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Abstract:

Biathlon is an Olympic sport combining cross-country skiing with rifle shooting, giving a penalty for each target miss. The biathletes ran different race formats, including the pursuit race. During this race, the biathletes chase the leader with a start time identical to the result of the sprint race previously achieved. So, pursuit involves different skills (such as tactics or management of emotional pressure) that are not present during races with an interval-start procedure like sprint. Furthermore, shootings have a more important impact during pursuit races than during sprint ones. Nevertheless, final pursuit rankings are strongly correlated to sprint ones, which prevents a spectacular comeback after a disappointing sprint race. We present here a new pursuit ranking system that is nearly decorrelated to sprint rankings. This simple ranking system is based on comparisons with previous pursuit results. The current and the new rankings were then compared on a single pursuit ranking and different pursuit world cup rankings, using a database of 148 results from men pursuit world cups. The new ranking was shown to strongly modify a single pursuit ranking but these modifications were smoothed on a whole world cup season. Advantages and limitations of the new ranking system are discussed, paving the way to a fairer modification of the current pursuit ranking to increase surprise and suspense in biathlon pursuit races.

Keywords (between 3 and 6): Biathlon, Pursuit race, Ranking system.

Introduction

Biathlon is an Olympic sport combining 3 to 5 laps of cross-country skiing with rifle shooting. Between each skiing lap, biathletes complete a shooting session in which they attempt to hit five targets placed at a distance of 50 m, alternating between the prone and standing shooting positions between laps. A penalty (time or skiing distance) is given for each target miss. The biathlete with the shortest overall time wins the race (International Biathlon Union, 2020). Several different biathlon events exist, in which the individual distance was included as an official Olympic event in 1960, followed by sprint (1980), pursuit (2002), and mass start (2006) (International Biathlon Union, 2020). More precisely, in pursuit races, the 60 best biathletes from the sprint race chase the leader with a start time identical to the result of the sprint race achieved a few days before (*i.e.* if the second biathlete arrives 12s after the winner of the sprint race, he will start 12s after the first for the pursuit race and so on). So, two of the four current individual Olympic biathlon races involve direct confrontation (mass-start and pursuit), where biathletes are fighting against each other, not versus time. In these events, tactics play a major role and the final ranking is often decided during the last shooting and/or the final skiing sprint. Furthermore, tight duels during the shootings and the subsequently increased emotional pressure (Vickers et al., 2007) influence shooting times and accuracies differently than for races with an interval-start procedure. During pursuit or mass-start races, drafting behind other skiers, locating oneself optimally in the crowd also helps maximize the utilization of individual skills (Laaksonen et al., 2018b). Finally, in pursuit races, the skiing speed exerts less impact on the overall performance than in sprint, since the pursuit event involves four bouts of shooting with shorter skiing loops between (Laaksonen et al., 2018b). The pursuit race is therefore expected to reward different skills than sprint or individual races.

Nevertheless, and despite its increasing public audience (EBU, 2019), the biathlon has been sparsely studied, as highlighted by the fact that a search in PubMed with "biathlon" as a keyword currently results in 107 hits, whereas a similar search with "cross-country skiing" (resp. "sport shooting") yields almost 8 (resp. 7) times as many hits. Among these references, the impact of different parameters on shooting accuracy (Gallicchio et al., 2019; Josefsson et al., 2020) or the influence of the different biathlon phases on sprint or individual results (Laaksonen et al., 2018a; Luchsinger et al., 2019) were extensively examined. Despite their specific aspects, the pursuit and the mass-start races are almost unexplored. Recently, Luchsinger et al. (2020) investigated the contribution from cross-country skiing, sprint race performance, and shooting components to the pursuit race performance. Sprint race performance was found to be the most influential factor, explaining more than 50% of the final pursuit performance. This result and the fact that the sprint races are the most numerous events (approximatively 40% of the events, 30% being pursuits, 20% mass-starts, and 10% individual races) during a world cup season involve that more than 55% of the final overall world cup results are due to sprint races, which seems very high. Also, the specific skills needed for the pursuit races (tactics, management of emotional pressure …) are not rewarded by the current pursuit ranking, mostly hidden by the importance of the sprint performances. A new pursuit ranking which minors the influence of the sprint results would therefore be of high interest for biathletes and organizers of international biathlon events. Different rankings than official ones have been recently developed in numerous sports, for example for football teams (Gásquez and Rovuela, 2016), for football players (Wolf et al., 2020), for tennis (Kovalchik, 2020), for basketball (Barrow et al., 2013) … We refer the interested reader to the review of Wunderlich and Memmert (2020) for more details. But, to our knowledge, none of the previous works could be easily adapted to our specific biathlon pursuit problem. Therefore, the current paper aimed

to propose a new, simple, and fairer ranking for the biathlon pursuit and to investigate its impact on pursuit races and world cup pursuit rankings.

Materials and methods

Data collection

The final results of all sprint and pursuit races are publicly available on the datacenter webpage of the IBU: https://biathlonresults.com/. The results were collected on the 15th December 2020 starting from the 2001/2002 season. All the results taken into account for the men's pursuit world cup were gathered, including world championships and Olympic games before 2014. It provides us 148 different pursuit results.

New pursuit ranking

As explained previously, during pursuit races, biathletes are racing each other in real-time for a better rank and not racing against time. Therefore, we chose to work using final ranks, not final times. All the pursuit results were gathered to compute final pursuit ranks according to the starting pursuit rank. This information is given in Figure 1 for some sprint ranking positions.

[***Figure 1 near here***]

This figure emphasizes the results of Luchsinger et al. (2020), highlighting the importance of the starting pursuit rank in the final pursuit result.

We propose a new approach to define a fairer pursuit final ranking that will decrease this correlation. For each starting biathlete at a pursuit race k, a quantity q_{ki} is calculated according to the position of his final results f_{ki} in the final result distribution of all previous starters with

the same rank i. Some of these distributions are plotted in Figure 1. This quantity is given by the following formula

$$q_{ki} = 1 - \frac{\sum_{j=1}^{148} \mathbb{1}_{(f_{ji} \geq f_{ki})}}{148}$$

where f_{ji} denotes the final pursuit rank of the biathlete with the starting pursuit rank i at the race j and $\mathbb{1}_{(f_{ji} \geq f_{ki})}$ is the usual indicator function that is equal to one when $f_{ji} \geq f_{ki}$, and zero otherwise. Each quantity q_{ki} can be viewed as a quantile of the distribution of the $(f_{ji})_{j=1,\ldots,148}$. Then, the quantities $(q_{ki})_{i=1,\ldots,60}$ are ordered, which provides the final ranking of the pursuit race k. To break the ties, the best current pursuit rank is selected. This rule ensures that the first finisher of the pursuit race will be ranked first at our new final pursuit ranking.

This formula is somewhat natural and explainable: indeed, if q_{ki} is equal to zero, it means that, during the previous 148 pursuit races, no biathlete with starting rank i achieved a final better (*i.e.* smaller) rank f_{ki} and so, for all $j, f_{ji} \geq f_{ki}$. So, this biathlete deserves a good new final pursuit rank, whatever his starting rank. On the contrary, if q_{ki} is equal to one (*i.e.* for all $j, f_{ji} < f_{ki}$), then f_{ki} is the worst final pursuit rank achieved by any of the 148 biathletes with this starting rank i and it must lead to a poor new final pursuit rank.

Data analyses

All the data analyses were performed using the R freeware, version 3.5.1 (R Core Team, 2019). The correlations were calculated using Spearman's rank correlation coefficient. For the world cup rankings, we remind that only the first forty biathletes of each race score points, according to the current rules of IBU (International Biathlon Union, 2020).

Results

Study of a specific pursuit race

We first choose to study a specific pursuit race to illustrate the modifications induced by our new ranking. We choose the pursuit race that took place at Annecy – Le Grand Bornand (21 December 2019). The results are given in Table 1.

[***Table 1 near here***]

The correlation between the starting rank and the current pursuit rank (resp. the new pursuit rank) is equal to 0.82 (resp. 0.20) which highlights the decreased influence of the sprint results on the new ranking. If we look at the main modifications we could see that T. Boe, B. Doll, E. Bjoentegaard, or J. Dale are losing more than 15 ranks with the new pursuit ranking. This is due to the fact that they had lost ranks during the pursuit and, therefore, their current good pursuit ranks are mainly due to their good performances in the sprint race. So, it seems logical that they lose ranks with the new ranking. On the contrary, E. Jacquelin, S. Schempp, and T. Bormolini performed very well during the pursuit race (resp. 14, 22, 28 ranks won during the pursuit race) and deserve their better pursuit rank using the new ranking. For example, T. Bormolini will be ranked 6^{th} with the new pursuit ranking whereas it never happened on all the past 148 pursuit races with the current ranking system for a biathlete with the 60^{th} starting rank, as it could be seen on the last plot of Figure 1.

The computer code used to obtain the results of Table 1 is provided as Supplementary Material with the corresponding dataset. This code could be reused with any pursuit result to compute the new rankings in less than a second on an ordinary laptop.

Study of the 2019/2020 pursuit world cup ranking

As explained above, the new pursuit ranking can lead to major modifications on a specific pursuit race. Then, we chose to study the 2019/2020 pursuit world cup to analyze the modifications at the scale of a whole season. The first ten biathletes using the two pursuit rankings are given in Table 2.

[***Table 2 near here***]

First, we could see that there is only a small modification on the podium, J. Boe who was 4th with the current ranking is now 3rd whereas Q. Fillon-Maillet who was 3rd is now 5th. There is no modification for the first two ranks and eight biathletes are in the two top 10. The strong modifications of the rankings of each pursuit race (as seen in the previous subsection) lead to non-negligible but with less impact world cup ranking modifications. Nevertheless, we can note some important individual modifications for example for E. Garanichev (26th with the current ranking and 6th with the new) or M. Krcmar (resp. 21st and 10th) who benefit from the new ranking unlike T. Boe (resp. 6th and 11th) or S. Desthieux (resp. 7th and 18th).

The number of points with the new ranking seems lower than the current one. Indeed, that is an important property of the new ranking: the points are awarded to most biathletes as they are less linked to the sprint results (71 biathletes with the current ranking and 81 with the new one). But there is a strong correlation of 0.83 between the number of points of each biathlete with the current or the new ranking which could explain the relatively small modifications between the two rankings, as mentioned above.

Note that these small modifications could have a major impact on the overall world cup ranking. Indeed, J. Boe won the overall world cup with 2 points ahead of M. Fourcade. With the new ranking, M. Fourcade would have won the overall world cup with the same margin. Obviously, this is science fiction as the application of the new ranking would probably modify the pursuit

157 races. Nevertheless, it could highlight the importance of the sprint results in the overall world
158 cup ranking (J. Boe won 4 of them this season) and the potential impact of the new ranking on
159 the overall world cup rankings, mainly when there are few points of difference.

160 *Study of the last ten pursuit world cup seasons*

161 We then studied the pursuit world cup seasons of the ten last years to analyze if the previous
162 remarks could be extended. First, on the pursuit races, the correlations between the starting
163 ranks and the pursuit ranks decreased as seen in the first results subsection: the correlation mean
164 is equal to 0.74 with the current ranking and to 0.06 with the new one. Then, we analyzed the
165 last ten pursuit world cup rankings. For all the rankings, there are more biathletes with points
166 with the new ranking than with the current one with a mean increase of 11 biathletes. The mean
167 of the difference of points between the first rank and the ranks from 2 to 10 are also all smaller
168 for the new pursuit ranking. This would have led to, in most of the cases, closer rankings and
169 more suspense in the last races of the season.

170 As seen in the previous subsection, the modifications on the podiums of the pursuit world cup
171 rankings are small but not negligible. For 7 seasons we have the same winner, two times the
172 first and the second invert their rankings and for the last one, the 4^{th} becomes 1^{st} with the new
173 ranking. There are only two identical podiums but, if we compare the name of the first three
174 biathletes, 23 above 30 are shared by the two different rankings. It highlights some important
175 common traits between the two rankings even if some individual rankings could be strongly
176 modified, for example, a biathlete who was 3^{rd} with the current ranking is 16^{th} with the new one
177 highlighting the importance of his sprint results in his good current pursuit ranking.

178 **Discussion**

179 *Advantages of the new ranking*

First, the main advantage of this new ranking is obviously that the correlation with the starting rank is very low. Therefore, even the 60th ranked at the end of the sprint had a chance to be on the podium which is not the case with the current ranking. It will result in more surprising and contested pursuit races, at each stage of the races, which is desirable for gaining audience (Bizzozero et al., 2016). More generally, it will also decrease the importance of the sprint races on the overall world cup rankings.

Second, even if the new ranking deeply modifies each pursuit ranking, each season pursuit world cup ranking is less modified than each single pursuit race. It sounds natural as, even if tactics and head-to-head are of major importance in pursuit races, it remains biathlon with cross-country skiing and shootings. So, the best biathletes are globally the same, the new pursuit ranking allows to define the pursuit as a whole discipline with real specialists, not just as a relatively small perturbation of the sprint ranking (as proven in Luchsinger et al., 2020).

Limitations of the new ranking

The first criticism that could be made to the new ranking is that it is more complicated than the current one. Nowadays, when you cross the finish line of the pursuit race in 3rd place, you are ranked 3rd, whereas with the new ranking you need to wait for all the biathletes to finish the race. Even if the new ranking is calculated in less than one second at the end of the race, it could be seen as a limiting factor. Nevertheless, this argument needs to be mitigated. First, the winner of the pursuit race is necessarily the winner of the new pursuit ranking and is therefore known immediately as he crosses the finish line. Then, for the sprint or individual biathlon races or for other sports such as the decathlon (where you need to refer to a complex points system to see how many points you score, see Cox et al. (2002) for further details) the final ranks are unknown until the last athlete crosses the finish line. This could induce important cliffhangers when biathletes are waiting in the finish area to wait and see if they are or not on the podium. Finally,

at each split time, a ranking based on the new pursuit ranking could be quickly calculated to inform the biathletes of their rankings.

Another limitation is that, when you have several biathletes that did not start or did not finish the pursuit race despite their presence on the first 60 biathletes of the sprint, it artificially increases the new rankings of biathletes that are at the end of the ranking. That could induce unmerited good new pursuit rankings for biathletes that have not performed well during the pursuit race but who improved their final rankings thanks to those who gave up. It could be solved by integrating the number of finishers of each pursuit race in the formula to calculate the quantity q_{ki}. But, to keep a very simple formula and as it is uncommon and does not impact the more important highest ranks, it was not taken into account in this paper.

Conclusion

The new pursuit ranking presented in this paper is less correlated to the starting ranking than the current one. Some minor limitations remain but, if considered as important, could be easily corrected. This paper paves the way to a fairer modification of the current pursuit ranking that will also increase surprise and suspense in the pursuit races.

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Declaration of interest statement

No potential conflict of interest was reported by the author.

Supplementary Material

The computer code and the dataset of the pursuit of Annecy-Le Grand Bornand 2019 are provided as Supplementary Material.

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Tables

Table 1. Sprint ranks, current and new final pursuit rank for the pursuit race in Annecy-Le Grand Bornand in 2019. The gain is the difference between the new and the current pursuit rank.

Current pursuit rank	Name	Sprint rank	New pursuit rank	Gain
1	BOE Johannes Thingnes	4	1	0
2	FILLON MAILLET Quentin	3	5	-3
3	CHRISTIANSEN Vetle	13	2	1
4	BOE Tarjei	2	25	-21
5	DOLL Benedikt	1	42	-37
6	JACQUELIN Emilien	20	4	2
7	FOURCADE Martin	12	12	-5
8	BJOENTEGAARD Erlend	5	24	-16
9	PEIFFER Arnd	21	10	-1
10	SCHEMPP Simon	32	3	7
11	HORN Philipp	25	7	4
12	DALE Johannes	6	38	-26
13	LOGINOV Alexander	11	23	-10
14	KRCMAR Michal	17	15	-1
15	DESTHIEUX Simon	8	35	-20
16	EBERHARD Julian	10	29	-13
17	WINDISCH Dominik	7	48	-31
18	ILIEV Vladimir	22	14	4
19	PONSILUOMA Martin	15	30	-11
20	PIDRUCHNYI Dmytro	18	27	-7
21	LAPSHIN Timofei	19	26	-5
22	CLAUDE Florent	23	20	2
23	KUEHN Johannes	14	41	-18
24	HOFER Lukas	9	49	-25
25	TRSAN Rok	47	9	16
26	EDER Simon	26	21	5
27	PRYMA Artem	34	17	10
28	LABASTAU Mikita	46	11	17
29	DUDCHENKO Anton	31	19	10
30	ELISEEV Matvey	28	33	-3
31	PORSHNEV Nikita	24	37	-6
32	BORMOLINI Thomas	60	6	26
33	RASTORGUJEVS Andrejs	36	22	11
34	CLAUDE Fabien	35	31	3
35	FEMLING Peppe	56	8	27
36	GARANICHEV Evgeniy	30	40	-4
37	SEPPALA Tero	33	34	3
38	BOCHARNIKOV Sergey	29	43	-5

39	SAMUELSSON Sebastian	27	44	-5
40	NELIN Jesper	42	32	8
41	VACLAVIK Adam	37	39	2
42	STVRTECKY Jakub	16	52	-10
43	GUIGONNAT Antonin	59	13	30
44	WEGER Benjamin	58	16	28
45	LEITNER Felix	49	36	9
46	LATYPOV Eduard	55	18	28
47	TKALENKO Ruslan	39	45	2
48	NORDGREN Leif	38	46	2
49	WIESTNER Serafin	57	28	21
50	BAUER Klemen	44	47	3
51	MALYSHKO Dmitry	41	53	-2
52	STENERSEN Torstein	43	51	1
53	CHENG Fangming	45	50	3
54	DOHERTY Sean	40	57	-3
55	LANDERTINGER Dominik	52	54	1
56	DOVZAN Miha	50	56	0
57	GUZIK Grzegorz	54	55	2
58	DOLDER Mario	48	58	0
59	HARJULA Tuomas	51	59	0
60	BURKHALTER Joscha	53	60	0

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293 *Table 2. The current and the new rankings for the 2019/2020 pursuit world cup.*

Rank	Name	New points	Name	Official points
1	JACQUELIN Emilien	219	JACQUELIN Emilien	232
2	FOURCADE Martin	188	FOURCADE Martin	230
3	BOE Johannes Thingnes	171	FILLON MAILLET Quentin	230
4	PEIFFER Arnd	160	BOE Johannes Thingnes	217
5	FILLON MAILLET Quentin	154	LOGINOV Alexander	197
6	GARANICHEV Evgeniy	153	BOE Tarjei	178
7	CHRISTIANSEN Vetle	141	DESTHIEUX Simon	171
8	BJOENTEGAARD Erlend	138	CHRISTIANSEN Vetle	169
9	LOGINOV Alexander	128	PEIFFER Arnd	167
10	KRCMAR Michal	114	BJOENTEGAARD Erlend	147

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Figures

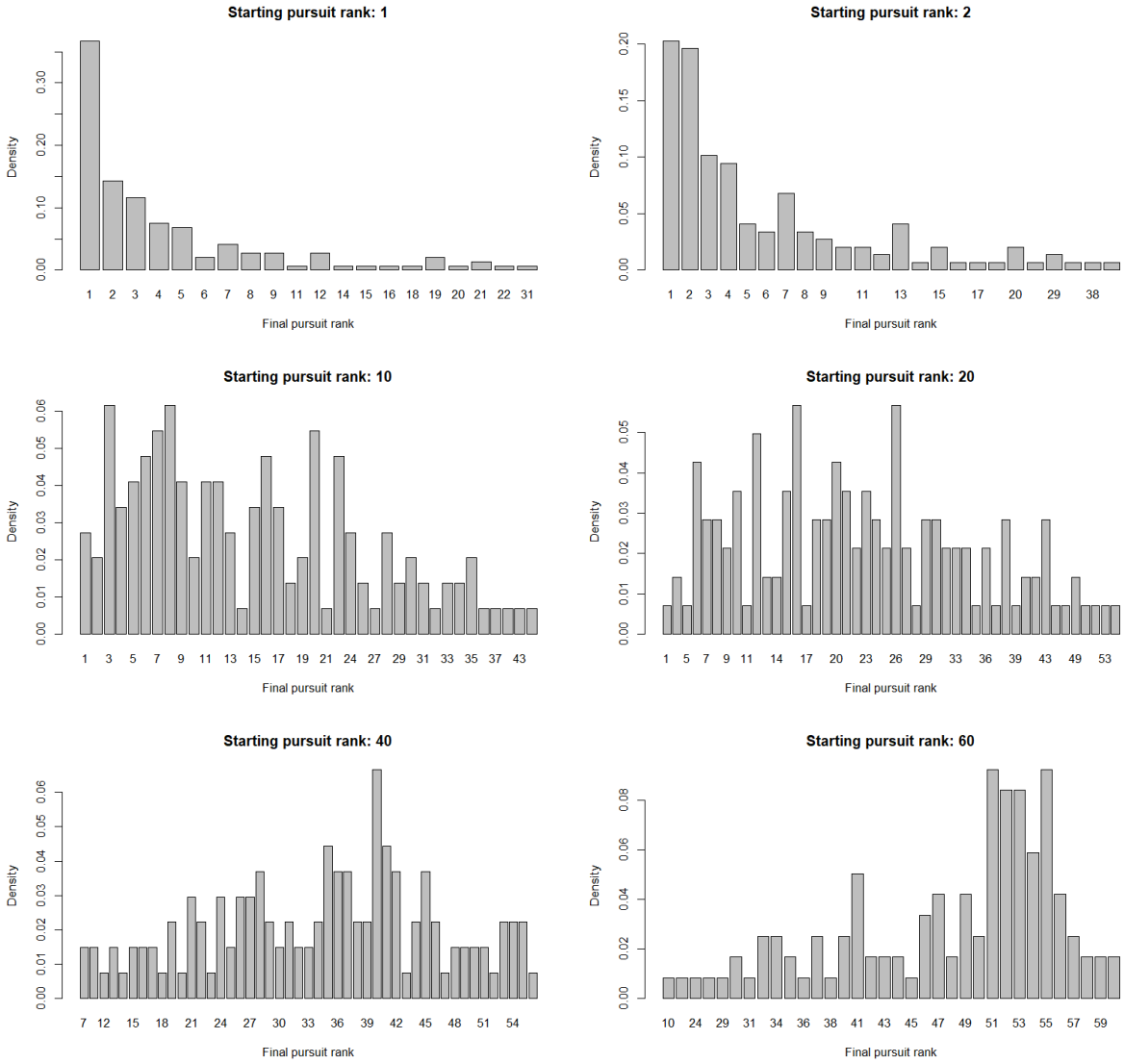

Figure 1.

Figure captions

Figure 1. Barplots of the final pursuit ranks according to six different starting pursuit ranks.