.**¹⁹ Players typically attended two 90-
139 minute soccer and one 70-minute resistance training session each
140 week. Resistance training involved a variety of neuromuscular
141 training stimuli as outlined previously.²⁰ Occasionally, typical
142 training sessions were replaced throughout the season with
143 conditioning sessions targeting the development of aerobic
144 fitness. **These sessions typologies were classified for analysis by**
145 **their primary or targeted goal ('soccer', 'resistance', 'fitness').**
146 Players also completed one 60 minute "movement" training
147 session which combined technical and fundamental movement
148 skills aiming to provide broad and varied cognitive and technical
149 stimuli. As such, we did not feel it was conceptually relevant to
150 differentiate between perceptual stimuli here and these
151 **"movement"** sessions were not included.

152 Ethics approval was granted from the University ethics
153 committee (SSSBLREC008) and conducted to standards set out
154 in the Declaration of Helsinki. After obtaining player and
155 parental consent, RPE were collected for each training session
156 and, nine soccer matches over the course of a season. We
157 collected 1097 observations for soccer training (**n=50 training**

158 sessions), 558 for strength and conditioning (n=33) and 64 for
159 fitness training (n = 3). In total, 157 match observations (n=10)
160 were made throughout the season. On each observation all three
161 RPE were collected in the same order (global RPE, sRPE-B,
162 sRPE-L) and at the same time.

163

164 *Methodology*

165 Approximately 15–30 minutes post-session, players used a
166 touch-screen tablet application²¹ (Iconia One 7 B1-750, Taipei,
167 Taiwan: Acer Inc.) to record their sRPE (global, sRPE-B, sRPE-
168 L) via the CR100[®] scale, which was numerically blinded,
169 labelled with the idiomatic English verbal anchors. This allowed
170 each player to record their scores confidentially to mitigate
171 issues of conformation and cognitive bias (i.e., ratings
172 influenced by team mates). Players were habituated with this
173 procedure for approximately 1 year prior to the current study,
174 ensuring familiarity with the entire range of sensations that
175 correspond to each category of effort within the CR100[®] scale
176 (i.e. ‘anchoring’). Players received prior instruction on the
177 definition of effort perception, including its separation from
178 other exercise related sensations such as fatigue, pain or
179 discomfort, and how to appraise feelings of overall effort,
180 breathlessness, leg muscle exertion and technical/cognitive
181 demands.

182

183 *Statistical Analysis*

184 We inspected the histograms and Q-Q plots of the raw data
185 visually for normal distribution. All data were approximately
186 normal with the exception of sRPE-B where a slight positive
187 skew was observed for fitness. Mixed linear modelling (SPSS
188 Statistics version 24) was used to analyse the difference between
189 fixed effects (comparing between sRPE types within a training
190 modality or match, and comparing training sRPE with match
191 sRPE [reference category]), while using a random effect for
192 player (intercept; variance components) to account for repeated
193 within-athlete observations (subsequently expressed as standard
194 deviations [SD]). To determine if higher global sRPE were
195 associated with dRPE, a general linear model was used to
196 provide estimates of within-player correlations.^{8,22}

197 Uncertainty in all estimates were expressed as 90% confidence
198 intervals (CI). We subsequently applied non-clinical magnitude-
199 based decisions^{23,24} to describe the size and precision of sRPE
200 differences and correlations. Here, the disposition of the effect
201 distribution (*t* for sRPE differences and *z* for sRPE correlations)
202 in relation to thresholds for substantiality were evaluated as
203 probabilities (percent chances). For sRPE differences, we used a

204 minimum practically important difference of 8 AU, as this
205 magnitude represents the shift required for a player's rating to be
206 typically closer or equal (e.g. halfway) to the next or preceding
207 effort category on the non-linear CR100[®] scale⁹. This is more
208 conservative compared to choosing a distribution-based
209 approach (e.g., $0.2 \times$ between-player SD), which are often far
210 lower than 7–10 AU.⁹ **We acknowledge that this threshold is not
211 perfect, particularly as the non-linearity of category-ratio scales
212 presents a challenge to setting such a threshold however, we feel
213 this represents a step-forward in attempting to define a practical
214 important difference.** Standardised effect sizes were calculated
215 from the pooled within- and between-subject SD and reported
216 but not interpreted not only because they may lack practical
217 context but also as they maybe more vulnerable to sample
218 variance.²⁵ For within-player correlations, and in light of no
219 practical anchor for a meaningful association, thresholds of 0.10,
220 0.30, 0.50, and 0.70 were used to anchor small, moderate, large
221 and very large relationships, respectively.²³ Given the above
222 concerns regarding standardization the raw effect slopes were
223 calculated and presented additionally.

224 Probabilities of effects being greater than these thresholds were
225 qualified as: 0.5–5.0 % very unlikely; 5.0–24.9 % unlikely;
226 25.0–74.9 % possibly; 75.0–94.9 % likely; 95.0–99.5 % very
227 likely; > 99.5 % most likely. Finally, given the chance of
228 inflated type I error with multiple comparisons, all inferences
229 were re-evaluated with 99% CI.²³

230

231 **Results**

232 Mean global and differential sRPE for each typology are
233 presented with between- and within-player SDs in Figure 1. On
234 average, matches were rated hard to very hard for both
235 breathlessness and leg muscle exertion; soccer training was rated
236 hard for breathlessness and leg muscle exertion; fitness training
237 was rated very to extremely hard for breathlessness and hard to
238 very hard for leg muscle exertion, and; resistance training was
239 rated somewhat hard to hard for breathlessness and hard to very
240 hard for leg muscle exertion.

241 We present differences in exertion between typologies in Table
242 1. Session RPE-B was most likely harder than sRPE-L for fitness
243 and most likely easier for resistance. Match and soccer dRPE
244 differences were likely to most likely trivial.

245 The differences between RPEs, within typologies, are presented
246 in Table 2. Compared to matches: soccer training was rated
247 substantially easier for all exertion types; resistance training was
248 substantially easier for global sRPE and sRPE-B, but not sRPE-
249 L, and; fitness training was rated substantially harder for all
250 exertion types.

251 Within- player correlations between exertion types are presented
252 in Figure 2 and Figure 3. The within-player relationships
253 between sRPE-B and sRPE-L were very likely moderate for
254 matches ($r^2 = 0.19$) and resistance training ($r^2 = 0.14$), likely
255 large for fitness ($r^2 = 0.26$) training and most likely large for
256 soccer training ($r^2 = 0.31$).

257

258

259 **Discussion**

260 We present for the first-time data describing the internal training
261 and match **exertion** in girls RTC soccer. Through examination of
262 post-match and training ratings (global and differential) we
263 observed practically meaningful differences between sRPE-B
264 and sRPE-L following training with distinct physical outcomes
265 (e.g., fitness and resistance). These differences may reflect the
266 different physiological stresses of fitness and resistance training,
267 providing further evidence of face and construct validity of
268 dRPE via known groups differences.²⁶ Conversely, we also
269 observed moderate to large within-player associations between
270 differential and global sRPE (range in within-player r of 0.38–
271 0.67). While this supports previous theories that differentiated
272 ratings are not mutually exclusive constructs,¹⁶ it also implies
273 that the shared variance between ratings is low (14–45%).
274 Collectively, these findings suggest that dRPE represent unique
275 sensory inputs, providing evidence for face and construct
276 validity as measures of internal **response** in girls soccer players.

277

278 Practically meaningful differences between sRPE-B and sRPE-
279 L were observed in training typologies with a distinct physical
280 goal (i.e. fitness and resistance), yet differences in perception of
281 breathlessness and leg exertion observed in soccer training,
282 where the goal was primarily technical and/or tactical were,
283 trivial. This trivial difference could be explained by the fact that
284 although soccer training was not prescribed with a targeted
285 physical stimulus, the central and peripheral internal responses
286 associated with the session are nonetheless substantial (Figure 1,
287 ‘Hard’) and likely to vary on a session-to-session basis (ranging
288 from more central to more peripheral) across long operational
289 periods. For resistance training, however, global sRPE and
290 sRPE-L were rated substantially harder than sRPE-B (Table 2),
291 likely reflective of the musculoskeletal and neurological aspect
292 of this training typology. Given the goal of resistance training is
293 to stress the neurological and musculoskeletal systems by
294 exerting force against a resistance to elicit acute
295 (neuroendocrine) and chronic (neurological or morphological)
296 adaptations,^{27,28} it seems logical that players would perceive
297 higher sRPE-L when compared with sRPE-B. For fitness

298 sessions, sRPE-B was rated substantially harder than leg
299 exertion. These training sessions were running based interval
300 training and targeted improvements in soccer specific aerobic
301 fitness. ²⁹ Whilst, we were limited to 64 observations on only
302 three training sessions higher sRPE-B has been shown for
303 similar training sessions previously ²¹ and may reflect the central
304 or cardiovascular demands ³⁰ of this training modality. ³¹ Indeed,
305 higher cumulative sRPE-B has been associated with
306 improvements in Yo-Yo intermittent recovery test level 1
307 performance in team sport athletes. ⁹ Collectively, these sRPE-B
308 and sRPE-L differences provide evidence to support the validity
309 of dRPE in youth female soccer players.

310

311 In matches sRPE-B was harder than sRPE-L by 5 AU (90% CI
312 ~1 to 9, effect size 0.34,) but we did not regard this difference to
313 be practical meaningful (> 8 AU, Table 2). There was also a
314 trivial difference between match sRPE-B and global sRPE, yet
315 match sRPE-L was substantially lower than global sRPE. This
316 could suggest that the global effort sense is mediated more so by
317 central as opposed to peripheral factors in youth female soccer
318 players during matches. Indeed, match sRPE-B had the strongest
319 within-player association with global sRPE, which would further
320 support such a statement. Previously, peripheral sensations have
321 been rated higher than central in match play in elite male
322 Australian Rules Football players ⁸ and semi-professional male
323 soccer players ¹³. The disparity in these findings with our current
324 data could represent differences in aerobic and anaerobic
325 capability between adults and adolescents, ¹¹ with the latter
326 typically lower due to development, growth and maturation.
327 Adolescent girls may also be more efficient in re-synthesis of
328 phosphocreatine than women. ³² In contrast, previous literature
329 suggests perceptions of leg exertion appear to provide the
330 dominant sensory signal in younger children (8 – 12 years), but
331 this maybe explained by the choice of cycle ergometry as a
332 modality in these studies. ¹⁸ Overall, this could indicate that
333 central or aerobic fitness is an important physical quality
334 associated with the response to match-play in this population.

335

336 Despite dRPE appearing sensitive in the ability to capture
337 discrete sensory inputs, separate ratings for central and
338 peripheral perceived exertion may not be entirely mutually
339 exclusive constructs ¹⁶ and our data are in support of this. We
340 report for the first time moderate to large within-player
341 correlations between dRPE (range in r : 0.59–0.69) and of global
342 sRPE with both sRPE-B (0.59–0.69) and sRPE-L (0.34–0.51;
343 Figure 2). Practically, this implies that during girls soccer
344 training and match-play, a change in one sRPE dimension
345 (overall, central or peripheral) is strongly associated with a

346 change in any other. Despite this, our largest observed
347 correlation, between global and breathlessness RPE in soccer
348 training, was 0.67, which at best explains only 45% of the
349 variance between the two measures. Furthermore, despite no
350 practically meaningful differences between sRPE-B and sRPE-
351 L following match-play or soccer training, the shared variance
352 between the two measures was 19–31%. Thus, despite some
353 clear collinearity between global, central, and peripheral
354 perceived exertion, we feel that these data do in fact strengthen
355 the case for adopting dRPE to monitoring strategies in girls
356 soccer.

357

358 Data collected from players during training and matches can aid
359 athlete management, training prescription and decision
360 making—ultimately facilitating player development. In our
361 investigation, sRPE-B was substantially higher for fitness
362 training compared to matches. Soccer specific fitness has been
363 observed previously to improve over pre-season in response to
364 fitness training in these players but not the in-season period
365 where players perform predominantly soccer and resistance
366 training^{29,33} Together, these data suggest the use of targeted
367 fitness training interventions that increase sRPE-B (such as high-
368 intensity interval training²⁹) over the in-season period could be
369 justified particularly given the substantial sex differences
370 reported between boys and girls players.² Practitioners may
371 wish to design such interventions so as to sensibly expose
372 players to exertion that is beyond match intensity as opposed to
373 training that purely replicates competition. **However, given the**
374 **low number of observations for fitness in our study we would**
375 **recommend further research here.**

376

377 We observed substantial within- and between- player variation
378 in all sRPE types for all training typologies (Figure 1). For match
379 intensity, within-player (match-to match) variability was similar
380 to that reported in elite male AFL players,⁸ but our between-
381 player variability (heterogeneity) was larger. It is likely the range
382 in maturation and training status of our youth players explains
383 the greater between-player variation compared with professional
384 athletes. **Cardiorespiratory factors involved in RPE appear to**
385 **increase with aging and, adolescence corresponds with an**
386 **increase in logical-mathematic meaning.**¹⁸ **Whilst there is a**
387 **relative paucity of conclusive research in this area it is possible**
388 **that differences in both physical and cognitive maturation could**
389 **partly explain this heterogeneity.** This highlights the importance
390 of comparing within- rather than between players when
391 monitoring training in girls' soccer. Coaches and practitioners
392 should thus be aware of the uncertainty in these data when

393 assessing practically important changes in an individual player's
394 sRPE.

395

396 The common use of standardised effect sizes in sports
397 performance research has recently been challenged (e.g.
398 Kyprianou and colleagues ²⁵), with anchors of practical
399 importance recommended as preferable to interpret the
400 magnitude of an effect. ³⁴ We elected to use a minimum
401 practically important difference of 8 AU, as this magnitude
402 represents a typical 'on the scale' change required for a player's
403 RPE to be closer or equal (e.g. halfway) to the next or preceding
404 effort category across the non-linear CR100® scale. ⁹ We
405 acknowledge that this threshold is not perfect, but had we used
406 the more common approach of standardization (e.g., 0.2 SDs; ~3
407 AU in this instance) we would have interpreted substantial
408 differences between ratings that lack practical relevance (e.g., 5
409 of the 7 trivial inferences in Table 1 would have appeared
410 substantial). For example, match RPE-B would have appeared
411 likely harder than match RPE-L (81% chance), constituting a
412 small standardised effect size (0.34, \pm 0.26). The interpretation
413 of correlations using standardised thresholds (r and r^2) could be
414 similarly criticised. For example, despite moderate to large
415 correlations, changes in global sRPE between matches of $>22 \pm 8$
416 AU or $>13 \pm 3$ AU would be required to be equivalent to a
417 practically meaningful change in sRPE-L or sRPE-B
418 respectively. A potential additional advantage of reporting the
419 non-standardised slopes (figures 3 and 4) is that it allows
420 interpretation of these relationships in raw units that may be
421 more relatable for coaches and practitioners. We therefore
422 recommend consideration of a minimum practically important
423 difference (e.g., 8 AU) ⁹ for those interpreting RPE in both
424 research and practice.

425 The main limitation to our study was the observational, rather
426 than experimental, nature of the research design, which may
427 limit the level of evidence and overall conclusions drawn from
428 the data. Furthermore, while our aims were to further understand
429 dRPE in a girls soccer population, our findings may be limited
430 to this group and it is as yet unknown if the findings drawn from
431 our sample (one RTC) are reflective of the wider population. We
432 were also unable to quantify external load within this study
433 which may limit our understanding of the specific types of
434 activity that result in a given internal response (for example, we
435 do not know if a higher sRPE in a match is due to greater total
436 distance covered or the requirement to repeat more bouts of high-
437 speed running). However, this provides a notable first step to
438 understanding the demands of RTC soccer and further research
439 with multiple RTCs would be warranted.

440

441 *Practical applications.*

442 There may be several practical applications from both training
443 monitoring and physical preparation perspectives that can be
444 drawn from our current findings. Assessing the differences
445 between global and differential sRPE may provide practitioners
446 with useful information into the specific internal responses
447 following training and matches in youth female soccer players.
448 More specifically, since there appears to be a moderate to large
449 association between global, central and peripheral exertion,
450 substantial deviations from the linear relationship between any
451 two of these constructs can be used to infer on ‘unusual’ changes
452 that could be caused by fitness or fatigue.⁴ Regarding the
453 interpretation of an individuals’ data, we estimate that a
454 threshold of 8–19 AU represents possible to likely meaningful
455 changes in match or training sRPE. This was derived following
456 methods previously described,⁸ using our within-player SD of
457 15–16 AU, a threshold for minimum practical importance of 8
458 AU, an 80% confidence level. We acknowledge that 19 AU is
459 both a large and conservative threshold, but practitioners can be
460 confident that changes of this magnitude are likely free from
461 noise and also of real-world importance. Practically, changes of
462 this magnitude might simply represent a typically ‘hard’ session
463 being subsequently rated as ‘somewhat hard’ or ‘very hard’.
464 Alternatively, in athlete monitoring it may be more problematic
465 to make a type II rather than a type I error, a threshold of 8 AU
466 is possibly real e.g. harder (50% chance) but, practitioners
467 should be aware of the possibility that it could be either trivial
468 (34% chance), or indeed easier (16% chance). Finally, from a
469 physical preparation perspective, our data show that soccer
470 training alone may not provide an adequate stimulus to prepare
471 players for the internal demands of matches. Incorporating
472 aerobic conditioning to target sRPE-B above match intensity
473 and, neuromuscular training for sRPE-L into girls’ RTC training
474 could be beneficial to prepare players for the demands of the
475 game.²⁰

476

477 *Conclusions*

478 In the first investigation of girls soccer match and training dRPE,
479 we found practically meaningful differences between global,
480 central and peripheral ratings collected in youth female soccer
481 players following training sessions which target physical
482 outcomes. When the direction and magnitude of these
483 differences are aligned with the known physiological and
484 biomechanical responses to exercise, our data provide evidence
485 for the face and construct validity of dRPE in girls soccer
486 players. With the putative practical recommendations in mind,
487 our data suggest that dRPE are valid and a worthwhile addition
488 to training and match monitoring for RTC practitioners.

489

490 Figure legends:

491

492 Figure 1: Mean global and dRPE for matches and training
493 typologies with error bars represented the between- (thin black
494 lines) and within- (thick grey lines) player standard deviations.

495 Figure 2: Within-player correlations for sRPE-B and sRPE-L
496 with global RPE. Standardised (r) and raw (β) effects are
497 presented with the uncertainty expressed as $\pm 90\%$ confidence
498 limits.

499 Figure 3: Within-player correlations for sRPE-L with sRPE-B
500 with global RPE. Standardised effect sizes are presented (r) with
501 the uncertainty expressed as $\pm 90\%$ confidence limits

502

503 References

- 504 1. Datson N, Drust B, Weston M, Gregson W. Repeated
505 high-speed running in elite female soccer players during
506 international competition. *Sci Med Football*.
507 2018;00(00):1-7. doi:10.1080/24733938.2018.1508880.
- 508 2. Mujika I, Santisteban J, Impellizzeri FM, Castagna C.
509 Fitness determinants of success in men's and women's
510 football. *J Sports Sci*. 2009;27(2):107-114.
511 doi:10.1080/02640410802428071
- 512 3. Impellizzeri FM, Marcora SM, Coutts AJ. Internal and
513 external training load: 15 years on. *Int J Sports Physiol*.
514 *Perform*. 2019;14(2):270-273. doi:10.1123/ijsp.2018-
515 0935.
- 516 4. McLaren SJ, Macpherson TW, Coutts AJ, Hurst C,
517 Spears IR, Weston M. The relationships between internal
518 and external measures of training load and intensity in
519 team sports: a meta-analysis. *Sports Med*.
520 2017;48(3):641-658. doi:10.1007/s40279-017-0830-z.
- 521 5. Chen MJ, Fan X, Moe ST. Criterion-related validity of
522 the Borg ratings of perceived exertion scale in healthy
523 individuals: a meta-analysis. *J Sports Sci*.
524 2010;20(11):873-899.
525 doi:10.1080/026404102320761787.
- 526 6. Scantlebury S, Till K, Atkinson G, Sawczuk T, Jones B.
527 The within-participant correlation between s-RPE and
528 heart rate in youth sport. *Sports Med Int Open*.
529 2017;1(06):E195-E199. doi:10.1055/s-0043-118650.

- 530 7. Weston M. Difficulties in Determining the Dose-
531 response nature of competitive soccer matches. *J Athletic*
532 *Enhancement*. 2013;02(01):1-5. doi:10.4172/2324-
533 9080.1000e107.
- 534 8. Weston M, Siegler J, Bahnert A, McBrien J, Lovell R.
535 The application of differential ratings of perceived
536 exertion to Australian Football League matches. *J Sci.*
537 *Med Sport*. 2015;18(6):704-708.
538 doi:10.1016/j.jsams.2014.09.001.
- 539 9. McLaren SJ. The application of differential ratings of
540 perceived exertion to training monitoring in team sports
541 (Doctoral Thesis).
- 542 10. Vanrenterghem J, Nedergaard NJ, Robinson MA, Drust
543 B. Training Load Monitoring in Team Sports: A Novel
544 Framework Separating Physiological and Biomechanical
545 Load-Adaptation Pathways. *Sports Medicine*.
546 2017;47(11):2135-2142. doi:10.1007/s40279-017-0714-
547 2.
- 548 11. Boisseau N, Delamarche P. Metabolic and Hormonal
549 Responses to Exercise in Children and Adolescents.
550 *Sports Med*. 2000;30(6):405-422.
551 doi:10.2165/00007256-200030060-00003.
- 552 12. Leceaga J, Los Arcos A, Castillo Alvira D, Yanci J.
553 Influence of plyometric training volume on
554 differentiated perceived exertion load of high level
555 soccer players. *PensarMov*. 2017;15(2):27664–17.
556 doi:10.15517/pensarmov.v15i2.27664.
- 557 13. Los Arcos A, Yanci J, Mendiguchia J, Gorostiaga EM.
558 Rating of muscular and respiratory perceived exertion in
559 professional soccer players. *J Strength Cond Res*.
560 2014;28(11):3280-3288.
561 doi:10.1519/JSC.0000000000000540.
- 562 14. Los Arcos A, Mendez-Villanueva A, Yanci J, Martínez-
563 Santos R. Respiratory and muscular perceived exertion
564 during official games in professional soccer players. *Int*
565 *J Sports Physiol Perform*. 2016;11(3):301-304.
566 doi:10.1123/ijsp.2015-0270.
- 567 15. Azcárate U, Yanci J, Arcos AL. Influence of match
568 playing time and the length of the between-match
569 microcycle in Spanish professional soccer players'
570 perceived training load. *Sci Med Football*. 2018;2(1):23-
571 28. doi:10.1080/24733938.2017.1386322.

- 572 16. Green JM, McIntosh JR, Hornsby J, Timme L, Gover L,
573 Mayes JL. Effect of exercise duration on session RPE at
574 an individualized constant workload. *Eur J Appl Physiol.*
575 2009;107(5):501-507. doi:10.1007/s00421-009-1153-z.
- 576 17. Weaving D, Jones B, Marshall P, Till K, Abt G. Multiple
577 measures are needed to quantify training Loads in
578 professional rugby league. *Int J Sports Med.*
579 2017;38(10):735-740. doi:10.1055/s-0043-114007.
- 580 18. Gros Lambert A, Mahon AD. Perceived exertion. *Sports*
581 *Med.* 2006;36(11):911-928. doi:10.2165/00007256-
582 200636110-00001.
- 583 19. Mirwald RL, Baxter-Jones ADG, Bailey DA, Beunen
584 GP. An assessment of maturity from anthropometric
585 measurements. *Med Sci Sports Exerc.* 2002;34(4):689-
586 694.
- 587 20. Wright MD, Laas M-M. Strength training and metabolic
588 conditioning for female youth and adolescent soccer
589 players. *Strength Cond J.* 2016;38(2):96-104.
590 doi:10.1519/SSC.0000000000000212.
- 591 21. McLaren SJ, Smith A, Spears IR, Weston M. A detailed
592 quantification of differential ratings of perceived
593 exertion during team-sport training. *J Sci Med Sport.*
594 2017;20(3):290-295. doi:10.1016/j.jsams.2016.06.011.
- 595 22. Bland JM, Altman DG. Statistics notes: Calculating
596 correlation coefficients with repeated observations: Part
597 1—correlation within subjects. *Br Med J.*
598 1995;310(6977):446-446.
599 doi:10.1136/bmj.310.6977.446.
- 600 23. Hopkins WG. A Spreadsheet for deriving a confidence
601 interval, mechanistic inference and clinical inference
602 from a p value. *Sportscience.* 2007;11:16-20.
603 sportsci.org/2007/wghinf.htm.
- 604 24. Hopkins W. Magnitude-Based Decisions. *Sportscience.*
605 2019;23:i–iii. sportsci.org/2019/inbrief.htm
- 606 25. Kyprianou E, Lolli L, Haddad Al H, et al. A novel
607 approach to assessing validity in sports performance
608 research: integrating expert practitioner opinion into the
609 statistical analysis. *Sci Med Football.* 2019;00(00):1-6.
610 doi:10.1080/24733938.2019.1617433.
- 611 26. Davidson M. Known-groups validity. In: *Encyclopedia*
612 *of quality of life and well-being research.* Dordrecht:

- 613 Springer, Dordrecht; 2014:3481-3482. doi:10.1007/978-
614 94-007-0753-5_1581.
- 615 27. Folland JP, Williams AG. The adaptations to strength
616 training. *Sports Med.* 2007;37(2):145-168.
- 617 28. Kraemer WJ, Ratamess NA. Hormonal responses and
618 adaptations to resistance exercise and training. *Sports*
619 *Med.* 2005;35(4):339-361. doi:10.2165/00007256-
620 200535040-00004.
- 621 29. Wright MD, Hurst C, Taylor JM. Contrasting effects of a
622 mixed-methods high-intensity interval training
623 intervention in girl football players. *J Sports Sci.*
624 2016;34(19):1808-1815.
625 doi:10.1080/02640414.2016.1139163.
- 626 30. McLaren SJ, Graham M, Spears IR, Weston M. The
627 sensitivity of differential ratings of perceived exertion as
628 measures of internal load. *Int J Sports Physiol Perform.*
629 2016;11(3):404-406. doi:10.1123/ijsp.2015-0223.
- 630 31. Buchheit M, Laursen PB. High-intensity interval
631 training, solutions to the programming puzzle. *Sports*
632 *Med.* 2013;43(5):313-338. doi:10.1007/s40279-013-
633 0029-x.
- 634 32. Chia M. Power recovery in the Wingate anaerobic test in
635 girls and women following prior sprints of a short
636 duration. *Biol Sport.* 2001;18(1):45-53.
- 637 33. Wright MD, Innerd A. Application and interpretation of
638 the yo-yo intermittent recovery test to the long-term
639 physical development of girls association football
640 players. *Sci Med Football.* 2019;00(00):1-10.
641 doi:10.1080/24733938.2019.1609071.
- 642 34. Cook J, Hislop J, Adewuyi T, et al. Assessing methods
643 to specify the target difference for a randomised
644 controlled trial: DELTA (Difference ELicitation in
645 TriAls) review. *Health Technol Asses.* 2014;18(28):1-
646 202. doi:10.3310/hta18280.

647