

This is a repository copy of The anemia-independent impact of myelodysplastic syndromes on health-related quality of life.

White Rose Research Online URL for this paper: <a href="https://eprints.whiterose.ac.uk/id/eprint/178495/">https://eprints.whiterose.ac.uk/id/eprint/178495/</a>

Version: Published Version

# Article:

Wouters, Hanneke J C M, Conrads-Frank, Annette, Koinig, Karin A et al. (8 more authors) (2021) The anemia-independent impact of myelodysplastic syndromes on health-related quality of life. Annals of Hematology. pp. 2921-2932. ISSN: 1432-0584

https://doi.org/10.1007/s00277-021-04654-1

# Reuse

This article is distributed under the terms of the Creative Commons Attribution (CC BY) licence. This licence allows you to distribute, remix, tweak, and build upon the work, even commercially, as long as you credit the authors for the original work. More information and the full terms of the licence here: https://creativecommons.org/licenses/

#### Takedown

If you consider content in White Rose Research Online to be in breach of UK law, please notify us by emailing eprints@whiterose.ac.uk including the URL of the record and the reason for the withdrawal request.



#### **ORIGINAL ARTICLE**



# The anemia-independent impact of myelodysplastic syndromes on health-related quality of life

Hanneke J. C. M. Wouters  $^{1,2}$  · Annette Conrads-Frank  $^3$  · Karin A. Koinig  $^4$  · Alex Smith  $^5$  · Ge Yu  $^{5,6}$  · Theo de Witte  $^7$  · Bruce H. R. Wolffenbuttel  $^2$  · Gerwin Huls  $^1$  · Uwe Siebert  $^{3,8,9,10}$  · Reinhard Stauder  $^4$  · Melanie M. van der Klauw  $^2$  · on behalf of the MDS-RIGHT partners

Received: 4 March 2021 / Accepted: 24 August 2021 © The Author(s) 2021

#### **Abstract**

Myelodysplastic syndromes (MDS) are in the majority of cases characterized by anemia. Both anemia and MDS per se may directly contribute to impairments in health-related quality of life (HRQoL). In this study, we aimed to investigate the anemia-independent impact of MDS on HRQoL. We evaluated participants ( $\geq$  50 years) from the large population-based Lifelines cohort (N=44,694, mean age 59.0±7.4 years, 43.6% male) and the European MDS Registry (EUMDS) (N=1538, mean age 73.4±9.0 years, 63.0% male), which comprises a cohort of lower-risk MDS patients. To enable comparison concerning HRQoL, SF-36 scores measured in Lifelines were converted to EQ-5D-3L index (range 0–1) and dimension scores. Lower-risk MDS patients had significantly lower HRQoL than those from the Lifelines cohort, as illustrated in both the index score and in the five different dimensions. Multivariable linear regression analysis demonstrated that MDS had an adjusted total impact on the EQ-5D index score (B = -0.12, p<0.001) and an anemia-independent "direct" impact (B = -0.10, p<0.001). Multivariable logistic regression analysis revealed an anemia-independent impact of MDS in the dimension mobility, self-care, usual activities, and anxiety/depression (all except pain/discomfort). This study demonstrates that the major part of the negative impact of lower-risk MDS on HRQoL is not mediated via anemia. Thus, the therapeutic focus should include treatment strategies directed at underlying pathogenic mechanisms to improve HRQoL, rather than aiming predominantly at increasing hemoglobin levels.

Keywords Myelodysplastic syndromes · Health-related quality of life · Anemia · Hemoglobin

- Hanneke J. C. M. Wouters h.j.c.m.wouters@umcg.nl
- Department of Hematology, University of Groningen, University Medical Center Groningen, Groningen, The Netherlands
- Department of Endocrinology, University of Groningen, University Medical Center Groningen, 9700 RB Groningen, The Netherlands
- Institute of Public Health, Medical Decision Making and Health Technology Assessment, Department of Public Health, Health Services Research and Health Technology Assessment, UMIT - University for Health Sciences, Medical Informatics and Technology, Hall in Tirol, Austria
- Department of Internal Medicine V (Hematology and Oncology), Medical University Innsbruck, Innsbruck, Austria

Published online: 02 September 2021

- <sup>5</sup> Epidemiology and Cancer Statistics Group, Department of Health Sciences, University of York, York, UK
- Population Health Sciences Institute, Newcastle University, Newcastle upon Tyne, UK
- Department of Tumor Immunology, Radboud University Medical Center, Nijmegen, The Netherlands
- Division of Health Technology Assessment, ONCOTYROL Center for Personalized Cancer Medicine, Innsbruck, Austria
- <sup>9</sup> Center for Health Decision Science, Department of Health Policy and Management, Harvard T.H. Chan School of Public Health, Boston, MA, USA
- Institute for Technology Assessment and Department of Radiology and Department of Radiology, Massachusetts General Hospital, Harvard Medical School, Boston, MA, USA

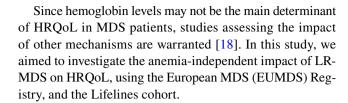


#### Introduction

Myelodysplastic syndromes (MDS) are acquired clonal disorders of the hematopoietic stem cell, which are characterized by bone marrow failure resulting in blood cytopenias. Anemia is the most prevalent cytopenia and is the most common objective disease manifestation [1, 2]. Several studies have been conducted to assess health-related quality of life (HRQoL) in patients with MDS. HRQoL is usually decreased in patients with MDS and is associated with an unfavorable survival [3, 4]. A previous study comparing HRQoL in newly diagnosed individuals with lower-risk MDS (LR-MDS) (N = 1690) demonstrated that a significant proportion of MDS patients experience profound age- and sex-dependent restrictions in different HRQoL dimensions [5].

Patients with MDS are classified into subgroups based on several biological parameters to predict overall survival and the risk of transformation to acute myeloid leukemia (Revised International Prognostics Scoring System; IPSS-R). Especially individuals with higher IPSS-R risk MDS have a poor prognosis [6, 7]. Intervention goals differ between IPSS-R risk groups. Treatment for patients with LR-MDS is focused on restoration of cytopenias, to delay progression to acute myeloid leukemia and prolonging survival [8]. The only curative option is hematopoietic cell transplantation [1]. Due to advanced age and/or co-existing medical conditions, patients are often ineligible for this procedure. Therefore, treatment decisions for lower risk IPSS-R MDS often focus on improvement of quality of life (QoL) [9].

Anemia, especially anemia of chronic inflammation, has been associated with a decreased HRQoL in older individuals in the general population [10]. In MDS patients, both anemia and other anemia-independent characteristics of MDS may have a direct contribution to impairments in HRQoL. There is conflicting evidence on the impact of hemoglobin levels on QoL in MDS, whereas chronic RBC transfusion dependency is clearly associated with an inferior QoL [11]. Steensma et al. demonstrated a poor correlation between hemoglobin levels and fatigue in MDS patients (N = 359). However, the influence of prior RBC transfusions on the evaluated hemoglobin levels was uncertain [12]. In another study (N=280), the degree of anemia was associated with, but could not fully explain, the subjective perception of fatigue [13]. In smaller studies (N=50 and N=39), lower hemoglobin levels were associated with fatigue and poorer QoL [14, 15]. Further, intervention studies do not convincingly prove that interventions that aim to increase the hemoglobin levels in MDS patients have a beneficial effect on HRQoL [16, 17].



# **Methods**

# Study design

First, we analyzed data from the EUMDS Registry, a noninterventional longitudinal study, enrolling newly diagnosed patients with MDS (IPSS low or intermediate-1) from 148 hematology centers in 16 European countries and Israel (started in 2007). Enrollment was within 100 days of the diagnostic bone marrow aspirate. The study has been approved by the local ethics committees and written informed consent was obtained from all participants. The study has been performed in accordance with the Declaration of Helsinki. Details of this cohort and the recorded clinical parameters have been described elsewhere [4, 5]. For the current analysis, we used data from the baseline survey and excluded participants younger than 50 years and those with missing data on HRQoL or hemoglobin level. Individuals who received a RBC transfusion within 30 days before the blood sample was taken were also excluded. In total, 1538 EUMDS patients were eligible for analysis. Second, we analyzed data from the Lifelines cohort. Lifelines is a multi-disciplinary prospective population-based cohort study examining in a unique three-generation design the health and health-related behaviors of 167,729 persons living in the North of The Netherlands. It employs a broad range of investigative procedures in assessing the biomedical, socio-demographic, behavioral, physical, and psychological factors which contribute to the health and disease of the general population, with a special focus on multimorbidity and complex genetics. The local ethics committee approved the research protocol, and informed consent was signed by every participant [19, 20]. At baseline, all subjects completed a self-administered questionnaire, amongst others on medical history, past and current diseases, use of medication, and quality of life. For the present study, we included 44,694 subjects of ≥ 50 years from whom data on HRQoL and hemoglobin level were available. Data about red blood cell transfusions were not available for Lifelines participants.

#### **Laboratory parameters**

In Lifelines, blood samples were collected in the morning after an overnight fast. The blood samples were placed at 4 °C and transported from the Lifelines research site to the



Lifelines laboratory, under tightly controlled and continuously monitored conditions. From the Lifelines laboratory, part of the samples were directly transferred to the central laboratory of the University Medical Center Groningen, to perform routine clinical chemistry assays on fresh samples. Hemoglobin, total leucocytes, and thrombocytes were measured using routine procedures on a XE2100-system (Sysmex, Japan). In EUMDS, a complete blood count was performed at entry of the study as part of routine clinical care in the local hospital.

# **Scoring of comorbidities**

In the EUMDS Registry, comorbidity was scored using the Hematopoietic Cell Transplantation-Comorbidity Index (HCT-CI) and the Myelodysplastic Syndrome-Comorbidity Index (MDS-CI). The HCT-CI was developed by Sorror et al. and comprises 17 groups of diseases [21, 22]. The MDS-CI was created using the five significant HCT-CI disease groups associated with non-leukemic deaths (cardiac disease (2 points), hepatic disease (1 point), pulmonary disease (1 point), renal disease (1 point), and solid tumor (1 point)) in a population of MDS patients. The final scores are low (0 points), intermediate (1 or 2 points), or high (3 or more points) [23]. Comorbidity index scores were generated based on information given by physicians in the EUMDS registry, and based on self-report combined with verified medication use (scored by ATC code) and laboratory data in the Lifelines cohort. Participants in the Lifelines cohort may suffer from a wide range of medical issues since only individuals with a limited life expectancy or severe psychiatric/ physical illness were excluded from participation [24]. The used definitions are listed in Table S1. Complete data were available for 15,784 Lifelines and 1157 EUMDS participants. Demographic characteristics between individuals with and without information available to generate the MDS-CI did not relevantly differ in both cohorts.

# Health-related quality of life

In EUMDS, HRQoL was measured by the EuroQol Five-Dimensional Questionnaire (EQ-5D-3L). The EQ-5D-3L is a commonly used, generic HRQoL questionnaire consisting of a descriptive part and a visual analogue scale (VAS). The descriptive part consists of five dimensions related to daily activities (mobility, self-care, usual activities, pain/discomfort, and anxiety/depression), with three response categories (no problems, moderate problems, or severe problems) [25]. These questions provide 243 possible health states from which an index score (generally ranging from 0–1) can be calculated [26]. The current analyses were performed using the UK value set [27]. In Lifelines, HRQoL was measured using the RAND 36-Item Health Survey (Dutch version of

the Short-Form 36 (SF-36) questionnaire). This generic questionnaire consists of 36 items in eight dimensions: physical functioning (10 items), physical role functioning (4 items), bodily pain (2 items), general health (5 items), vitality (4 items), social functioning (2 items), emotional role functioning (3 items), and mental health (5 items). Dimension scores (range 0–100) on the eight domains were generated [28]. A higher score reflects a better health status and well-being in both questionnaires. The SF-12 is a shortened version of the SF-36, including 12 of the 36 questions [29].

#### Conversion of SF-36 to EQ-5D

To enable comparisons between HRQoL measured in EUMDS and in Lifelines, the SF-36 data (and derived SF-12 data) were converted to EQ-5D data in two approaches. In the first approach, domain scores of the SF-36 questionnaire were converted into a preference-based EQ-5D index score following the mapping algorithm of Rowen et al. (random effects generalized least squares model 3) [30]. In the second approach, the multinomial response mapping algorithm developed by Gray et al. was used to estimate the probability of a score within one of the three response categories of the EQ-5D for each dimension based on the SF-12 results [31].

### **Statistical analysis**

Data were presented as mean (standard deviation), median (interquartile range), or percentage. We evaluated between-group differences using one-way ANOVA, Kruskal-Wallis test, or Chi-square test, as appropriate. Anemia was defined according to the WHO criteria as a hemoglobin level < 13.0 g/dL in men and < 12.0 g/dL in women [32]. Following best practice recommendations for observational studies [33], a simple causal diagram was derived by an expert panel of epidemiologists and clinical experts (authors) to explicitly present the prior assumptions based on literature in order to derive the causal effect of MDS on HRQoL [5]. The causal directed acyclic graph (DAG) for the study is presented in Fig. 1. Based on the causal DAG, confounders (i.e., common causes of (severity of) MDS and HRQoL) were selected prior to the analysis. Multivariable linear regression analyses (for the outcome EQ-5D index score) and logistic regression analyses (for the outcomes EQ-5D domains; problems (moderate or severe) versus no problems) were used to examine both the total and the anemia-independent impact of MDS on HRQoL. First, a crude (unadjusted) analysis for the association between MDS and HRQoL was performed (model 1). Model 2 was adjusted for the confounders age (50-60/61-75/ > 75 years), sex, comorbidity (MDS-CI



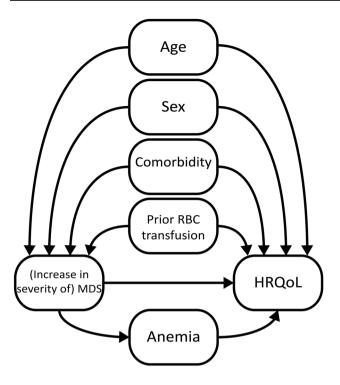


Fig. 1 Directed acyclic graph for the assessment of the total and anemia-independent impact of lower-risk myelodysplastic syndromes on health-related quality of life. This causal diagram encodes the prior assumptions on common causes of (increase in severity of) MDS and HRQoL as well as direct and indirect causal pathways from MDS to HRQoL. The four confounders may also influence anemia; the related arrows have been left out for simplified visualization but are fully considered in the analyses. HRQoL, health-related quality of life; MDS, myelodysplastic syndromes; RBC, red blood cell

low/intermediate/high), and prior RBC transfusions, in order to assess the total causal impact of MDS on HROoL. In model 3, we additionally controlled for the mediator anemia to assess the ("direct") causal impact of MDS on HRQoL that is not mediated via anemia. Lastly, in model 4 we added hemoglobin levels to the model. Participants were eligible for inclusion in the EUMDS registry when they had a low or intermediate-1 risk score according to the IPSS. From 2012, IPSS-R scores were retrospectively assigned by one of the investigators of the EUMDS registry and verified by an independent expert of the international IPSS working group of the MDS Foundation [4]. As sensitivity analysis, the analyses were repeated excluding individuals who were retrospectively classified as IPSS-R intermediate, high or very high risk (N=205), or who had an unknown IPSS-R (N = 142), and individuals who ever received a RBC transfusion (N = 313). Unstandardized regression coefficients and odds ratios are reported with 95% confidence intervals. All statistical tests were performed two-sided and a p-value < 0.05 was considered significant. Data were analyzed using IBM SPSS software, version 23.0.



#### Results

Relevant baseline characteristics for both anemic and non-anemic participants from the population-based Lifelines cohort and EUMDS cohort are shown in Table 1. Participants from the EUMDS cohort were significantly older, were more often male, and revealed a higher comorbidity burden compared with the Lifelines participants. Anemia was present in 89.2% of EUMDS participants in contrast to 2.9% in individuals of Lifelines. In both cohorts, anemic participants were older than non-anemic individuals, whereas in the Lifelines cohort, there was a higher percentage of anemic females. Anemic EUMDS participants had significantly lower mean hemoglobin levels than anemic Lifelines participants.

The EUMDS cohort was characterized by a mean EQ-5D index score of 0.74 ( $\pm$ 0.27), whereas the mean EQ-5D index score in the Lifelines cohort was 0.90 ( $\pm$ 0.10) (P<0.001) (Table S2). Likewise, a significantly larger percentage of EUMDS participants reported moderate to severe problems in all five EQ-5D dimensions compared to individuals from the Lifelines cohort (Fig. 2a). The most pronounced differences were observed in the dimensions mobility and usual activities. Smaller differences were observed in the dimensions self-care, pain/discomfort, and anxiety/depression.

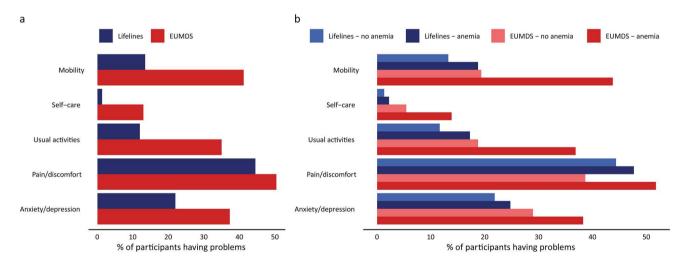
A lower EQ-5D index score as well as a larger percentage of individuals with moderate to severe problems was observed in females, at advanced age, and in individuals with an increased comorbidity burden in all five EQ-5D dimensions in both cohorts, except for the dimension anxiety/depression in the EUMDS cohort. In this dimension a larger proportion of problems was only observed in females compared to males and no significant differences related to age or comorbidity burden were present (Table S2), Furthermore, a significantly lower index score and a larger percentage of participants with moderate to severe problems in all five dimensions were detected in anemic participants as compared to non-anemic participants in both cohorts, being more pronounced in the EUMDS cohort (Fig. 2b and Table S2).

To assess the anemia-independent impact of MDS on HRQoL, univariable and multivariable linear and logistic regression analyses were performed. Univariable linear regression analysis demonstrated a significant negative association between MDS and EQ-5D index scores in the crude analysis (model 1, B = -0.16). MDS had an adjusted (causal) total impact on HRQoL (model 2, B = -0.12) and an anemia-independent "direct" impact (model 3, B = -0.11), independent of age, sex, comorbidity, and prior RBC transfusions. Since the hemoglobin levels differed significantly between anemic individuals

Table 1 Baseline characteristics of the Lifelines cohort and the EUMDS cohort

	Lifelines par	ticipants		EUMDS participants						
	Total cohort	Anemic individuals (N=1294)	Non-anemic individuals (N=43,400)	P value	Total cohort	Anemic individuals (N=1372)	Non-anemic individuals (N=166)	P value	P value	
Age				< 0.001				< 0.001	< 0.001	
50–60 years (%)	56.0	57.0	56.0		9.3	8.7	14.5			
61–75 years (%)	41.5	37.3	41.6		45.3	44.0	56.0			
>75 years (%)	2.5	5.7	2.4		45.4	47.3	29.5			
Male (%)	43.6	26.9	44.1	< 0.001	63.0	63.0	62.7	0.92	< 0.001	
Hemoglobin lev	el (g/dL)									
Male	$15.0\pm1.0$	$12.2 \pm 0.7$	$15.1 \pm 0.9$	< 0.001	$10.6 \pm 1.9$	$10.2 \pm 1.5$	$14.0 \pm 0.9$	< 0.001	< 0.001	
Female	$13.6 \pm 0.9$	$11.3 \pm 0.8$	$13.7 \pm 0.8$	< 0.001	$10.1 \pm 1.6$	$9.8 \pm 1.2$	$13.0 \pm 0.7$	< 0.001	< 0.001	
RBC transfusion (%)	NA	NA	NA	NA	20.4	22.6	1.8	< 0.001	NA	
MDS-CI <sup>a</sup> (%)				0.21				0.39	< 0.001	
Low	78.1	75.0	78.2		61.7	61.1	66.7			
Intermediate	20.2	23.3	20.1		32.9	33.3	30.0			
High	1.7	1.7	1.7		5.4	5.6	3.3			

Data are given as mean ± SD or percentage. <sup>a</sup>MDS-CI was available in 516 anemic Lifelines participants, in 15,268 non-anemic Lifelines participants, in 1037 anemic EUMDS participants and in 120 non-anemic EUMDS participants. *MDS-CI*, myelodysplastic syndromes comorbidity index; *NA*, not applicable; *RBC*, red blood cell; *SD*, standard deviation



**Fig. 2** Percentage of individuals with moderate to severe problems in the five EQ-5D dimensions according to cohort and presence of anemia. Panel **a** shows the percentage of individuals with moderate to severe problems in the five EQ-5D dimensions according to cohort

(EUMDS or Lifelines). Panel  ${\bf b}$  shows the percentage of individuals with moderate to severe problems in the five EQ-5D dimensions according to the presence of anemia in both cohorts

in both cohorts, in model 4, we additionally adjusted for hemoglobin levels, which did not change the impact as present in model 3 (model 4, B = -0.10) (Table 2). Our results indicated that the presence of MDS was associated

with a decrease of EQ-5D index score of 0.10 on a range of 0-1, independent of anemia.

Subsequently, logistic regression analysis was performed to assess the anemia-independent impact on the five EQ-5D



Table 2 The total and anemia-independent "direct" impact of lower-risk myelodysplastic syndromes and the impact of anemia on HRQoL (EQ-5D index score) based on univariable and multivariable linear regression analyses

EQ-5D index score																
	Model 1 (crude association)				Model 2 (total causal impact)			Model 3 ("direct" causal impact)				Model 4 ("direct" causal impact)				
	В	SE	β	P value	В	SE	β	P value	В	SE	β	P value	В	SE	β	P value
MDS (y/n)	-0.163	0.003	-0.259	< 0.001	-0.119	0.004	-0.243	< 0.001	-0.106	0.006	-0.215	< 0.001	-0.104	0.006	-0.212	< 0.001
Anemia (y/n)									-0.016	0.005	-0.038	< 0.001	-0.013	0.005	-0.031	0.012
Hemoglobin level (g/dL)													0.001	0.001	0.015	0.23
Age group																
50-60 years					Ref				Ref				Ref			
61-75 years					0.005	0.002	0.019	0.009	0.005	0.002	0.019	0.009	0.005	0.002	0.019	0.009
>75 years					0.037	0.005	-0.066	< 0.001	-0.036	0.005	-0.064	< 0.001	-0.036	0.005	-0.064	< 0.001
Sex (female)					-0.028	0.002	-0.112	< 0.001	-0.028	0.002	-0.110	< 0.001	-0.026	0.002	-0.104	< 0.001
MDS-CI																
Low					Ref				Ref				Ref			
Intermediate					-0.037	0.002	-0.121	< 0.001	-0.037	0.002	-0.120	< 0.001	-0.037	0.005	-0.121	< 0.001
High					-0.089	0.006	-0.100	< 0.001	-0.089	0.006	-0.100	< 0.001	-0.089	0.006	-0.100	< 0.001
RBC transfusion (y/n)					-0.077	0.008	-0.074	< 0.001	-0.075	0.008	-0.072	< 0.001	-0.073	0.009	-0.070	< 0.001

Model 1 was a crude analysis. Model 2 was adjusted for age (50–60 years, 61–75 years, or 75 years and older), sex, comorbidity (MDS-CI low, intermediate, high), and prior RBC transfusions. Model 3 was additionally adjusted for anemia. Model 4 was additionally adjusted for hemoglobin levels. Anemia was defined as a hemoglobin level < 13.0 g/dL in men and < 12.0 g/dL in women. B, unstandardized regression coefficient; β, standardized regression coefficient; MDS, myelodysplastic syndromes; MDS-CI, myelodysplastic syndromes comorbidity index; RBC, red blood cell; Ref, reference; SE, standard error

dimensions. In the univariable analysis (model 1), assessing the unadjusted association between MDS and HRQoL, MDS was strongly associated with decreased HRQoL in four dimensions (all except pain/discomfort). Multivariable regression revealed a significant total adjusted impact of MDS (model 2) in the dimension mobility, self-care, usual activities, and anxiety/depression. Furthermore, increasing age (>75 years), being female, having a higher MDS-CI, and prior RBC transfusion negatively impacted HRQoL. However, increasing age was associated with less problems in the dimension anxiety/depression. In model 3, we additionally controlled for the mediator anemia, to assess the "direct" causal impact of MDS on the HRQoL dimensions that is not mediated via anemia. An anemia-independent impact

of MDS was demonstrated in the same four dimensions; mobility, self-care, usual activities, and anxiety/depression. Additionally, controlling for hemoglobin levels (model 4) decreased the odds ratio's in the dimensions self-care and usual activities, whereas the odds ratios in the dimensions mobility and anxiety/depression were comparable. Anemia (model 4) had only a residual significant impact on HRQoL in the dimension mobility (Fig. 3 and Table S3). A higher hemoglobin level (per g/dL) was associated with a lower percentage of participants with moderate to severe problems in the dimensions self-care and usual activities. Sensitivity analysis restricted to individuals with IPSS-R (very) low risk and without RBC transfusions did not materially alter the described associations (Table S4).

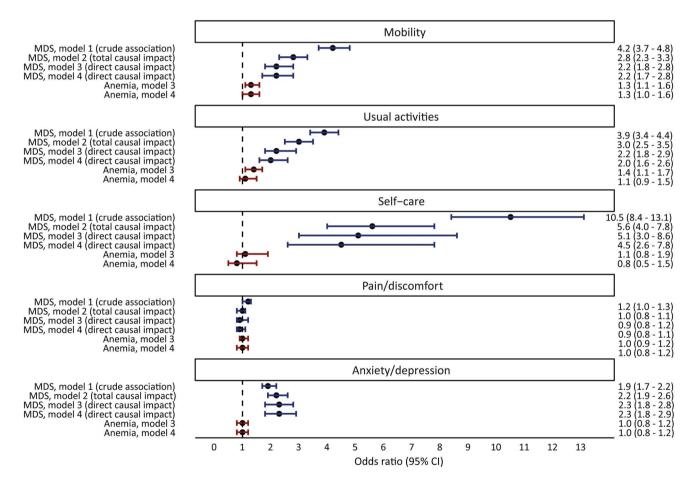


Fig. 3 Forest plot showing the total and anemia-independent impact of lower-risk myelodysplastic syndromes and the impact of anemia on health-related quality of life. Forest plots indicating the odds ratio (circles) and 95% confidence intervals (error bars) of having moderate to severe problems in the five dimensions of the EQ-5D as crude association between MDS and HRQoL (blue, model 1), total causal impact of MDS on HRQoL (blue, model 2), anemia-independent "direct" causal impact of MDS (blue, model 3 and 4), and impact

of anemia (red, model 3 and 4). Model 1 was an unadjusted (crude) analysis. Model 2 was adjusted for age (50–60 years, 61–75 years, or 75 years and older), sex, comorbidity (MDS-CI low, intermediate, high), and prior red blood cell transfusions. Model 3 was additionally adjusted for anemia. Model 4 was additionally adjusted for hemoglobin levels. CI, confidence interval; MDS, myelodysplastic syndromes

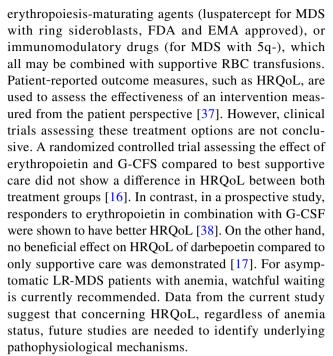


# Discussion

Combining data from a large number of newly diagnosed LR-MDS patients and a large general population-based cohort, we confirmed the negative impact of LR-MDS on HRQoL, which was particularly present in the dimension mobility, usual activities, self-care, and anxiety/depression. This study is the first to assess the anemia-independent impact of LR-MDS on HRQoL and demonstrates that the major part of the negative impact is not mediated via anemia. After correction for hemoglobin levels, only the dimension mobility was negatively affected by anemia. Previous studies focused on demonstrating the negative impact of MDS in general on HRQoL, while others assessed the impact of anemia and hemoglobin levels on HRQoL in MDS patients, with conflicting results [5, 12–15].

The anemia-independent negative impact of LR-MDS was mainly present in HRQoL dimensions which reflect capacities that are essential for living independently and maintaining social well-being, whereas there was no impact in the dimension pain/discomfort. Especially, the strong impact in the dimension self-care is clinically important, since problems in this dimension are rare in the general population. The impact shown in these dimensions is in line with the fact that fatigue is the most prevalent symptom of MDS [12, 13, 34] and is known to be significantly related to activities of daily living [35]. Additionally, patients with fatigue experience greater overall symptom burden, particularly loss of appetite, dyspnea, insomnia, and pain [13]. The impact of LR-MDS on anxiety/depression decreased when adjusted for age. This may be explained by the known inverse relationship between emotional distress and age in cancer patients. It has been hypothesized that older individuals might be cognitively and emotionally better prepared to accept illness [36].

The small residual impact of anemia in LR-MDS on HRQoL was present in the dimension mobility, whereas hemoglobin levels were associated with HRQoL dimensions self-care and usual activities. This is in line with the impact of anemia in older individuals from the general population, which is also mainly present in dimensions representing physical functioning [10]. It could be hypothesized that the relative effect of anemia on HRQoL might be smaller due to the frequent co-existing morbidities in older MDS patients. In current guidelines for symptomatic LR-MDS patients with anemia, treatment modalities which aim to increase hemoglobin levels are the first choice [1]. Treatment selection depends on the del(5q) status, the transfusion need, and serum EPO levels. Treatment options include erythropoiesis-stimulating agents, granulocyte-colony-stimulating factor (G-CSF),



In recent years, accumulating evidence has indicated that dysregulation of the immunological environment has an important role in the pathogenesis of MDS [39]. A recent meta-analysis demonstrated increased levels of TNF-α, IL-6, and IL-8 and decreased levels of IL-17 in individuals with MDS as compared to controls [40]. Several studies assessed the impact of inflammation on HRQoL/self-rated health in older individuals from the general population, showing in general a negative impact. Those studies included different biochemical markers of inflammation, e.g., pro-inflammatory cytokines (including IL-6 and TNF- $\alpha$ ) [41–43], acutephase proteins [42–44], or white blood cell counts [45]. In MDS, elevated levels of IL-6 and IL-1 receptor antagonist and TNF-α were associated with worse HRQoL [46]. Given the association between inflammation, anemia, and HRQoL, targeting systemic inflammation may be an encouraging therapeutic possibility [10, 47]. For example, treatment with lenalidomide, which modulates different components of the immune system including altering cytokine production [48], has been demonstrated to be associated with improved HRQoL [49–51]. However, it should be noted that improved HRQoL was associated with an increase in hemoglobin level. Other treatment modalities targeting the immune system are currently under study [52]. Furthermore, it has been demonstrated in older patients with hematological malignancies that individuals with malnutrition had more often inflammation (as measured by elevated CRP and low albumin) and suffered from impairments in mood, performance status, and fatigue [18]. Alternatively, the anemiaindependent impaired HRQoL in MDS patients could partly be explained by the knowledge of having a (pre-)malignant disorder [36, 53, 54], which is supported by the impact of



LR-MDS on the HRQoL dimension anxiety/depression, irrespective of anemia status.

The major strength of this first study assessing the anemia-independent impact of LR-MDS on HRQoL is the use of data from a large MDS registry and a large general population-based cohort. We were able to link data of two wellcharacterized study cohorts. Another strength is the explicit reporting of our causal assumptions via a causal diagram [33]. This helps to better understand the different components of causal pathways and potential biases. In addition, the huge confounding bias by age, sex, comorbidity, and prior RBC transfusions encoded in the causal diagram is made explicit in Fig. 3 by contrasting the crude (model 1) and confounder-adjusted (model 2) impact estimates. This causal logic supports the plausibility of our results.

Several limitations should be acknowledged. First, HRQoL was assessed using two different general HRQoL questionnaires. By the absence of a cohort including both individuals with MDS and individuals from the general population in which HRQoL was assessed using the same instrument and of whom medical data are available, we used published mapping algorithms to convert the Lifelines data into a summary EQ-5D index score and into scores for the five EQ-5D dimensions. As these mapping algorithms are not perfect, this may have led to measurement bias. On the other hand, the performance of the mapping algorithms is best in the range of EQ-5D index scores relevant for the Lifelines cohort. Absolute estimation errors in the model dataset of the mapping algorithms are smaller than the differences between the two cohorts in this study. Using these algorithms allowed not only the comparison of the overall HRQoL represented by the EQ-5D index but also comparison of mobility, self-care, usual activities, pain/discomfort, and anxiety/depression. A second limitation is that the assessment of comorbidities differed between the cohorts. In the EUMDS cohort, comorbidity was scored according to a physician's evaluation, whereas in the Lifelines cohort, MDS-CI was mainly based on (verified) medication use and self-reported disorders. Validation studies have shown substantial agreement between self-report questionnaires and medical record data [55–57], but over- or underestimation of the real prevalence cannot be excluded. Third, individuals with a RBC transfusion in the last 30 days were excluded to capture the unmasked impact of anemia, which may have led to selection bias. Fourth, since biochemical measurements associated with inflammation (e.g., CRP or ferritin) or with the type of anemia were only available in a minority of the participants, we were not able to study their relation with HROoL in the context of MDS. Fifth, as in all observational studies, residual confounding by unknown or unmeasured confounders or the presence of time-varying confounding may bias results [58]. Sixth, there may be additional confounders for the relation between anemia and HRQoL beyond the ones we have adjusted for, which may complicate the "direct" impact estimation. Seventh, there is an ongoing debate on the interpretation of total and "direct" causal impacts of disease characteristics, as changing those needs well-defined interventions. Therefore, our results should be interpreted with caution, merely indicating potential causal pathways that should not be overlooked when optimizing treatment of MDS. Finally, our study is restricted to LR-MDS and cannot be generalized to all subtypes of MDS.

In conclusion, this study presents the first large-scale assessment of the anemia-independent impact of LR-MDS on HRQoL. Our data indicate that the major part of the negative impact of LR-MDS on HRQoL, particularly in the dimensions mobility, usual activities, self-care, and anxiety/depression, is not mediated via anemia. Thus, the therapeutic focus should include treatment strategies directed at underlying pathogenic mechanisms to improve HRQoL, rather than aiming predominantly at increasing hemoglobin levels.

**Supplementary Information** The online version contains supplementary material available at https://doi.org/10.1007/s00277-021-04654-1.

Acknowledgements We would like to thank Donna Rowen for her contribution to this work. The authors wish to acknowledge the services of the Lifelines Cohort Study, the contributing research centers delivering data to Lifelines, and all the study participants. The authors would like to thank the other MDS-RIGHT partners, all EUMDS Steering Committee members, local investigators (Table \$5) and patients for their contribution to the EUMDS Registry; Corine van Marrewijk and the research group at Radboud University Medical Center, Nijmegen for administrative, logistical, and practical support in the MDS-RIGHT project and the EUMDS Registry.

Author contribution Hanneke J.C.M. Wouters, Annette Conrads-Frank, Karin A. Koinig, Uwe Siebert, Reinhard Stauder, and Melanie M. van der Klauw contributed to the study design. Hanneke J.C.M. Wouters performed the statistical analysis. All authors contributed to the interpretation of the data and analysis. Hanneke J.C.M. Wouters wrote the first draft and all authors edited the paper. All authors read and approved the final manuscript.

Funding The Lifelines Biobank initiative has been made possible by subsidy from the Dutch Ministry of Health, Welfare and Sport, the Dutch Ministry of Economic Affairs, the University Medical Center Groningen (UMCG the Netherlands), University Groningen, and the Northern Provinces of the Netherlands. This work is part of the MDS-RIGHT activities, which has received funding from the European Union's Horizon 2020 research and innovation program under grant agreement No 634789—"Providing the right care to the right patient with MyeloDysplastic Syndrome at the right time." The EUMDS Registry is supported by an educational grant from Novartis Pharmacy B.V. Oncology Europe, Amgen Limited, Celgene, and Janssen Pharmaceutica NV.

Availability of data and material Lifelines is a facility which allows data access for reproducibility of the study results. Questions regarding the data availability can be addressed to the Research Office of Lifelines, data@research@lifelines.nl.

Code availability Not applicable.



#### **Declarations**

**Ethics approval** This study was performed in line with the principles of the Declaration of Helsinki. The study has been approved by the local ethics committees.

Consent to participate Informed consent was obtained from all participants.

Consent for publication Not applicable.

Conflict of interest AS: research funding from Novartis, Cilag-Janssen and Boehringer Ingelheim. TdW: research funding from Amgen, Celgene, Janssen and Novartis, as project coordinator EUMDS. RS: research funding and honoraria from Celgene, Teva and Novartis. The remaining authors declare that they have no conflict of interest.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/.

# References

- Malcovati L, Hellstrom-Lindberg E, Bowen D et al (2013) Diagnosis and treatment of primary myelodysplastic syndromes in adults: recommendations from the European LeukemiaNet. Blood 122:2943–2964. https://doi.org/10.1182/blood-2013-03-492884
- Santini V (2015) Anemia as the main manifestation of myelodysplastic syndromes. Semin Hematol 52:348–356. https://doi.org/ 10.1053/j.seminhematol.2015.06.002
- Abel GA, Buckstein R (2016) Integrating frailty, comorbidity, and quality of life in the management of myelodysplastic syndromes. Am Soc Clin Oncol Educ Book 35:e337-344. https://doi.org/10. 1200/EDBK\_158639
- de Swart L, Smith A, Johnston TW et al (2015) Validation of the revised international prognostic scoring system (IPSS-R) in patients with lower-risk myelodysplastic syndromes: a report from the prospective European LeukaemiaNet MDS (EUMDS) registry. Br J Haematol 170:372–383, https://doi.org/10.1111/bjh.13450
- Stauder R, Yu G, Koinig KA et al (2018) Health-related quality of life in lower-risk MDS patients compared with age- and sex-matched reference populations: a European LeukemiaNet study. Leukemia 32:1380–1392. https://doi.org/10.1038/s41375-018-0089-x
- Greenberg P, Cox C, LeBeau MM et al (1997) International scoring system for evaluating prognosis in myelodysplastic syndromes. Blood 89:2079–2088
- Greenberg PL, Tuechler H, Schanz J et al (2012) Revised international prognostic scoring system for myelodysplastic syndromes. Blood 120:2454–2465. https://doi.org/10.1182/ blood-2012-03-420489

- Montalban-Bravo G, Garcia-Manero G (2018) Myelodysplastic syndromes: 2018 update on diagnosis, risk-stratification and management. Am J Hematol 93:129–147. https://doi.org/10.1002/ajh. 24930
- Rochau U, Stojkov I, Conrads-Frank A et al (2020) Development of a core outcome set for myelodysplastic syndromes - a Delphi study from the EUMDS Registry Group. Br J Haematol 191:405– 417. https://doi.org/10.1111/bjh.16654
- Wouters HJ, van der Klauw MM, de Witte T et al (2019) Association of anemia with health-related quality of life and survival: a large population-based cohort study. Haematologica 104:468–476. https://doi.org/10.3324/haematol.2018.195552
- Platzbecker U, Hofbauer LC, Ehninger G, Hölig K (2012) The clinical, quality of life, and economic consequences of chronic anemia and transfusion support in patients with myelodysplastic syndromes. Leuk Res 36:525–536. https://doi.org/10.1016/j. leukres.2012.01.006
- Steensma DP, Heptinstall KV, Johnson VM et al (2008) Common troublesome symptoms and their impact on quality of life in patients with myelodysplastic syndromes (MDS): results of a large internet-based survey. Leuk Res 32:691–698. https://doi.org/10.1016/j.leukres.2007.10.015
- 13. Efficace F, Gaidano G, Breccia M et al (2015) Prevalence, severity and correlates of fatigue in newly diagnosed patients with myelodysplastic syndromes. Br J Haematol 168:361–370. https://doi.org/10.1111/bjh.13138
- Oliva EN, Dimitrov BD, Benedetto F, D'Angelo A, Nobile F (2005) Hemoglobin level threshold for cardiac remodeling and quality of life in myelodysplastic syndrome. Leuk Res 29:1217– 1219. https://doi.org/10.1016/j.leukres.2005.03.004
- Jansen AJ, Essink-Bot ML, Beckers EA, Hop WC, Schipperus MR, Van Rhenen DJ (2003) Quality of life measurement in patients with transfusion-dependent myelodysplastic syndromes. Br J Haematol 121:270–274. https://doi.org/10.1046/j. 1365-2141.2003.04272.x
- Casadevall N, Durieux P, Dubois S et al (2004) Health, economic, and quality-of-life effects of erythropoietin and granulocyte colony-stimulating factor for the treatment of myelodysplastic syndromes: a randomized, controlled trial. Blood 104:321–327. https://doi.org/10.1182/blood-2003-07-2252
- Platzbecker U, Symeonidis A, Oliva EN et al (2017) A phase 3 randomized placebo-controlled trial of darbepoetin alfa in patients with anemia and lower-risk myelodysplastic syndromes. Leukemia 31:1944–1950. https://doi.org/10.1038/leu.2017.192
- Stauder R, Augschoell J, Hamaker ME, Koinig KA (2020) Malnutrition in older patients with hematological malignancies at initial diagnosis - association with impairments in health status, systemic inflammation and adverse outcome. Hemasphere 4(1):e332. https://doi.org/10.1097/HS9.00000000000000332
- Scholtens S, Smidt N, Swertz MA et al (2015) Cohort Profile: LifeLines, a three-generation cohort study and biobank. Int J Epidemiol 44:1172–1180. https://doi.org/10.1093/ije/dyu229
- Stolk RP, Rosmalen JG, Postma DS et al (2008) Universal risk factors for multifactorial diseases: LifeLines: a three-generation population-based study. Eur J Epidemiol 23:67–74. https://doi. org/10.1007/s10654-007-9204-4
- Sorror ML, Maris MB, Storb R et al (2005) Hematopoietic cell transplantation (HCT)-specific comorbidity index: a new tool for risk assessment before allogeneic HCT. Blood 106:2912– 2919. https://doi.org/10.1182/blood-2005-05-2004
- Sorror ML, Sandmaier BM, Storer BE et al (2007) Comorbidity and disease status based risk stratification of outcomes among patients with acute myeloid leukemia or myelodysplasia receiving allogeneic hematopoietic cell transplantation. J Clin Oncol 25:4246–4254. https://doi.org/10.1200/JCO.2006.09.7865



- Della Porta MG, Malcovati L, Strupp C et al (2010) Risk stratification based on both disease status and extra-hematologic comorbidities in patients with myelodysplastic syndrome. Haematologica 96:441–449. https://doi.org/10.3324/haematol.2010.033506
- Klijs B, Scholtens S, Mandemakers JJ, Snieder H, Stolk RP, Smidt N (2015) Representativeness of the LifeLines Cohort Study. PLoS ONE 10(9):e0137203. https://doi.org/10.1371/ journal.pone.0137203
- Brooks R (1996) EuroQol: the current state of play. Health Policy 37:53–72. https://doi.org/10.1016/0168-8510(96)00822-6
- Greiner W, Weijnen T, Nieuwenhuizen M et al (2003) A single European currency for EQ-5D health states. Results from a sixcountry study. Eur J Health Econ 4:222–231. https://doi.org/10. 1007/s10198-003-0182-5
- Dolan P (1997) Modeling Valuations for EuroQol Health States. Med Care 35:1095–1111. https://doi.org/10.1097/00005650-199711000-00002
- VanderZee KI, Sanderman R, Heyink JW, de Haes H (1996) Psychometric qualities of the RAND 36-Item Health Survey 1.0: a multidimensional measure of general health status. Int J Behav Med 3:104–122. https://doi.org/10.1207/s15327558ijbm0302\_2
- Ware J, Kosinski M, Keller SD (1996) A 12-item short-form health survey: construction of scales and preliminary tests of reliability and validity. Med Care 34:220–233. https://doi.org/10. 1097/00005650-199603000-00003
- Rowen D, Brazier J, Roberts J (2009) Mapping SF-36 onto the EQ-5D index: how reliable is the relationship? Health Qual Life Outcomes 7:27. https://doi.org/10.1186/1477-7525-7-27
- Gray AM, Rivero-Arias O, Clarke PM (2006) Estimating the association between SF-12 responses and EQ-5D utility values by response mapping. Med Decis Making 26:18–29. https://doi.org/10.1177/0272989X05284108
- Blanc B, Finch CA, Hallberg L et al (1968) Nutritional anaemias. Report of a WHO scientific group. World Health Organ Tech Rep Ser 405:5–37
- 33. Cox E, Martin BC, Van Staa T et al (2009) Good research practices for comparative effectiveness research: approaches to mitigate bias and confounding in the design of nonrandomized studies of treatment effects using secondary data sources: the international society for pharmacoeconomics and outcomes research good research practices for retrospective database analysis task force report–part II. Value Health 12:1053–1061. https://doi.org/10.1111/j.1524-4733.2009.00601.x
- Efficace F, Cottone F, Oswald LB et al (2020) The IPSS-R more accurately captures fatigue severity of newly diagnosed patients with myelodysplastic syndromes compared with the IPSS index. Leukemia 34:2451–2459. https://doi.org/10.1038/ s41375-020-0746-8
- Vestergaard S, Nayfield SG, Patel KV et al (2009) Fatigue in a representative population of older persons and its association with functional impairment, functional limitation, and disability. J Gerontol A Biol Sci Med Sci 64(1):76–82. https://doi.org/10.1093/ gerona/gln017
- Linden W, Vodermaier A, Mackenzie R, Greig D (2012) Anxiety and depression after cancer diagnosis: prevalence rates by cancer type, gender, and age. J Affect Disord 141:343–351. https://doi. org/10.1016/j.jad.2012.03.025
- Stauder R, Lambert J, Desruol-Allardin S et al (2020) Patient-reported outcome measures in studies of myelodysplastic syndromes and acute myeloid leukemia: literature review and land-scape analysis. Eur J Haematol 104:476–487. https://doi.org/10.1111/ejh.13389
- Hellström-Lindberg E, Gulbrandsen N, Lindberg G et al (2003) A validated decision model for treating the anaemia of myelodysplastic syndromes with erythropoietin + granulocyte

- colony-stimulating factor: significant effects on quality of life. Br J Haematol 120:1037–1046. https://doi.org/10.1046/j.1365-2141. 2003.04153.x
- Banerjee T, Calvi LM, Becker MW, Liesveld JL (2019) Flaming and fanning: the spectrum of inflammatory influences in myelodysplastic syndromes. Blood Rev 36:57–69. https://doi.org/10. 1016/j.blre.2019.04.004
- Shi X, Zheng Y, Xu L, Cao C, Dong B, Chen X (2019) The inflammatory cytokine profile of myelodysplastic syndromes: a meta-analysis. Medicine (Baltimore) 98(22):e15844. https://doi. org/10.1097/MD.0000000000015844
- 41. Cohen HJ, Pieper CF, Harris T, Rao KM, Currie MS (1997) The association of plasma IL-6 levels with functional disability in community-dwelling elderly. J Gerontol A Biol Sci Med Sci 52:M201-208. https://doi.org/10.1093/gerona/52a.4.m201
- Christian LM, Glaser R, Porter K, Malarkey WB, Beversdorf D, Kiecolt-Glaser JK (2011) Poorer self-rated health is associated with elevated inflammatory markers among older adults. Psychoneuroendocrinology 36:1495–1504. https://doi.org/10.1016/j. psyneuen.2011.04.003
- Tait JL, Duckham RL, Milte CM, Main LC, Daly RM (2019) Associations between inflammatory and neurological markers with quality of life and well-being in older adults. Exp Gerontol 125:110662. https://doi.org/10.1016/j.exger.2019.110662
- Nowakowski AC (2014) Chronic inflammation and quality of life in older adults: a cross-sectional study using biomarkers to predict emotional and relational outcomes. Health Qual Life Outcomes 12:141. https://doi.org/10.1186/s12955-014-0141-0
- Jylhä M, Volpato S, Guralnik JM (2006) Self-rated health showed a graded association with frequently used biomarkers in a large population sample. J Clin Epidemiol 59:465–471. https://doi.org/ 10.1016/j.jclinepi.2005.12.004
- Meyers CA, Albitar M, Estey E (2005) Cognitive impairment, fatigue, and cytokine levels in patients with acute myelogenous leukemia or myelodysplastic syndrome. Cancer 104:788–793. https://doi.org/10.1002/cncr.21234
- Cluzeau T, McGraw KL, Irvine B et al (2017) Pro-inflammatory proteins S100A9 and tumor necrosis factor-α suppress erythropoietin elaboration in myelodysplastic syndromes. Haematologica 102:2015–2020. https://doi.org/10.3324/haematol.2016.158857
- 48. Kotla V, Goel S, Nischal S et al (2009) Mechanism of action of lenalidomide in hematological malignancies. J Hematol Oncol 2:36. https://doi.org/10.1186/1756-8722-2-36
- 49. Santini V, Almeida A, Giagounidis A et al (2018) The effect of lenalidomide on health-related quality of life in patients with lower-risk non-del(5q) myelodysplastic syndromes: results from the MDS-005 study. Clin Lymphoma Myeloma Leuk 18:136-144. e7. https://doi.org/10.1186/1756-8722-2-36
- Revicki DA, Brandenburg NA, Muus P, Yu R, Knight R, Fenaux P (2013) Health-related quality of life outcomes of lenalidomide in transfusion-dependent patients with Low- or Intermediate-1-risk myelodysplastic syndromes with a chromosome 5q deletion: results from a randomized clinical trial. Leuk Res 37:259–265. https://doi.org/10.1016/j.leukres.2012.11.017
- Fenaux P, Giagounidis A, Selleslag D et al (2011) A randomized phase 3 study of lenalidomide versus placebo in RBC transfusiondependent patients with Low-/Intermediate-1-risk myelodysplastic syndromes with del5q. Blood 118:3765–3776. https://doi.org/ 10.1182/blood-2011-01-330126
- Ivy KS, Brent Ferrell Jr P (2018) Disordered immune regulation and its therapeutic targeting in myelodysplastic syndromes.
   Curr Hematol Malig Rep 13:244–255. https://doi.org/10.1007/s11899-018-0463-9
- 53. Schwartz RM, Ornstein KA, Liu B, Alpert N, Bevilacqua KG, Taioli E (2019) Change in quality of life after a cancer diagnosis among a nationally representative cohort of older adults in the



- US. Cancer Invest 37:299–310. https://doi.org/10.1080/07357907. 2019.1645160
- Reeve BB, Potosky AL, Smith AW et al (2009) Impact of cancer on health-related quality of life of older Americans. J Natl Cancer Inst 101(12):860–868. https://doi.org/10.1093/jnci/djp123
- Haapanen N, Miilunpalo S, Pasanen M, Oja P, Vuori I (1997)
   Agreement between questionnaire data and medical records of chronic diseases in middle-aged and elderly Finnish men and women. Am J Epidemiol 145:762–769. https://doi.org/10.1093/aje/145.8.762
- Bergmann MM, Calle EE, Mervis CA, Miracle-McMahill HL, Thun MJ, Heath CW (1998) Validity of self-reported cancers in a prospective cohort study in comparison with data from state cancer registries. Am J Epidemiol 147(6):556–562. https://doi. org/10.1093/oxfordjournals.aje.a009487
- 57. Okura Y, Urban LH, Mahoney DW, Jacobsen SJ, Rodeheffer RJ (2004) Agreement between self-report questionnaires and medical record data was substantial for diabetes, hypertension, myocardial infarction and stroke but not for heart failure. J Clin Epidemiol 57(10):1096–1103. https://doi.org/10.1016/j.jclinepi.2004.04.005
- Hernán MA, Robins JM (2020) CausalInference: What If. Chapman&Hall/CRC, BocaRaton

**Publisher's note** Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

