



Monitoring the recovery-stress states of athletes: Psychometric properties of the Acute Recovery and Stress Scale and Short Recovery and Stress Scale among Dutch and Flemish Athletes

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14 **ABSTRACT**

15 The Acute Recovery and Stress Scale (ARSS) and the Short Recovery and Stress Scale
16 (SRSS) are recently-introduced instruments to monitor recovery and stress processes in
17 athletes. In this study, our aims were to replicate and extend previous psychometric
18 assessments of the instruments, by incorporating recovery and stress dimensions into one
19 model. Therefore, we conducted five confirmatory factor analyses (CFA) and determined
20 structural validity, internal consistency, cross-cultural validity, and construct validity. Dutch and
21 Flemish athletes (N=385, 213 females, 170 males, 2 others, 21.03±5.44 years) completed the
22 translated ARSS and SRSS, the Recovery Stress Questionnaire for Athletes (RESTQ-Sport-76),
23 and information on their last training. There was a good model fit for the replicated CFA, sub-
24 optimal model fit for the models that incorporated recovery and stress into one model, and
25 satisfactory internal consistency ($\alpha=.75 - .87$). The correlations within and between the ARSS
26 and SRSS, as well as between the ARSS/SRSS and the RESTQ-Sport-76 ($r=.31 - .77$ for the ARSS,
27 $r=.28 - .63$ for the SRSS) and information of their last training also supported construct validity.
28 The combined findings support the use of the ARSS and SRSS to assess stress and recovery in
29 sports-related research and practice.
30

31 **INTRODUCTION**

32 Optimizing the balance between recovery and stress can enhance performance and
33 decrease the risk of injury and illness for athletes, making it a critical aspect of training and
34 coaching.¹ Therefore, researchers and practitioners are constantly searching for methods to
35 capture both recovery and stress. Indeed, it is recommended to closely monitor the physical
36 and psycho-social recovery and stress of athletes during the training process, as both recovery
37 and stress are highly “intertwined and interdependent constructs”.²

38 Monitoring practices can be performed by measuring physiological, psychological,
39 biochemical, and immunological responses.³ However, it is not feasible to collect these
40 measures on a daily basis, because they are often invasive, costly, and time-consuming (e.g.,
41 biochemical markers such as creatine phosphokinase need to be derived from blood
42 samples).⁴⁻⁸ To tackle these disadvantages, athlete monitoring through self-report was
43 introduced as a valid and time-efficient alternative.⁹ Furthermore, it is suggested that self-
44 report is more sensitive to training than physiological, biochemical, and immunological
45 measures.^{9,10} Therefore, it is mostly the preferred method for athlete monitoring in practice.¹¹

46 Ideally, self-report measures include the cause, intensity, and frequency of recovery and
47 stress-related activities, or their consequences, such as fatigue, muscle soreness, or mood and
48 concentration disturbances. This allows coaches, staff, and athletes themselves to adjust the
49 cause (e.g., adjust the load), or intervene on the process (e.g., cognitive re-structuring) or the

50 consequences (e.g., adapt the recovery strategies).^{3,12} Recently, the *Acute Recovery and Stress*
51 *Scale* (ARSS) and the *Short Recovery and Stress Scale* (SRSS) were developed to assess the
52 emotional,¹³ physical, and mental aspects of recovery and stress on a day-to-day basis. Studies
53 conducted in the UK and Germany are promising in light of the psychometric properties of the
54 scales. For instance, the questionnaires showed satisfactory internal consistency and
55 convergent validity was supported by correlations with the *Recovery Stress Questionnaire for*
56 *Athletes* (RESTQ-Sport-76).^{14,15} In addition, all scales of the ARSS were affected by the changing
57 loads of a field hockey training camp.¹⁶ For the full details of the development and
58 psychometric properties in the German and English cohorts, we refer to the manual of the
59 ARSS and the SRSS.¹³

60 There are, however, important steps to be made to establish the validity of the ARSS
61 and SRSS. First, previous validation studies proceeded from two separate models, which implies
62 that recovery and stress are two independent and unrelated constructs. However, the so-called
63 'scissors model', as defined by Kallus and Kellmann (2000), suggests that recovery demands and
64 stress states are interrelated.^{17,18} Moreover, from a psychometric perspective, it is important to
65 include the interrelation between the domains in one model to test whether the 'scissors
66 model' fits. Second, given the purpose of the ARSS and SRSS to frequently monitor the load and
67 recovery of athletes, it is also important to determine its validity with respect to the daily load
68 and recovery experienced. Currently, the *Rating of Perceived Exertion* (RPE) and *Total Quality of*
69 *Recovery* (TQR) are widely used in practice,^{3,19} and considered as general measures of exertion
70 and recovery. Hence, in a next validation step, the relations between the ARSS/SRSS and these
71 single-item questions need to be determined. Third, although the English and German
72 questionnaires revealed promising initial results for different samples of athletes, validation in a
73 broader population is warranted.

74 This study therefore aims to advance the ongoing process of validating the ARSS and
75 SRSS among Dutch and Flemish athletes. After we translated the ARSS/SRSS, we replicated the
76 analysis of the structural validity according to the analysis done by Kölling et al (2020) for the
77 purpose of comparison with earlier results. Next, we determined the structural validity with five
78 alternative models that included both the recovery and stress dimensions (for the proposed
79 structure of the models, appendix 1). Then, we followed the COnsensus-based Standards for
80 the selection of Health Measurement INstruments (COSMIN) guidelines and analyzed the
81 internal consistency,²⁰ cross-cultural validity (between females and males and between types of
82 sport), and construct validity with the RESTQ-Sport-76, RPE, and TQR in a large group of
83 athletes.

84

85 MATERIALS AND METHODS

86 Participants

87 To properly validate the ARSS/SRSS, we aimed to include at least 320 participants aged
88 16 years or older from various endurance and team sports. This sample size was chosen
89 according to the upper limit of the rule of thumb that Terwee et al. (2007) proposed for factor
90 analysis ($\#items \times 10$).²¹ To ensure a representative sample of the population, we considered all
91 genders, athletes with and without disabilities, different levels of sports, and athletes from all
92 regions in the Netherlands and Flanders, Belgium. Therefore, the research population was
93 recruited through the Dutch Sports Federation, Flemish sport federations, university student
94 athletes, and from the circle of acquaintances of the researchers. All participants were native
95 Dutch speakers.

96 The study protocol was approved by the Ethics Committee (PSY-1920-S-0513), and
97 informed consent was obtained from all athletes. Of the 850 athletes we contacted, 385
98 athletes completed the full questionnaires, which were then considered for analysis. The five
99 sports with the highest number of participants were soccer ($n=74$), athletics ($n=29$), field hockey
100 ($n=28$), volleyball ($n=27$), and basketball ($n=27$). Participants competed at the Olympic ($n=24$),
101 continental ($n=35$), national ($n=266$), or regional ($n=60$) levels. The descriptive statistics of the
102 included athletes are shown in Table 1.

103

Table 1. Description of the included athletes

Characteristics	<i>N</i> = 385
Age (years [SD])	21.03 (5.44)
Gender	
Female (<i>n</i> [%])	213 (55.3%)
Male (<i>n</i> [%])	170 (44.2%)
Other (<i>n</i> [%])	2 (0.5%)
Paralympic (<i>n</i> [%])	2 (0.5%)
Level	
Regional (<i>n</i> [%])	60 (15.6%)
National (<i>n</i> [%])	266 (69.1%)
European (<i>n</i> [%])	35 (9.1%)
Olympic (<i>n</i> [%])	24 (6.2%)
Average training hours per week (hours [SD])	10.71 (8.58)
Average RPE last training (SD)	13.16 (2.10)
Average duration of last training (hours [SD])	1.66 (0.75)

Table 1. Description of the included athletes

Characteristics	<i>N</i> = 385
Average hours since last training (hours [SD])	34.57 (31.92)
Average TQR at this moment (SD)	15.75 (2.68)

Note. Age, average training hours per week, average rating of perceived exertion (RPE) last training, average duration of last training, average hours since last training, and average total quality of recovery (TQR) at this moment are given as mean and standard deviation (SD). Other values are given as the number of participants and their percentages (%).

104 **Translation procedure**

105 The English versions of the ARSS/SRSS were translated through a parallel back-
106 translation procedure.²² Both questionnaires were translated into Dutch by six sports scientists
107 including academic staff of the [Redacted], and experts in endurance and team sports (i.e.,
108 rowing and football). All group members individually translated the items of the English
109 ARSS/SRSS. The English version was used because this version is used worldwide, incorporates
110 extra adjectives, and the outcomes can serve as a reference.¹³

111 First, the agreements and disagreements between the six translations were analyzed.
112 Items that were identical in at least three out of the six translations were considered to have
113 sufficient agreement. In cases of greater variation, different translations were considered. The
114 following ordered procedure was used for the consideration of the items: a) use in sports, b)
115 translation closest to English, c) German equivalent, and d) use of the Dutch version of the
116 RESTQ-Sport-76. After this procedure, a group of nine sports scientists, sports psychologists,
117 and applied sports scientists (including members who translated the questionnaire) had the
118 opportunity to provide feedback on the Dutch translation of the items. In case of disagreement,
119 consensus was reached after one more round of feedback.

120 After agreement on the Dutch version, the result was translated into English by a near-
121 native English speaker. Then, the original English questionnaire and the new English
122 questionnaire were compared. Any ambiguities were discussed until a consensus was reached.
123 Finally, the Dutch version was pre-tested with a small group of athletes, who were asked to
124 provide feedback on the questionnaire. Their feedback on the items or questions was used to
125 address ambiguities. No items were added or removed compared to the English version.

126 **Design and measures**

127 Participants received a link to an online environment named Qualtrics (2022).²³ This
128 survey included demographics with questions about age, gender, sport type, and sport level.
129 This was followed by questions about the last training, such as duration (in blocks of 15

130 minutes), the RPE (on a scale of 6 – 20 “no exertion at all – maximal exertion”),^{19,24} TQR (on a
131 scale of 6 – 20 “no recovery at all – maximal recovery”),³ and time since last training (in half
132 hours). Subsequently, participants filled out the ARSS, SRSS, and RESTQ-Sport-76.

133 The ARSS consists of a list of 32 adjectives related to recovery and stress that are
134 preceded by the sentence: “at this moment I feel/ I am”. Each item describes a different state of
135 recovery or stress (e.g., “strong” or “muscle exhaustion”). The items are grouped in eight scales, of
136 which four describe the *Recovery* dimension (*Physical Performance Capability, Mental Performance*
137 *Capability, Emotional Balance, Overall Recovery*). The four other scales describe the *Stress*
138 dimension (*Muscular Stress, Lack of Activation, Negative Emotional State, Overall Stress*). Means and
139 total scores of these scales are calculated. The SRSS is a compact version of the ARSS and
140 consists of eight items that correspond to the eight scales of the ARSS.¹⁴ For the SRSS, the
141 items of the corresponding ARSS scale serve as descriptors for each item (e.g., *Muscular Stress*
142 is described by *muscle soreness* and *muscle stiffness*). The items of the SRSS are rated in relation
143 to the highest recovery or stress state of the athlete. Both the ARSS and SRSS items are rated
144 on a Likert-type rating scale from 0 (does not apply at all) to 6 (fully applies). For full details of
145 these questionnaires, we refer to the manual by Kellmann and Kölling (2019).¹³

146 The Dutch RESTQ-Sport-76 is composed of 76 questions that can be answered on a
147 Likert scale from 0 (never) to 6 (always).^{2,25} The statements refer to the frequency of
148 perceptions of stress and of recovery activities in the last week (e.g., *last week, I had muscle pain*
149 *after performance* or *last week, my body felt strong*). The questionnaire consists of 19 scales,
150 which provide insights regarding non-sport and sport-specific aspects of recovery and stress.
151 For further information see the manual.²⁶

152 **Statistical analysis**

153 For analysis, we used R with the packages Lavaan, semTools, and semPlot.²⁷⁻³⁰
154 Descriptive statistics were calculated and the means (M) and standard deviations (SD) were
155 determined for all values.

156 The structural validity of the ARSS was determined with confirmatory factor analysis
157 (CFA) rather than exploratory factor analysis, because the factor structure has been
158 determined previously.^{13,31} The analysis of the structural validity was done in two steps. First, we
159 replicated the steps described by Kölling et al. (2020) and performed three CFAs with robust
160 maximum likelihood estimators (first-order model, hierarchical model, and a bifactor model).³¹
161 Second, we conducted five CFA’s (orthogonal first-order, single-factor, bifactor, oblique lower-
162 order, and a higher order model) in which we included all items to assess the proposed
163 multidimensional structure of the ARSS (for the proposed structures, see appendix 1). Initially,
164 in accordance with the models described by Kölling et al (2020),³¹ we allowed correlation
165 between the error variances of the items *strong* and *physically capable*, *muscle exhaustion* and

166 *muscle fatigue*, as well as between *muscle soreness* and *muscle stiffness*. To describe the global fit
167 of the models, we reported the root mean square error of approximation (RMSEA),
168 comparative fit index (CFI), Tucker-Lewis Index (TLI), and standardized root mean square
169 residual (SRMR). Following the recommendations by Credé and Harms (2015),³² we did not
170 interpret the global fit indices using arbitrary cut-off values (as these were not developed for
171 higher order models) but rather present the change in the χ^2 statistic when comparing
172 different models using the alternative approach as described by Satorra and Bentler (2001) in
173 combination with reporting the RMSEA, CFI, TLI, and SRMR.³³ Ideally, if the χ^2 statistic is *non-*
174 significant at an alpha level of $>.01$, the CFI is high, and the SRMR and RMSEA are low, the global
175 fit of the model is assumed good.

176 Cross-cultural validity of the ARSS/SRSS was determined by multigroup CFA for the
177 subgroups based on gender and type of sport (individual vs. team).²¹ Measurement invariance
178 for the multigroup CFA was tested according similar as described by Kölling et al. (2020).³¹

179 After we determined the structural validity, we assessed the internal consistency with
180 Cronbach's α . Next, the corrected item-total correlation was calculated to assess the strength
181 of the relationship between individual items and the total score of the scale that the item
182 belongs to. Finally, we determined the inter-item correlations between different items within
183 the scale.

184 Because no gold standard is available, we determined construct validity rather than
185 criterion validity. According to the guidelines proposed by the COSMIN initiative,²⁰ we
186 formulated hypotheses about the magnitude of the relations within and between the
187 ARSS/SRSS, the RESTQ-Sport-76, RPE, and TQR. Based on previous research,^{15,31} we formulated
188 the following hypotheses: 1) there are moderate to large positive correlations within the
189 *Recovery* and *Stress* domains of the ARSS and SRSS, as well as moderate to large negative
190 correlations between the *Recovery* and *Stress* domains of the ARSS and SRSS; 2) there are large
191 to very large positive correlations between the ARSS and SRSS; 3) there are significant positive
192 correlations between the ARSS/SRSS scales with similar dimensions on the RESTQ-Sport-76 and
193 significant negative correlations with opposite scales; and 4) there are significant positive
194 correlations between the exertion and recovery factors (i.e., RPE, TQR) and stress and recovery
195 scales of the ARSS/SRSS. If 75% or more of the proposed hypotheses were confirmed, the
196 concurrent validity of the questionnaire is considered good.³⁴ The correlation coefficients were
197 determined with Pearson correlations (r) and considered trivial ($r < .1$), small ($.1 < r \leq .3$), moderate
198 ($.3 < r \leq .5$), large ($.5 < r \leq .7$), very large ($.7 < r \leq .9$), almost perfect ($r > .9$) or perfect ($r = 1$).³⁵ The alpha
199 level was set at .05.

200 RESULTS

201 Structural validity

202 After examining the inter-item correlations, corrected item-total correlations, and the
203 CFA's, item (MPC2; *receptive*) was deleted which had the highest negative contribution to
204 Cronbach's alpha, corrected item-total correlation, and a low factor loading.

205 First, we replicated the models described by Kölling et al. (2020)(see appendix 2).³¹ In
206 addition, we estimated an orthogonal first-order, single-factor, bifactor, oblique lower-order,
207 and a higher order model first-order CFA, a bifactor CFA, and a higher order CFA with all items
208 of the ARSS. Although none of the alternative models reached optimal global fit values, the
209 oblique lower-order model was retained for further analysis as it had the best global fit. Table 2
210 displays the full details of the factor loadings and appendix 3 the correlation matrix.

211

Table 2. Results of the confirmatory factor analysis of the Dutch ARSS for the total sample and subsamples.

	Model	χ^2	df	p	RMSEA	CFI	TLI	SRMR
Total sample (N = 385)	Orthogonal first-order model	3228.69	430	<.01	.13	.59	.56	.32
	Single-factor model	2549.40	430	<.01	.11	.69	.67	.11
	Bifactor model	1446.57	398	<.01	.08	.85	.82	.09
	Oblique lower-order model	1095.47	402	<.01	.07	.90	.88	.07
	Higher order model	1651.77	420	<.01	.09	.82	.8	.10
Female vs. male sample (n = 383)	Oblique lower-order model	1632.81	804	0	0.07	.88	.86	.07
Team sports vs. individual sports sample (N = 385)	Oblique lower-order model	1669.64	804	0	0.07	.88	.86	.07

Note. ARSS = Acute Recovery and Stress Scale, df = Degrees of Freedom, RMSEA = Root Mean Square Error of Approximation, CFI = Comparative Fit Index, TLI = Tucker-Lewis Index, SRMR = Standardized Root Mean Square Residual. Because we did not include the "other" gender in the multigroup CFA, the total number of participants for the multigroup confirmatory factor analysis on gender does not add up to 385.

212 Internal consistency

213 The descriptive statistics for the ARSS and SRSS are presented in Tables 3 and 4.
214 Internal consistency of the ARSS scales ranged between $\alpha=.59$ and $\alpha=.87$. The corrected item-
215 total correlations ranged between $r=.47$ and $r=.79$, and were all significant. The ARSS also
216 demonstrated good internal consistency for the *Recovery* dimension $\alpha=.91$ and the *Stress*
217 dimension $\alpha=.90$.

218 As the SRSS is a condensed version of the ARSS, each item was supported by four
219 example adjectives from the ARSS. Internal consistency of the SRSS was good for both *Recovery*
220 ($\alpha=.78$) and *Stress* ($\alpha=.75$) dimensions. The corrected item-total correlations ranged from $r=.55$
221 to $r=.65$ for the *Recovery* dimension and from $r=.31$ to $r=.72$ for the *Stress* dimension.

222

Table 3. Means, standard deviations (SD), standardized alphas, corrected item-total correlations, and inter-item correlations of the Dutch ARSS for the sample. Scores range between 0 (does not apply) and 6 (fully applies)

Scales; Adjectives	Mean (SD)	α	Corrected item-total correlations	Inter-item correlations
PPC	3.77 (0.99)	.83		
PPC item 1	3.87 (1.13)		.62	.59
PPC item 2	4.01 (1.24)		.61	.59
PPC item 3	3.72 (1.22)		.65	.57
PPC item 4	3.47 (1.24)		.79	.48
MPC	3.75 (1.03)	.75		
MPC item 1	3.77 (1.26)		.51	.60
MPC item 2 ^a	3.13 (1.57)		.04	.50
MPC item 3	3.79 (1.26)		.62	.45
MPC item 4	3.68 (1.26)		.61	.46
EB	4.14 (0.94)	.77		
EB item 1	4.54 (1.16)		.55	.48
EB item 2	4.12 (1.15)		.61	.44
EB item 3	4.26 (1.19)		.58	.45
EB item 4	3.64 (1.38)		.56	.47
OR	3.87 (1.08)	.82		
OR item 1	4.54 (1.26)		.60	.55
OR item 2	3.48 (1.38)		.55	.58
OR item 3	3.64 (1.37)		.69	.49
OR item 4	3.81 (1.35)		.71	.48
MS	1.93 (1.36)	.87		
MS item 1	2.15 (1.65)		.68	.65
MS item 2	2.21 (1.58)		.79	.58
MS item 3	1.66 (1.63)		.78	.58
MS item 4	1.71 (1.55)		.64	.68
LA	1.66 (1.09)	.77		
LA item 1	1.28 (1.46)		.47	.52
LA item 2	1.94 (1.41)		.57	.45
LA item 3	1.35 (1.33)		.63	.41
LA item 4	2.06 (1.50)		.60	.43
NES	1.61 (1.18)	.81		
NES item 1	1.45 (1.45)		.59	.55
NES item 2	2.10 (1.58)		.58	.56
NES item 3	1.35 (1.36)		.72	.46
NES item 4	1.54 (1.49)		.63	.52
OS	1.81 (1.16)	.81		
OS item 1	2.69 (1.54)		.62	.52
OS item 2	1.48 (1.37)		.66	.50
OS item 3	1.45 (1.53)		.51	.60
OS item 4	1.60 (1.41)		.73	.45

Table 3. Means, standard deviations (SD), standardized alphas, corrected item-total correlations, and inter-item correlations of the Dutch ARSS for the sample. Scores range between 0 (does not apply) and 6 (fully applies)

Scales; Adjectives	Mean (SD)	α	Corrected item-total correlations	Inter-item correlations
Note. PPC = Physical Performance Capability, MPC = Mental Performance Capability, EB = Emotional Balance, OR = Overall Recovery, MS = Muscular Stress, LA = Lack of Activation, NES = Negative Emotional State, OS = Overall Stress, ^a item deleted.				

223

Table 4. Means, standard deviations (SD), standardized alphas, corrected item-total correlations, and inter-item correlations of the Dutch SRSS for the sample. Scores range between 0 (does not apply) and 6 (fully applies).

Item	Mean (SD)	Corrected item-total correlations	Inter-item correlations
PPC	3.78 (1.06)	.58	.46
MPC	3.86 (1.17)	.65	.43
EB	3.81 (1.30)	.55	.49
OR	3.92 (1.16)	.55	.48
MS	2.09 (1.47)	.31	.60
LA	1.79 (1.42)	.55	.43
NES	1.71 (1.47)	.64	.37
OS	2.05 (1.38)	.72	.33

Note. PPC = Physical Performance Capability, MPC = Mental Performance Capability, EB = Emotional Balance, OR = Overall Recovery, MS = Muscular Stress, LA = Lack of Activation, NES = Negative Emotional State, OS = Overall Stress.

224 **Cross-cultural validity**

225 Table 5 displays the results of the multigroup CFA for the subgroups gender and type of
 226 sport. The configural and metric models showed comparable fit indices; however, in the scalar
 227 model, the fit indices were lower than ideal in both multigroup CFAs.

228

Table 5. Results of multigroup confirmatory factor analysis for the subgroups gender and type of sport

Measurement invariance		χ^2	df	p	RMSEA	CFI	SRMR	Δ df	Δ RMSEA	Δ CFI	Δ SRMR
Gender	Configural	1632.81	804	< .001	.073	.880	.07				
	Metric	1658.04	827	< .001	.072	.879	.08	23	-.001	.000	.005
	Scalar	1786.97	850	< .001	.076	.864	.08	2023	.003	-.014	.002
Type of sport	Configural	1669.64	804	< .001	.075	.88	.07				
	Metric	1698.00	827	< .001	.074	.88	.08	23	-.001	-.001	.004
	Scalar	1742.99	850	< .001	.074	.87	.08	23	.000	-.003	.001

Note. CFI = Comparative Fit Index, SRMR = Standardized Root Mean Residual; RMSEA = Root Mean Error of Approximation

229 **Construct validity**

230 **Correlations within and between the ARSS and SRSS.**

231 Table 6 presents the correlations within the ARSS scales and table 7 presents the
 232 summary of the hypotheses and results for determining construct validity. Within the *Recovery*
 233 dimension (table 6: upper left quadrant) of the ARSS, *r* ranged from .50 to .73. Within the *Stress*
 234 dimension (table 6: lower right quadrant), *r* ranged from .22 to .69. The correlations between
 235 *Recovery* and *Stress* (upper right quadrant) ranged from -.16 to -.73. All correlations were
 236 statistically significant ($p < .05$).

237 The correlations within the items were ranging from .33 to .61 for the *Short Recovery*
 238 *Scale* and from .18 to .67 for the *Short Stress Scale* (Table 6). The correlations between *Recovery*
 239 and *Stress* ranged from -.17 to -.68. All correlation coefficients were significant ($p < .05$).

240 All correlations between the corresponding scales and items of the ARSS and SRSS
 241 (Table 6) were significant ($p < .05$), and could be considered as large to very large (*r* ranged from
 242 .65 to .77).

Table 6. Pearson correlations within the Dutch ARSS scales, the Dutch SRSS items, and between the scales/items.

Scale/ Item	Between ARSS & SRSS	upper data matrix: ARSS							
		PPC	MPC	EB	OR	MS	LA	NES	OS
PPC	.74*		.73*	.67*	.60*	-.21*	-.59*	-.43*	-.54*
MPC	.65*	.50*		.65*	.54*	-.22*	-.57*	-.55*	-.52*
EB	.67*	.33*	.61*		.50*	-.16*	-.59*	-.67*	-.48*
OR	.72*	.58*	.40*	.37*		-.63*	-.35*	-.37*	-.73*
MS	.72*	-.26*	-.18*	-.17*	-.53*		.22*	.28*	.67*
LA	.66*	-.39*	-.50*	-.41*	-.22*	.18*		.69*	.60*
NES	.77*	-.35*	-.53*	-.68*	-.35*	.23*	.58*		.67*
OS	.65*	-.46*	-.48*	-.52*	-.47*	.39*	.54*	.67*	

lower data matrix: SRSS

Note. The upper matrix describes the correlations within the ARSS scales, the lower matrix describes the correlations within the SRSS items. PPC = Physical Performance Capability, MPC = Mental Performance Capability, EB = Emotional Balance, OR = Overall Recovery, MS = Muscular Stress, LA = Lack of Activation, NES = Negative Emotional State, OS = Overall Stress, * = $p < .05$.

243

Table 7. Predefined hypotheses and instances in which the hypotheses are confirmed.

Hypothesis	Confirmed in:
There are trivial to large positive correlations of .3 to .7 within the Recovery domain of the ARSS and Stress domains of the ARSS.	6/6
There are trivial to large positive correlations of .3 to .7 within the Recovery domain of the ARSS and Stress domains of the SRSS.	4/6
There are trivial to large positive correlations of .3 to .7 within the Stress domain of the ARSS and Stress domains of the ARSS.	6/6

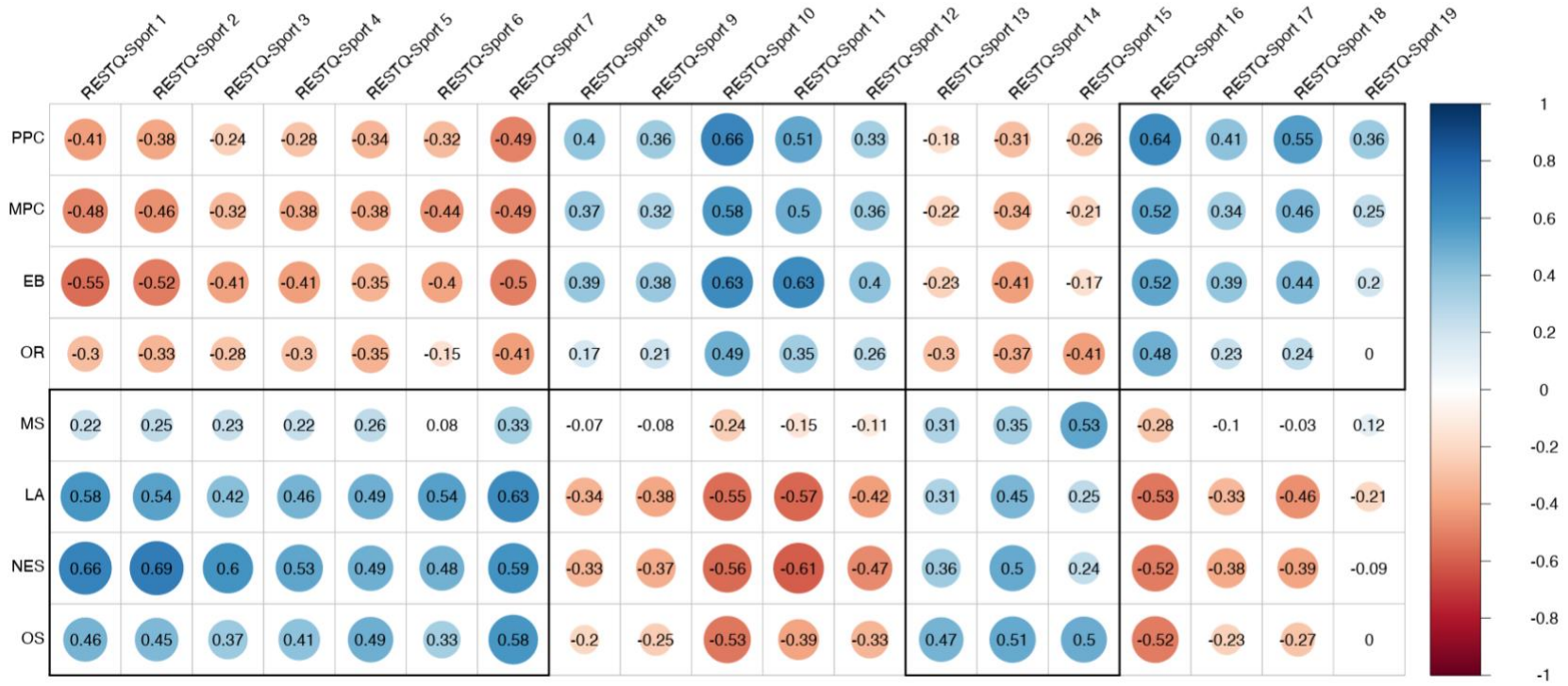
There are trivial to large positive correlations of .3 to .7 within the Stress domain of the ARSS and Stress domains of the SRSS.	4/6
There are trivial to large negative correlations of .3 to .7 between the Recovery and Stress domains of the ARSS.	13/16
There are trivial to large negative correlations of .3 to .7 between the Recovery and Stress domains of the SRSS.	12/16
There are moderate to large positive correlations of .5 to .7 between the ARSS and SRSS;	8/8
There are significant correlations between the ARSS scales and SRSS items with similar dimensions on the RESTQ-Sport-76.	291/304
There are significant positive correlations between the exertion and recovery factors (i.e., RPE, TQR) and stress and recovery scales of the ARSS.	9/16
There are significant positive correlations between the exertion and recovery factors (i.e., RPE, TQR) and stress and recovery items of the SRSS.	6/16
Total confirmed	359/400

Note. Correlations are considered trivial ($r < .1$), small ($.1 < r \leq .3$), moderate ($.3 < r \leq .5$), large ($.5 < r \leq .7$), very large ($.7 < r \leq .9$), almost perfect ($r > .9$) or perfect ($r = 1$).

244 **Correlations between RESTQ-Sport-76, ARSS and SRSS.**

245 Convergent validity of the ARSS and SRSS was assessed by examining their scores in
246 relation to the RESTQ-Sport-76 (Figure 1). The ARSS *Negative Emotional State* showed the largest
247 correlation with the RESTQ-Sport-76 *Emotional Stress* ($r = .69$). Accordingly, the SRSS *Negative*
248 *Emotional State* showed the largest correlation with the RESTQ-Sport-76 *Emotional Stress* ($r = .66$).
249 Overall, 291 of the 304 correlations were significant, and the coefficients were moderate to
250 large, while the coefficients with the SRSS were consistently smaller. Considering the
251 hypothesis-relevant relations between the different questionnaires, a congruent pattern was
252 found for the ARSS and SRSS. This pattern showed positive correlations among the related
253 areas and negative correlations between the opposite areas for both stress and recovery. For
254 example, the ARSS's *Muscular Stress* showed larger coefficients with the RESTQ-Sport-76 *Injury*
255 ($r = .53$) scale, but not with *Self-efficacy* ($r = -.03$) or *Self-regulation* ($r = -.12$).

a



b

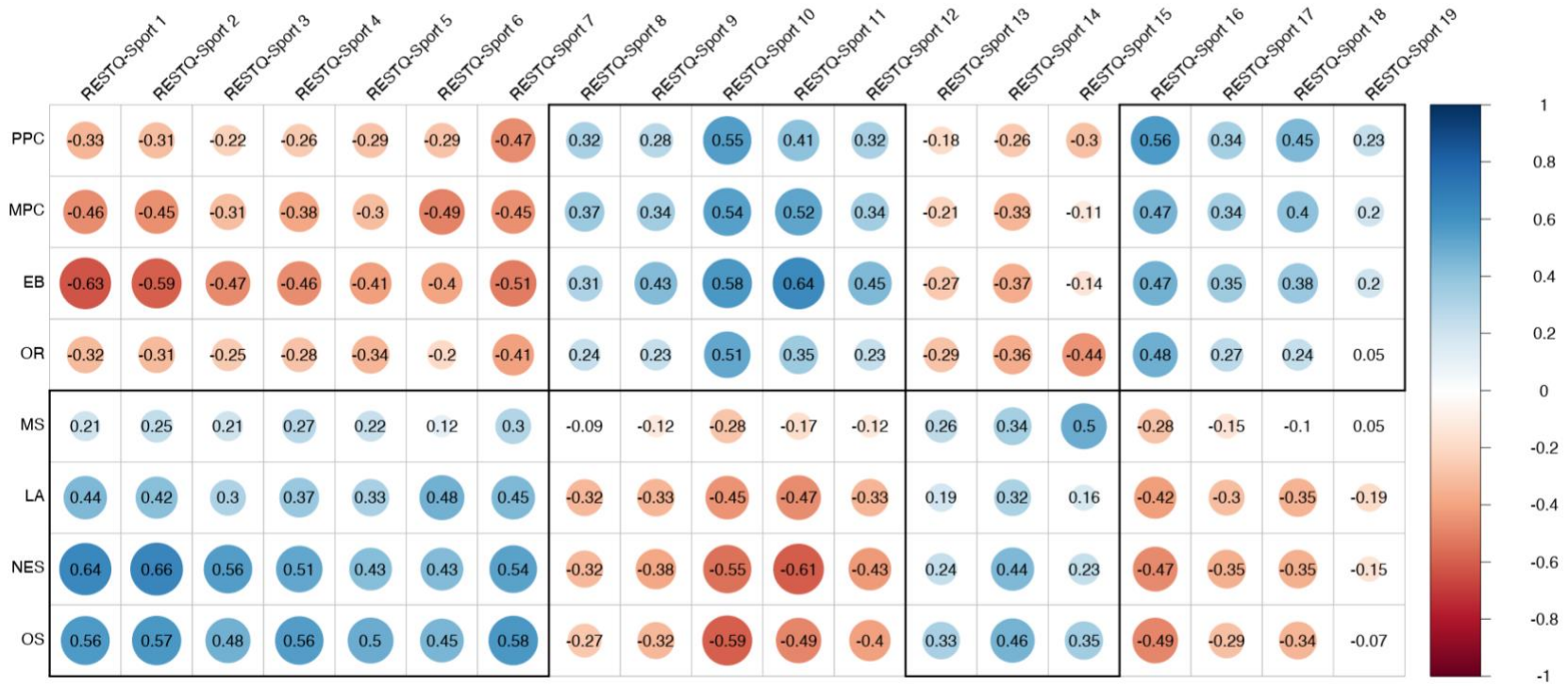


Figure 1. Pearson correlations between the ARSS (a) scales and SRSS (b) items and the RESTQ-Sport-76 scales (significant correlations are colored red (negative) or blue (positive); nonsignificant correlations are colored white). Correlations follow the expected pattern (that is, positive correlations with similar domains, negative correlations with opposite dimensions, and similar magnitudes of correlations as Nässi et al., 2017 and Kölling et al., 2020). Note. PPC = Physical Performance Capability, MPC = Mental Performance Capability, EB = Emotional Balance, OR = Overall Recovery, MS = Muscular Stress, LA = Lack of Activation, NES = Negative Emotional State, OS = Overall Stress, 1 = General Stress; 2 = Emotional Stress; 3 = Social Stress; 4 = Conflicts/Pressure; 5 = Fatigue; 6 = Lack of Energy; 7 = Physical Complaints; 8 = Success; 9 = Social Recovery; 10 = Physical Recovery; 11 = General Well-being; 12 = Sleep Quality; 13 = Disturbed Breaks; 14 = Emotional Exhaustion; 15 = Injury; 16 = Being in Shape; 17 = Personal Accomplishment; 18 = Self-Efficacy; 19 = Self-Regulation.

Correlation between RPE and TQR and ARSS and SRSS.

Finally, we calculated the correlations between the ARSS/SRSS, RPE, and TQR ($N=385$). There were significant correlations between the RPE and Overall Recovery ($r=-.23$) and Muscular Stress ($r=.19$). All scales of the ARSS except of Lack of Activation were significantly correlated with the TQR, of which Overall Recovery ($r=.63$), Muscular Stress ($r=-.63$), and Overall Stress ($r=-.51$) were the largest. Similar patterns were found for the SRSS, although the magnitude of the correlations was smaller, and fewer correlations were significant (see Appendix 4).

Discussion

This study aimed to determine structural validity, internal consistency, cross-cultural validity, and construct validity of the ARSS and SRSS in a large group of Dutch-speaking athletes. Our findings indicate that these short questionnaires are easy to administer and that their structural validity, internal consistency, cross-cultural validity, and construct validity are sufficient.

The descriptive statistics of the ARSS and SRSS were similar to those previously reported.^{14,15,31} When comparing the means and standard deviations of all specific adjectives for the ARSS, the results most closely resembled those of Kölling et al. (2020) and Hitzschke et al. (2016).^{14,31} The difference in mean scores between the current study and these studies only exceeded one point for the first item of *Overall Recovery* for the study by Hitzschke et al. (2016).¹⁴

To determine the structural validity, we replicated the analyses as described by Kölling et al. (2020) and retrieved similar global fit indices.³¹ Next, we applied multiple CFAs that included both the recovery and stress dimensions. On the whole, at least psychometrically speaking, *Recovery* and *Stress* can be seen as intertwined and interdependent constructs with clear, and correlated, underlying scales but the global fit of this model can still be improved. For instance, during the estimation of the final model, a warning was generated indicating that the variance-covariance matrix of the estimated parameters was not positive definite. This may be caused by multicollinearity or by having too few observations relative to the number of parameters in the model. Despite this warning, the results of the model are presented for the sake of completeness, but should be interpreted with caution. In addition, the scales were mostly stable for gender and type of sport. Results for the subgroups should be interpreted with caution, however, because the sample sizes for these analyses were low.

The deletion of the *Mental Performance Capability* item receptive increased internal consistency, with all scales being above the reliability threshold of $\alpha > .70$. Next to that, the corrected item-total correlations ($r > .47$) and inter-item correlations ($r > .41$) all provided

evidence for a good reliability of the scale. These high values are in accordance with validation studies among German and English samples.^{16,31} We discussed several possible alternative items and checked with the authors of the original questionnaire whether there were German items that could be considered. However, the items that they proposed were already covered in the final Dutch translation, and there was a consensus among all translators to delete the item in the final translation.

To determine the construct validity, we specified five hypotheses a priori based on previous studies.^{15,31} Of all the possible correlations, 90% were as expected. However, 4 out of 19 correlations between the *Muscular Stress* scale of the ARSS and the RESTQ-Sport-76, and 4 out of 8 correlations between the scales of the ARSS and the RESTQ-Sport-76 *Self-regulation* scale were not significant. In addition, there were some small differences with the previous studies. For the ARSS, 51 out of 304 (17%) correlations had a difference of more than .10 (but almost always less than .20) compared with the study by Kölling et al. (2020).³¹ Compared to Nässi et al. (2017),¹⁵ 63 out of 304 (21%) correlations differed by more than .10 (but almost always less than .20). The correlations between the SRSS and the RESTQ-Sport-76 showed fairly the same results as the results of the ARSS scales, but were somewhat smaller. Within the *Short Recovery Scale* of the SRSS, the highest correlations were found with the RESTQ-Sport-76 scales of *Overall Recovery* and *Physical Recovery*. The slightly weaker relations for the SRSS items could be explained by the fact that the SRSS exists of one question, whereas the scales of ARSS and RESTQ-Sport-76 are based on four questions, which makes the outcome more robust.³⁶ A possible explanation for these differences could be that the Dutch RESTQ-Sport-76 refers to the preceding week, whereas the German and English versions refers to the preceding three days/nights.

To assess whether the ARSS and SRSS scores were related to previous training, we studied the association between the preceding training RPE and subsequent recovery. There were some significant but trivial correlations between the RPE and ARSS and SRSS. An explanation for the trivial correlations is most likely that enough time elapsed for full recovery between the end of the training and the moment that the athlete completed the questionnaire.³⁷ Another explanation could be the reduced precision of RPE as a result of recall bias.³⁸ Kölling et al. (2015),¹⁶ found a relation between the intensity rated by the coach and the ARSS. However, they collected the ARSS twice a day, before and after training, during a 5-day training camp, thus excluding recall bias. Furthermore, the present study neglects the timeframe between training and measurement of stress and recovery states as the questionnaires were filled out independent of training. Thus, it is unknown what kind of

activities an athlete has engaged in since their last training. This means that athletes can be exposed to stressors in daily life, or perform recovery-enhancing activities after the training.³⁹ This could theoretically influence the relation between the preceding RPE and the score on the ARSS or SRSS at a later moment.³⁹

However, there were more significant relations between the TQR and the ARSS and SRSS. One could argue that TQR encompasses recovery and integrates different dimensions into one question. This suggests that TQR could serve as an early marker and ARSS could be used to distinguish between recovery dimensions.³ Because the TQR was completed at the same time as the ARSS and SRSS, and there was also no influence of other stressors since the last training.³ Consequently, the relation between TQR and the ARSS and SRSS was stronger than the relation between RPE and the ARSS and SRSS as discussed above.

Limitations, and future research

This study has limitations that must be considered. First, we received 385 valid responses while 850 athletes received a link to the questionnaire. Therefore, a selection bias could not be ruled out. However, the absolute number of respondents was above the target ($N=320$). This means that with the current number of participants, the study design is adequate to assess construct validity.²⁰ For the multigroup CFA, however, the required sample size ($n=200$ per subgroup) was not met and therefore, these results should be interpreted with caution.²¹

For future research, it would be fruitful to better understand the reasons behind the lower fit of the models including both the recovery and stress dimensions. These reasons can be diverse and hence relate to, amongst others, instruction, translation, grouping of items, anchors used, and scoring. For instance, the ARSS instruction asks athletes to rate their current state, whereas the SRSS the instruction asks athletes to rate their current state compared to their best recovery or stress state ever. These different instructions could have led to confusion among respondents when filling out both questionnaires. Additionally, the CFA revealed high factor loadings between some Dutch items and their underlying factor (appendix 3; seven correlations $>.8$), which makes it difficult to determine the unique contributions of each item. This could mean that some correlations should be omitted from the model, or that items with high factor loadings within a scale should be collapsed.⁴⁰ If confirmed in other studies, the number of Dutch items may be reduced. Future studies could determine whether these choices affect the measured construct and could add new items or

remove items to reduce multicollinearity, and to determine if the global model fit of a model that includes both recovery and stress could be improved.

Conclusion

This study provides a new step in the validation process of promising new scales to measure recovery and stress: the ARSS and SRSS. Our psychometric assessment revealed novel evidence that recovery and stress could be considered as intertwined constructs which is in line with the theorized model. However, the model fit of the models that include both constructs is less than ideal. In addition, we found valuable evidence that the Dutch translations of the ARSS and SRSS show sufficient construct and convergent validity, and are both correlated with total quality of recovery. Therefore, these questionnaires can be used by coaches and athletes to assess the perception of recovery and stress in sports-related research and practice. For instance, to measure recovery and stress before and after training. Future research could focus on unravelling the underlying relations between recovery and stress to further improve the structure of the questionnaires.

Contributions

Contributed to conception and design: JB, RDH, MB

Contributed to acquisition of data: JB, MB, PW

Contributed to analysis and interpretation of data: JB, RDH, MB

Drafted and/or revised the article: RDH, SJ, MK, PW, KL, MB

Approved the submitted version for publication: JB, RDH, SJ, MK, PW, KL, MB

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Data and Supplementary Material Accessibility

The full dataset and scripts are available in DataverseNL at <https://doi.org/10.34894/A7GZSJ>.

The supplementary material is available at OSF

(https://osf.io/zuyme/?view_only=91b67d07c1ac4f07b92df6f01065f481):

Appendix 1. Proposed structure of the ARSS.

Appendix 2. Replication of the analysis by Kölling et al. (2020).

Appendix 3. Standardized factor loadings and correlation matrix of the ARSS.

Appendix 4. Pearson correlations between the Dutch ARSS scales, SRSS items, and RPE and TQR.

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