

# Journal of Science and Medicine in Sport

journal homepage: www.elsevier.com/locate/jsams

# Original research

# A step towards understanding the mechanisms of running-related injuries



# Laurent Malisoux<sup>a,\*</sup>, Rasmus Oestergaard Nielsen<sup>b,c</sup>, Axel Urhausen<sup>a,d</sup>, Daniel Theisen<sup>a</sup>

<sup>a</sup> Sports Medicine Research Laboratory, Public Research Centre for Health, Luxembourg

<sup>b</sup> Department of Public Health, Section of Sport Science, Aarhus University, Denmark

<sup>c</sup> Orthopedic Surgery Research Unit, Science and Innovation Center, Aalborg University Hospital, Denmark

<sup>d</sup> Sports Clinic, Centre Hospitalier de Luxembourg, Luxembourg

#### ARTICLE INFO

Article history: Received 5 June 2014 Received in revised form 2 July 2014 Accepted 25 July 2014 Available online 12 August 2014

Keywords: Sports injury prevention Training load monitoring Effect-measure modification Injury mechanism

### ABSTRACT

*Objectives:* To investigate the association between training-related characteristics and running-related injury using a new conceptual model for running-related injury generation, focusing on the synergy between training load and previous injuries, short-term running experience or body mass index (> or  $<25 \text{ kg m}^{-2}$ ).

Design: Prospective cohort study with a 9-month follow-up.

*Methods:* The data of two previous studies using the same methodology were revisited. Recreational runners (n = 517) reported information about running training characteristics (weekly distance, frequency, speed), other sport participation and injuries on a dedicated internet platform. Weekly volume (dichotomized into <2 h and  $\ge 2$  h) and session frequency (dichotomized into <2 and  $\ge 2$ ) were the main exposures because they were considered necessary causes for running-related injury. Non-training-related characteristics were included in Cox regression analyses as effect-measure modifiers. Hazard ratio was the measure of association. The size of effect-measure modification was calculated as the relative excess risk due to interaction.

*Results*: One hundred sixty-seven runners reported a running-related injury. Crude analyses revealed that weekly volume <2 h (hazard ratio = 3.29; 95% confidence intervals = 2.27; 4.79) and weekly session frequency <2 (hazard ratio = 2.41; 95% confidence intervals = 1.71; 3.42) were associated with increased injury rate. Previous injury was identified as an effect-measure modifier on weekly volume (relative excess risk due to interaction = 4.69; 95% confidence intervals = 1.42; 7.95; p = 0.005) and session frequency (relative excess risk due to interaction = 2.44; 95% confidence intervals = 0.48; 4.39; p = 0.015). A negative synergy was found between body mass index and weekly volume (relative excess risk due to interaction = -2.88; 95% confidence intervals = -5.10; -0.66; p = 0.018).

*Conclusions:* The effect of a runner's training load on running-related injury is influenced by body mass index and previous injury. These results show the importance to distinguish between confounding and effect-measure modification in running-related injury research.

© 2014 Sports Medicine Australia. Published by Elsevier Ltd. This is an open access article under the CC BY-NC-ND license (http://creativecommons.org/licenses/by-nc-nd/3.0/).

#### 1. Introduction

Risk factors for running-related injury (RRI) in runners have been widely investigated.<sup>1–3</sup> Such studies are extremely valuable to identify populations at risk. In spite of past research efforts, only few consistent risk factors have been revealed in the literature, probably due to different study designs and analytical approaches used.<sup>5</sup> Moreover, the sole identification of risk factors is insufficient

\* Corresponding author. E-mail address: laurent.malisoux@crp-sante.lu (L. Malisoux). to elucidate the mechanisms involved in RRI generation,<sup>6,7</sup> a prerequisite for successful injury prevention measures.<sup>1,8</sup>

To date, evidence on RRI aetiology is virtually non-existent. One of the main reasons regularly highlighted is the absence of largescale prospective cohort studies.<sup>2,5,8</sup> In addition, the conceptual and statistical approach used for data-analysis has been given insufficient attention. The classical way used by many authors is to run regression analyses,<sup>10,11,13</sup> where all variables thought to be related to injury are first tested separately for their association with RRI. Next, those below a certain *p*-value are included in a final adjusted model. This approach implies that each included variable is a confounder for the outcome and is directly associated with it.

http://dx.doi.org/10.1016/i.isams.2014.07.014

<sup>1440-2440/© 2014</sup> Sports Medicine Australia. Published by Elsevier Ltd. This is an open access article under the CC BY-NC-ND license (http://creativecommons.org/licenses/by-nc-nd/3.0/).

Personal characteristics such as age, body mass index (BMI), previous injury, preferred running surface or use of different pairs of running shoes have previously been suggested to be related to RRI.<sup>1</sup> Another study concluded that atypical foot pronation and inadequate hip muscle stabilization were suspected mechanisms involved in the cause of overuse running injuries.<sup>4</sup> However, strictly speaking, none of these factors in themselves are sufficient causes for injury. Runners do not sustain an RRI only because they are overweight, older, or have had a previous injury.<sup>14,15</sup> RRI can only occur when people practice running.<sup>16</sup> This means that running practice is a necessary cause for RRI and, in fact, the only necessary cause. Therefore, when studying causal mechanisms, training-related characteristics should be considered as primary exposures of interest in RRI research. Unfortunately, there is so far only limited evidence about the association between trainingrelated characteristics and RRI.<sup>1,8</sup> Previously, experts have argued that half of all RRIs are related to training errors and could be preventable.<sup>3,16</sup> However, a systematic review failed to identify which of these training errors are related to RRI.<sup>8</sup>

The identification of training errors represents a particularly interesting line of attack regarding injury prevention. On the one hand, running-related characteristics (e.g. training volume and frequency) are necessary factors for injury development,<sup>14</sup> on the other hand a runner's training regime is easily modified.<sup>17</sup> However, the mere detection of risk factors without understanding the underlying mechanism is insufficient to optimize prevention measures.<sup>7</sup> Although a multifactorial model for sports injury aetiology was suggested already 20 years ago,<sup>18</sup> no study to date has investigated if and how injury predictors work in synergism. To fill this knowledge gap, we suggest here a conceptual model of RRI generation in which the primary exposures of interest are training-related characteristics. Non-training-related characteristics are considered as potential effect-measure modifiers (EMM) because the effect of training-related exposure is different across strata of non-training-related factors. Therefore, the aim of this study was to investigate the influence of training volume (hours per week) and training frequency on RRI, and especially to analyse in how far other personal characteristics affect these relationships. To achieve this goal, we combined and re-analysed the data of over 500 recreational runners collected in the framework of 2 previous studies.11,12

# 2. Methods

A prospective observational study<sup>11</sup> and a randomized control trial<sup>12</sup> were initiated in parallel in 2012, using the same methodology. All participants (above 18 years) signed an informed consent and were free to follow their own training programme. The main study requirements in both studies were: (1) to train on average at least once a week, (2) to report training data related to running and all other sporting activities (per training session) at least once a week, (3) to systematically report any injury and illness sustained during the 9-month follow-up period, (4) to have no contraindication to running training (e.g. injury) at the time of initial inclusion, and (5) to have no degenerative conditions and no history of surgery to the lower limbs or the back region within the previous 12 months. The study protocols and online procedures had previously been approved by the National Ethics Committee for Research (Refs. 201111/10 and 201201/02).

A total of 754 participants initially created their account on the Training and Injury Prevention Platform for Sport (TIPPS) website during the recruitment phase of the randomized controlled trial (n=299) and the observational study (n=455). The demographic data gathered were: age, sex, weight, height, regular running practice over the previous 12 months (number of months with at

least one session a week), running experience (years of previous regular practice) and previous (12 months) injury to the lower back or lower limbs preventing the participant from normal running activity.

The injury definition was a modified version of the one used by Buist et al.<sup>9</sup>: any physical pain located at the lower limbs or lower back region, sustained during or as a result of running practice and impeding planned running activity for at least 1 day (time-loss definition). Participants were instructed to report all adverse events including injuries preventing them from normal running activity via a dedicated questionnaire on their TIPPS account. In the present study, overuse and traumatic non-contact injuries were included in the analyses, whatever the mode of onset (sudden or gradual).<sup>19</sup> RRIs were classified according to consensus guidelines on sports injury surveillance studies.<sup>19,20</sup>

During follow-up, participants were instructed to upload all running sessions and other sporting activities undertaken onto their TIPPS account.<sup>21</sup> Primary exposures were weekly running volume and weekly session frequency. Running practice characteristics were described as average values during the follow-up period. Dichotomization was done for weekly running volume (<2 h and  $\geq$ 2 h week<sup>-1</sup>) and weekly session frequency (<2 and  $\geq$ 2 sessions week<sup>-1</sup>), based on the respective median.

Individual e-mail reminders were sent to the participants who had not provided the system with any data for the previous week. Injury data was systematically checked by one of the investigators for completeness and coherence. Personal phone calls were made if the reported information on the injury form was found to be inconsistent. A participant was considered as dropping out of the study when no data was uploaded in the system for more than 2 weeks despite the automatic reminder sent by the system and a phone call from the research team.

Effect-measure modifiers were BMI, previous injury and shortterm (12 previous months) regular running experience. BMI was dichotomized into <25 and  $\geq$ 25 kg m<sup>-2</sup>. Runners were considered as regulars if they had practiced running on a weekly basis over the previous 12 months. Previous injury was defined as any RRI sustained over the previous 12 months.

Cox regression was used to compute the hazard rates in the exposure groups, using RRI as the primary outcome and hours spent running (time at risk, expressed in hours) as the time-scale.<sup>22</sup> Date at inclusion and date at injury (if applicable) or at censoring were basic data used to calculate the time at risk. Participants were right-censored in case of severe disease, non-running-related injury causing a modification of the running plan or at the end of follow-up, whichever came first. The assumption of proportional hazards was evaluated by log-minus-log plots to validate the statistical model. In addition, the recommendation of using at least 10 injuries per predictor variable included in the Cox regression analysis was followed strictly.<sup>23</sup>

As a preliminary phase, unadjusted Cox proportional hazard regressions were performed to present the crude estimates of training-related characteristics. To study whether the effects of the primary exposures on RRI were modified by previous injury, short-term running experience and BMI (cf. Fig. 1), the additional following steps were performed, according to the recommendations by Knol and VanderWeele.<sup>24</sup> First, stratified analyses were performed separately for each of the two training characteristics (weekly volume and frequency) including either previous injury, short-term running experience or BMI as potential EMM (thus creating 4 strata for each analysis). Hazard ratios (HR) and their 95% confidence intervals (95%CI) were determined for each stratum with a single reference category (the stratum with the lowest injury rate). Secondly, HR and the corresponding 95%CI were computed within strata of previous injuries, short-term running experience and BMI. Finally, the size of the effect-measure modification was



**Fig. 1.** A conceptual model of the determinants of running-related injuries (RRI); since running training must be present for injury to occur, training characteristics must be considered a necessary cause to injury development, according to Rothman's theories (cf. text for further detail); other personal and behavioural characteristics (non-training-related) are complementary causes which may or may not be a part of the causal mechanism. Non-training-related characteristics affect the training load a runner is able to tolerate before injury occurs. They are to be tested as effect-measure modifiers when investigating the causal mechanisms of RRI.

calculated as the relative excess risk due to interaction (RERI), using the additive scale. Synergism between two exposures was concluded if 0 was not comprised in the 95%CI of the RERI.<sup>24</sup> An RERI value above zero implies a positive synergism while a negative value implies a negative synergism.

Cut-off values for dichotomization were determined, amongst others, with the aim to get at least 15 participants with and without injuries within each of the strata. Significance was accepted for p < 0.05. In addition, estimated effect size and estimated precision (95% confidence limits) were used for proper interpretation of study results.<sup>25</sup> All analyses were performed using SPSS V20.

#### 3. Results

Of the 754 volunteers who initially registered to the prospective cohort study or the RCT, 237 of them were excluded from the analyses because they did not upload any sporting activity during the observation period, they reported <2 running sessions before the first RRI or censoring, or they did not provide all required information. Thus, a total of 517 recreational runners were eventually included in the analyses. Participants reported an average of  $2.1 \pm 1.1$  running sessions per week, with a total volume of  $2.3 \pm 1.6$  h week<sup>-1</sup>. Their mean running distance was  $22.1 \pm 16.2$  km week<sup>-1</sup> and the average running speed was  $9.6 \pm 1.6$  km h<sup>-1</sup>. Personal and sport-related characteristics of the participants are presented in Table 1.

A non-contact RRI was sustained by 167 of the 517 participants (32.3%). For comparison purposes to previous studies, the overall incidence was 6.68 RRI/1000 h of running. Acute non-contact injuries (e.g. muscles tear) accounted for 13.8% (n = 23) of the RRIs, and 32.9% (n = 55) of all injuries were recurrent. Most of the RRIs affected muscles (44.9%) and tendons (41.3%), and the most often concerned anatomical locations were the lower leg (22.7%), the knee (22.2%) and the thigh (20.9%).

A crude analysis (unadjusted Cox regression model) of the association between the factors presented in Fig. 1 revealed that weekly volume <2 h (HR = 3.29; 95%CI = 2.27; 4.79) and session frequency <2 sessions per week (HR = 2.41; 95%CI = 1.71; 3.42), were associated with increased injury rate.

A stratified analysis according to previous injury is presented in Table 2. In both strata, the rate at which RRI occurred at any time was higher amongst the participants with a weekly volume <2 h and those who ran <2 sessions week<sup>-1</sup>. Moreover, previous injury was identified as an EMM, since the RERI on weekly volume (RERI = 4.69; 95%CI = 1.42; 7.95; p = 0.005), as well as on session frequency (RERI = 2.44; 95%CI = 0.48; 4.39; p = 0.015), was significantly higher than 0.

After stratification according to short-term regular running experience, HR were higher amongst participants with a weekly volume <2 h and those who ran <2 sessions week<sup>-1</sup> in both strata. Regular running did not induce effect modification on weekly volume nor on session frequency.

The stratified analysis according to BMI revealed that the rate at which RRI occurred at any time was higher amongst the participants with a weekly volume <2 h and those who ran

#### Table 1

Personal and sport-related characteristics of the study participants (n = 517).

Variables	Unit/qualifier	Value
Personal characteristics		
Age	Years	$42.2\pm9.9$
Sex	Male	336(65.0%)
	Female	181 (35.0%)
Weight	kg	$71.5\pm11.6$
BMI	$<\!25  \text{kg}  \text{m}^{-2}$	368(71.2%)
	$\geq$ 25 kg m <sup>-2</sup>	149(28.8%)
Study	Cohort	249(48.2%)
	RCT	268(51.8%)
Previous injury	Yes	202(39.1%)
	No	315(60.9%)
Running experience <sup>a</sup>	Years	5(0;42)
Regularity over the last 12 months <sup>b</sup>	Yes	312(60.5%)
	No	204(39.5%)
Sport-related characteristics		
Weekly running volume	<2 h week <sup>-1</sup>	259(50.1%)
	$\geq 2 h week^{-1}$	258(49.9%)
Session frequency	<2 sessions week <sup>-1</sup>	258(49.9%)
	$\geq 2$ sessions week <sup>-1</sup>	259(50.1%)
Running speed	$<10  \text{km}  \text{h}^{-1}$	310(60%)
	$\geq 10  km  h^{-1}$	207(40%)

<sup>a</sup> Three missing data.

<sup>b</sup> One missing data. Descriptive data for the participants' personal and sportrelated characteristics are presented as mean (standard deviation) for continuous variables, and as counts (percentage) for categorical variables, except for running experience, for which the median and extreme values are displayed.

#### Table 2

Analyses on effect modification where either weekly volume or session frequency is the primary exposure and either previous injury (Prev. Inj.), running regularity over the previous 12 months (Regular runner) or body mass index (BMI – kg m<sup>-2</sup>) is the potential effect-measure modifier (n = 517).

	Weekly volume		Session frequency			
	<2 h week <sup>-1</sup> N with and without injuries; HR [95%CI] p-value	≥2 h week <sup>-1</sup> N with and without injuries; HR [95%CI] p-value	HR (95%CI); p-value for weekly volume <2 h within strata	<2 sessions week <sup>-1</sup> N with and without injuries; HR [95%CI] p-value	≥2 sessions week <sup>-1</sup> N with and without injuries; HR [95%CI] p-value	HR (95%CI); p-value for session frequency <2 within strata
Prev. Inj. – no	37/128 2.80 [1.72; 4.56] <i>p</i> < 0.001	44/106 Reference	2.98 [1.76; 5.04] <i>p</i> < 0.001	35/127 2.08 [1.30; 3.32] <i>p</i> = 0.002	46/107 Reference	2.21 [1.36; 3.61] <i>p</i> =0.002
Prev. Inj. – yes	39/55 8.05 [4.89; 13.28] <i>p</i> < 0.001 4.60 [1.42: 7.05]: <i>p</i> =0	47/61 1.56 [1.04; 2.37] <i>p</i> =0.034	4.63 [2.67; 8.01] <i>p</i> < 0.001	38/58 5.09 [3.19; 8.11] p < 0.001 2.44 [0.48: 4.20]: n=0	48/58 1.57 [1.05; 2.36] <i>p</i> =0.029	2.97 [1.80; 4.90] <i>p</i> < 0.001
KERI [95%CI]	4.69 [1.42, 7.95], <i>p</i> =0.005		2.44[0.46, 4.59], p = 0.015			
Regular runner – no Regular runner – ves	33/84 4.12 [2.52; 6.74] <i>p</i> < 0.001 43/99	37/50 1.81 [1.18; 2.76] <i>p</i> = 0.006 54/116	2.16 [1.26; 3.70] <i>p</i> = 0.005	35/84 2.99 [1.90; 4.71] <i>p</i> < 0.001 38/101	35/50 1.61 [1.06; 2.47] p=0.027 59/114	1.82 [1.10; 3.02] <i>p</i> =0.020
RERI [95%CI]	4.17 [2.61; 6.64] p < 0.001 -0.86 [-2.88; 1.18]; p	Reference	4.48 [2.66; 7.56] <i>p</i> < 0.001	2.75 [1.76; 4.31] p < 0.001 -0.37 [-1.84; 1.10]; p	Reference	2.76 [1.71; 4.45] <i>p</i> < 0.001
BMI <25	54/108 4.70 [3.07; 7.21] p < 0.001	65/141 Reference	4.52 [2.88; 7.08] p < 0.001	49/114 2.88 [1.92; 4.31] p<0.001	70/135 Reference	2.68 [1.77; 4.06] p<0.001
$BMI \ge \! 25$	22/75 2.94 [1.72; 5.03] p < 0.001	26/26 2.12 [1.34; 3.36] <i>p</i> = 0.001	1.51 [0.77–2.95] p=0.230	24/71 2.52 [1.53; 4.16] p < 0.001	24/30 1.71 [1.07; 2.73] p=0.025	1.77 [0.93; 3.38] p=0.083
RERI [95%CI]	-2.88 [-5.10; -0.66]; <i>p</i> =0.018		-1.07 [-2.61; 0.48]; p=0.177			

HR: hazard ratio; CI: confidence interval; kg: kilogram; m: metres; RERI: relative excess risk due to interaction is the measure of effect modification on either weekly volume or session frequency on additive scale. In each analysis, the reference group was the one with the lowest hazard. Weekly volume is the average weekly running volume during follow-up, dichotomized into <2 h and  $\ge 2$  h based on the median. Weekly session frequency is the average weekly session frequency during follow-up, dichotomized into <2 h and  $\ge 2$  h based on the median. Weekly session frequency is the average weekly basis over the last 12 months before the observational period (1 missing value).

<2 sessions week<sup>-1</sup>, but only in the stratum BMI <25 kg m<sup>-2</sup>. A negative synergy was found between BMI and weekly volume, as indicated by the negative value of RERI (RERI = -2.88; 95%CI = -5.10; -0.66; p = 0.018).

#### 4. Discussion

The main objective of this study was to investigate the relationships between training-related characteristics and RRI, with particular focus on the question if personal characteristics affect these relationships. This study aim was formulated based on a new conceptual model for RRI generation, as presented in Fig. 1. This approach does not immediately consider all factors as covariables, as suggested by established practice, but distinguishes between primary factors (training-related characteristics) and EMM (non-training-related characteristics). Furthermore, the statistical methods used in the present study are also specific to the study aim and not usually employed in the field of sports injury prevention. A recent review put forward the great heterogeneity of statistical methods between studies, which makes it difficult to perform the much needed meta-analyses to bring the field forward.<sup>5</sup> The model presented here throws the basis for an original approach that can be adopted in future large-scale prospective studies and help improve our understanding of RRI aetiology. Rather than to analysis a larger set of training characteristics and potential EMM, we preferred to focus more on the methodology of the analysis. Indeed, there is virtually no limitation in the number of variables that can be tested with the present model.

The first step of the method applied here consists in the crude analysis of the association between independent primary exposure variables and RRI. This analysis revealed that the groups of

runners with a weekly volume <2 h or a weekly session frequency <2 displayed a higher HR. These observations are counterintuitive, since common sense would suggest the opposite, i.e. that a higher weekly volume or session frequency would be associated with greater injury risk. To date, the association between weekly running distance and the occurrence of running injuries remains unclear. Two high quality studies reported that high weekly mileage (above 64 km) is a risk factor for lower extremity injuries.<sup>26,27</sup> In contrast, higher weekly distance was a strong protective factor in cohort studies.<sup>13,28,29</sup> It could be speculated that, in habitual recreational runners, those characterized by a higher level of fitness have a decreased risk of injury. Therefore, as suggested by others,<sup>29,30</sup> the relationship between weekly running volume and RRI risk is multidimensional and results from a subtle combination of overload and under-conditioning. In other words, running experience and fitness level should be considered before formulating recommendations (e.g. upper limits) for weekly volume.

In a second phase, the size of the effect-measure modification was calculated, an approach rarely used in RRI research. Yet, it is highly recommended because it provides the reader with the relevant data to interpret the effect modification analysis.<sup>24</sup> Importantly, we did identify several associations that were significantly influenced (positively or negatively) by effect-measure modification: previous injury or BMI. Since the effect of the training variables differs across the strata of these co-variates, it would be inappropriate to include them as confounders in the regression model. Instead, an effect-modification analysis is required, because the effect of the confounder is not similar across strata. This finding is paramount, and we encourage researchers in RRI research to consider analysing effect-measure modification before performing an adjusted regression analysis.

An example of a significant positive effect modification was the RERI = 4.69 found between weekly volume and previous injury. This means that the combined effect of running <2 h week<sup>-1</sup> and having had a previous injury was much worse than expected. Based on this finding, a low weekly volume and previous injury work in synergism, and it is fair to conclude that the subpopulation of individuals with low weekly volume and with previous injury are particular vulnerable to injury. Although this result may be difficult to interpret, as already discussed above, the idea here is not so much to establish a causal relationship between weekly volume and RRI, but rather to put forward the need to stratify this analysis according to previous injury. An example of a significant negative effect modification was the RERI = -2.88 found between weekly volume and BMI. Here, a lessened injury rate than expected was present for individuals with high BMI and a low running volume. In fact, a HR of 6.82 was expected based on the results from the other strata (4.70+2.12). Nevertheless, the HR was estimated to 2.94, and these results suggest that the subpopulation with high BMI and displaying a low weekly volume had a lessened injury rate, while the runners particularly vulnerable were those with BMI below 25 and a low weekly volume. Again, the explanations for these observations are not straightforward, and we can only speculate about the involved mechanisms. For example, it is possible that runners with a low BMI accumulate a greater mileage per running session compared to those with a high BMI, who could be more precautious and reach a given training volume through a combination of higher session frequency and lower session volume. In more general terms, the subjective perception of increased injury risk (e.g. because of a higher BMI) could lead to different behaviour and induce short-term changes in training patterns that allow for better tissue repair and a different training tolerance. To determine if these hypotheses are founded, future research should be directed towards short-term changes in running routines and their relationship on cumulative tissue load, RRI and the ability for adaptive repair.<sup>16</sup> Since runners generally have a fluctuating training regime, this means that methodologies taking the time-varying exposure into account are required.

Subpopulations with increased vulnerability to injury were identified in this article, which is of particular interest from a public health and injury prevention perspective. Prevention initiatives should be founded on knowledge on the causal relationship between risk factors and injury. This implies that randomized controlled trials assessing different training modalities are needed to understand the impact of training-related characteristics on RRI. In this respect, the main limitation of the present observational study is that the relationships presented here are most likely not causal. More investigations including larger numbers of runners and using controlled interventions are needed to improve our understanding of RRI aetiology. Furthermore, stratification into more subpopulations and inclusion of time-varying trainingrelated exposures are needed to get closer to a causal pattern. Still, we believe the approach used here is "closer to causal" than the more traditional identification of risk factors using stepwise models.9-13

# 5. Conclusions

The present study proposes a conceptual model in which non-training-related characteristics are considered as potential EMM, i.e. factors influencing the training load a runner is able to tolerate before injury occurs. Based on our results, we conclude that previous injury displayed a positive synergy with weekly volume and session frequency, while a negative synergy was observed between BMI and weekly volume. Future research into RRI prevention should move towards the explanation of injury mechanisms and the identification of causal relationships between training-related factors and RRI. This is a prerequisite for efficient preventive measures targeted to highest risk populations.

# 6. Practical implications

- Training-related characteristics should be considered as primary exposure of interest while non-training-related characteristics should be considered as potential EMM.
- The training load a runner is able to tolerate is affected by previous injury and BMI.
- The relationship between weekly volume or session frequency and RRI remains unclear.

# Acknowledgment

The present study was financially supported by the National Ministry of Sport, and the National Olympic Committee.

#### References

- van Gent RN, Siem D, van Middelkoop M et al. Incidence and determinants of lower extremity running injuries in long distance runners: a systematic review. *Br J Sports Med* 2007; 41(8):469–480, discussion 480.
- Wen DY. Risk factors for overuse injuries in runners. Curr Sports Med Rep 2007; 6(5):307–313.
- Fields KB, Sykes JC, Walker KM et al. Prevention of running injuries. Curr Sports Med Rep 2010; 9(3):176–182.
- Ferber R, Hreljac A, Kendall KD. Suspected mechanisms in the cause of overuse running injuries: a clinical review. Sports Health 2009; 1(3):242–246.
- Saragiotto BT, Yamato TP, Hespanhol Junior LC et al. What are the main risk factors for running-related injuries? *Sports Med* 2014. http://dx.doi.org/10.1007/s40279-014-0194-6.
- van Mechelen W, Hlobil H, Kemper HC. Incidence, severity, aetiology and prevention of sports injuries. A review of concepts. Sports Med 1992; 14(2):82–99.
- Finch C. A new framework for research leading to sports injury prevention. J Sci Med Sport 2006; 9(1–2):3–9, discussion 10.
- Nielsen RO, Buist I, Sorensen H et al. Training errors and running related injuries: a systematic review. Int J Sports Phys Ther 2012; 7(1):58–75.
- Buist I, Bredeweg SW, Bessem B et al. Incidence and risk factors of runningrelated injuries during preparation for a 4-mile recreational running event. Br J Sports Med 2010; 44(8):598–604.
- Buist I, Bredeweg SW, Lemmink KA et al. Predictors of running-related injuries in novice runners enrolled in a systematic training program: a prospective cohort study. Am J Sports Med 2010; 38(2):273–280.
- 11. Malisoux L, Ramesh J, Mann R et al. Can parallel use of different running shoes decrease running-related injury risk? *Scand J Med Sci Sports* 2013. http://dx.doi.org/10.1111/sms.12154.
- Theisen D, Malisoux L, Genin J et al. Influence of midsole hardness of standard cushioned shoes on running-related injury risk. *Br J Sports Med* 2013. http://dx.doi.org/10.1136/bjsports-2013-092613.
- Van Middelkoop M, Kolkman J, Van Ochten J et al. Risk factors for lower extremity injuries among male marathon runners. *Scand J Med Sci Sports* 2008; 18(6):691–697.
- Meeuwisse WH, Tyreman H, Hagel B et al. A dynamic model of etiology in sport injury: the recursive nature of risk and causation. *Clin J Sport Med* 2007; 17(3):215–219.
- 15. Rothman KJ. Causes, 1976. Am J Epidemiol 1995; 141(2):90–95, discussion 89.
- Hreljac A. Etiology, prevention, and early intervention of overuse injuries in runners: a biomechanical perspective. *Phys Med Rehabil Clin N Am* 2005; 16(3):651–667, vi.
- Cameron KL. Commentary: time for a paradigm shift in conceptualizing risk factors in sports injury research. J Athl Train 2010; 45(1):58–60.
- Meeuwisse W. Athletic injury etiology: distinguish between interaction and confounding. *Clin J Sport Med* 1994; 4(3):171–175.
- 19. Timpka T, Alonso JM, Jacobsson J et al. Injury and illness definitions and data collection procedures for use in epidemiological studies in athletics (track and field): consensus statement. *Br J Sports Med* 2014; 48(7):483–490.
- Fuller CW, Ekstrand J, Junge A et al. Consensus statement on injury definitions and data collection procedures in studies of football (soccer) injuries. Br J Sports Med 2006; 40(3):193–201.
- Malisoux L, Frisch A, Urhausen A et al. Monitoring of sport participation and injury risk in young athletes. J Sci Med Sport 2013; 16(6):504–508.
- Bahr R, Holme I. Risk factors for sports injuries a methodological approach. Br J Sports Med 2003; 37(5):384–392.

- **23.** Peduzzi P, Concato J, Feinstein AR et al. Importance of events per independent variable in proportional hazards regression analysis. II. Accuracy and precision of regression estimates. *J Clin Epidemiol* 1995; 48(12):1503–1510.
- Knol MJ, VanderWeele TJ. Recommendations for presenting analyses of effect modification and interaction. Int J Epidemiol 2012; 41(2):514–520.
- **25.** Stang A, Poole C, Kuss O. The ongoing tyranny of statistical significance testing in biomedical research. *Eur J Epidemiol* 2010; 25(4):225–230.
- 26. Macera CA, Pate RR, Powell KE et al. Predicting lower-extremity injuries among habitual runners. *Arch Intern Med* 1989; 149(11):2565–2568.
- **27.** Walter SD, Hart LE, McIntosh JM et al. The Ontario cohort study of runningrelated injuries. *Arch Intern Med* 1989; 149(11):2561–2564.
- 28. Jakobsen BW, Kroner K, Schmidt SA et al. Prevention of injuries in long-distance runners. *Knee Surg Sports Traumatol Arthrosc* 1994; 2(4):245–249.
- Rasmussen CH, Nielsen RO, Juul MS et al. Weekly running volume and risk of running-related injuries among marathon runners. *Int J Sports Phys Ther* 2013; 8(2):111–120.
- **30.** Satterthwaite P, Norton R, Larmer P et al. Risk factors for injuries and other health problems sustained in a marathon. *Br J Sports Med* 1999; 33(1):22–26.