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Conditioning regimens are associated with distinct patterns of microbiota injury in allogeneic hematopoietic cell transplantation

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Abstract

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Purpose: The gut microbiota is subject to multiple insults in allogeneic-hematopoietic cell transplantation (allo-HCT) recipients. We hypothesized that preparative conditioning regimens contribute to microbiota perturbation in allo-HCT.

Experimental design: This was a retrospective study that evaluated the relationship between conditioning regimens exposure in 1,188 allo-HCT recipients and the gut microbiome. Stool samples collected from 20 days before transplantation up to 30 days after were profiled using 16S rRNA sequencing. Microbiota injury was quantified by changes in α -diversity.

Results: We identified distinct patterns of microbiota injury that varied by conditioning regimen. Diversity loss was graded into three levels of conditioning-associated microbiota injury (CMBI) in a multivariable model that included antibiotic exposures. High-intensity regimens, such as total body irradiation (TBI)-thiotepa-cyclophosphamide, were associated with the greatest injury loss (CMBI III). In contrast, the non-myeloablative regimen fludarabine-cyclophosphamide with low-dose TBI (Flu/Cy/TBI200) had a low-grade injury (CMBI I). The risk of acute graft-versus-host disease correlated with CMBI degree. Pre-transplant microbial compositions were best preserved with Flu/Cy/TBI200, whereas other regimens were associated with loss of commensal bacteria and expansion of *Enterococcus*.

Conclusions: Our findings support an interaction between conditioning at the regimen level and the extent of microbiota injury.

TRANSLATIONAL RELEVANCE

Conditioning regimens have unique patterns of microbiota injury that correlate with GVHD. We propose a novel scale for conditioning-associated microbiota injury. It offers a new axis for assessing conditioning regimens distinct from typical conditioning intensity classification. Our work identifies conditioning strategies that could potentially benefit from microbiota-directed interventions.

Keywords

Allogeneic hematopoietic cell transplantation; Conditioning; Microbiome; Microbiota injury; Graft-versus-host disease

INTRODUCTION

In allogeneic hematopoietic cell transplantation (allo-HCT) conditioning regimens facilitate engraftment and eradicate residual tumor cells. Conditioning regimens are classified into three intensity groups according to their ability to irreversibly ablate hematopoiesis: myeloablative (MAC), reduced intensity (RIC), and non-myeloablative (NMA).(1,2) Higher-intensity regimens are considered more toxic to the gastrointestinal tract and are associated with higher risk of graft-versus-host disease (GVHD).(3) While aggregation of conditioning regimens by intensity groups has proved clinically helpful,(1,2) conditioning drugs act through unique mechanisms and have distinct toxicity profiles. Furthermore, there is considerable intra-individual variability in toxicity patterns and clinical outcomes are incompletely accounted for by clinical features.(4)

Intestinal homeostasis is influenced by the intestinal microbiome and the neighboring mucosal tissue, as well as the interaction of microbe-derived factors with host cell populations.(5–8) In allo-HCT, the gut mucosa is inflamed and the microbiome markedly altered;(9–11) antibiotic exposures partially account for these microbial shifts.(12–16) Chemotherapy and radiation may also affect the microbiome,(17,18) but have not been extensively studied in allo-HCT. Furthermore, the microbiome may modulate the sensitivity and metabolism of these interventions.(19,20) In this observational study, we investigated the hypothesis that microbiota injury in allo-HCT is also dependent on conditioning regimens.

METHODS

Patients

Patients that received allo-HCT at Memorial Sloan Kettering Cancer Center between 2009-09-04 and 2019-12-26 were screened for inclusion. Patients were eligible if they had at least one stool sample collected between days –20 and +30. We excluded patients treated with uncommon conditioning regimens (n<40), those whose samples were collected at the time of a second or third allo-HCT for graft failure or a third allo-HCT, and those who received uncommon GVHD prophylaxis regimens (administered to <10 patients; Figure 1A). Conditioning regimens included were IV busulfan (pharmacokinetics-directed) 9.6 – 12.8 mg/kg, melphalan 140 mg/m², and fludarabine 125 mg/m² (**Bu4/Mel/Flu**); fludarabine 160 mg/m² and IV busulfan (pharmacokinetics-directed) 9.6 – 12.8 mg/kg (**Flu/Bu4**); total body irradiation (TBI) 1375 cGy, thiotepa 10 mg/kg, and cyclophosphamide 120 mg/kg (**TBI1375/Tt/Cy**); clofarabine 100mg/m², melphalan 140 mg/m², and thiotepa 10 mg/kg (**Clo/Tt/Mel**); fludarabine 150 mg/m², cyclophosphamide 50 mg/kg, thiotepa 10 mg/kg, and TBI 400 cGy (**Flu/Cy/Tt/TBI400**); melphalan 140 mg/m², thiotepa 5 mg/kg, and fludarabine 160 mg/m² (**Mel/Tt/Flu**); fludarabine 120 mg/m² and melphalan 140 mg/m² (**Flu/Mel**); fludarabine 125 mg/m², cyclophosphamide 50 mg/kg, and TBI 200 cGy (**Flu/Cy/TBI200**). Conditioning intensity was classified according to standard criteria (Figure 1B).^(1,2)

To validate the association between conditioning intensity and diversity loss, we included an additional cohort of allo-HCT recipients from Duke University Medical Center in Durham, North Carolina; the University Medical Center, University Hospital Regensburg, in Regensburg, Germany; and Hokkaido University Hospital in Sapporo, Japan. The cohort features were previously reported by Peled *et al.*(11)

Patients provided written consent to an IRB-approved biospecimen-collection protocol.

Stool samples and sequencing

Stool samples were processed by disruption of bacterial cell walls with silica bead-beating, isolation of nucleic acids, and amplifying and sequencing the genomic 16S ribosomal-RNA gene V4–V5 variable region on the Illumina MiSeq platform, as previously described. (11) Amplicon sequence variants (ASVs) were called using the DADA2 pipeline and mapped to the NCBI 16S rRNA sequence database using BLAST.(21) α - and β -diversity

were calculated with the Simpson reciprocal index and Bray-Curtis distances, respectively. Laboratory technicians ascertained stool consistency at the time of aliquoting.

The distances in Figure 2D were determined by applying multidimensional scaling (MDS) to the Bray-Curtis distance matrix. For each patient that had samples collected before conditioning, the earliest sample was selected for calculating per-regimen baseline centroids (based on the first two MDS components). Figure 1F shows the Euclidean distance between each patient's latest sample and the regimen centroid.

Statistical analysis

Descriptive statistics, including median and interquartile range [IQR] for continuous variables, and percentages for categorical variables, are provided. Acute GVHD was estimated using the cumulative incidence function, with death and relapse considered as competing events. A generalized estimating equation was constructed to assess correlations between clinical covariates, including the timing of sample collection and α diversity.

Modeling taxonomic abundance with multivariate models

In order to separate the association of the microbial community composition with conditioning regimens from the influence of the various patient variables, the data were modeled using Microbiome Multivariable Association with Linear Models (MaAsLin2). (22) In short, the dependency structure of the taxonomic composition within each patient was modeled by a patient-specific random effect. Covariates with fixed effects included conditioning regimens and time from HCT to sample collection. An alternative version of the model included additional covariates with fixed-effects – antibiotic exposures, diagnoses, GVHD-prophylaxis, previous allo-HCT, age, and graft type. Antibiotic exposure was encoded such that any sample collected the calendar day after the first dose of that antibiotic was considered exposed

MaAsLin2 was run with a minimum relative abundance threshold 2×10^{-3} (corresponding to the limit of detection given the inclusion criteria of a minimum 1000 reads per sample), and a prevalence abundance of features being present in greater than or equal to 5% of the samples. Taxa indicated by a “f_” prefix indicate that no annotation was available at the Genus level. The base linear model was used on the log-scaled abundances; continuous metadata was left un-standardized. The data were analyzed in two windows: day –10 to 0, and day 0–12; these windows represent the conditioning period and the post-transplant/GVHD prophylaxis period, respectively. Hits were considered significant if they had a Benjamini-Hochberg corrected p-value less than 0.05.

Some of the various computational tools that have been developed for determining microbial differential abundance between groups have been observed to produce different sets of results under certain circumstances. To validate the bivariate results of MaAsLin2, we also used Corncob,(23) ANCOM2,(24) ANCOM-BC,(25) and metagenomeSeq (Bioconductor package)(26–28) to assess the compositional data from this study under various statistical approaches. Of these tools, only MaAsLin2 and ANCOM2 natively support the analysis of repeated measures from the same subjects.

Healthy volunteers

Healthy volunteers who provided stool samples provided written informed consent according to a biospecimen-collection protocol approved by the Memorial Sloan Kettering Cancer Center Institutional Review Board.

Data Availability Statement

Data sharing requests can be e-mailed to the corresponding author.

RESULTS

Patients

Of 1,903 allo-HCT recipients, 1,188 met the inclusion criteria for this observational cohort; key among these criteria were that the patient received one a relatively common conditioning regimen and had an donated an evaluable fecal specimen between day –20 and +30 relative to transplantation (Figure 1A, Table 1). CD34-selected peripheral blood stem cells (PBSC) were the most common graft source (498 [41.9%]), followed by unmodified PBSC (428 [36.0%]). Population and transplantation features differed between the conditioning regimens (Figure S1, Table S1). Most patients with lymphoma and chronic lymphocytic leukemia were conditioned with fludarabine, cyclophosphamide, and total body irradiation (TBI) 200 cGY (Flu/Cy/TBI200),(29) the only NMA regimen. Busulfan, melphalan, and fludarabine (Bu4/Mel/Flu), a myeloablative regimen frequently used before infusion of CD34-selected grafts, was commonly administered in those with myeloid malignancies and myeloma. Recipients of CD34-selected transplants did not receive any additional agents for GVHD prophylaxis. Unmodified PBSC grafts and methotrexate-based GVHD prophylaxis were most common after fludarabine and busulfan at a myeloablative dose (Flu/Bu4), fludarabine and melphalan (Flu/Mel), and Flu/Cy/TBI200 conditioning. Exposure to non-prophylactic antibiotics (i.e., antibiotics initiated empirically, as for fever or a documented infection) between days 0 to 21 was highest with TBI1375.

Factors other than antibiotics contribute to changes in the microbiome of allo-HCT recipients

To characterize patterns of microbiota injury, we used 16S rRNA gene sequencing to analyze 7,682 stool samples (mean of 6.5 samples per patient) collected between days –20 to 30 (Figure S2). Alpha-diversity, a measure that reflects the number of unique bacteria present and their relative frequencies, was measured by the inverse Simpson index. Consistent with our previous studies,(11) α -diversity markedly decreased during allo-HCT; in particular the steepest decline was observed early in the treatment course, especially before day 0 (Figure 1C- black curve, Figure S2). The reduction was only partially explained by exposure to non-prophylactic antibiotics and any antibacterial antibiotics (Figure 1C, blue and purple curves). Among samples collected before graft infusion and not exposed to any type of bacterial antibiotics, diversity was lower in samples collected between days –5 to 0 (Figure 1C, purple line, period t2) than those collected between days –20 to –6 (Figure 1C, purple line, period t1, Figure 1D; $p<0.01$). Furthermore, in samples not exposed to antibacterial antibiotics, the similarity of the patient samples and healthy controls (measured as the

Bray-Curtis distance to the average of the healthy-volunteer samples) still increased over time (Figure 1E, $p < 0.001$). Therefore, additional factors besides antibiotics must be invoked to explain gut-microbiome disruption in allo-HCT recipients.

Conditioning regimen-associated microbiota injury

Stool consistency is a surrogate for microbiome composition.⁽³⁰⁾ The fraction of stool samples with liquid consistency (Figure 1F) correlated with conditioning intensity (MAC 72%, RIC 61%, NMA 27%, $p < 0.001$), suggesting microbiome injury is highest with myeloablative conditioning. Diversity declined over time in recipients of all three conditioning intensities (Figure 2A). However, the decrease was greatest in recipients of MAC, followed by RIC and NMA (Table S2). Notably, NMA was also associated with preservation of diversity compared to MAC in an external, previously reported⁽¹¹⁾ multicenter cohort ($n = 291$, Table S3). Therefore, conditioning intensity partially explains the variance in diversity trajectories among allo-HCT recipients.

We hypothesized that microbiota injury varies not only by conditioning intensity category but also between specific conditioning regimens. Patient samples followed a similar overall pattern of diversity reduction regardless of intensity (Figure 2B). However, diversity loss in samples collected shortly after graft infusion was most pronounced with TBI 1375 cGy, thiotepa, and cyclophosphamide (TBI1375/Tt/Cy) and fludarabine, cyclophosphamide, thiotepa, and TBI 400 cGy (Flu/Cy/Tt/TBI400) and lowest with Flu/Cy/TBI200 (Figure 2C).

We next asked whether conditioning regimens induce specific taxonomic changes in the fecal microbiome. Microbial composition shifted over time with all regimens, as measured by Bray-Curtis distance: compared to pre-conditioning samples, recipients of TBI135/Tt/Cy and clofarabine, melphalan, and thiotepa (Clo/Tt/Mel) exhibited the greatest magnitude of change, and recipients of Flu/Cy/TBI200 the least (Figure 2D). Nonetheless, the cumulative incidence of bacterial monodominance (defined as a relative-abundance threshold of any single ASV of $\geq 30\%$)⁽¹¹⁾ exceeded 80% by day 30, irrespective of the conditioning regimen (Figure S3). To explore the specific taxonomic changes that underpinned these shifts in global composition, we constructed a MaAslin2 multivariable linear model⁽²²⁾ in which the outcome variables were the changes in genus relative abundances and the exposure variables were time relative to transplantation and exposure to each of the conditioning regimens (Figure 2E). The red and blue circles in the figure indicate relative enrichment or depletion of taxa between day 0 and day 12, respectively; the size and intensity of the circles convey the magnitude of change and statistical significance, respectively. For example, a relative decline in *Blautia* abundance was associated with all the regimens except Flu/Cy/TBI200. Furthermore, Flu/Cy/TBI200 had a pattern distinct from the others with relative preservation of members of the Clostridia class, including *Anaerostipes* and *Ruminococcus*; an inverse relationship was seen with many of the other regimens and clostridia. To validate the bivariate results of MaAsLin2, we used additional modeling tools that rely on different statistical approaches (Figure S4).^(23–28) Overall, there was strong agreement between the methods.

In a similar MaAsLin2 model also taking into account antibiotic exposures, underlying disease, GVHD prophylaxis, and other clinical features, a preponderance of the significant

associations between taxa and clinical variables were observed for the antibiotic exposures. Oral vancomycin and piperacillin/tazobactam were associated with extensive taxonomic shifts, including a reduction in many of the commensal bacteria (Figure S5A). Nevertheless, conditioning-associated microbiome changes were still evident in the multivariable models, despite a correlation between conditioning regimens and antibiotic exposures (Figure S6). For instance, many taxonomic shifts were observed in the Flu/Cy/Tt/TBI400 regimen including the loss of *Blautia*, *Ruminococcus*, and other *Ruminococcaeae*. GVHD prophylaxis was associated with a significant reduction of *Clostridia*, including *Blautia*, *Anaerostipes*, *Dorea*, and *Drancourtella*. We therefore constructed an additional multivariable model separating GVHD prophylaxis to individual elements (Figure S5B). Methotrexate and cyclophosphamide, which were used in mutually exclusive fashion for GVHD prophylaxis (Figure S6), were both associated with *Clostridia* loss, although numerically a greater change was observed with methotrexate. In contrast, cyclosporine and mycophenolate mofetil were associated with minimal microbial changes. Notably, in analysis of individual antibiotic or conditioning drug exposure in the pre-infusion time window, antibiotic exposures had many strong associations (Figure S5C). Oral vancomycin was associated with the greatest shifts. Collectively, our findings support a differential association between conditioning regimens and microbiome composition.

Conditioning-associated microbiota injury grading

To provide a scale quantifying the degree of microbiota injury by regimen, we constructed a generalized estimating equation multivariable model for α -diversity and then manually grouped the resulting diversity-reduction coefficients into three levels of Conditioning-associated **M**icrobiome **I**njury (CMBI; Figure 2F, Table S4): low (CMBI I: Flu/Cy/TBI200), intermediate (CMBI II: Flu/Mel, Flu/Bu4, Mel/Tt/Flu [melphalan, thiotepa, and fludarabine]), and high (CMBI III: Flu/Cy/TBI400, Bu4/Mel/Flu, Clo/Tt/Mel, TBI1375/Tt/Cy). Notably, the myeloablative regimen Flu/Bu4(1,2) was associated with intermediate microbiota toxicity. Among recipients of unmanipulated grafts (i.e., excluding CD34-selected), regimens assigned to intermediate and high-grade CMBI had a higher risk of grade II-IV acute GVHD compared to low-grade MBI (Figure 2G). Altogether, our findings indicate that microbiota injury patterns are regimen-specific and can serve as a clinical biomarker.

DISCUSSION

This observational study is the first to show regimen-specific relationships between individual conditioning regimens and fecal microbiome composition. Conditioning-associated changes in the microbiome were observed with global metrics of microbiome composition, such as α - and β -diversity, as well as the taxonomic level. Multivariable modeling illustrated that antibiotic exposures and GVHD prophylaxis also contribute to microbiome perturbations after HCT. Our results in cancer patients extend prior reports of interactions between non-antibiotic drugs and gut microbiome in healthy volunteers, inflammatory bowel disease, and *in vitro* analyses.(17,31,32)

Conditioning regimens are the backbone of allogeneic HCT. Conditioning intensity categories (1,2) reflect the tradeoff between the degree of tumor eradication and toxicity, both being greatest with myeloablative regimens and reduced with nonmyeloablative regimens. We propose microbiota injury as a new axis for evaluating conditioning regimens and provide a classification of commonly used regimens that summarizes their degree of microbiota toxicity, which may be relevant to clinical outcomes such as GVHD and immune reconstitution.(9,11,33–35) In contrast to intensity classification, which was based on expert opinion,(1,2,36) we used a data-driven approach to quantitate microbiota changes and define injury levels. We defined injury based on α -diversity since it is a measure associated with survival after allo-HCT.(11,37) Given this association, there are ongoing efforts to increase diversity in allo-HCT recipients.(38,39) Our results suggest that conditioning regimens categorized with high-grade CMBI may serve as the optimal candidates for such interventions.

Non-antibiotic drugs can influence growth of bacterial population.(17,31,32) Our observation that changes in microbial patterns are conditioning-regimen dependent could be explained by several potential mechanisms. First, there could be direct effects of chemotherapy or radiation on bacteria. Indeed, radiation and cyclophosphamide, which are both commonly used as part of the conditioning backbone, have been shown to induce microbial changes in mice.(18,19,40) Conditioning may also lead to bacterial changes indirectly. Chemotherapy and radiation damage the mucosal membrane and elements of the intestinal epithelium, such as Paneth cells that secrete antibacterial peptides.(41–44)

Isolating the impact of conditioning regimens on the microbiota is challenging since confounders such as antibiotics, GVHD prophylaxis, and nutrition also affect bacterial populations. Nonetheless, we observed associations between conditioning regimens and microbiome perturbation, even after accounting for antibiotic and GVHD prophylaxis drug exposures. There are additional observations from the literature supporting conditioning as a driver of microbiome shifts. Maier and colleagues demonstrated that non-antibiotic drugs, including chemotherapeutic drugs, have an inhibiting effect on bacterial growth *in-vitro*.(17) Others have shown that radiation and cyclophosphamide (both commonly used for conditioning) have an impact on the gut microbiome.(18,19,40,45) The multivariable models illustrate the profound impact of antibiotics on the microbiome. Specifically, oral vancomycin and IV piperacillin-tazobactam were associated with dramatic changes in the microbiome, including butyrate-producing members of the Clostridiaceae family. Our findings raise the possibility that antibiotic stewardship and rational selection of antibiotics could substantially mitigate microbiota injury in allo-HCT recipients, a hypothesis we are testing in a randomized trial ([NCT03078010](#)).

Our findings indicate that conditioning regimens contribute to microbiota injury in allo-HCT recipients. Notably, the degree of injury is not directly correlated to classical conditioning intensity levels. For instance, conditioning with fludarabine and busulfan at a myeloablative dose (Flu/Bu4) was associated with intermediate microbiota injury (CMBI II). Since conditioning regimens are modifiable, there may be a rationale to select less microbiome-disruptive regimens in certain patients, perhaps those at higher risk of GVHD or those with already injured microbiome composition at baseline. Finally, the microbiome injury index

could potentially be used for risk stratification in clinical trials studying microbiome-based interventions in HCT.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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Disclosure of Conflicts of Interest

Roni Shouval served as a consultant for Medexus and MyBiotics.

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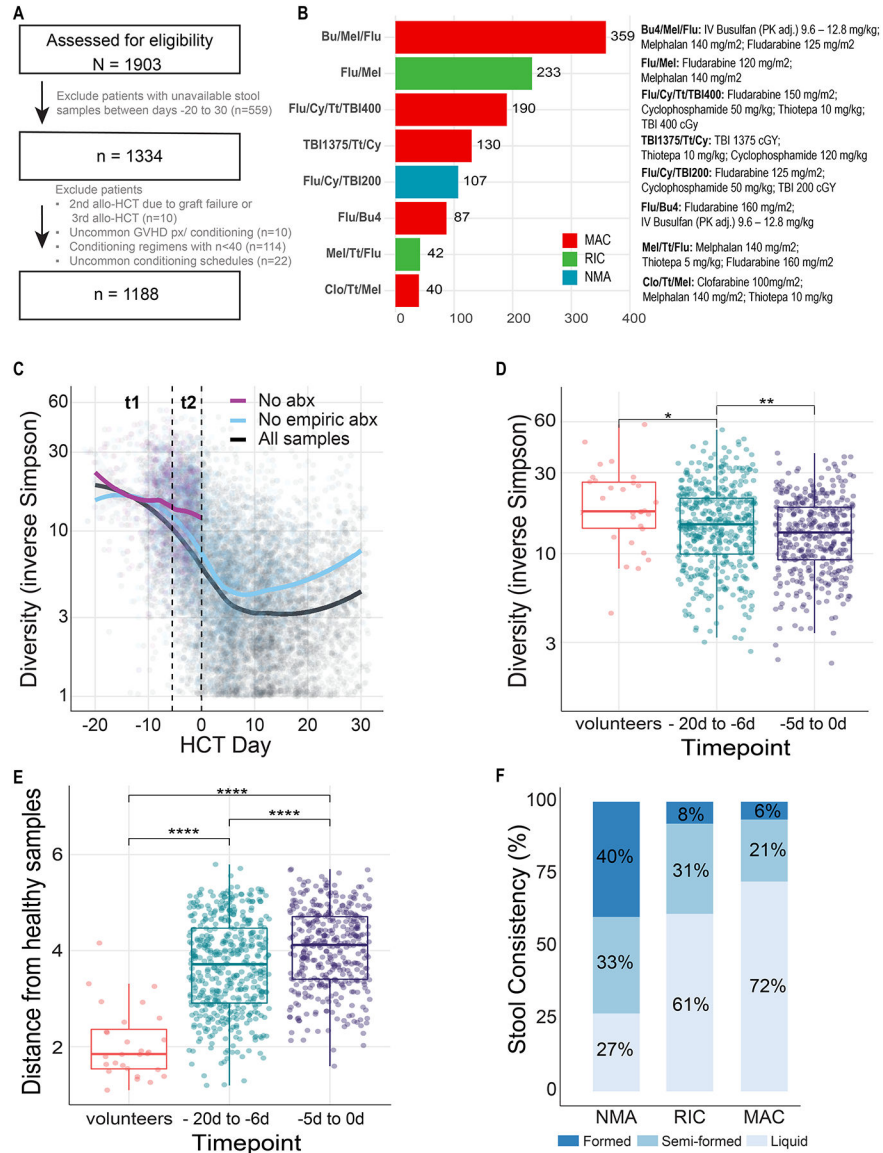
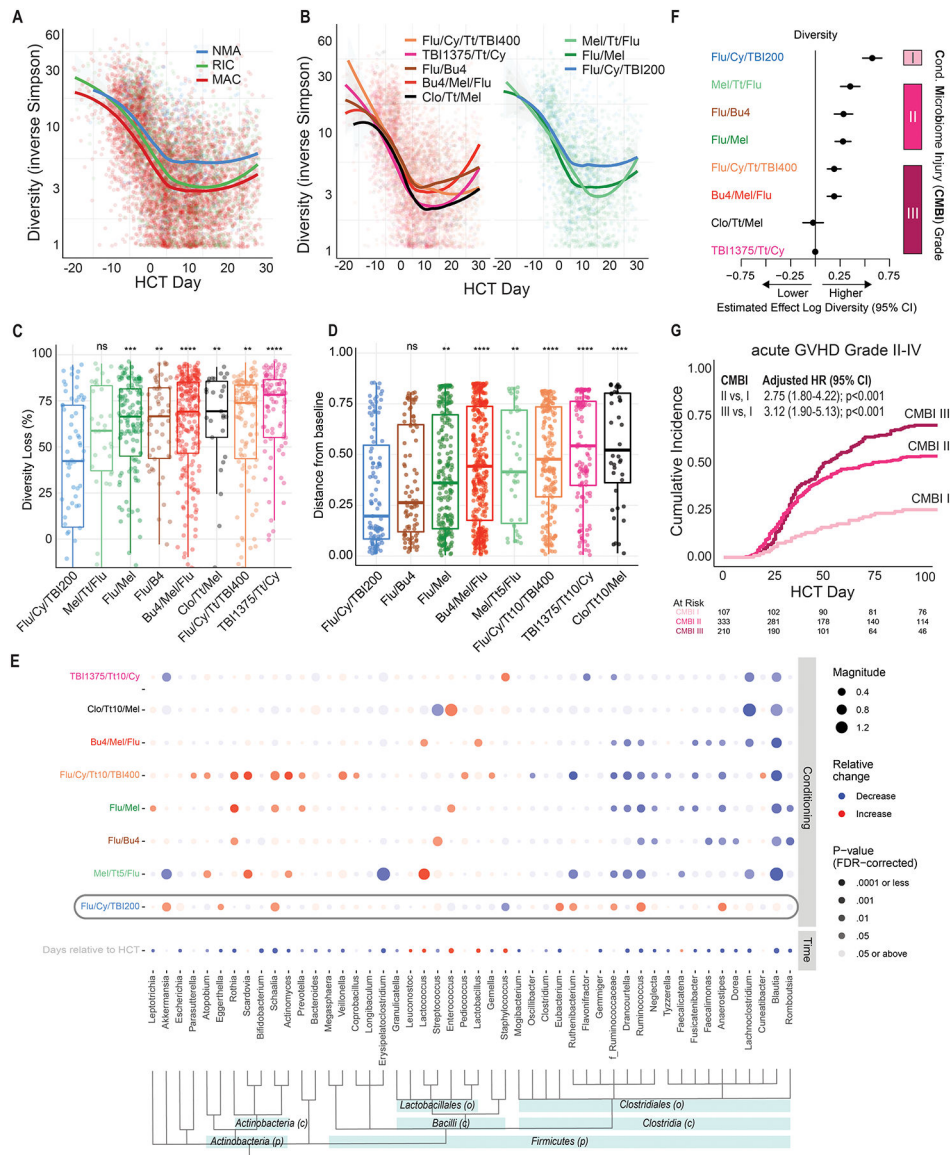


Figure 1. Fecal samples from 1,188 recipients of allo-HCT were analyzed. (A) CONSORT diagram for patient inclusion. The patients were conditioned with one of the eight regimens received by >40 patients with at least one stool sample collected between days -20 to 30. (B) Flu/Cy/TBI200 was the only nonmyeloablative (NMA) regimen. Flu/Mel and Mel/Tt/Flu were the reduced-intensity conditioning (RIC) regimens; the rest of the regimens were myeloablative (MAC). (C) Not all diversity loss can be attributed to antibiotic exposures. Each point is a stool sample whose α -diversity (as measured by 16S amplicon sequencing and the inverse Simpson index) is plotted over time relative to transplantation. Lines are smoothed average by the LOESS (locally estimated scatterplot smoothing) method, in which each data point (α -diversity measurement) is considered as an independent event. The black curve averages all samples, including those collected before or after any antibiotic exposure. The purple curve ignores any sample collected after exposure to any antibacterial antibiotic; as virtually all patients commenced prophylactic

antibiotics by day -2 or with the onset of neutropenia, the purple curve does not extend beyond day 0. The blue curve ignores any samples collected after exposure to non-prophylactic antibiotics, i.e., samples exposed to the prophylactic antibiotics ciprofloxacin and intravenous vancomycin are included in the blue smoothed average. Time bin $t1$ (day -20 to -6) and $t2$ (day -5 to 0) are indicated with dashed vertical lines. **(D)** Among samples from $n = 507$ patients whose samples were not exposed to any antibacterial antibiotics, α -diversity declines significantly between $t1$ and $t2$, indicating that not all diversity loss can be attributed to antibiotic exposures. $t1$ α -diversity is also significantly lower than those of healthy volunteers ($n = 30$). Only one stool sample per patient was considered in each time window. **(E)** Among samples from $n = 507$ patients whose samples were not exposed to any antibacterial antibiotics, microbiota composition is significantly different between $t1$ and $t2$, as measured by Bray-Curtis distance to a centroid of healthy volunteers ($n = 28$) compositions, indicating that not all composition changes can be attributed to antibiotic exposures. **(F)** Liquid stool samples ($n=957$), collected between days 0 to 10, were more commonly collected from recipients of more intense conditioning regimens, as assessed by laboratory technicians at the time of sample aliquoting. X-squared for all samples= 118.44, $df = 4$, p -value $< 2.2 \times 10^{-16}$.

* $p < 0.05$, ** $p < 0.01$, *** $p < 0.001$, **** $p < 0.0001$

Abbreviations: allo-HCT – allogeneic hematopoietic cell transplantation; MAC – myeloablative conditioning; RIC – reduced-intensity conditioning; NMA – nonmyeloablative conditioning; Abx – antibiotics.



distance matrix, between samples collected at days 0 and 12 was significantly increased in all conditioning regimens except Flu/Cy/TBI200. The greatest distance was in the myeloablative regimen Clo/Tt/Mel. (E) A multivariable MaAsLin2 model(22) adjusting for time of sampling and conditioning regimens reveals a differential association between microbial taxa and conditioning regimens. Bacteria are ordered by taxonomical ranking. ASVs that could not be classified to the genus level were analyzed at the family level, as indicated by f_Ruminococcaceae. Flu/Cy/TBI200, highlighted with a gray rounded rectangle, was associated with the preservation of members of the Clostridia class. (F) A grading scheme classifying regimens into three categories of microbiota injury (low [I], intermediate [II], and high [III]) based diversity reduction between days -20 to 30 was introduced. The estimated effect on diversity of each regimen was derived from a generalized estimating equation (Table S4) regression model, adjusting for time, age, sex, exposure to GVHD prophylaxis, antibiotics, and conditioning. (G) Patients who received unmodified grafts had a higher incidence of acute GVHD Grade II-IV with regimens categorized as having greater microbiota toxicity. CMBI hazard ratios are derived from a multivariable Cox-regression adjusting for age, sex, comorbidity burden, donor and HLA matching, and GVHD prophylaxis.

* p 0.05, ** p 0.01, *** p 0.001, **** p 0.0001

HCT – allogeneic hematopoietic cell transplantation; MAC – myeloablative conditioning; RIC – reduced-intensity conditioning; NMA – nonmyeloablative conditioning; CMBI – conditioning-associated microbiota injury; graft-versus-host disease (GVHD);

Table 1.

Population characteristics

		Overall	Missing
n		1188	
Sex (%)	Male	715 (60.2)	0
	Female	473 (39.8)	
Age (median [IQR])		57 [47, 64]	0
Disease (%)	Acute myeloid leukemia	418 (35.2)	0
	MDS or MPN	286 (24.1)	
	Lymphoma/CLL	231 (19.4)	
	ALL	110 (9.3)	
	Plasma cell neoplasm	111 (9.3)	
	Other leukemias	22 (1.9)	
	Non-malignant disorders	10 (0.8)	
	Previous Allo-HCT (%)	1st allo-HCT	1141 (96.0)
	2nd allo-HCT	47 (4.0)	
HCT-CI (median [IQR])		2 [1, 4]	2.1
HCT year (median [IQR])		2015 [2013, 2017]	0
Donor type (%)	Matched unrelated	534 (44.9)	0
	Matched related	307 (25.8)	
	Cord blood	174 (14.6)	
	Mismatched non-haploidentical	128 (10.8)	
	Haploidentical	45 (3.8)	
Graft source (%)	PBSC T-cell depleted	498 (41.9)	0
	PBSC unmodified	428 (36.0)	
	Cord blood	174 (14.6)	
	BM unmodified	88 (7.4)	
Conditioning intensity (%)	Ablative	806 (67.8)	0
	Reduced Intensity	275 (23.1)	
	Nonmyeloablative	107 (9.0)	
Conditioning regimens (%)	Bu4/Mel/Flu	359 (30.2)	0
	Flu/Mel	233 (19.6)	
	Flu/Cy/Tt/TBI400	190 (16.0)	
	TBI1375/Tt/Cy	130 (10.9)	
	Flu/Bu4	87 (7.3)	
	Flu/Cy/TBI200	107 (9.0)	
	Mel/Tt/Flu	42 (3.5)	
	Clo/Tt/Mel	40 (3.4)	
	GVHD prophylaxis (%)	none	498 (41.9)
	MTX-based	426 (35.9)	
	MMF-based	186 (15.7)	
	PTCy-based	78 (6.6)	

		Overall	Missing
Exposure to antibiotics * up to day 21 (%)	Exposed	804 (67.7)	0
	Not exposed	384 (32.3)	

* The frequency of antibiotic exposure considered any exposure to drugs commonly used in this cohort of treatment of neutropenic fever or for *C. difficile* diarrhea (oral vancomycin, imipenem-cilastatin, meropenem, piperacillin-tazobactam, clindamycin, and metronidazole) between the first days of conditioning and days 21 post-allo-HCT.

IQR - interquartile range; AML – acute myeloid leukemia; MDS – myelodysplastic syndrome; MPN – myeloproliferative neoplasm; CLL – chronic lymphocytic leukemia; ALL – acute lymphoblastic leukemia; Allo-HCT – allogeneic hematopoietic cell transplantation; HCT-CI - hematopoietic cell transplantation-specific comorbidity index; MTX – Methotrexate; MMF – mycophenolate mofetil; PTCy – post-transplantation Cyclophosphamide.

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