

1 **Competitive Performance Predictors in Speed Climbing, Bouldering,**  
2 **and Lead Climbing**

3 Marvin Winkler<sup>a</sup>, Stefan Künzell<sup>a</sup> & Claudia Augste<sup>a</sup>

4 *<sup>a</sup>Institute of Sports Science, Augsburg University, Augsburg, Germany*

5 Marvin Winkler, Institute of Sports Science, Universitätsstraße 3, 86135 Augsburg,  
6 Germany, [mr.marvin.winkler@gmail.com](mailto:mr.marvin.winkler@gmail.com)

7

## 8 **Competitive Performance Predictors in Speed Climbing, Bouldering,** 9 **and Lead Climbing**

10

11 The study modeled the influence of anthropometric components, climbing-  
12 specific power, strength and endurance parameters, flexibility, coordination, and  
13 motor planning skills on competitive climbing performance in speed, bouldering,  
14 and lead climbing. Sixty-one competitive climbers (26 women [ $18.1 \pm 1.9$ y], 35  
15 men [ $21.4 \pm 6.1$ y]) participated. PCA and MRA were used for statistical analyses.  
16 Significant predictors for speed climbing performance ( $R^2 = 44\%$  and  $35\%$ ) were  
17 lower ( $\beta = .43$  and  $.47$ ) and upper body power and strength ( $\beta = .40$  and  $.37$ ) for  
18 women and men, respectively. For women's bouldering performance ( $R^2 = 39\%$ ),  
19 they were hip flexibility ( $\beta = .42$ ) and upper body power and strength ( $\beta = .37$ ),  
20 for the men's ( $R^2 = 53\%$ ) lower ( $\beta = .41$ ) and upper body power ( $\beta = .41$ ) and  
21 body fat ( $\beta = .37$ ). For women's lead climbing ( $R^2 = 58\%$ ) upper body power and  
22 strength ( $\beta = .59$ ) and finger endurance ( $\beta = .48$ ) predict performance, for the  
23 men's ( $R^2 = 58\%$ ) lower ( $\beta = .36$ ) and upper body power ( $\beta = .28$ ), body fat  
24 ( $\beta = .27$ ) and motor planning skills ( $\beta = .27$ ). The multivariate models provide a  
25 framework for scientifically grounded climbing training by emphasizing the role  
26 of specific performance components.

27

28 Keywords: performance analysis, elite climbing, bouldering, lead climbing, speed  
29 climbing

30

31 Word count: 4364

## 32 **Introduction**

33 Scientific analyses of competition performance's main prerequisites and components are  
34 required to further develop peak performance in competitions. At present, multivariate  
35 analyses in sport climbing are rare. Mermier (2000) aimed to identify the  
36 anthropometric and physiological determinants of lead climbing performance based on  
37 a large number of variables categorized into "training," "flexibility," and  
38 "anthropometric" components, with a descending proportion of variance clarification.  
39 Baláš et al. (2012) explained lead climbing performance based on hand and arm  
40 strength and endurance and the exogenous variables body of fat percentage, climbing  
41 volume, and climbing experience. Magiera et al. (2013) assessed the variables that  
42 predict self-reported lead climbing performance and extracted three sets of variables  
43 corresponding to physical, technical, and mental characteristics. Laffaye et al. (2016)  
44 likewise performed a multivariate analysis on lead climbing ability and extracted three  
45 components: training, muscle, and anthropometry. Lastly, MacKenzie et al. (2020)  
46 analyzed the role of physical and physiological characteristics in lead climbing ability  
47 and identified shoulder power and endurance as crucial components. Secondary  
48 determinants were finger, hand, and arm strength, core-body endurance, aerobic  
49 endurance, flexibility, and balance.

50         These examples show that previous studies included different variables and  
51 therefore identified a varying number of different components. The existing multivariate  
52 analyses are limited to lead climbing only, with bouldering and speed climbing  
53 remaining unaddressed.

54         Apart from the multivariate studies presented above, the present research  
55 focuses on single characteristics and their contribution to climbing performance (for a  
56 review, see Saul et al. (2019)).

57           The increased professionalization and popularity of the sport, including its  
58 election as an Olympic discipline, are conducive to a high interest in studies providing  
59 valid measurements of competitive climbing performance. Yet in almost all studies,  
60 climbing performance is quantified by self-reported ability assessment, which provides  
61 a valid and accurate reflection of lead climbing ability (Draper, Dickson, Blackwell,  
62 Fryer, et al., 2011) but does not necessarily reflect competitive climbing performance.  
63 Therefore, for studies about competitive climbing, it is of uttermost importance to use  
64 valid measurements for competitive climbing performance: either the ranking or the  
65 scores the ranking is based on.

66           The only previous study dealing with competitive climbing performance is from  
67 Mladenov et al. (2009). They determined the correlation between anthropometric and  
68 strength characteristics and achieved ranking at a bouldering World Cup in 2007 and  
69 found significant correlations between ranking and age, experience, and height, but not  
70 for any of the other anthropometric or strength characteristics. Bouldering performance  
71 depends on a great variety of skills whose relative importance is primarily influenced by  
72 the characteristics of the set boulder problems (Augste et al., 2021), which could  
73 explain the small predictive values of anthropometric and strength characteristics.

74           To conclude the above findings, we can observe that there is currently a research  
75 gap regarding multivariate models to predict competitive climbing performance.

76           Another essential aspect to be addressed is the severe underrepresentation of  
77 climbing-related studies on women in the current literature. Women, when included,  
78 have been the minority, and studies with only female participants are rare. Exceptions  
79 are the studies from Giles, Barnes, et al. (2021), Grant et al. (2001), and Wall et al.  
80 (2004). Furthermore, few sex-specific analyses have been performed (Baláš et al., 2012;  
81 MacKenzie et al., 2020).

82 To address both aspects (the above-mentioned research deficit on multivariate  
83 models to predict competitive climbing performance and the lack of sex-specific  
84 analyses), the present study aims to perform sex-specific multivariate analyses of  
85 competitive climbing performance in the present-day disciplines of speed, bouldering,  
86 and lead.<sup>1</sup>

## 87 **METHODS**

### 88 *Procedure*

89 For the multivariate analyses, hypothetically relevant variables for climbing  
90 performance in the respective disciplines were tested with specific performance tests in  
91 a study of competition climbers. These variables were either identified through a  
92 systematic literature review or derived from interviews with expert coaches (Augste &  
93 Künzell, 2017). The 14 tests included in the test battery were evaluated in preliminary  
94 studies and showed sufficient reliability (all  $ICC > .86$ ) and validity (all  $R > .52$ )  
95 (Augste et al., 2020a). The participants performed all tests within a single test session  
96 such that 1) recovery time between single tests targeting the same muscle groups was  
97 maximized, and 2) maximum strength tests were performed before strength endurance  
98 tests. For each test, athletes received instruction regarding the procedure and completed  
99 a familiarization trial consisting of one attempt for the power, maximum strength,  
100 flexibility, and coordination tests, and a few repetitions for the endurance tests. The

---

1

Hatch and Leonardon (2021). Olympic Combined is not considered since no competitions in the format used for the 2024 Olympic Games had taken place so far and therefore no rankings are available.

101 familiarization trial was done for each test separately and immediately before the actual  
102 test. A few minutes of rest were given to minimize the influence of fatigue on the test  
103 results. Test familiarization and testing were performed within the same session to  
104 reduce the impact on the participants' training schedules and therefore enhance study  
105 compliance.

106 Although the test protocol called for only one attempt, athletes were encouraged to  
107 make another if they felt they had not achieved maximum performance. The best result  
108 was included in the final data analysis.

## 109 *Variables*

### 110 *Independent Variables*

111 The following tests were performed; for further details, see Augste et al. (2020b).

#### 112 • Anthropometry

113 Anthropometric measurements included height, arm span, body weight, and fat  
114 percentage. In addition, the arm span to height index was calculated.

115 Measurements were taken with a tape measure or digital scale with 1 centimeter  
116 or kilogram accuracy. Body fat percentage was determined through  
117 bioimpedance (BC-545N, Tanita Europe BV, Netherlands).

#### 118 • Upper limb power and maximum strength

119 Maximum finger strength was measured in half crimp and open hand finger  
120 position on two different hold sizes (8 mm Beastmaker micro and 23 mm  
121 custom-built rung with 12 mm radius) to specifically target both the m. flexor  
122 digitorum profundus and m. flexor digitorum superficialis (Schweizer & Hudek,  
123 2011). Athletes stood on a force plate (Kistler Instrumente GmbH, Germany) in  
124 an upright body position with straight arms as recommended by Michailov et al.

125 (2018) and maximally loaded the rung for at least 3 seconds by bending the  
126 knees. If necessary, additional weight was attached to the athlete's harness. The  
127 maximum average value of the loaded weight for a 3-second period was  
128 calculated and divided by the athlete's body weight.

129 The maximum strength of the arm flexors was measured using the same method  
130 as used for finger strength, except a bar was used, and the athletes loaded their  
131 arms at a 90-degree elbow angle.

132 Upper body power was tested using the power slap test described by Draper,  
133 Dickson, Blackwell, Priestley, et al. (2011). Hanging from the rung on the power  
134 slap board, athletes performed an explosive initiation of a pull-up followed by  
135 the release of one hand hitting the board at the highest possible point. The  
136 vertical distance between the rung's upper edge and the highest point of the  
137 visible imprint was measured. Absolute distance and distance relative to arm  
138 span were considered.

139 • Lower limb power

140 Athletes performed unilateral and bilateral countermovement (CMJ) and  
141 bilateral squat jumps (SJ). A newly developed test similar to the box jump step-  
142 up was also applied. The box height was adjusted to standardize the knee angle  
143 of the take-off leg to 90 degrees. Athletes jumped up explosively while keeping  
144 their hands on their hips and their lower leg straight without performing a  
145 countermovement. The vertical jump performance for all jump tests was  
146 calculated via flight time.

147 • Strength endurance of the upper limbs

148 To mimic the load structure in lead competitions (Winkler et al., 2022), an  
149 intermittent finger endurance test consisting of a loading phase of 7 s hanging

150 with straight arms on a crimp followed by 2 s of rest was performed. Completed  
151 repetitions were counted until contact with the hold was lost before the end of the  
152 load phase. Furthermore, a 30-second continuous finger endurance test on a 23  
153 mm-rung, as described by Michailov et al. (2018) was performed to measure the  
154 average force normalized to body weight.

155 • Maximum core strength and endurance

156 One core maximum strength test and one core strength endurance test were  
157 performed, as suggested by Winkler (2018). For the maximum strength test,  
158 athletes held a bar and placed their feet on two footsteps attached to a board  
159 (inclination: -60 degrees). The distance between the bar and the footsteps was  
160 equal to the vertical height of the tuberculum majus. Athletes were instructed to  
161 release both feet simultaneously and to minimize backswing. The maximum  
162 backswing angle was assessed using a smartphone attached between the athlete's  
163 shoulder blades and running an app for digital angle measurement with a  
164 recording function. For the strength endurance test, the distance between the bar  
165 and footsteps was reduced and set to equal the difference between the athlete's  
166 height and the vertical height of the lateral joint line of the knee. Athletes  
167 alternately stepped on the footsteps in a diagonal manner from the hanging  
168 position without swinging. Repetitions were counted until the athletes failed to  
169 step on the footsteps on three consecutive attempts.

170 • Flexibility

171 For hip flexibility assessment, two different tests were used. The starting  
172 positions for both tests were the same. Athletes stood on two footsteps set  
173 shoulder-width apart on a vertical wall and held onto a rung adjusted to a height  
174 that required them to stand upright with their arms fully extended. For the



175 lateral-frontal leg lifting test, athletes lifted one leg as high as possible while  
176 straightening the leg. For the frontal knee raising test, the aim was to lift the  
177 knee as high as possible while maintaining a frontal position controlled by wall  
178 contact of the contralateral hip and the knee and heel of the lifted leg. The  
179 vertical distance between the footsteps and the highest part of the foot or knee,  
180 which could be maintained for two seconds, was measured.

181 • Coordination

182 To assess the simultaneous coordination level of limbs, athletes had to jump  
183 sideways to four climbing holds mounted on a vertical wall. The time delay  
184 between the contact of the first and the last limb with the respective climbing  
185 hold was measured.

186 • Motor planning

187 Athletes had to visualize four competition-style boulder problems of  
188 submaximal difficulties and record the planned order of movements on a chart  
189 before attempting the boulders. The ratio of matches between the visualized and  
190 realized moves was determined.

191 *Dependent Variables*

192 Climbing performance as the criterion variable was operationalized as follows: For  
193 speed, personal best times on the 15 m standard route were obtained from publicly  
194 available competition results or personal training best times measured by an approved  
195 automatic timing system. For lead and bouldering, a ranking list of athletes in the  
196 respective disciplines was created based on placements in all official climbing  
197 competitions in 2018 and 2019. An athlete was ranked above another if they performed  
198 better more frequently than the other.

199 ***Participants***

200 Sixty-one German competitive climbers (26 female, 35 male) participated in the study,  
201 from regional squad athletes to national team athletes. Participants were included in the  
202 study if a) they were allowed to compete in the adult category and b) they participated  
203 in at least one official competition, irrespective of the climbing discipline, in 2018 or  
204 2019. Participants' assignment to the climbing disciplines was based on competition  
205 results; if they had a valid result in bouldering, lead or speed their data were used for  
206 separate discipline-specific analyses.

207 Subject characteristics were assessed according to the recommendations by Draper et al.  
208 (2015). Participants received online questionnaires after test completion and were  
209 requested to complete within the following week. Subject characteristics are presented  
210 in table 1.

211 \*\*\* Insert Table 1 here \*\*\*

212 The local university ethics committee approved the study (Augsburg University,  
213 approval number: 18/05), and all athletes gave written consent to participate.

214 ***Statistical Analyses***

215 First, variables that showed neither a significant correlation nor mean differences  
216 between performance groups concerning climbing performance were excluded. Next,  
217 the remaining variables were grouped using factor analyses. The selection regarding the  
218 number of factors and the rotation method was based on the interpretability criterion,  
219 resulting in a simple structure. Multiple imputations, that estimated missing data of the  
220 independent variables with 20 iterations (Corbeil, 2016), were averaged to create the  
221 final data set used for factor analysis (Sauer, 2010). Multiple regression analysis was

222 applied using the factor scores as independent variables to determine the influence of  
223 the identified components on climbing performance. IBM® SPSS® Statistics (Version  
224 26) was used for all statistical analyses.

## 225 **Results**

226 Descriptive results of all tests are presented in table 2.

227 \*\*\* Insert Table 2 here \*\*\*

228 The multivariate models for each discipline and sex are shown in Figures 1-6. The  
229 extracted components are presented in the middle column with their respective variables  
230 and factor loadings on the left. The influence of the respective components on  
231 competition performance is quantified via the standardized beta coefficient obtained  
232 from multiple regression analysis. All components that enhanced the overall model fit  
233 are shown.

234

235 \*\*\* Insert Figures 1 - 6 about here \*\*\*

236

237 The proportion of variance explained varied. For women, climbing performance was  
238 best explained in lead ( $R^2 = .577$ ), followed by speed ( $R^2 = .437$ ) and bouldering  
239 ( $R^2 = .386$ ), whereas for men, it was highest in bouldering ( $R^2 = .534$ ) followed by lead  
240 ( $R^2 = .518$ ) and speed ( $R^2 = .348$ ). Consequently, the variance explained was higher for  
241 women than for men in speed and lead but not in bouldering.

242 For women, arm strength and power were among the highest predictors across all  
243 disciplines. Exceptions were lower body power in speed climbing and flexibility in  
244 bouldering, which were the only components with a higher predictive value than arm  
245 strength and power.

246

247 Finger strength and endurance are two more extracted components. Finger strength but  
248 not endurance predicts speed climbing times; both predict bouldering performance. In  
249 lead climbing, finger endurance was significant but finger strength was not. Of the other  
250 assessed variables (coordination, anthropometrics, and motor planning), coordination  
251 enhanced the model fit in speed climbing but not in bouldering and lead, while  
252 anthropometrics and motor planning did not show predictive value in any of the  
253 disciplines.

254 For men, the highest predictor across all disciplines was lower body power, followed by  
255 upper body power for bouldering and lead, and power and maximum strength for speed.  
256 Strength and strength endurance further enhanced the overall model fit in all disciplines,  
257 but for lead climbing this was the case only for maximum strength and not for strength  
258 endurance. The only predictive anthropometric variable was body fat percentage, which  
259 significantly predicted bouldering performance and showed a trend towards being  
260 significant in lead, but didn't play any role in speed climbing. Similar results were found  
261 for coordination, which enhanced the overall model fit in bouldering and lead but not in  
262 speed climbing. Motor planning and core endurance contributed to variance explanation  
263 only in lead climbing.

## 264 **Discussion**

265 This study is the only multivariate analysis that models the influence of different  
266 performance components on competitive climbing performance. Given the  
267 multifactorial nature of performance, each athlete uses a specific set of skills to master  
268 the climbs with varying requirements across different disciplines and route-setting  
269 styles. Furthermore, the performance components are partly complementary (Magiera et

270 al., 2013). Multivariate models do not provide a complete understanding of climbing  
271 performance, but since studies on competition climbing are scarce in general, they do  
272 provide a framework for scientifically grounded climbing training by emphasizing the  
273 role of specific performance components (Baláš et al., 2012). Targeted training of  
274 components that predict climbing performance has been shown to improve climbing  
275 performance (MacKenzie et al., 2020).  
276 The results and training implications for each discipline are discussed separately below.

### 277 *Speed*

278 Given the nature of the sport, speed climbing performance depends mainly on speed,  
279 power, and maximum strength of the lower and upper limbs.

280 Accordingly, for women, lower limb power was the best predictor of speed climbing  
281 time, followed by the arm strength factor. For men similarly, lower limb power was the  
282 highest predictor, followed by the factor representing arm power and maximum strength  
283 of the finger flexors.

284 These findings align with existing studies, which indicate that jumping performance  
285 parameters predict speed climbing time (Krawczyk et al., 2020). Additional variables  
286 that could enhance the explained variance might be reaction times to the starting signal,  
287 technical components such as optimizing the trajectory path of the center of mass  
288 (Legreneur et al., 2019), and anthropometric components (Krawczyk et al., 2018). The  
289 latter may not come into play in our study due to the relatively low level of the  
290 participants compared to the world's best speed climbers.

### 291 *Bouldering*

292 For competitive bouldering, multivariate analyses revealed different predictors for

293 women and men, which implies that they should set different training priorities.

294 For women, hip flexibility measured by the lateral-frontal leg raising test best predicted  
295 competition performance. The remarkable importance of hip flexibility seems to be a  
296 unique feature of competitive bouldering, given that in previous studies, flexibility  
297 showed no relation to bouldering performance (Giles, Barnes, et al., 2021; Wall et al.,  
298 2004). This might be because foot placements in competitive climbing on artificial  
299 climbing walls are highly limited compared to outdoor bouldering. High levels of  
300 flexibility enable athletes to reach stretched-out body positions and improve the  
301 direction of force applied to holds by increasing the range of center of gravity  
302 displacements and limb positioning. Ultimately, flexibility may lead to an expansion of  
303 an athlete's movement repertoire, which has the potential to increase performance by  
304 allowing new solutions for bouldering problems (Künzell et al., 2021). Based on the  
305 high importance of flexibility for competitive performance and the above-discussed  
306 advantages of high levels of flexibility, effective training programs to improve  
307 climbing-specific hip flexibility should be implemented.

308 The high predictive value of flexibility in the women's but not in the men's category  
309 could be due to differences in route setting styles between sexes.

310 Additionally, we found high importance for upper limb power, maximum strength, and  
311 strength endurance, which is in line with other studies on bouldering performance (Wall  
312 et al., 2004) and self-reported bouldering abilities (Augustsson et al., 2018; Giles,  
313 Barnes, et al., 2021; Giles, Hartley, et al., 2021; Torr et al., 2020).

314

315 For men, lower limb power is the highest predictor of bouldering performance. This  
316 factor may also be of particular relevance to competitive bouldering due to the

317 discipline's specific requirements. More than 50% of the bouldering sequences in World  
318 Cups are dynos, and the top 20 athletes score significantly better in this category than  
319 lower-ranked athletes (Augste et al., 2021). Route setters aim to set visually attractive  
320 boulder problems, which, in contrast to outdoor bouldering, contain many dynamic  
321 elements. Given the differences between competitive and outdoor bouldering, it is  
322 unsurprising that in the study by Gaşior (2020), the dynamic and kinematic parameters  
323 of the lower limbs didn't influence self-reported ability levels. For competitive  
324 bouldering, however, adding often-neglected strength and conditioning programs for the  
325 lower limbs more frequently, especially for lower body power, may be beneficial for the  
326 athlete's performance.

327

328 Of almost similar predictive value is upper limb power. Other studies confirm its  
329 outstanding role in bouldering performance, both as a primary discriminant between  
330 boulder and lead climbers (Fanchini et al., 2013) and between boulderers of different  
331 levels (Gaşior, 2020). Therefore, power should be trained and assessed in addition to  
332 maximum strength. Power training recommendations highlight the use of movement  
333 patterns, loads, and velocities that are specific to the sport's demands and emphasize  
334 that traditional strength training exercises are recommended for less-trained athletes  
335 when it comes to movement patterns. In contrast, ballistic and plyometric exercises are  
336 mandatory for highly trained athletes, such as competitive boulderers (Cormie et al.,  
337 2011).

338 The only anthropometric variable that predicted bouldering performance is body fat  
339 percentage. This contrasts with Mladenov et al. (2009), who found a significant  
340 correlation between ranking and height (apart from age and experience). The more  
341 heterogeneous sample in our study might explain the study's differences.

342 The maximum strength of finger flexors and upper limbs also enhanced the overall  
343 model fit, but wasn't a significant predictor for competitive performance. Given that  
344 male boulderers are characterized as having higher levels of finger and arm strength and  
345 similar levels of finger endurance compared to lead climbers (Fanchini et al., 2013;  
346 Stien et al., 2019), it is not surprising that these variables predict bouldering  
347 performance, which is in consensus with several other studies (Augustsson et al., 2018;  
348 Fanchini et al., 2013; Gąsior, 2020; Giles, Hartley, et al., 2021; Macdonald & Callender,  
349 2011; Stien et al., 2019). In the only other study of competitive bouldering (Mladenov et  
350 al., 2009), no significant correlations were found between handgrip or finger strength  
351 and competition ranking. Considering our findings, this strengthens the hypothesis that  
352 for competitive bouldering, upper limb power is more important than maximal finger  
353 flexor strength, and thus should be prioritized in training.

#### 354 *Lead*

355 For competitive lead climbing, performance was explained by only two factors in the  
356 women's category, whereas many more factors enhanced the overall model fit for men.  
357 The dissimilar results found for women and men could either be an actual difference  
358 due to non-identical competition requirements or be biased by differences in sample  
359 sizes and the climbing levels of participants.

360

361 For women, two extracted factors, arm strength and finger endurance, explained 57.7%  
362 of competition performance. Their relevance is supported by MacKenzie et al. (2020),  
363 in which shoulder power and endurance factors, which consist of measures similar to  
364 the arm strength factor in our study, explained 62% of self-reported lead climbing  
365 abilities. The high amount of variance explained by arm strength and finger endurance



366 only, underlies their high relevance for competitive performance and these qualities are  
367 thus recommended as a primary training priority.

368

369 For men, in contrast, the numerous factors contributing to climbing success (presented  
370 in descending order) are lower limb power, upper limb power, constitution (body fat  
371 percentage), motor planning abilities, core endurance, coordination, and maximum  
372 strength of the upper limbs.

373 A notable finding is that lower body power is the highest predictor of climbing  
374 performance. To our knowledge, no studies exist that have analyzed the relationship  
375 between lower body power and lead climbing performance, and this factor has not been  
376 assessed in existing multivariate analyses (Baláš et al., 2012; Laffaye et al., 2016;  
377 MacKenzie et al., 2020; Magiera et al., 2013; Mermier, 2000). The fact that lower body  
378 power is important for climbing is also shown by Li et al. (2018), who showed that  
379 climbing enhanced vertical jump performance among college students, and in the study  
380 by Ryepko (2013), in which lead climbers had higher levels of jumping power than  
381 mountaineers. As for bouldering, we can conclude that strength and conditioning  
382 programs for the lower limbs should be performed regularly.

383

384 In contrast, upper limb power is a well-studied performance indicator (Draper, Dickson,  
385 Blackwell, Priestley, et al., 2011; Laffaye et al., 2014). Whereas in previous  
386 multivariate studies maximum upper limb strength was extracted as one of the main  
387 determinants, in our research, power had a higher predictive value than maximum  
388 strength, which enhanced the overall model fit but wasn't a significant predictor of  
389 climbing performance. Therefore, as for bouldering, power should be trained and  
390 assessed in addition to maximum strength.

391 The only predictive anthropometric parameter was body fat percentage. However, the  
392 role of body fat percentage is inconsistent between studies. Though elite climbers have  
393 the lowest values (Saul et al., 2019), it has little predictive power. The highest value  
394 among the multivariate analyses was found by Baláš et al. (2012), who reported body  
395 fat percentage as the only anthropometric variable directly related to climbing  
396 performance, with an explained variance of 22% for women and 11% for men. In  
397 contrast, Laffaye et al. (2016) found only 4% and Mermier (2000) 0.3% of explained  
398 variance by various anthropometric parameters, while Magiera et al. (2013) as well as  
399 MacKenzie et al. (2020) found no significant relation.

400 Motor planning, assessed in our study via the agreement between visualized and  
401 realized moves, refers to the so-called route reading skill: the ability to decode and  
402 recall movement sequences. Sanchez et al. (2012) showed that route previewing  
403 positively influenced climbing efficiency but not success in routes that were easier than  
404 the participant's level. However, the influence of route previewing might be different in  
405 real competitions, given the high complexity of competition-style routes and, in contrast  
406 to Sanchez et al. (2012), a route difficulty at or above the competitors' level.

407

408 Core endurance is another performance factor that has received little attention in  
409 climbing-specific scientific literature. In our study, it wasn't a significant performance  
410 contributing factor but it did enhance the overall model fit. Similarly, in the study by  
411 MacKenzie et al. (2020), it correlated positively with climbing performance but wasn't  
412 included in the final model.

413 Finally, high levels of coordination seem beneficial. In a systematic review, Orth et al.  
414 (2016) pointed out that advanced climbing performance is characterized by smoothness  
415 and fluency, which is achieved by optimizing perceptual and movement-related

416 behavior, limb activity, and postural adjustments. In our case, coordination, specifically  
417 the simultaneous coordination of limbs when making dynamic moves, improved the  
418 model fit and underlined that good coordination addresses today's requirements of  
419 competitive lead climbing. Therefore, since modern lead routes are designed by  
420 stringing together several boulder problems, it is recommended that dynamic-  
421 coordination moves be included in technique training for lead climbing as well.

#### 422 *Limitations*

423 The current study provides valuable insight into the main determinants of competitive  
424 climbing. However, since there is no uniform ranking list based on multiple  
425 competitions attended by many competitors, the described procedure to create ranking  
426 lists in Germany necessitated a wider time span between performance assessment and  
427 competitions. Furthermore, although sport climbing has been included in the canon of  
428 Olympic sports, competition climbing is still a niche sport. Therefore, even though we  
429 tried to recruit as many competition climbers as possible, and most of the national squad  
430 athletes participated in our study, the sample size must still be considered very small  
431 from a statistical point of view regarding the calculation of factor analysis. One  
432 limitation is that physical performance indicators were mainly measured, with mental,  
433 skill, and tactical factors being underrepresented. This is because no validated test  
434 protocols exist for these factors, and further research is needed. The integration of these  
435 parameters might enhance the model fit for multivariate analyses.

436

437

438

439 **Acknowledgments**

440 We would like to thank everyone who contributed to this study: The study assistants for  
441 data acquisition and processing, the German Alpine Club for providing the athletes, the  
442 DAV Kletterzentrum Augsburg for letting us use their premises and facilities, and  
443 especially the participants. Thank you.

444 **Funding details**

445 This study was part of the research project "Development of a scientifically based  
446 performance diagnostics in sports climbing," funded by the German Federal Institute  
447 of Sport Science (BISp ZMVI4-070707/18-19).

448 **Declaration of interest statement**

449 The corresponding author declares no conflict of interest for himself and his co-authors.  
450

451      **Appendix**

452

453 Table 1: Subject characteristics

	Women		Men	
	M	SD	M	SD
Age [years]	18.1	1.9	21.4	6.4
Lead: Self-reported ability <sup>1</sup> [IRCRA scale]	19.7	2.1	22.4	2.6
Bouldering: Self-reported ability <sup>1</sup> [IRCRA scale]	21.1	2.1	24.6	2.6
Speed: Personal best 15 m standard route [s]	12.8	3.0	11.0	4.5
Weekly training session <sup>2</sup>	4.6	1.4	5.0	1.9
Training session duration <sup>2</sup> [min]	177.9	42.2	167.3	32.1
Percentage of lead training <sup>2</sup> [%]	38.8	26.1	34.2	18.1
Percentage of bouldering training <sup>2</sup> [%]	43.5	22.4	57.1	19.0
Percentage of speed training <sup>2</sup> [%]	9.1	7.5	5.0	8.4
Percentage of indoor climbing <sup>2</sup> [%]	82.1	20.1	86.9	9.0

454 Legend: <sup>1</sup>3 hardest ascents in the past three months, <sup>2</sup>in the past 12 months, "Other training content "not  
 455 displayed in the table.  
 456

457 Table 2: Descriptive test results

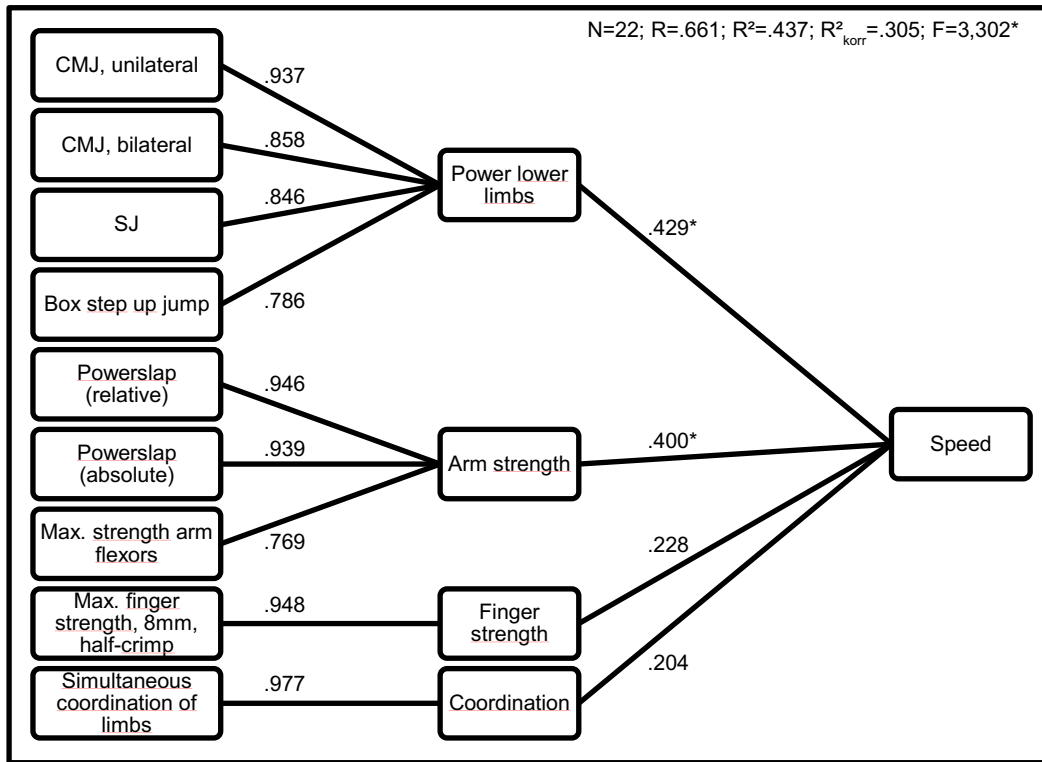
	Women		Men	
	M	SD	M	SD
Anthropometrics				
Body height [cm]	166.0	4.3	176.5	6.3
Body weight [kg]	58.5	4.9	66.3	7.3
Body fat [%]	18.0	3.8	8.2	2.9
Arm span [cm]	168.5	4.9	184.1	7.7
Arm span to height index	1.02	0.02	1.04	0.02
Power and maximum strength of the upper limbs				
Max. finger strength, 23 mm, open hand [%] <sup>1</sup>	85.6	11.2	97.8	16.9
Max. finger strength, 23 mm half-crimp [%] <sup>1</sup>	76.4	10.7	92.2	12.1
Max. finger strength, 8 mm, open hand [%] <sup>1</sup>	44.3	6.5	50.9	10.7
Max. finger strength, 8 mm, half-crimp [%] <sup>1</sup>	43.2	6.6	55.6	10.0
Powerslap [cm]	80.1	8.7	98.3	8.5
Powerslap [%] <sup>2</sup>	47.7	5.2	52.9	3.9
Max. strength arm flexors [%] <sup>1</sup>	85.1	12.0	106.5	12.7
Power of the lower limbs				
Box step-up jump [cm]	11.3	2.3	13.9	3.7
CMJ, bilateral [cm]	28.9	3.8	37.7	6.0
CMJ, unilateral [cm]	13.8	2.1	17.2	4.0
SJ, bilateral [cm]	26.9	3.5	35.4	5.6
Power endurance of the upper limbs				
Intermittent finger endurance [rep]	11.9	3.9	16.3	6.0
Continuous finger endurance [%] <sup>1</sup>	55.1	8.2	71.5	9.8
Body tension				
Maximum strength [°]	-65.3	18.3	-66.3	14.9
Strength endurance [rep]	10.4	6.7	27.7	11.6
Flexibility				
Lateral-frontal leg lifting [cm]	146.9	26.1	129.9	16.6
Lateral-frontal leg lifting [%] <sup>3</sup>	89.2	16.7	74.7	10.3
Frontal knee raising [cm]	93.6	6.0	98.3	5.1
Frontal knee raising [%] <sup>3</sup>	56.8	3.5	55.4	1.9
Coordination				
Simultaneous coordination of limbs [s]	0.94	0.66	1.15	0.52
Motor planning				
Agreement between visualized & realized moves [%]	48.6	11.3	55.5	11.0

458 Legend: <sup>1</sup> in relation to body weight, <sup>2</sup> in relation to arm span, <sup>3</sup> in relation to body height

459

460  
461  
462

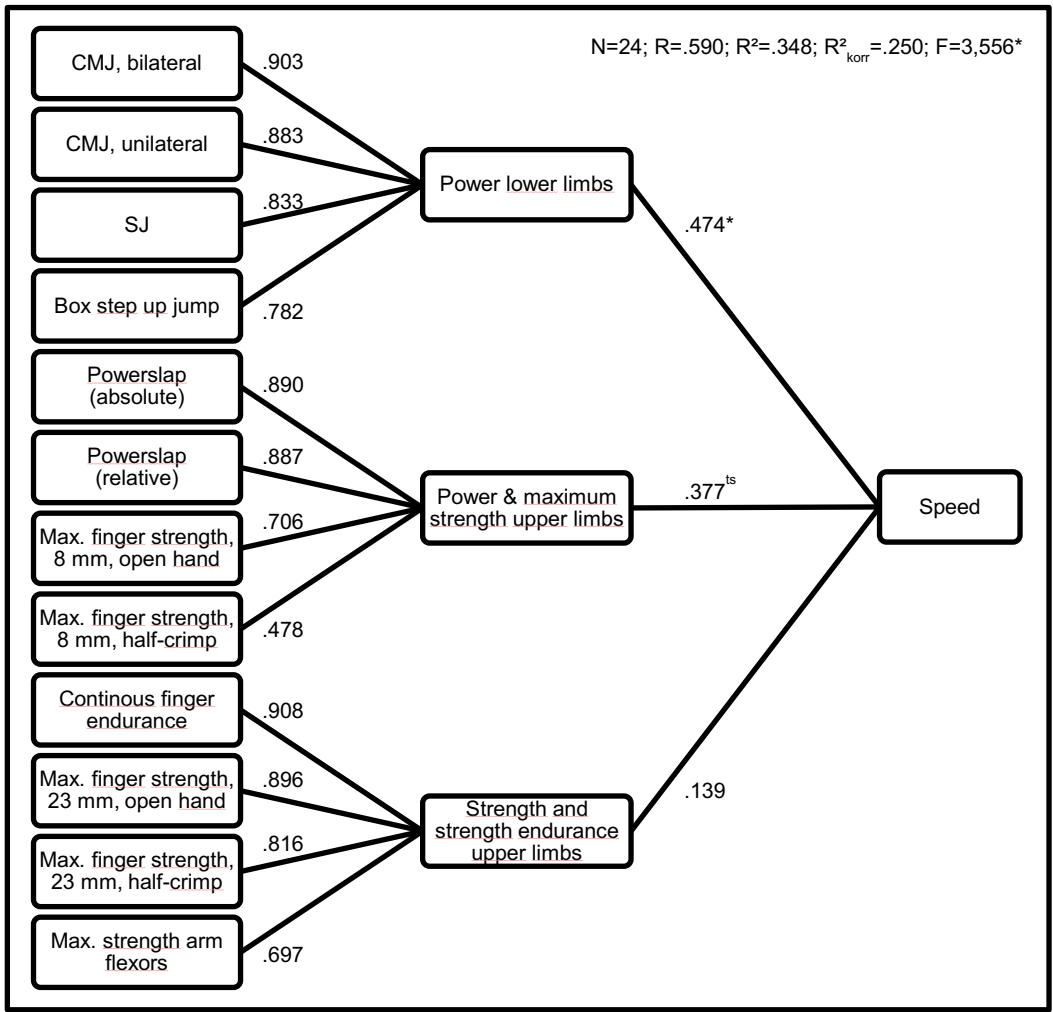
Figure 1: Multivariate model of speed climbing performance in the women's category



\* p < .05



463 Figure 2: Multivariate models of speed climbing performance in the men's category



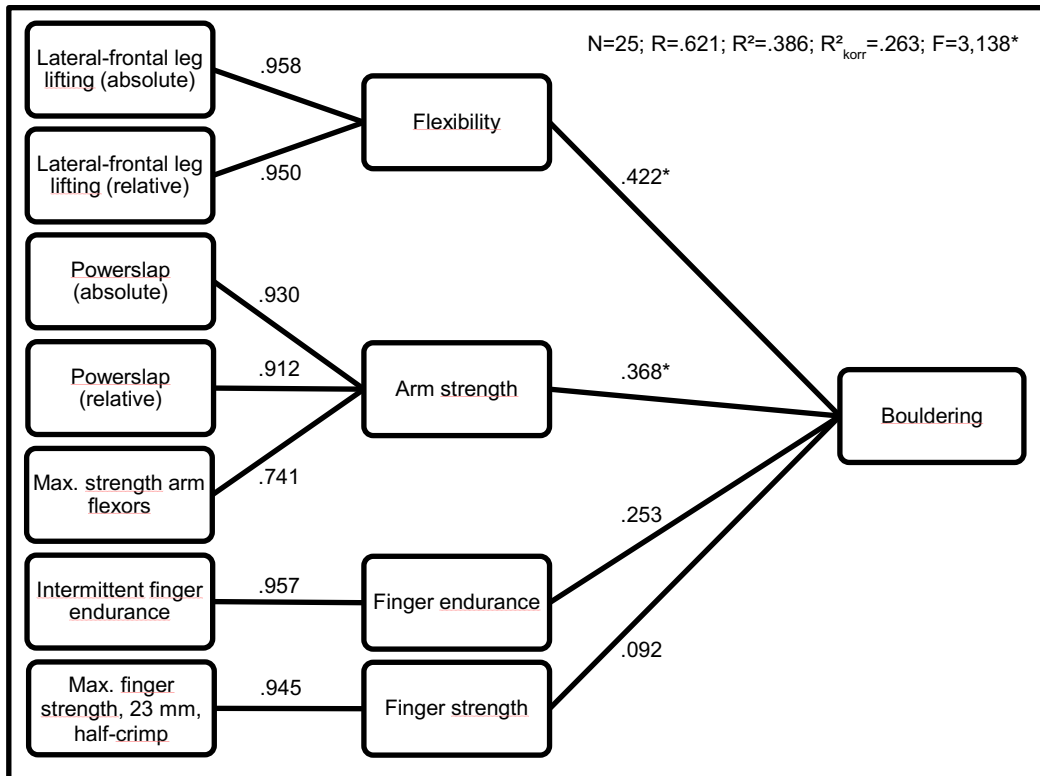
\* p < .05, ns p < .1

464 Figure 3: Multivariate models of bouldering performance in the women's category

465

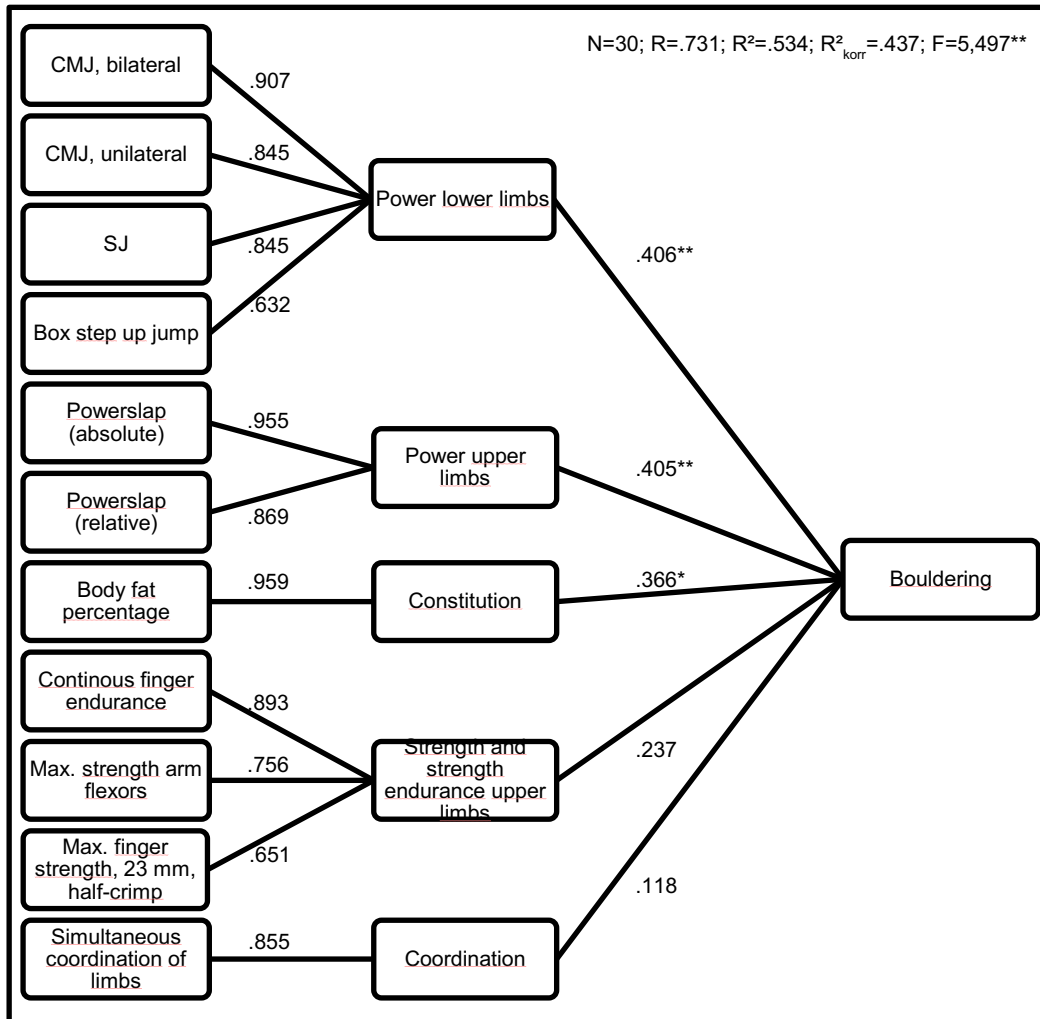
466

467



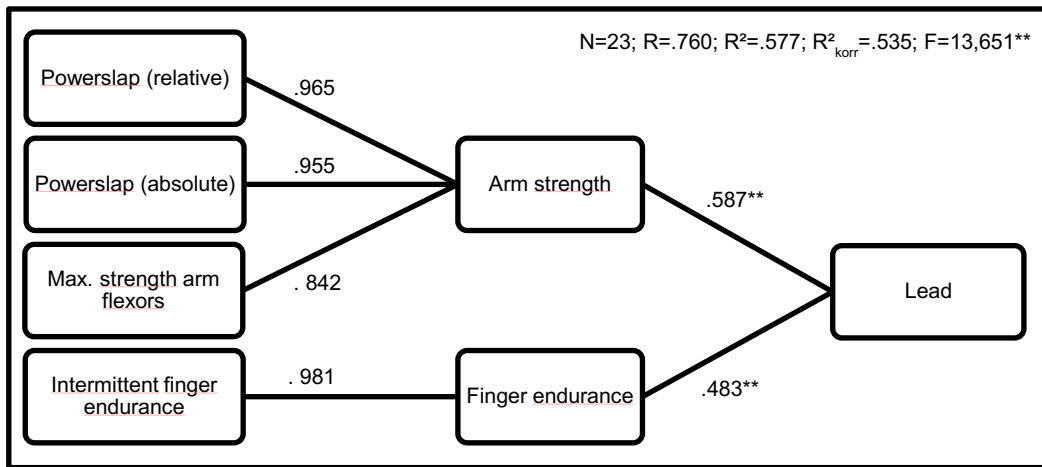
\* p < .05, ts p < .1

468 Figure 4: Multivariate models of bouldering performance in the men's category



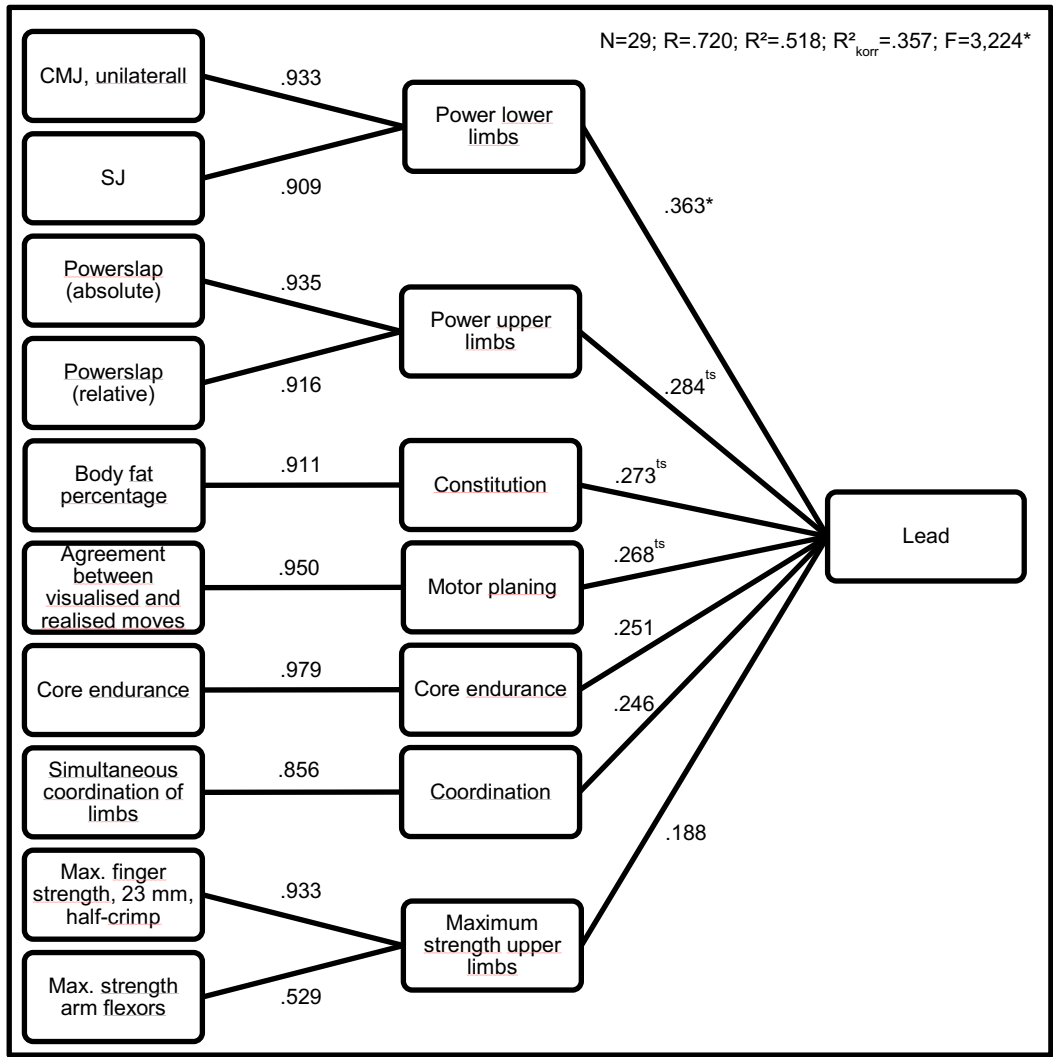
\*\* p < .01 \* p < .05

469 Figure 5: Multivariate model of lead climbing performance in the women's category



\*\* p < .01

470 Figure 6: Multivariate model of lead climbing performance in the men's category  
 471



472 \*  $p < .05$ ,  $ts < .1$   
 473  
 474

475 **References**

476

477 Augste, C., & Künzell, S. (2017). Welche Eigenschaften zeichnen einen  
478 Spitzenkletterer aus? Ergebnisse aus Interviews mit Leistungstrainern [What are  
479 the characteristics of an elite climber? Results from interviews with top  
480 coaches]. *Leistungssport*, 47(4), 49–55.

481 Augste, C., Sponar, P., & Winkler, M. (2021). Athletes' performance in different  
482 boulder types at international bouldering competitions. *International Journal of*  
483 *Performance Analysis in Sport*, 21(3), 409–420.

484 <https://doi.org/10.1080/24748668.2021.1907728>

485 Augste, C., Winkler, M., & Künzell, S. (2020a). *Entwicklung einer wissenschaftlich*  
486 *fundierten Leistungsdiagnostik im Sportklettern: Projektbericht [online]*.

487 Universität Augsburg. URN: urn:nbn:de:bvb:384-opus4-766056.

488 Augste, C., Winkler, M., & Künzell, S. (2020b). *Performance diagnostics in sport*  
489 *climbing - test manual*. Retrieved 15.03.2022 from [https://nbn-](https://nbn-resolving.de/urn:nbn:de:bvb:384-opus4-761869)

490 [resolving.de/urn:nbn:de:bvb:384-opus4-761869](https://nbn-resolving.de/urn:nbn:de:bvb:384-opus4-761869)

491 Augustsson, S. R., Frodi-Lundgren, A., & Svantesson, U. (2018). Elbow Strength  
492 Profiles and Performance Level in Swedish Climbers. *Journal of Physical*  
493 *Medicine, Rehabilitation and Disabilities*, 4, 1–7. [https://doi.org/10.24966/pmrdr-](https://doi.org/10.24966/pmrdr-8670/100026)

494 [8670/100026](https://doi.org/10.24966/pmrdr-8670/100026)

495 Baláš, J., Pecha, O., Martin, A. J., & Cochrane, D. (2012). Hand–arm strength and  
496 endurance as predictors of climbing performance. *European Journal of Sport*  
497 *Science*, 12, 16–25. <https://doi.org/10.1080/17461391.2010.546431>

498 Corbeil, C. (2016). Gaps in the spreadsheet: How to deal with missing data using  
499 multiple imputation. *Psychological Science Agenda*(2).

500 <https://www.apa.org/science/about/psa/2016/02/gaps-spreadsheet>

501 Draper, N., Dickson, T., Blackwell, G., Fryer, S., Priestley, S., Winter, D., & Ellis, G.  
502 (2011). Self-reported ability assessment in rock climbing. *Journal of Sports*  
503 *Sciences*, 29(8), 851–858. <https://doi.org/10.1080/02640414.2011.565362>

504 Draper, N., Dickson, T., Blackwell, G., Priestley, S., Fryer, S., Marshall, H., Shearman,  
505 J., Hamlin, M., Winter, D., & Ellis, G. (2011). Sport-specific power assessment  
506 for rock climbing. *Journal of sports medicine and physical fitness*, 51(3), 417.

507 Draper, N., Giles, D., Schöffl, V., Fuss, F. K., Watts, P., Wolf, P., Baláš, J., Espana-  
508 Romero, V., Blunt Gonzalez, G., & Fryer, S. (2015). Comparative grading  
509 scales, statistical analyses, climber descriptors and ability grouping:

510 International Rock Climbing Research Association Position Statement. *Sports*  
511 *Technology*, 8(3-4), 88–94.

512 Fanchini, M., Violette, F., Impellizzeri, F. M., & Maffiuletti, N. A. (2013). Differences  
513 in Climbing-Specific Strength Between Boulder and Lead Rock Climbers.

514 *Journal of Strength and Conditioning Research*, 27, 310–314.

515 <https://doi.org/10.1519/JSC.0b013e3182577026>

516 Gaşior, P. (2020). Kinesthetic differentiation, kinematic and dynamic parameters in  
517 sports climbing competitors of varying ability levels. *Journal of Kinesiology and*  
518 *Exercise Sciences*, 30(92), 19–27. <https://doi.org/10.5604/01.3001.0014.8209>

519 Giles, D., Barnes, K., Taylor, N., Chidley, C., Chidley, J., Mitchell, J., Torr, O., Gibson-  
520 Smith, E., & España-Romero, V. (2021). Anthropometry and performance

521 characteristics of recreational advanced to elite female rock climbers. *Journal of*  
522 *Sports Sciences*, 39(1), 48–56. <https://doi.org/10.1080/02640414.2020.1804784>

523 Giles, D., Hartley, C., Maslen, H., Hadley, J., Taylor, N., Torr, O., Chidley, J., Randall,  
524 T., & Fryer, S. (2021). An All-Out Test to Determine Finger Flexor Critical

525 Force in Rock Climbers. *International Journal of Sports Physiology and*  
526 *Performance*, 16(7), 942–949. <https://doi.org/10.1123/ijsp.2020-0637>

527 Grant, S., Hasler, T., Davies, C., Aitchison, T. C., Wilson, J., & Whittaker, A. (2001). A  
528 comparison of the anthropometric, strength, endurance and flexibility  
529 characteristics of female elite and recreational climbers and non-climbers.  
530 *Journal of Sports Sciences*, 19(7), 499–505.  
531 <https://doi.org/10.1080/026404101750238953>

532 Krawczyk, M., Ozimek, M., Rokowski, R., Pocięcha, M., & Draga, P. (2018).  
533 Anthropometric characteristics and anaerobic power of lower limbs and their  
534 relationship with race time in female speed climbers. *SOCIETY.*  
535 *INTEGRATION. EDUCATION. Proceedings of the International Scientific*  
536 *Conference*, 4, 118–126. <https://doi.org/10.17770/sie2018vol1.3268>

537 Krawczyk, M., Pocięcha, M., Ozimek, M., & Draga, P. (2020). The force, velocity, and  
538 power of the lower limbs as determinants of speed climbing efficiency. *Trends*  
539 *in Sport Sciences*, 27(4), 219–224. <https://9lib.org/document/eqo1pmz1-force-velocity-power-lower-limbs-determinants-climbing-efficiency.html>

540  
541 Künzell, S., Thomiczek, J., Winkler, M., & Augste, C. (2021). Finding new creative  
542 solutions is a key component in world-class competitive bouldering. *German*  
543 *Journal of Exercise and Sport Research*, 51(1), 112–115.  
544 <https://doi.org/10.1007/s12662-020-00680-9>

545 Laffaye, G., Collin, J.-M., Levernier, G., & Padulo, J. (2014). Upper-limb Power Test in  
546 Rock-climbing. *International Journal of Sports Medicine*, 35, 670–675.  
547 <https://doi.org/10.1055/s-0033-1358473>

548 Laffaye, G., Levernier, G., & Collin, J.-M. (2016). Determinant factors in climbing  
549 ability: Influence of strength, anthropometry, and neuromuscular fatigue.  
550 *Scandinavian Journal of Medicine & Science in Sports*, 26(10), 1151–1159.  
551 <https://doi.org/10.1111/sms.12558>

552 Legreneur, P., Rogowski, I., & Durif, T. (2019). Kinematic analysis of the speed  
553 climbing event at the 2018 Youth Olympic Games. *Computer Methods in*  
554 *Biomechanics and Biomedical Engineering*, 22(sup1), S264–S266.  
555 <https://doi.org/10.1080/10255842.2020.1714907>

556 Li, L., Ru, A., Liao, T., Zou, S., Niu, X. H., & Wang, Y. T. (2018). Effects of Rock  
557 Climbing Exercise on Physical Fitness among College Students: A Review  
558 Article and Meta-analysis. *Iran Journal of Public Health*, 47(10), 1440–1452.

559 Macdonald, J. H., & Callender, N. (2011). Athletic Profile of Highly Accomplished  
560 Boulders. *Wilderness & Environmental Medicine*, 22, 140–143.  
561 <https://doi.org/10.1016/j.wem.2010.11.012>

562 MacKenzie, R., Monaghan, L., Masson, R. A., Werner, A. K., Caprez, T. S., Johnston,  
563 L., & Kemi, O. J. (2020). Physical and Physiological Determinants of Rock  
564 Climbing. *International Journal of Sports Physiology and Performance*, 15(2),  
565 168–179. <https://doi.org/10.1123/ijsp.2018-0901>

566 Magiera, A., Rocznik, R., Maszczyk, A., Czuba, M., Kantyka, J., & Kurek, P. (2013).  
567 The Structure of Performance of a Sport Rock Climber. *Journal of Human*  
568 *Kinetics*, 36(1). <https://doi.org/10.2478/hukin-2013-0011>

569 Mermier, C. M. (2000). Physiological and anthropometric determinants of sport  
570 climbing performance. *British Journal of Sports Medicine*, 34(5), 359–365.  
571 <https://doi.org/10.1136/bjism.34.5.359>

572 Michailov, M. L., Baláš, J., Tanev, S. K., Andonov, H. S., Kodejška, J., & Brown, L.  
573 (2018). Reliability and Validity of Finger Strength and Endurance

574 Measurements in Rock Climbing. *Research quarterly for exercise and sport*,  
575 89(2), 246–254. <https://doi.org/10.1080/02701367.2018.1441484>

576 Mladenov, L. V., Mihailov, M. L., & Schoffl, V. R. (2009). Anthropometric and  
577 strength characteristics of world-class boulderers. *Medicina Sportiva*, 13(4),  
578 231–238.

579 Orth, D., Davids, K., & Seifert, L. (2016). Coordination in Climbing: Effect of Skill,  
580 Practice and Constraints Manipulation. *Sports Medicine*, 46(2), 255–268.  
581 <https://doi.org/10.1007/s40279-015-0417-5>

582 Ryepko, E. (2013). Features and functionality of speed and power capabilities of elite  
583 climbers and various types of rock climbing. *Physical education of students*,  
584 17(6), 60–65. <https://doi.org/10.6084/m9.Figshare.840505>

585 Sanchez, X., Lambert, P., Jones, G., & Llewellyn, D. J. (2012). Efficacy of pre-ascent  
586 climbing route visual inspection in indoor sport climbing. *Scandinavian Journal*  
587 *of Medicine and Science in Sports*, 22, 67–72.  
588 <https://onlinelibrary.wiley.com/doi/epdf/10.1111/j.1600-0838.2010.01151.x>

589 Sauer, S. (2010). *Behandlung fehlender Daten in der Faktorenanalyse* [Diplomarbeit,  
590 Ludwig-Maximilians Universität München]. [https://epub.ub.uni-](https://epub.ub.uni-muenchen.de/11714/2/DA_Sauer.pdf)  
591 [muenchen.de/11714/2/DA\\_Sauer.pdf](https://epub.ub.uni-muenchen.de/11714/2/DA_Sauer.pdf)

592 Saul, D., Steinmetz, G., Lehmann, W., & Schilling, A. F. (2019). Determinants for  
593 Success in Climbing: A Systematic Review. *Journal of exercise science and*  
594 *fitness*, 17(3), 91–100. <https://doi.org/10.1016/j.jesf.2019.04.002>

595 Stien, N., Saeterbakken, A. H., Hermans, E., Vereide, V. A., Olsen, E., & Andersen, V.  
596 (2019). Comparison of climbing-specific strength and endurance between lead  
597 and boulder climbers. *PloS one*, 14(9), e0222529.  
598 <https://doi.org/10.1371/journal.pone.0222529>

599 Torr, O., Randall, T., Knowles, R., Giles, D., & Atkins, S. (2020). Reliability and  
600 Validity of a Method for the Assessment of Sport Rock Climbers' Isometric  
601 Finger Strength. *Journal of Strength and Conditioning Research*, 36(8), 2277-  
602 2282. <https://doi.org/10.1519/jsc.0000000000003548>

603 Wall, C. B., Starek, J. E., Fleck, S. J., & Byrnes, W. C. (2004). Prediction of indoor  
604 climbing performance in women rock climbers. *Strength and Conditioning*  
605 *Research*, 18, 77–83.

606 Winkler, M. (2018). *Dimensionale Struktur der Rumpfkraftausdauerleistungsfähigkeit*  
607 [Masterarbeit, Goethe-Universität Frankfurt am Main].

608 Winkler, M., Künzell, S., & Augste, C. (2022). The Load Structure in International  
609 Competitive Climbing. *Frontiers in sports and active living*, 4, 790336.  
610 <https://doi.org/10.3389/fspor.2022.790336>

611