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# Peak age and relative performance progression in international cross-country skiers

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#### 10

- 11 This manuscript has been read and approved by all the listed co-authors and meets the 12 requirements of co-authorship as specified in the Human Kinetics Authorship Guidelines. This
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This is an original investigation with 2 figures. The abstract consists of 248 and the text 3320 words.

18

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24

### 25 Abstract

26 **Purpose:** To quantify peak age and relative performance progression towards peak age in cross-27 country (XC) skiing according to event type, sex and athlete performance level. Methods: 28 International Ski Federation (FIS) points (performance expressed relative to the best athlete) of 29 athletes born between 1981 and 1991 and competing in junior world championships or finishing 30 top 30 in world championships or Olympics were downloaded from the FIS website. Individual 31 performance trends were derived by fitting a quadratic curve to each athletes FIS point and age 32 data. Results: Peak age was 26.2 (2.3) years in distance and 26.0 (1.7) years in sprint events. 33 The sex difference in peak age in sprint events was ~0.8 years (small, P = .001), while there 34 was no significant sex difference in peak age in distance events (P = .668). Top-performers 35 displayed higher peak ages than other athletes in distance (mean difference, ±95% CL: 1.6 y, 36  $\pm 0.6$  y, moderate, P < .001) and sprint events (1.0,  $\pm 0.6$  y, moderate, P < .001). FIS point 37 improvement over the 5 years preceding peak age did not differ between event types (P = .325) 38 while men improved more than women in both events (8.8,  $\pm 5.4\%$ , small, P = .002 and 7.5, 39  $\pm 6.4\%$ , small, P = .002). Performance level had a large effect on improvement in FIS points in 40 both events (P < .001). Conclusion: This study provides novel insights on peak age and relative 41 performance progression among world-class XC skiers and can assist practitioners, sport 42 institutions and federations with goal setting and evaluating strategies for achieving success. 43 44 **Keywords**: age of peak performance, XC skiing, FIS points, elite athletes, gender differences

45

#### 46 Introduction

47 Competitive performance in sports evolves and devolves throughout life via growth, 48 maturation, training and ageing. Understanding the relationship between age and performance 49 is important for practitioners, scientists, sport institutions and sport governing bodies, as such 50 knowledge is fundamental to goal setting, long-term training planning, season evaluation, talent 51 development benchmarking, athlete selection processes and allocation of funding and 52 resources.<sup>1-3</sup> Accordingly, several scientific publications are devoted to determination of age 53 of peak performance (peak age) and performance progression. So far, these analyses have been 54 mainly restricted to summer Olympic sports such as athletics,<sup>4-6</sup> swimming<sup>7</sup> and weightlifting.<sup>8</sup>

55 Cross-country (XC) skiing is a weight-bearing, full-body locomotion modality with 56 plyometric muscle actions involved, and this sport has always been a cornerstone of the winter 57 Olympic program. A variety of competition formats (sprint-, distance- and team-events) is 58 performed in the classic and skating styles, while managing hilly terrain.<sup>9</sup> Individual races in 59 XC skiing range from sprint races, covering a distance of four times 1.3 to 1.8 km (initial 60 qualification and three knockout heats) to distance races, ranging from 10 to 30 km for women 61 and 15 to 50 km for men performed as either mass starts or individual time trials. Despite the 62 large number of published studies dealing with XC skiing, no valid information is currently 63 available regarding peak age and progression in relative performance in elite XC skiers.

64 A review of the literature within typical endurance sports showed that peak age and 65 performance progression differ as a function of sport events, athlete performance level and 66 sex.<sup>6,8,10</sup> For example, peak age tended to increase with increasing event duration for endurance events,<sup>10</sup> although these trends were less pronounced in a recent study in athletics.<sup>6</sup> Here, only 67 68 trivial to small differences were observed for the running disciplines between 800 and 69 10 000 m, but peak age was clearly higher in marathon compared to 1500 m. The race duration 70 in these events is comparable to a 50 km and sprint races, which raises the question about 71 possible differences in peak age between sprint and distance XC skiing. Similarly, athletes with 72 top 16 positions or better in international competitions tend to have ~1 y lower peak age across 73 several sports.<sup>6,8,11</sup> Differences between male and female athletes, however, are varying among 74 endurance sports. While female long-distance runners displayed a 1-2 y higher peak age than 75 males,<sup>4,6</sup> the opposite pattern was shown for triathletes<sup>11</sup> and swimmers.<sup>7</sup> In contrast, women 76 showed a larger performance progression in the years leading up to peak age than men, $^{6-8}$  which 77 was also the case for top-performers compared to athletes of lower level within both 78 sexes.<sup>6,8,11</sup>Despite being a traditional Olympic sport,<sup>12</sup> cross-country skiing has continuously 79 evolved over the last decades, which subsequently could have influenced peak age.

In the context of talent selection and the development process, understanding the
 relationship between junior and senior performance is of high interest, especially for sport
 institutions. However, previous studies investigating athletics indicate that performing well at
 junior age not necessarily leads to high senior performance.<sup>2,13</sup>

84 The International Ski Federation (FIS) has recorded and systemized competition results 85 of international junior and senior athletes in XC skiing events over several decades. The 86 database is based on the FIS point system (see a detailed description in the methods), which 87 measures performance in relation to the best athletes (relative performance) and provides the 88 opportunity to investigate the long-term relative performance development of XC skiers. 89 Therefore, the aim of this study was to quantify peak age and progression in relative performance in the preceding years to peak age in XC skiers according to event type, sex, and 90 91 athlete performance level. In addition, average absolute FIS points and a prediction of peak 92 performance based on junior performance were reported to provide reference values for sports 93 practice. Such information is useful for athletes, coaches and sport institutions for proper 94 goalsetting, talent developing benchmarking and evaluating strategies for achieving success.

#### 95 Methods

#### 96 Data acquisition

97 All data were collected from the FIS website (https://www.fis-ski.com/en/cross-country). FIS 98 has established the FIS point system, where an individual FIS race point is calculated for each 99 athlete competing in that specific race. The FIS race point takes race duration, the gap to the 100 winning athlete and the race format into account, by presenting race performances relatively. 101 In addition to the FIS race points, a FIS points list is provided. Here, athletes are ranked 102 according to the mean of their five best FIS race points during the last 365 days. Based on the 103 FIS point system, relative race performance and performance level can be monitored, even 104 though race distances, styles, profiles and weather conditions differ between races within the 105 same format. The FIS point system is the most valid way to express race performance and is well established in science within the field of XC skiing.<sup>14–17</sup> FIS race points of all athletes born 106 107 from 1981 to 1991 and competing in the junior world championships between 2001 and 2011 108 were selected, as long as these athletes were competing in FIS races (i.e. minimum three races 109 per year) for at least four years after they turned senior. To prevent us from missing late-110 developing athletes, all top 30 finishers in Olympic winter games and world championships 111 were included, even when they did not compete in junior world championships but met the 112 other criteria. FIS points were calculated for each individual race and competitor according to 113 international competition rules with the following equation:

114 
$$FIS \ race \ point = \frac{\bar{F} * T_x}{T_o} - F$$

115 where F is the factor for the race type (800 for interval starts, 1200 for sprints/pursuits with a 116 break, 1400 for mass starts and pursuits without a break), T<sub>x</sub> and T<sub>o</sub> are the competitor's and 117 winner's race time in seconds. Based on this calculation, the best race point value and thereby 118 the highest performance achievable is zero. To consider the participants' performance level for 119 all races other than world cup, world championships and Olympics, a race penalty was added 120 to each individual race point. The penalty was calculated by selecting the values of the top 5 121 finishers from the FIS point list and summating the three lowest values among them and 122 dividing the sum with 3.75. If this calculated race penalty was lower than the minimum penalty, 123 which is defined for each race category in the international competition rules, this minimum 124 penalty was applied. For all athletes included in this study, the three official races with the best 125 FIS race points of each season beginning from the last junior season until the end of the 2019 126 season or the individual end of the career were averaged separately for sprint and distance 127 events. When an athlete was not competing or was out of competition for more than two years 128 or having less than three sprint or three distance races per season after turning senior, data were 129 not included. To avoid the uncertainty of extrapolating performance trends, only athletes that 130 were active for at least five years prior to their estimated peak age were included. Athletes that 131 met the inclusion criteria for both event groups were additionally defined as all-round athletes 132 for complementary differentiation.

Additional data, such as sex, nationality and date of birth were also collected from the FIS website. Results of all individual races at the Olympic winter games, world championships and world cup of included athletes were used to categorize them as "top-performers" (having finished top 3 at least twice in the named races which closely matches the criteria used in previous studies<sup>8,11</sup>) and "others". Age was calculated according to FIS international competition rules by subtracting the year of birth from the year in which the season ended. As all data collected are publicly available, individual informed consent was not required. 141 A quadratic regression was performed to each athlete's performance and age data using SPSS 142 Statistics version 25 (IBM Corp., Armonk, NY, USA). Peak age was determined as the 143 minimum of the quadratic equation: Performance =  $a^*Age^2 + b^*Age + c$ . If the peak occurred 144 outside the age range of the performances or the quadratic curve was turned upside down, data 145 were not included. Relative performance progression preceding peak age was determined based 146 on the individual quadratic curve by subtracting peak performance from performance five years 147 prior to the estimated peak. Peak age and relative performance progression are presented as 148 mean and standard deviation (SD). The data were analyzed using mixed models with the 149 dependent variables peak age and relative performance progression, respectively, and the level 150 of significance was set at  $\alpha \leq 0.05$ . Event type (sprint or distance), sex and performance level 151 were each fixed explanatory variables for the three separate analyses. To respect the 152 hierarchical structure of the data, nationality was defined as a random factor. Chi square 153 statistics and -2 log-likelihood were used to check if a factor improved the fit of the model. 154 Effects sizes (ES) were calculated as Cohen's d, and criteria for interpretation were 0.0-0.2 155 trivial, 0.2–0.6 small, 0.6–1.2 moderate, 1.2–2.0 large, and > 2.0 very large.<sup>18</sup>

#### 156 Results

157 Overall, 9719 annual performances from 949 athletes were initially selected according to the 158 inclusion criteria. Due to inadequate data, 382 athletes had to be removed. Thus, 379 athletes 159 were finally included in the distance and 188 in the sprint group. The number of men was more 160 than 1.5-times the number of women (348 vs. 219) whereas there were almost 5-times less top-161 performers (99) than other athletes (468). Mean goodness of fit of the individual quadratic 162 curves was similar in distance and sprint skiers ( $R^2 = 0.73$  [0.22] and 0.73 [0.20]).

163 Peak age

164 Peak age was 26.2 (2.3) years in distance events and 26.0 (1.7) years in sprint events (ES 0.1, 165 P = .003). When analyzing all-round athletes only (frequently competing in both events), peak 166 age remained consistent. Trends of peak age in distance and sprint skiing across years of birth 167 are presented in Figure 1.

168 169

170

Figure 1

171 Differences in peak age as a function of sex and performance level were analyzed separately 172 by event type (Figure 2). Peak age did not differ between men and women in distance events 173 (mean difference,  $\pm 95$  % CL: <0.1,  $\pm 0.5$  y, ES<0.1, P = .668), whereas significant differences 174 were observed in sprint events (0.8,  $\pm 0.5$  y, ES=0.5, P = .001). Top-performers in distance 175 events reached their peak age 1.6 y later than other athletes ( $\pm 0.6$  y, ES=0.7, P < .001), while 176 top-performers in sprint events were 1.0 y older when reaching their peak age compared to 177 others ( $\pm 0.6$  y, ES=0.6, P < .001).

- **178 179** Figure 2
- 180
- 181 *Relative performance progression*

182 No significant difference was found in percentage improvement in relative performance over
183 the five preceding years to peak age when comparing athletes in distance and sprint events
184 (40.20) (52.40) (52.40) (52.00) (10.20) (10.20)

**184** (48.3% [26.4%] and 52.4% [22.0 %], ES=0.2, P = .325).

Percentage improvements in relative performance over the five preceding years to peak age according to sex and performance level are presented in Figure 3. Men improved more than women in both distance (8.8,  $\pm 5.4$  %, ES=0.4, P = .002) and sprint events (7.5,  $\pm 6.4$  %, ES=0.4, P = .002). Top-performers improved their relative performance more than others in both distance (42.9,  $\pm 6.1$  %, ES=1.6, P < .001) and sprint events (26.9,  $\pm 6.6$  %, ES=1.4, P < .001).

Figure 3

191 192

#### **193** *Relative performance at junior and peak age*

194 Relative performance based on individual quadratic trends in the last junior season (age 20 y) was higher in distance events (87.9 [31.1] FIS points) than in sprint events (110.8 [25.6] FIS 195 196 points, ES=0.6, P < 0.001). Estimated relative peak performance was 43.3 (26.7) FIS points in distance and 49.6 (34.9) FIS points in sprint events (ES=0.2, P < .001). No sex differences were 197 198 observed at peak or junior age in sprint events. In distance events men displayed better FIS point scores than women at both junior (81.3 [27.7] and 99.1 [33.4] FIS points, ES=0.6 199 200 P < .001) and peak age (38.1 [26.3] and 52.1 [25.0] FIS points, ES=0.5, P < .001). Top-201 performers in both event groups displayed better FIS point scores at junior age (58.2 [20.7] vs. 202 93.2 [29.7] FIS points in distance and 74.4 [25.0] versus 121.3 [42.1] FIS points in sprint 203 events, ES 1.4 and P < .001 in both events).

204 Relative performance at junior age based on the individual performance trends 205 explained 45 % of the variance in observed relative peak performance in distance ( $R^2=0.445$ , 206 p<0.001) and 54 % in sprint events ( $R^2 = .538$ , P < .001).

The FIS point change scores were calculated based on original FIS point values for each
year, beginning from age 18 until 30 y, separated after event type, sex and performance level,
and can be found in the Supplementary Material (available online).

#### 210 Discussion

211 This is the first study to quantify peak age and relative performance progression in distance and 212 sprint XC skiing. The main findings were firstly, that differences in peak age between distance 213 and sprint events were trivial, also when considering only all-round athletes that frequently 214 competed in both events. Relative performance among the analyzed athletes was higher in 215 distance events at any time compared to sprint events. Secondly, we found substantial sex 216 differences in sprint peak age, where men peaked  $\sim 0.8$  y earlier than women. Male XC skiers 217 showed a higher relative performance progression in the five years preceding peak age. Lastly, 218 top-performers displayed a higher peak age, performed better at junior age and improved their 219 relative performance more in the preceding years to peak age than other athletes, independent 220 of event type.

221 The estimated peak ages of  $\sim 26$  y in distance and sprint events are in line with previous 222 studies of athletics.<sup>4,6,10</sup> It has to be mentioned that in all these sports, peak age might be affected 223 by training age, as for example an earlier specialization may increase the likelihood of an earlier 224 peak age. Our data do not support the trend of an increasing peak age with increasing event 225 duration in endurance events, as reported by Allen & Hopkins.<sup>10</sup> However, the character of sprint races in XC skiing is different to events in other sports that last ~3-4 minutes, as the race 226 227 consists of four runs within 4 hours. It seems reasonable that different attributes like the ability 228 to recover fast after a run are needed in XC skiing sprint events, and that those attributes are 229 related to the demands of distance events. The trivial difference in peak age between XC skiing 230 event types demonstrates that a simultaneous development in sprint and distance skiing is 231 generally possible. This is supported by previous publications showing a high similarity in

training and physiology of sprint and distance skiers.<sup>19</sup> The analyzed peak ages of all-round
athletes were consistent with the overall analysis and showed no chronological preference in
the development of these athletes. Interestingly, we observed a decreasing trend in peak age for
years of birth in both distance and sprint events, indicating that athletes who were born later
reached their peak age earlier. We can only speculate about possible reasons, and future studies
should examine even younger age groups and additional parameters such as training age to
confirm or disconfirm these findings.

239 No sex differences were observed in peak age in distance events. However, while peak 240 age among women in sprint events was in line with distance events, men displayed significantly 241 lower peak age in sprint events. We can only speculate for possible reasons. One could be the 242 tendency of a higher degree of specialization towards sprint or distance events in men, which 243 could support a theory of a less simultaneous development compared to generally more all-244 round orientated women. This was supported by the higher percentage of all-round athletes 245 among female athletes. Our findings related to sex differences in peak age in distance events 246 are somehow contradictory to the trends reported by Haugen et al.<sup>6</sup> More studies should focus 247 on sex-related performance trends in the context of endurance sports.

248 Top-performers in this study reached their peak age significantly later in both distance 249 (1.6 y) and sprint events (1.0 y) compared to other athletes. These findings differ from earlier 250 investigations on endurance athletes,<sup>6</sup> but we can only speculate about possible reasons for these discrepancies. As described by Tucker and Collins,<sup>20</sup> less successful athletes may have a 251 252 lower genetic potential or they do not manage to realize their potential to the same degree as 253 top-performers. Both aspects may explain an earlier turning point in sport careers. Furthermore, 254 it is also reasonable to assume that the rate of dropout due to a lack in motivation before 255 exploiting their individual potential is higher among less successful athletes, thereby affecting 256 the general career duration. Interestingly, peak age in top-performers was clearly higher in 257 distance than in sprint events. Although this finding contrasts with the overall results of the 258 present study, it is in line with earlier reports indicating increasing peak ages with increasing 259 event duration.<sup>10</sup>

260 Calculated FIS points for skiers in distance events were 6.3 points lower at peak age and 261 22.9 points lower at junior age compared to sprint events. The difference reflects generally 262 higher competitiveness in distance events, especially at junior age. However, the percentage 263 improvement towards peak age did not differ between distance and sprint events. We 264 hypothesize that sprint events have been introduced later and have not evolved in the same way 265 as distance events. Further, the number of competitors and the frequency of races in the two 266 event types differ, reflecting the number of athletes that met all inclusion criteria for this study (i.e., three races per season per event), that was twice as high in distance events. In major 267 268 championships, such as world championships and Olympics, three individual distance races are 269 part of the program, while only one sprint race takes place. Thus, media attention and the higher 270 number of successful athletes favor distance events, which probably affects goal setting and the 271 focus of young athletes. Similar issues may explain the higher relative performance progression 272 in male versus female athletes. Most practitioners would argue that a smaller number of female 273 competitors also causes less pressure on individual development, which could affect the 274 percentage improvement.

275 Progression in relative performance in the years preceding peak age was clearly higher 276 in top-performers, which has also been reported in other sports.<sup>6</sup> The clearly higher performance 277 level at junior age (large effects in both distance and sprint events) might be an explanation, as 278 this is associated with a higher aerobic capacity that probably allows top-performers to train more and respond better.<sup>21-23</sup> Further, better athletes usually get more access to and higher 279 280 quality in support staff, including trainer, physician, psychologist and technician. However, 281 regression analyses of relative junior and peak performance based on the individual performance trends revealed  $R^2$  values of only ~0.5. Future studies should therefore aim to 282

investigate the longitudinal development in training and physiology with respect to different
 performance levels to get a deeper understanding of the long-term development in endurance
 sports.

286 There are several limitations to the study design. Firstly, time as direct measurement of 287 performance in a XC skiing race is not comparable with other races, due to varying race profiles, 288 weather and snow conditions. Hence, performance can only be described in relation to the 289 winner (FIS-points). Thus, all expressions of performance are influenced by the level of the 290 best performing athletes. Consequently, the percentage progression in relative performance 291 cannot be compared to previous data. Moreover, FIS-points in sprint are only related to the 292 qualification and not to overall sprint performance. However, additional analysis of 13068 293 individual results revealed a strong correlation (r=0.660, p<0.001) between the rankings in 294 qualification and final. Furthermore, no data is available regarding the participants training age, 295 which is probably a strong predictor of peak age. Finally, potential use of prohibited substances 296 (doping) and improvement in equipment may have influenced individual performance data.

#### 297 Practical applications

298 This study provides novel insight on peak age and relative performance progression in world-299 class XC skiing contestants that can be useful for goal setting, long-term training planning, 300 seasonal evaluations, talent development benchmarking, athlete selection processes and 301 allocation of funding and resources. Specifically, these findings indicate that practitioners, sport 302 institutions and federations aiming for fast success should focus specifically on sprint skiing 303 and female athletes and should not consider junior performance as primarily criterion for talent 304 selection. Furthermore, the identified dynamics in peak age are useful as motivational factor 305 for young athletes. In addition, our observations also provide a point of departure for future 306 studies aiming to investigate the possible underlying mechanisms related to peak age and 307 relative performance progression across athletes, exercise modalities and physiological 308 capacities.

#### 309 Conclusions

The present study revealed that mean peak age was ~26 y in both distance and sprint skiing, indicating that a simultaneous development in both events is possible. Male XC skiers showed a higher relative performance progression in the five years preceding peak age. Top-performers performed better at junior age, improved more and over a longer time frame than other athletes. Moreover, we found that competitiveness was lower in sprint events and among women in both event types. Furthermore, we found that junior performance can only account for half of the

316 variance in peak performance.

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- 390

#### 391 **Figure captions**

392 Figure 1. Age of peak performance among cross-country skiers across years of birth in 393 comparison to the overall means (dotted lines). Data are means and standard deviations. 394

395 Figure 2. Age of peak performance among cross-country skiers across sex (Panel A) and 396 performance level (Panel B). Data are means and standard deviations. Effect sizes: \* trivial, \*\* 397 small, \*\*\* moderate.

398 399 Figure 3. Improvement in FIS points in cross-country skiers over the five preceding years to 400 age of peak performance across sex (Panel A) and performance level (Panel B). Data are means

and standard deviations. Effect sizes: \*\* small, \*\*\*\* large. 401





Year of birth





Figure 3

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