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- 32

33 Abstract

34 The purpose of this research was to examine the (1) reliability, (2) validity and (3) 35 sensitivity of an individualised sub-maximal fitness test (SMFT_{IFT60}). Nineteen elite rugby 36 league players $(22 \pm 4 \text{ y})$ participated in the study. Part 1: players performed a one-week test-37 retest of SMFT_{IFT60}. Typical Errors and ICCs were: small (<3.5%) and extremely high (>0.90) for accelerometer-derived variables; moderate (<2.5% points) and moderate to very high 38 39 (0.71–0.89) for all heart rate (HR) variables. Part 2: SMFT_{IFT60} and the 30-15 Intermittent 40 Fitness Test (V_{IFT}) were performed prior to and following a 10-week training period. Associations with change in V_{IFT} were large for changes in heart rate during (HRex; r = -0.57) 41 and following (HRR; 0.60) SMFT_{IFT60}, and very large for changes in accelerometer measures 42 (range: -0.71 to -0.79). Part 3: Within-player dose-response relationships between SMFT_{IFT60} 43 heart rate measures (dependent variables) and prior accumulated internal and external 44 training loads (independent variables) were examined. HRex relationships with acute internal 45 and external loads (prior 3 days) were all negative and ranged from moderate (session ratings 46 of perceived exertion, r = -0.34), to large (high-speed running distance, r = -0.51; acceleration 47 load, r = -0.73) and very large (HR Training Impulse, r = -0.83). All other relationships were 48 unclear or trivial to small (r= -0.24 to 0.29). The SMFT_{IFT60} is reliable and valid for both 49 physiological and accelerometer-derived measures. HRex could be the more sensitive 50 51 outcome measure to acute internal and external training loads. This could therefore be useful 52 within team sport monitoring strategies; however, a greater understanding of dose-response 53 sensitivity and underpinning physiological mechanisms is warranted.

54

55 Key Words

56 Dose-response, training loads, testing, team sports, GPS

57 Introduction

58 Team sports staff aim to optimally prepare their athletes for competition while reducing 59 their risk of injury. Training theory suggests that the internal training response is dependent 60 on the training dose applied and its interaction with individual characteristics, environmental 61 and lifestyle factors (1). As such, practitioners are required to use a multidimensional approach, rather than evaluate training loads in isolation, to provide a complete picture on the 62 adaptive response to the training undertaken. Typically, practitioners may also evaluate the 63 development of physical capacities (i.e., maximal fitness assessments), providing insights into 64 the response of athletes, defined as the dose-response relationship (2), whilst providing 65 information on their current performance-state (defined here as the constant and continual 66 interaction of an individual's fitness-fatigue status) (3, 4). However, identifying an individual's 67 performance-state in team sports is limited due to: 1) the underlying complexities of the 68 multidimensional constructs of internal load (i.e. physiological systems, biomechanical and 69 70 psychological domains (1, 5, 6)); and 2) the exposure to competition and scheduling considerations, reducing the opportunity and likelihood for maximal testing in-season (7, 8). 71

72 Sub-maximal fitness tests (SMFT) have become popular for practitioners aiming to 73 evaluate the performance-state of their athletes in a non-exhaustive manner (9, 10). SMFT 74 provide a practical and systematic method of observing the response to a standardised 75 physical stimulus (dose), allowing information and interpretation on the individual's performance-state (11, 12). The most appropriate protocol to evaluate this training response 76 77 is not known; with studies examining stationary cycling (13), continuous running (14, 15), 78 intermittent shuttle running (16), modified Yo-Yo tests (10, 17), incremental running protocols 79 (18), individualised sub-maximal shuttle runs (9, 19) and short high-intensity bursts (20, 21). Identifying and utilising specific tests with improved reliability and sensitivity is vital to 80 practitioners given the potential for noise in field conditions (22). McLaren et al. (19) reported 81 82 improved heart rate (HR) reliability (% of HRmax) during SMFT when using individually prescribed sub-maximal shuttles (57–64 m, TE = 1.3 %; SMFT_{IFT60}) versus continuous running 83 (TE = 2.4%) and modified Yo-Yo (TE = 2.6%) protocols at absolute (athlete-independent) 84 running velocities. Importantly, improved reliability of these measurement properties may lead 85 86 to greater sensitivity when identifying the dose-response relationship between SMFT and 87 training load, allowing for a 'meaningful' detection of performance-state alterations (9, 23).

The validity of SMFT remains unclear, with changes in HR recorded during SMFT (HRex) and concordant changes in maximal test performance equivocal. Some studies have suggested likely associations between HRex and maximally derived cardiorespiratory function (11, 24) while others have reported non-significant correlations (25, 26). The disparity in research suggests these tests (SMFT vs. maximal testing) may evaluate different constructs/mechanisms of the training process. Additionally, this may be reflective of the interplay between different SMFT modalities, and confounders of the multidimensional internal load construct (e.g., mood, running efficiency, surface). Hence, the identification of more sensitive measurement tools may better quantify the dose–response relationship associated with training, assisting practitioners with decision making in regard to player performancestate. Whilst the enhanced test-retest reliability of the SMFT_{IFT60} may offer potential in this regard (19), its validity and sensitivity is unknown.

100 Typically, studies have adopted between-athlete analyses in their examinations of SMFT convergent validity. However, this is an approach does not reflect the individualised 101 102 nature of monitoring used in elite sport (i.e., monitoring within-athlete change). In addition, 103 these studies have generally examined the internal adaptive response, with consideration for only physiological (cardiorespiratory) pathways. Recently, it was suggested that physiological 104 and biomechanical load-adaptation pathways should be considered separately due to the 105 stress that training elicits on both systems (6). Yet little is understood on the most appropriate 106 107 way to quantify this biomechanical stress in the field. Therefore, this study had 3 aims: Part 1) 108 to re-examine the reliability of the SMFT_{IFT60}; Part 2) to assess the convergent validity 109 (physiological and; mechanical, through an explorative analysis) of the SMFT_{IFT60}; and Part 3) 110 determine the within-individual physiological dose-response relationship between the SMFT_{IFT60} and measures of training load in elite rugby league players. 111

112

113 Methods

114 Participants

Forty-one elite rugby league players competing for a single club in the Australianbased National Rugby League (NRL), were initially eligible for participation in this study. Per specific inclusion–exclusion criteria (see *Supplementary File 1*), not all players were included in each study part. An overview of the final player samples for each part is presented in Table 1. When players participated, they were cleared of injury by the club's medical staff *a priori*. Throughout the testing periods, players adhered to their usual nutritional, hydration, and ergogenic aid strategies.

Data were collected as part of players' routine training assessments, per their contractual agreements, with no experimental manipulations. Informed consent for analysis of anonymised data was therefore not deemed necessary (27). Nonetheless, all data collection and handling conformed to recommendations of the Declaration of Helsinki and the General Data Protection Regulation (2018).

127	
128	*** INSERT TABLE 1 ABOUT HERE ***
129	

130 Experimental Design

All study parts followed observational, repeated-measures designs, with players tested and 131 monitored across pre-specified periods aligned to each specific aim. All testing sessions 132 (SMFT_{IFT60} and 30-15_{IFT}) were performed on the same outdoor grass field at the same time of 133 day (~0700–0900), with players wearing their own football boots. Due to the influence of 134 external factors on HR response all players were advised to maintain their normal diet, 135 including consuming breakfast, and to abstain from caffeine, alcohol and exercise in the 24-136 137 hours prior to testing. In an attempt to standardise player nutritional substrate status prior to all testing periods the team dietician provided nutritional and hydration strategies to all players 138 139 as per club guidelines.

140

141 Part 1: Test-Retest Reliability of SMFT_{IFT60} Outcome Measures

The SMFT_{IFT60} was performed one week apart at the start of the pre-season phase, occurring in the morning of the first training session preceded by 24 hours of rest. Both sessions were

- 144 performed under similar environmental conditions (21-23°C).
- 145

Part 2: Convergent Validity between SMFT_{IFT60} Outcome Measures and Maximal Test
Performance

At the beginning and following a 10- week pre-season training period, the SMFT_{IFT60} was performed with the 30-15 Intermittent Fitness Test ($30-15_{IFT}$). SMFT_{IFT60} was performed with near complete ($30-15_{IFT}$ performed 48-72 hours prior) rest in the 72 hours prior to completion, at the beginning and end of pre-season, respectively. Analyses were performed to evaluate the associations with observed test outcomes and pre-post change in outcomes for both tests.

153 All testing was performed in temperatures between 21-24°C.

154

- 155 Part 3: Dose–Response Sensitivity of SMFT_{IFT60} Heart Rate Measures to Training Load.
- 156 The SMFT_{IFT60} was completed 4 times in pre-season (~every 3 weeks) and 5 times in-season
- 157 (~every 4 weeks). A schematic diagram of the testing procedures is displayed in Figure 1.

158 Internal and external training loads were collected between every testing session and 159 subsequently accumulated for specifically identified training 'dose' time-periods. We defined 160 acute (accumulated from the previous 3-days) and chronic (accumulated load since the previous SMFT until the acute period) time-periods aligned to current tenets that these 161 represent proposed determents of 'fatigue' and 'fitness' characteristics. While crude, the 162 163 accumulated time windows were selected as they represent periods where many physiological processes are restored to baseline/homeostasis in rugby league (fatigue; ~72 hours) (28), as 164 well as the suggested residual training effect for aerobic endurance (fitness; ~25-35 days) 165 (29). Consequently, SMFT_{IFT60} physiological (HR-derived) measures were used as measures 166 of 'response' to this load and compared to selected internal and external measures to evaluate 167 their sensitivity (responsiveness). Although we examined the use of SMFT_{IFT60} 168 accelerometery-based measures in Part 2 as an explorative observation (convergent validity 169 170 with maximal test performance, details subsequent), we opted to omit these data from dose-171 response sensitivity analysis, given there is currently little scientific understanding and lack of 172 a causal framework linking these SMFT outcome measures with prior accumulated training load. All testing was performed in temperatures between 18-24°C. 173

- 174
- 175

*** INSERT FIGURE 1 ABOUT HERE ***

176

177 Protocols and Outcome Measures

178 The 30-15 Intermittent Fitness Test (30-15_{IFT})

The 40-m version of the 30-15_{IFT} was conducted at the beginning and end of preseason (prior to the SMFT_{IFT60}) using previously established procedures, with the final running velocity (V_{IFT}) used as our criterion measure of intermittent exercise capacity (30). Peak heart rate was recorded as the highest heart rate recorded during the final 30-s of the test and considered to be true maximum heart rate, and subsequently used to quantify all other study heart rate data as % points of maximum. Peak heart rate was modified for players if higher values were achieved during the post-test.

186

187 30-15_{IFT}-derived Individualised Sub-maximal Fitness Test (SMFT_{IFT60})

188 The SMFT_{IFT60} is a 4-min continuous shuttle test, designed for players to reach a 189 steady-state (31). Testing took place on the same grass surface at the club's training facility, 190 performed as the final stage of the warm-up (a standardised ~8-min block of drills, including running movement patterns, striding and dynamic stretching) and following a day of complete rest. During the SMFT_{IFT60} players were required to complete 12, 20-second shuttles, performed together as a squad. The distance for each player was individualised, prescribed as 60% of the participant's V_{IFT} (Equation 1), with players running back and forth across their specified distance. To standardise the 'dose', this distance was determined at the beginning of pre-season and maintained throughout both the pre-season and competitive phases (i.e. it was not altered after 30-15_{IFT} post-test, regardless of a different result) (19).

198

199 Equation 1.

200

SMFT_{IFT60} shuttle length (m) = $[0.6 \times \left(\frac{V_{IFT}}{3.6}\right)] \times 20$

201

Where: V_{IFT} is divided by 3.6 as a conversion from km·h⁻¹ to m·s⁻¹.

202

During the test, players were given a 10-s and 20-s auditory cue on each shuttle to ensure they maintained the prescribed sub-maximal running velocity. To determine individual heart rate recovery (HRR), players were required to stand with hands on their hips upon completing the test, without any movement or verbal communication, for two minutes. Findings from previous work (9) suggested that two-minute HRR is more reliable than one-minute HRR.

208

209 Heart Rate Measures

Beat-to-beat HR was recorded throughout the 30-15_{IFT}, SMFT_{IFT60} and every session 210 (training and competition) using a chest strap (Polar H1 sensor, Kempele, Finland), which 211 212 transmitted to a microelectromechanical systems (MEMS) unit (EVO; GPSports, Canberra, Australia) at 5 Hz. Raw HR data (beats min⁻¹) were normalised as a percentage of each 213 player's HR_{max} prior to analysis. The average HR during the final 60-s of the SMFT_{IFT60} (HRex) 214 was calculated in accordance with previous studies (10, 11). HRR was calculated as the 215 percentage decrement in HRex from the end of the test up until two-minutes post-exercise, to 216 account for potential variability in HRex across trials (11). For training sessions and matches, 217 Edwards Training Impulse (TRIMP; summated zones) was calculated as a measure of internal 218 219 load (32).

220

221 Positional and Accelerometery Measures

222 The MEMS unit contained a 10-Hz Global Navigation Satellite System (GNSS) and a 223 tri-axial piezoelectric linear accelerometer (Kionix: KXP94) sampling at 100 Hz. The unit was placed in a neoprene garment supplied by the manufacturers housing the unit between the 224 scapulae. Prior to the start of each season units were calibrated using the manufacturers jig 225 to ensure values were within the manufacturer's guidelines. To minimise inter-unit variability, 226 participants were fitted with the same GPS device for the entirety of the collection period (33). 227 During pre-season SMFT_{IFT60}, instantaneous accelerations were recorded, and raw 228 accelerometer data was extrapolated from the proprietary software (GPSports Console, 229 Canberra, Australia). Vector magnitude (PL) and vertical component (PL_V) accelerometery-230 231 loads were calculated across each SMFT_{IFT60} trial (expressed in arbitrary units; AU), as per the PlayerLoad algorithm (34), using Microsoft Excel (Excel 2016, Microsoft Office, Seattle, 232 233 Washington, USA).

Prior to every training session and match, devices were switched on 15-mins prior to 234 data collection to allow for the collection of erroneous data owing to poor GNSS signal quality. 235 236 The mean (± SD) number of satellites and horizontal dilution of precision during the data 237 collection period were 12.9 ± 2.8 and 0.9 ± 0.1 respectively. Data from GPS were downloaded 238 following the completion of each training session using proprietary software (GPSports 239 Console, Canberra, Australia) and trimmed to include only active drill or match-play time. Acceleration load (AccLoad) (35) and relative high speed running distance (HSRD) (36) were 240 retained for analysis, as per the selection criteria (and justification) in Supplementary File 1. 241 Briefly, HSRD was calculated on an athlete dependent basis (VT_{2IFT}; 87% V_{IFT} = 16.7 \pm 0.7 242 km·h⁻¹ or 4.6 \pm 0.2 m·s⁻¹) and updated following each 30-15_{IFT} assessment, as previously 243 described (37). 244

245

246 Session Ratings of Perceived Exertion

Session ratings of perceived exertion (sRPE) were collected in isolation ~15–30 minutes after each training session or match. Here, numerically-blinded sRPE (using the 'centiMax' category-ratio scale; CR100) were collected using a customized application (Smartabase, Fusion, Australia) on a 7-inch tablet, as per methods previously described (32). The numeric rating was then multiplied by the duration of the session to calculate sRPE training load (sRPE-TL; AU) and retained for analysis (38).

253

254 Statistical Analysis

255 All raw data were approximately normally distributed and are therefore presented as 256 the mean ± standard deviation (SD). For reliability analysis, a custom-made spreadsheet (39) was used to estimate the test-retest typical error (TE), coefficient of variation (CV; where 257 appropriate) and intraclass correlation coefficients (2-way mixed-effects model; $ICC_{3,1}$) of each 258 SMFT outcome measure. Additionally, the pure between-subject SD (between-player SD less 259 the TE) was estimated (40). All estimates of reliability and variability are accompanied by the 260 appropriate 90% confidence (compatibility) limits (CL) (40). Because TEs presented as 261 intervals (i.e., ±) their value must be doubled to assess the entire magnitude of the limits. We 262 performed against usual standardized thresholds for small, moderate and large effects (the 263 pure between-subject SD multiplied by 0.2, 0.6 and 1.2, respectively) (41, 42). Intraclass 264 correlation coefficients magnitudes were evaluated using the following thresholds: >0.99, 265 extremely high; 0.99–0.90, very high; 0.75–0.90, high; 0.50–0.75, moderate; 0.20–0.50, low; 266 267 <0.20, very low (43).

To examine convergent validity, general linear models (GLM) were used to examine 268 269 the degree of association between 1) observed SMFT outcome measures and observed 270 performance in the 30-15_{IFT} during pre-season, and 2) changes in SMFT outcome variables 271 and changes in 30-15_{IFT} performance across pre-season. In the former analysis, the mean of 272 pre- and post-test scores were used in replacement of the original data (44) and in the latter analysis, the paired pre-post change scores were used. Models were ran via the stats 273 package in the statistical computing software R (Version 3.6.2; R Core Team, 2019). 274 Magnitudes of Pearson's product moment correlation coefficients (r) were assessed, against 275 276 small, moderate, large and very large thresholds (\pm 0.1, 0.3, 0.5 and 0.7, respectively). If the 90% CL overlapped positive and negative values, the association was interpreted as unclear 277 (45). When associations were clear, the relationship was further described using estimates of 278 the coefficient of determination (R^2), standard error of the estimate (SEE), intercept and slope. 279

Finally, for analysis of dose-response sensitivity, within-player GLMs were used to 280 281 determine if changes in selected training load variables were associated with changes in SMFT_{IFT60} HRex and HRR. The observed HR measures were separate dependent variables 282 283 and independent variables were either acute or chronic accumulated training loads (modelled 284 univariately due to limited degrees of freedom). The within-player correlation coefficients were 285 calculated as per Bland & Altman (46), using the *rmcorr* package (47), with 90% CL's 286 constructed using a bias corrected accelerated bootstrapping technique of 2000 samples with replacement from the original data. Correlation magnitudes were interpreted as previously 287 described. 288

289	Results
290	Reliability
291	Descriptive and inferential statistics for reliability are shown in Table 2. The magnitude of
292	TEs were small for PL and PLv, and moderate for all other variables. ICC magnitudes were
293	high for all measures of HR and very high for PL and PL_{ν} .
294	
295	*** INSERT TABLE 2 ABOUT HERE ***
296	
297	Convergent Validity
298	The associations between V_{IFT} and SMFT outcome measures are displayed in Figure 2. The
299	relationships between observed test performances were all unclear, with estimated <i>r</i> values
300	shanges in HD massures were large (negative for HDey, positive for HDP,). Very large
301	(negative) correlations were withoused between changes in V(, and acceleremeter measures
302 202	(Figure 2: top papel). Standard errors of the estimate for these relationships were all < 0.5
204	(ingula 2, top participation). Standard entries of the estimate for these relationships were all < 0.5
304	accelerometer measures (Table 3).
306	
307	*** INSERT FIGURE 2 ABOUT HERE ***
308	
309	*** INSERT TABLE 3 ABOUT HERE ***
310	
311	Sensitivity
312	The within-player dose-response associations of acute and chronic training loads with SMFT
313	heart rate outcomes are presented through Figures 3–6. HRex is presented in Figures 3 and
314	4, respectively. HRex relationships with acute loads were all negative and very large for
315	TRIMP and AccLoad, large for HSRD and moderate with sRPE-TL (Figure 3). For chronic
316	loads, all relationships with HRex were unclear, with estimated r values being trivial to small
317	(Figure 4).
318	
319	*** INSERT FIGURE 3 ABOUT HERE ***

10

320

*** INSERT FIGURE 4 ABOUT HERE ***

All HRR relationships with acute loads were unclear, with estimated *r* values being trivial (Figure 5). For chronic loads, HRR relationships were small and positive, with the exception of HSRD which was unclear (Figure 6).

*** INSERT FIGURE 5 ABOUT HERE ***

*** INSERT FIGURE 6 ABOUT HERE ***

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328 Discussion

The purpose of this study was to examine the reliability, convergent validity and 329 sensitivity of an individualised SMFT. Our findings demonstrate that both physiological and 330 mechanical measures produced from SMFT_{IFT60} have high levels of reliability and are related 331 332 to changes in maximal running performance. Specifically, our findings suggest improved HRR 333 along with decreases in HRex and accelerometry-loads are associated with improvements in maximal running performance. We also report acute and longitudinal dose-response 334 relationships between training load measures and SMFT. Here, our results suggest that a 335 336 decrease in HRex is associated to greater exposure to acute training loads, while training 337 loads across chronic time periods present unclear to small associations; somewhat contradicting available conceptual frameworks (12). 338

Due to the underlying complexities of the training process and associated outcomes 339 (1), monitoring systems that predominantly focus on the internal and external training load 340 interaction may be limited in their evaluation of the fitness-fatigue status of athletes. In 341 extension of previous observations (HRex TE: 1.3%; (19)), our results demonstrate that the 342 SMFT_{IFT60} has high levels of reliability across physiological measures, reinforcing the potential 343 344 benefit of an individualised approach to SMFT in team sport athletes (9, 19). Moreover, the 345 strong reliability of accelerometer-derived variables observed herein may provide practitioners with additional insights. Given the potential for extraneous noise in field conditions (22), 346 limiting test protocol variability is vital in order to improve the sensitivity (the ability to detect 347 348 small, but important changes in performance; signal > noise) of the measure. Building on past 349 research (9, 12), our reliability data can be used to identify true within-player changes in 350 SMFT_{IFT60} by accounting for both the threshold for practical significance (e.g., 1% for HRex) and the test TE (e.g., 1.4% for HRex), rather than inappropriately interpreting the observed 351 352 difference with no regard for signal or noise (48). For example, an acute, within-player change in HRex of -3.6 percentage points results in an 80% confidence interval for the true change
falling entirely outside the -1% threshold, which may be considered a conservative approach
to determining a 'real' and practically important change in elite rugby league players.

Both physiological and mechanical changes in SMFT_{IFT60} related to changes in 356 357 maximal running performance in the current study showing large negative associations like previous research (10, 24, 49). This is not surprising given HRex is theoretically associated 358 with oxygen uptake (12). However, the strength of this relationship (r = -0.55; -0.82 to -0.07) 359 360 offers more evidence that SMFT provides information on similar, yet divergent, constructs on the training outcome. In agreement with some endurance (50, 51) and team sport literature 361 (10, 52), but in contrast to others (11, 49, 53), we observed a large positive relationship 362 363 between HRR and changes in 30-15_{FT} performance. HRR is characterised by parasympathetic reactivation and sympathetic withdrawal made in response to the cessation 364 of exercise (54), reflective of the hemodynamic adjustments made in relation to body position 365 (12, 50). Therefore, improvements in HRR are thought to represent improved parasympathetic 366 367 activation. We offer practitioners a novel tool to practically evaluate changes in SMFT outcome 368 measures and changes in maximal running performance (Table 3). For example, a change in 369 HRex of -5.6% was associated with a minimally important change in 30-15_{IFT} performance (0.5 370 km·h⁻¹; one stage). This, along with the other measures assessed, may provide practitioners with a method to describe the 'fitness' component of one's performance-state using SMFT. 371

372 A reduction in PL and PL_V during SMFT_{IFT60} was strongly associated with an improvement in maximal running performance. While interpretation of such measures are not 373 yet well understood, a reduction in accelerometry-loads may be due to reduced leg stiffness 374 375 (typically a measure of fatigue) (20, 55, 56), morphological adaptations (e.g. muscle 376 architecture) (57, 58), and/or improved gait (muscle) coordination (i.e. movement efficiency) and running economy (59); aside from the former, these adaptations appear beneficial to 377 378 shuttle running performance. For example, excessive changes in momentum (and increases 379 in net and total vertical impulse) may be considered wasteful motions, requiring greater metabolic demands (59). Yet due to the complex interaction between kinetic and kinematic 380 381 performance in the field (57), coupled with the lack of concurrent measures of neuromuscular 382 performance and/or criterion measures of morphological and biomechanical functions, 383 drawing definite conclusions may be difficult in this study. Additionally, it has been suggested 384 that the placement of the device (between the scapulae) may be inappropriate to precisely 385 capture true lower limb stiffness and movement given its distal location from the ground (60). As such, further research maybe warranted to identify if changes in mechanical properties 386 (e.g., lower-limb (tendon) stiffness, ground reaction forces, running kinematics) assessed 387 388 during SMFT can assist in our understanding on the performance-state of individuals.

389 To date, research in team sports examining the dose-response relationship between 390 training load and SMFT response measures has primarily been conducted in training-camp environments (7-14 days) (52, 53). These studies have used between-individual analysis 391 392 methods (52, 53), which differ from routine industry practice where performance staff use individual data to drive player management strategies (61). Despite these differences, the 393 394 findings are concordant; observing a reduction in HRex and strong negative associations between HRex and training load (sRPE-TL; r = -0.85 (52), r = -0.80 (53)). On an individual 395 level, our findings suggest an increased training load undertaken in the acute period (72 hours) 396 prior to testing had similar moderate to strong negative associations with HRex. Contrasting 397 previous studies (52, 53), sRPE-TL showed the poorest association (r = -0.34) with HRex, 398 instead measures of TRIMP (r = -0.83) and external load (HSRD: r = -0.51; AccLoad: r = -399 0.73) revealed stronger relationships. Schneider and colleagues (62) observed similar, 400 401 reporting HRex reduced when elite badminton players were in a strained state (following four 402 days of training), before increasing again following two days of recovery (62). Whilst 403 speculative, there are a few physiological mechanisms that may describe the acute changes 404 in HRex. For example, a reduction in HRex may be associated with diminished sympathetic 405 or increased parasympathetic nervous system activity (63, 64), decreased sensitivity to 406 catecholamine and/or fluctuations in adrenergic receptor activity (62, 63, 65), or exercise-407 induced plasma expansion (53). Indeed, these acute changes in plasma volume expansion 408 appear well associated with cardiac parasympathetic function (66). However, any proposal of 409 the specific mechanisms that underpin the current findings are outside the scope of the current 410 study.

It is notable that these findings are somewhat paradoxical to those observed in Part 2, 411 which established large associations between decreased HRex and improved fitness. Given 412 413 that this study identified decreased HRex is related to both improved fitness as well as greater 414 acute training loads (fatigue), drawing definitive inferences may be somewhat challenging. 415 Indeed, it appears the underpinning mechanisms related to HRex may interact across varying time scales, limiting interpretation of the outcome variable. An important note is that the current 416 417 study (Part 2) methodology included either complete or near-complete prescribed rest in the 418 72-hour period prior to the criterion test measures (i.e., start and end of pre-season). As such, 419 we may assume that the decreased HRex witnessed (in Part 2) is related to chronic positive 420 adaptations in the performance-state (improved physiological function; fitness status) (10, 24, 421 49), rather than acute physiological impairment (fatigue status). However, in field-based 422 settings such rest intervals may not be practical during the in-season (as in the case of Part 423 3). If this is the case, practitioners might consider the scheduling of SMFT given the potential 424 impact that acute training loads may have on SMFT outcome variables, and aim to limit425 physical activity in the proceeding 72 hours (if feasible).

Contrary to others (52), HRR demonstrated no considerable dose-response 426 427 relationship with training load measures. HRR has been suggested to improve with positive 428 changes in high-intensity exercise performance (a notion supported by our findings in Part 2) 429 (12), whilst remaining stable or decreasing with maintained or negative alterations in one's physical performance (fitness) (50). However, HRR is influenced by fatigue (and overreaching) 430 431 (52), which may partly explain the null findings in the current study. As SMFT_{IFT60} was 432 performed throughout the pre-season and in-season phases, large variations in training loads 433 existed. Indeed, our results demonstrate that while HRR may be used to describe positive 434 chronic alterations in individual's performance state, it may not be sensitive enough to 435 determine week-to-week dose-response relationships, where high variability in training loads may occur. Additionally, it could be that the defined time periods (acute and chronic) of this 436 437 study dampened some of the signal of SMFT_{IFT60} outcome measures. Indeed, we witnessed 438 no substantial dose-response relationship with any SMFT_{IFT60} and training load measure over 439 the chronic period. Such findings challenge the current conceptual paradigm on changes in 440 training load, fitness characteristics and SMFT. These largely unclear findings may also be 441 distorted by the varying time windows (14-35 days) comprising the chronic period. This study employed a threshold of time that is suggested to be representative of the residual training 442 443 effect for aerobic endurance (29), whilst ensuring no mathematical coupling occurred between the acute and chronic periods. Despite these attempts, the uncertainty associated with these 444 445 (and any) chronic periods may limit current, and future, insights on individual's performancestate. 446

447 Given the exploratory nature of our study, it is important not to over-interpret the findings and acknowledge the following limitations. Firstly, the sample-sizes across the study 448 449 (Part 2 and 3) delivers less confidence around point estimates. Here we traded statistical 450 power for analysis integrity, with the application of robust exclusion criteria resulting in large amounts data loss (Supplementary File 1). The circumstances for data loss (Supplementary 451 452 File 1) are the result of policies employed by the club, and therefore, likely reflect the limitations 453 faced in the 'real' applied environment where SMFT practice may be implemented. The 454 implementation of PL as a measure used to interpret changes in specific neuromuscular 455 and/or musculoskeletal function also yields caution; with little evidence to suggest it has direct relations with these functions (67). Further, the time frames used to capture the acute phase 456 (fatigue; 72 hours) and the chronic phase (fitness; day 14-35 depending on when testing 457 occur) are arbitrary. Lastly, while strategies were employed to minimise the impact of 458 459 contextual factors throughout the study period (e.g., nutrition/hydration status, ground surface,

460 environmental conditions), the true extent of their influence in unknown. Further, some 461 contextual factors (e.g., ground hardness, heat index) were not quantified. While we 462 acknowledge this as a limitation of the current study, we believe our study design is 463 representative of ecological valid conditions, allowing practitioners to interpret these findings 464 as they would in an applied environment.

465

466 Conclusion

Our results demonstrate that the SMFT_{IFT60} exhibits high levels of reliability and validity 467 for both physiological and mechanical measures; providing information on similar, yet 468 divergent, constructs on the training outcome as maximal fitness tests. Collectively, our 469 470 findings suggest that HRex may provide a more sensitive dose-response outcome measure to monitor in team sports (particularly in an acute time period). Yet, as HRex and HRR evaluate 471 different aspects of cardiac function (12), combined with the strong relationships witnessed 472 473 between HRR and maximal running performance (fitness), we advise practitioners to monitor both. Our results also raise questions about the direct physiological mechanisms that underpin 474 these physiological and mechanical variables. It is apparent that our conceptual understanding 475 476 (12) on the function of these cardiac measures and their response to team sport training is not 477 particularly clear. Indeed, the somewhat contrasting findings presented in Part 2 and Part 3 478 provide question over the inferences able to be made from these HR indices. As such, while 479 we advocate the inclusion of SMFT within monitoring strategies, we suggest it is part of a 480 multivariate approach; including multiple HR and mechanical indices from SMFT with other training load data, to assist decision-making strategies. Further, we recommend (where 481 482 feasible) a standardised approach in the 72 hours prior to implementing SMFT, whereby 483 practitioners may aim to minimise the volume and variability of training loads exposed to players. 484

485

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TABLES

Table 1. Study inclusion criteria, sample size and player characteristics.

Study Part	Analysis Inclusion Criteria	Final	Player Characteristics (mean ± SD)			
		sample Age (y)		Stature (cm)	Body Mass (kg)	
Part 1 (<i>Reliability</i>)	Completed SMFTIFT60 at both the test- and re-test time points; No erroneous test data	19	22 ± 4	184.2 ± 6.1	102.4 ± 10.9	
Part 2 (<i>Validity</i>)	Completed SMFT _{IFT60} and 30- 15 _{IFT} at both the pre- and post- testing time points;	12	24 ± 4	185.2 ± 6.7	103.9 ± 11.8	
	No erroneous test data					
Part 3 (Sensitivity)	A minimum of 4 SMFT _{IFT60} completed throughout the season, At least 14 and no more than 35 days between tests;	10	23 ± 3	183.9 ± 6.4	98.3 ± 10.3	
	No erroneous test or training load data					

Table 2. Descriptive statistics (group mean ± SD) and inferential statistics (90% confidence limits) for reliability of an individualised submaximal fitness test in elite rugby league players.

Testing	variable	Subjects (n)	Trial 1	Trial 2	Mean Change	ICC _{3,1}	TE	CV (%)	Pure SD*
Exercise	HR _{ex}	17	85.6 ± 3.6	84.2 ± 4.2	-1.38	0.89 (0.75 – 0.95)	1.4 (1.0 – 2.0)		3.9 (2.3 – 5.6)
Recovery	HRR ₆₀	17	22.0 ± 4.9	21.9 ± 5.0	-0.13	0.71 (0.44 – 0.87)	2.8 (2.2 – 3.9)		4.9 (2.8 – 6.9)
	HRR ₁₂₀	17	33.4 ± 5.4	36.9 ± 6.0	3.45	0.83 (0.63 – 0.92)	2.5 (2.0 – 3.6)		5.9 (3.4 – 8.4)
PlayerLoad™	PL	19	97.7 ± 12.1	95.4 ± 11.7	-2.26	0.93 (0.86 – 0.97)	3.2 (2.0 – 3.6)	3.3	11.8 (7.1 – 16.5)
	PLv	19	71.5 ± 10.3	71.1 ± 10.1	-0.34	0.94 (0.87 – 0.97)	2.6 (2.1 – 3.6)	3.5	10.0 (6.0 – 14.0)

All heart rate variables are expressed as a percentage of maximum heart rate.

*between-player

HR_{ex}: mean exercising heart rate recorded in the final 60 seconds of the test; HRR₆₀: 60-second heart rate recovery, expressed in percentage points as the difference between 60-second postexercise heart rate and HR_{ex}, HRR₁₂₀: 120-second heart rate recovery, expressed in percentage points as the difference between 120-second post-exercise heart rate and HR_{ex}, PL: Total PlayerLoadTM; PL_V: Vertical PlayerLoadTM; ICC: Intraclass correlation coefficient; SD: standard deviation; TE: typical error.

Table 3. General linear models describing the associations between changes in SMFT
outcome measures and the change in 30-15 IFT performance across the pre-season training
phase.

SMFT _{IFT60} Outcome Measure	R ²	Intercept (km·h⁻¹)	Slope km·h⁻¹)	SEE (km·h⁻¹)
ΔHRex	0.30	0.13 (-0.28 to 0.53)	-0.09 (-0.17 to -0.01)	0.46
ΔHRR ₁₂₀	0.36	0.48 (0.25 to 0.71)	0.06 (0.01 to 0.12)	0.44
ΔΡLνм	0.50	0.24 (0.01 to 0.49)	-0.06 (-0.09 to -0.02)	0.43
ΔPLv	0.62	0.22 (0.02 to 0.42)	-0.09 (-0.13 to -0.05)	0.38

FIGURE LEGEND

Figure 1. A schematic diagram of the testing procedures implemented by this study.

 \mathscr{F} : 30-15 Intermittent Fitness Test; \mathfrak{V} : Sub-maximal Fitness Test (SMFT_{IFT60}); \mathfrak{V} : Global positioning system and heart rate monitoring (collected throughout both phases); \square : Rating of Perceived Exertion monitoring (CR100; collected throughout both phases).

Figure 2. Pearson's correlation coefficients for changes in 30-15_{IFT} performance and changes in heart rate and PlayerLoadTM measures, as well as raw 30-15_{IFT} test performance and raw measures of heart rate and PlayerLoadTM measures with individual depiction of data. HR_{ex}: mean exercising heart rate recorded in the final 60 seconds of the test; HRR₁₂₀: 120-second heart rate recovery, expressed in percentage points as the difference between 120-second post-exercise heart rate and HR_{ex}, PL: Total PlayerLoadTM; PL_v: Vertical PlayerLoadTM

Figure 3. Acute (\leq 3 days) within-subject dose-response relationships between exercise heart rate (HRex) during the sub-maximal intermittent running (SMFT_{IFT60}) and measures of internal (a: Edwards TRIMP; and b: Session RPE-Training load) and external (c: High Speed Running Distance; and d: Acceleration Load) training load.

Figure 4. *Chronic* (between acute period and last test) within-subject dose-response relationships between exercise heart rate (HRex) during the sub-maximal intermittent running (SMFT_{IFT60}) and measures of internal (a: Edwards TRIMP; and b: Session RPE-Training load) and external (c: High Speed Running Distance; and d: Acceleration Load) training load.

Figure 5. Acute (\leq 3 days) within-subject dose-response relationships between two-minute heart rate recovery (HRR) during the sub-maximal intermittent running (SMFT_{IFT60}) and measures of internal (a: Edwards TRIMP; and b: Session RPE-Training load) and external (c: High Speed Running Distance; and d: Acceleration Load) training load.

Figure 6. *Chronic* (between acute period and last test) within-subject dose-response relationships between two-minute heart rate recovery (HRR) during the sub-maximal intermittent running (SMFT_{IFT60}) and measures of internal (a: Edwards TRIMP; and b: Session RPE-Training load) and external (c: High Speed Running Distance; and d: Acceleration Load) training load.