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OPEN Higher cyclosporine-A concentration increases the risk of relapse in AML following allogeneic stem cell transplantation from unrelated donors using anti-thymocyte globulin

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Cyclosporine-A (CsA) is used to prevent acute graft-versus-host disease (aGvHD). European Society for Blood and Marrow transplantation (EBMT) recommends a CsA target serum concentration of 200– 300 μ g/L during the first month after allogeneic hematopoietic stem cell transplantation (HSCT). With this study, we investigated whether a median CsA concentration > 200 μ g/L (CsA_{high}) the first month after HSCT, compared to \leq 200 μ g/L (CsA_{low}), increased the relapse risk of acute myloid leukemia (AML), using unrelated donors (URD) and antithymocyte globulin (ATG). Data was collected from 157 patients with AML, transplanted 2010–2016. The cumulative incidence of relapse (CIR) at 60 months was 50% in the CsA_{high} versus 32% in the CsA_{low} group (p = 0.016). In univariate analysis, CsA_{high} versus CsA_{low} (p = 0.028), 10-unit increase of CsA as a continuous variable (p = 0.017) and high risk disease (p = 0.003) were associated with higher CIR. The results remained after adjusting for disease risk. Death following relapse occurred more frequently in the CsA_{high} group (p = 0.0076). There were no significant differences in rates of aGvHD, chronic GvHD (cGvHD), EBV/CMV-infections or overall survival (OS) between the two groups. In conclusion, we found that a median CsA concentration > 200 μ g/L, the first month after HSCT, results in higher CIR of AML when combined with ATG.

Allogeneic hematopoietic stem cell transplantation (HSCT) is an effective treatment to prevent relapse for patients with acute myloid leukemia (AML). However, relapse remains the leading cause of death after HSCT¹⁻³. Graft-versus-host disease (GvHD) is a common complication after HSCT despite the use of prophylactic measures, and can potentially lead to additional morbidity^{4–7}, increased non-relapse mortality (NRM) and reduced overall survival (OS)^{8,9}.

Cyclosporine-A (CsA) is commonly used for the prevention of acute GvHD (aGvHD)¹⁰⁻¹⁴. Higher CsA concentrations, especially during the first month after transplant, including the period of engraftment, have been found to reduce the occurrence and severity of aGvHD^{10,14-17}. The European Society for Blood and Marrow transplantation (EBMT) recommends targeting of CsA serum concentration at 200–300 µg/L during the first month after HSCT as prophylaxis against aGvHD¹⁸. However, some studies have found a correlation between higher CsA concentration and relapse of hematological malignancies¹⁹⁻²². Antithymocyte globulin (ATG) is

¹Department of Hematology and Coagulation, Sahlgrenska University Hospital, Bruna stråket 5, plan 5, 413 45 Gothenburg, Sweden. ²Sahlgrenska Academy, Gothenburg University, Gothenburg, Sweden. ³Department of Hematology, Skane University Hospital, Lund, Sweden. ⁴Department of Hematology, Norrland University Hospital, Umeå, Sweden. [⊠]email: mikael.lisak@vgregion.se an immunosuppressive agent that prevents or alleviates GvHD, particulary reducing the incidence and severity of chronic GvHD (cGvHD)^{23–25}. Historically, ATG has mostly been used when involving unrelated donors (URD), but in recent years also with allografts from related donors (RD)^{24,26}. While ATG is frequently used as prophylaxis against cGvHD²⁷, there are conflicting evidence regarding its effect on relapse incidence, and there is no clear consensus on optimal dosage in different transplantation settings^{25,28–30}. Higher ATG dosages have been linked to increased relapse risk³¹, and therefore, there is concern that the T-cell depletion may impair the Graft-versus-Leukemia effect (GvL).

Nevertheless, CsA, often in combination with methotrexate (MTX) and ATG, is still considered a cornerstone drug for the prevention of aGvHD and graft rejection¹⁸.

To our knowledge, no study has specifically analyzed the impact of CsA exposure on the risk of AML relapse when combined with ATG. Therefore, the aim of this study was to investigate whether a higher level of CsA blood concentration during the first month after HSCT (> 200 μ g/L; CsA_{high} versus \leq 200 μ g/L; CsA_{low}), in combination with ATG, is associated with increased incidence of AML relapse.

Methods

Patients

This retrospective study recruited adult patients with AML allografted between 2010 and 2016 at three Swedish transplant centers (Sahlgrenska University Hospital, Gothenburg, Skåne University Hospital, Lund and Norrland University Hospital, Umeå).

The inclusion criterias were: (1) AML diagnosis, (2) age \geq 18 years, (3) HSCT with an URD between 2010 and 2016, (4) stem cell source being bone marrow or peripheral blood stem cells (PBSC), (5) reduced or myeloablative conditioning (RIC, MAC) and (6) ATG, MTX and CsA as GvHD prophylaxis.

The exclusion criterias were: (1) haploidentical donor, (2) cord blood cell transplant, (3) conditioning with total lymphoid irradiation, (4) pre-transplant alemtuzumab in conditioning or less than two months before HSCT, (5) mycophenolate (within 30 days post-HSCT) and (6) CsA treatment < 30 days.

The study was approved by the Ethic Review Board of Gothenburg ("Regionala etikprövningsnämnden i Göteborg") (Dnr 144-18), and for this retrospective study, informed consent was waived by "Regionala etikprövningsnämnden i Göteborg". All research was performed in accordance with relevant guidelines/regulations and in accordance with the Declaration of Helsinki.

Data collection

Clinical data were collected from medical records.

Immunosuppressive treatment

All patients received ATG (Thymoglobuline^{*} or ATG-Fresenius^{*}/Grafalon^{*}). In addition, a short course of intravenous MTX(2-4 daily doses, 16-45 mg/m², between day + 1 to + 11 post HST) was administrated as GvHD prevention to all patients (Table 1).

Cyclosporine

Initially, the patients routinely received CsA intravenously and later switched to oral formulation when tolerated. CsA was administered twice daily and dosage was adjusted to intended concentrations (usually between 150 and 250 μ g/L). During the hospitalization period, the trough whole blood CsA samples were collected daily, 12 h after the prior dose and immediately before the morning dose, both after intravenous and oral administration. See Supplementary 1 regarding methods to analyze CsA concentration. Markedly divergent concentrations were excluded. All CsA concentrations the first 30 days after HSCT were registered from which the median CsA concentration was calculated for each patient.

AML-relapse risk categorization

The risk of relapse at transplantion was categorized into low, intermediate or high risk according to a risk categorization manual (Supplementary 2) based on the Swedish National Guidelines for AML³². The risk was determined by using cytogenetics and mutational status, when available, as well as disease-related factors and treatment response.

Minimal residual disease (MRD) status was not included in the risk categorization due to lack of information about MRD in many patients at the time of this study. Though, for the patients with available pre-transplant MRD status, its influence on relapse risk was analyzed separately. In these cases, immunophenotyping was almost exclusively (92%) used to assess MRD, with the cut-off $\geq 0,1\%$ regarded as positive. In a few cases PCR (NPM1 mutation) was used to assess MRD.

Graft-versus-host disease

Acute GvHD was based on medical records and defined and graded according to the modified Glucksberg criteria³³. The National Institute of Health (NIH) Consensus Development Project 2014 guidelines were used to define and score cGvHD in each involved organ³⁴.

Graft-versus-host disease was registered according to the criteria, within the specified time period or until relapse, re-transplation or death.

Characteristic	CsA conc \leq 200 µg/L (n=87)	CsA conc > 200 µg/L (n = 70)	P value	
Age at alloSCT, median (range), years	56 (19–71)	51.5 (18-71)	0.26	
Female gender, n (%)	38 (44)	32 (46)	0.80	
HCT-CI score, n (%) [§]				
0-2	63 (72)	47 (68)	0.52	
3–5	23 (26)	20 (29)		
≥6	1(1)	2 (3)		
Disease risk group, n (%) [#]			·	
Intermediate	26 (30)	21 (30)	0.99	
High	61 (70)	49 (70)		
Disease stage at HSCT, n (%)#				
Non-CR	10 (11)	4 (6)	0.27	
Minimal residual disease at HSCT, n (%) [§]	ι		1	
Negative	38 (44)	27 (39)		
Positive	8 (9)	6 (9)	- 0.93	
Not done	40 (46)	37 (53)	0.52	
Stem cell source, n (%)		1		
BM	8 (9)	4 (6)		
PBSC	79 (91)	66 (94)	0.67	
HLA matching, n (%) [§]				
10/10	73 (84)	54 (77)		
≤9/10	13 (15)	16 (23)	- 0.22	
≤7/8	8 (9)	7 (10)	0.88	
Gender matching (patient/donor), n (%)				
Male/female	4 (5)	7 (10)		
All other combinations	83 (95)	63 (90)	0.22	
CMV-IgG (patient/donor), n (%)§				
Positive/negative	29 (34)	17 (25)	0.22	
Positive/positive	36 (42)	30 (43)	0.84	
Negative/positive	2 (2)	3 (4)	0.66	
Negative/negative	19 (22)	19 (28)	0.43	
Donor age, median (range), years	25 (18-54)*	27 (18–59)	0.24	
Creatinine clearence, n (%)			1	
eGFR [~] , median (range) (ml/min) day – 1 from HSCT	92 (56–154)	91.5 (64-129)	0.84	
eGFR [~] , median (range) (ml/min) day+21 from HSCT	74 (26–132)	78.5 (35–126)	0.26	
Conditioning, n (%)				
BIC				
Flu150-180 + Bu8/BuS 6.4 (n = 79) Flu150 + Treo42 (n = 5)	48 (55)	31 (44)		
MAC			0.18	
Cy120 + TBI 10-12 Gy (n=9) Cy100-120 + Bu16/BuS9.6-12.8 (n=34) Flu150-180 + Bu16/BuS9.6-12.8 (n=30)	39 (45)	39 (56)		
ATG, n (% of ATG)				
ATG-Fresenius [™] /Grafalon [™]	17 (20)	13 (19)	0.88	
30 mg/kg	2 (12)	1 (8)		
40 mg/kg	15 (88)	12 (92)	1.0	
Thymoglobulin™	70 (80)	57 (81)	0.88	
4–5 mg/kg	53 (76)	37 (65)		
6–8 mg/kg	17 (24)	20 (35)	0.18	
MTX, n (% of MTX)	1	1		
MTX median total dose (range) (mg/m ²)	35 (16-45)	35 (16-45)	0.003	
Median CsA concentration	ı			
CsA conc, median (range) (µg/L)	180 (140.5–200)	215 (200.5-260)	< 0.001	

Table 1. Background characteristics (n = 157). ~ eGFR measured with the Lund–Malmö revised (LMR) equation⁵³. *CsA* cyclosporine-A, *HCT-CI* hematopoietic cell transplantation comorbidity index, *CR* complete remission, *BM* bone marrow, *PBSC* peripheral blood stem cells, *CMV* cytomegalovirus, *eGFR* estimatied glomerular filtratrion rate, *RIC* reduced intensity conditioning, *MAC* myeloablative conditioning, *Flu* fludarabine, *Bu* busulfan (orally), *BuS* busulfan (intravenously), *Cy* cyclophosphamide, *Treo* treosulfan, *TBI* total body irradiation, anti-thymocyte globulinacute, *MTX* methotrexate. [§]Data missing for one patient. *Data missing for two patients. [#]Risk categorization according to Supplementary 1.

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Conditioning intensity

Reduced intensity and myeloablative conditioning w defined according to Bacigalupo et al.³⁵. Total Body Irradiation \geq 8 Gy fractionated and Busulfan > 8 mg/kg orally (Bu) or > 6,4 mg/kg intravenous (BuS) was regarded as MAC. Treosulfan-based conditioning was defined as RIC (non-myeloablative), when the total treosulfan dose was 30 g/m², and as MAC (toxicity-reduced) when the total dose was 42 g/m².

Study endpoints

The primary endpoint was the cumulative incidence of relapse (CIR) at 60 months after HSCT. Secondary endpoints were aGvHD (any grade, grade 2–4 and 3–4), cGvHD (any grade within 12 months and moderate/ severe cGvHD within 24 months post-HSCT), NRM, relapse-free survival (RFS), time to relapse (TTR) and OS.

Non-relapse mortality was defined as death without previous occurrence of relapse. RFS was defined as survival without occurrence of relapse or death of any cause. Time to relapse was defined as time to first evidence of relapse.

Statistical analysis

The median CsA concentration was used for analyses due to skew distribution of values. The Cyclosporine-A exposure was dichotomized by cut-off based on EBMT recommendation¹⁸; CsA_{high} > 200 µg/L and CsA_{low} \leq 200 µg/L. The Cyclosporine-A exposure was also analyzed by using concentration as a continuous variable and by sectioning the patients into quartiles (based on lowest to highest concentration). Baseline characteristics in the CsA_{high} and CsA_{low} groups were compared using Chi-square (or Fisher's Exact) test for categorical variables, Mann–Whitney U-test for ordinal data and if skewed distribution, or the Student's t-test for continuous and normally distributed variables.

The median follow-up time was estimated by the reverse Kaplan-Meier method^{36,37}.

Competing event analysis was used to assess CIR and NRM³⁸. The Fine-Gray subdistribution hazard model was used to estimate the incidence of outcomes over time in the presence of competing risks. Gray's test for subdistribution hazards has been used for comparing cumulative incidence functions^{39,40}. Death was labelled as competing event in the CIR analysis and in RFS, while death was censored in TTR. In the NRM analysis, relapse was the competing event. Logistic regression was used to compare effect of different quartiles of CsA concentration on secondary endpoints. Overall survival was analyzed with Kaplan–Meier and log-rank testing for group comparisons. Uni- and multivariate analyses were made with Cox regression. To analyze if there was an interaction effect between two predicting variables, a likelihood-ratio test was used comparing regression models with and without the interaction term. The non-linear effect of CsA concentration on relapse was modelled by a spline function in a flexible parametric survival model (Supplementary Fig. 1). Reference point 1.0 of CsA concentration for the hazard ratio was chosen to 140 µg/L. The stpm2 macro developed by Royston and Lambert was used for the analyses⁴¹. P-values less than 0.05 were considered significant. For most analyses concerning comparison of background characteristics, the SPSS version 24 (IBM* SPSS* Statistics, NY, USA) was used. The Kaplan–Meier calculations and cumulative incidence analyses were performed with Stata for Mac, version 17.0 (StataCorp*, TX, USA).

Results

After an initial screening of 233 patients with AML allografted between 2010 and 2016 at three Swedish transplantation centra, 157 fulfilled the inclusion criteria. Median age at HSCT was 54 years (range: 18–71) and 45% were females. Peripheral blood stem cells was the most common stem cell source (92%). Baseline characteristics were similar between the CsA_{high} and CsA_{low} group, see Table 1. Despite that the methotrexate median total dose and range were the same in the CsA_{high} and CsA_{low} group, the distribution was skew in the former group, resulting in a significant difference between the groups, see Table 1.

The median CsA concentration day 0–30 after HSCT amongst all patients was 198 (range: 140.5–260) μ g/L, and 180 (range: 140.5–200) versus 215 (range: 200.5–260) μ g/L, in the CsA_{low} and the CsA_{high} group respectively. The median follow-up time for all patients was 57.5 months (95% confidence interval [CI], 52.9–64.6).

Relapse

Sixty-two patients (39%) relapsed during the follow up period, 28 (32%), in the CsA_{low} group and 34 (49%) in the CsA_{high} group (p=0.037) (Table 2). The 60-month CIR was 50% (95% CI, 38– 62) in the CsA_{high} group compared to 32% (95% CI, 23–44) in the CsA_{low} group (p=0.016), see Fig. 1, and 40% (95% CI, 32–48) in the whole cohort.

Univariable analysis with Cox regression confirmed a higher incidence of relapse in the CsA_{high} versus CsA_{low} group [hazard ratio (HR), 1.77; 95% CI, 1.06–2.95 p = 0.028]. Additionally, when using CsA concentration as a continuous variable, every 10-unit increase of CsA concentration increased the risk of relapse (HR, 1.15; 95% CI, 1.02–1.28; p = 0.017).

Besides CsA concentration, high-risk disease was the only factor associated with increased 60-month CIR (HR, 2.84; 95% CI, 1.44–5.61; p = 0.003). The median CsA concentrations did not differ between the risk groups (intermediate risk:198.0 µg/L, high risk:198.3 µg/L). When adjusting for disease risk in multivariable analysis, relapse incidence remained higher in the CsA_{high} versus CsA_{low} group [hazard ratio (HR), 1.78; 95% CI, 1.07–2.96 p = 0.028] and so did every 10 unit-increase of CsA concentration (HR, 1.14; 95% CI, 1.02–1.20; p = 0.017).

A likelihood-ratio test showed no significant interaction between the median CsA concentration and disease risk (p = 0.25). Furthermore, MRD status was not significantly associated with relapse risk.

The median CsA concentration was lower amongst patients without relapse compared to those with relapse; 194 (range 140.5–235) μ g/L versus 202.5 (range 144.5–260) μ g/L (p = 0.019). The quartile of patients with the

Variable	CsA conc \leq 200 µg/L (n=87)	CsA conc >200 µg/L (n=70)	P value	
Acute GvHD, n (%)				
Any grade	53 (61)	37 (53)	0.31	
Grade 1	26 (30)	21 (30)		
Grade 2	20 (23)	14 (20)	0.69	
Grade 3	5 (6)	2 (3)		
Grade 4	2 (2)	0 (0)		
Grade 0–1	60 (69)	54 (77)	*	
Grade 2–4	27 (31)	16 (23)		
Grade 0–2	80 (92)	68 (97)	*	
Grade 3–4	7 (8)	2 (3)		
Chronic GvHD within 12 mos after HSCT, n (%)				
Any grade	51 (59)	45 (64)	*	
Chronic GvHD within 24 mos after HSCT, n (%)				
Moderate-severe	19 (22)	20 (29)	*	
CMV treatment within first yr after HSCT, n (%)				
Yes	31 (36)	27 (39)	0.83	
EBV treatment within first yr after HSCT, n (%)				
Yes	15 (17)	15 (21)	0.51	
Relapse, n (%)	28 (32)	34 (49)	*	
Death, n (%)	38 (44)	33 (47)	*	
Causes of death, n (% of deaths)				
Relapse	22 (58)	29 (88)	0.0076	
GvHD or related infections	4 (11)	2 (6)	0.69	
Infection	5 (13)	2 (6)	0.44	
Other	7 (18)	0 (0)	0.013	

Table 2. Results (n = 157). GvHD graft-versus-host disease, HSCT allogeneic stem cell transplantation, CMVcytomegalovirus, EBV Epstein-Barr-virus, CI confidence interval. *See in the chapter "Results".



Figure 1. The cumulative incidence of relapse (CIR) during the first 60 months post-HSCT, compared between CsA_{high} and CsA_{low} . Competing event is death.

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highest CsA concentrations (210–260 μ g/L), had an increased rate of relapse (HR, 2.05; 95% CI, 1.01–4.13; p=0.046) compared to the quartile with lowest concentrations (140.7–177.5 μ g/L).

To analyze the chosen CsA concentration cut-off at $200 \mu g/L$, a non-linear risk analysis was made confirming the cut-off being appropriate (Supplementary Fig. 1). Besides, the CsA exposure with mean concentration for each patient was analyzed (data not shown). In general, the results pointed in the same directions.

Acute and chronic GvHD

No significant difference was seen between the CsA_{high} versus CsA_{low} group in the rate (p=0.31) and severity of aGvHD; grade 2–4 [odds ratio (OR), 0.66; 95% CI, 0.32–1.35; p=0.26] and grade 3–4 (OR, 0.34; 95% CI, 0.07–1.67; p=0.18). Additionally, there was no difference in aGvHD grade 2–4 when the quartile of patients with highest CsA concentrations was compared to the quartile with lowest concentrations (HR, 0.44; 95% CI, 0.17–1.15; p=0.093). Neither did CsA_{high} and CsA_{low} differ in the rate of cGvHD; any grade within 12 months post-HSCT (OR, 1.27; 95% CI, 0.66–2.43; p=0.47) or moderate/severe cGvHD within 24 months post-HSCT (OR, 1.43; 95% CI, 0.69–2.96; p=0.33).

Reactivation of Epstein–Barr virus (EBV) and cytomegalovirus (CMV)

No differences were seen in the in incidence of clinical significant reactivations of EBV or CMV.

NRM, RFS, TTR and overall survival

The cumulative incidence of NRM was 12.5% at 60-months in the whole cohort, and 18.1% (95% CI, 10.9–29.3) in the CsA_{low} group compared to 5.8% (95% CI, 2.2–14.7) in the CsA_{hieh} group (p = 0.058), see Fig. 2.

The RFS at 60 months was 49.8% (95% CI, 37.3–61.1) versus 44.4% (95% CI, 32.2–55.9) in the CsA_{low} and CsA_{hieb} group, respectively (p=0.26), see Fig. 3.

Seventy-one patients (45%) died during follow up, without differences in death rates; 44% in the CsA_{low} and 47% in the CsA_{high} group. The 60-month OS for CsA_{high} was 55.6% (95% CI, 43.5–66.0) compared to 50.0% (95% CI, 36.9–61.7) in the CsA_{low} group (p=0.44), see Fig. 4. The OS for the whole cohort at 24 and 60 months was 65% (95% CI, 57–72) and 53% (95% CI, 44–61), respectively. Relapse was the most common cause of death, 51 of 71 deaths (72%), and was more frequent in the CsA_{high} compared to the CsA_{low} group; 88% versus 58% (p=0.0076). In the CsA_{low} group, seven patients died from other causes (glioblastoma n = 1, neuroendocrine tumor n = 1, intracranial hemorrhage n = 1, cardiovascular disease n = 1, idiopatic pneumonia syndrome n = 1, unknown n = 2).

Due to excess of deaths of other causes in the CsA_{low} group, a TTR analysis was made where patients with relapse-free deaths were censored as opposed to the calculations of RFS. The 60-month CIR (K-M; relapse-free deaths censored) for CsA_{high} was 51.6% (95% CI, 39.9–64.5) compared to 35.4% (95% CI, 24.7–49.0) in the CsA_{low} group (p = 0.026), see Supplementary Fig. 2.



Figure 2. The non-relapse mortality during the first 60 months post-HSCT, compared between CsA_{high} and CsA_{low} . Competing event is relapse.



Figure 3. The relapse-free survival during the first 60 months post-HSCT, compared between $\rm CsA_{high}$ and $\rm CsA_{low}$



Figure 4. The overall survival during the first 60 months post-HSCT, compared between CsA_{high} and CsA_{low}.

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Discussion

In this study, we found that median CsA concentration above 200 μ g/L, the first month after HSCT, resulted in higher incidence of AML relapse compared to lower concentrations when combined with ATG treatment. No significant differences between the compared groups were found in clinically relevant EBV/CMV reactivations, acute or chronic GvHD, NRM, RFS or OS.

Acute myeloid leukemia is the most common indication for $HSCT^{42}$, with the goal of preventing relapse and increase survival. Nevertheless, relapse, which often occurs within the first year after $HSCT^{43,44}$, is the leading cause of death^{1–3}. Factors that determine the risk of relapse include the disease characteristics at diagnosis,

treatment response and post-transplant immunosuppressive treatment after HSCT⁴⁵⁻⁴⁸. There is no consensus on whether CsA exposure interacts with ATG on the GvL-effect, and consequently the risk of relapse.

In the EBMT recommendation, no clear distinction in targeted CsA concentration is made concerning the use of parallell immunosuppressive drugs, e.g. ATG¹⁸, potentially hampering the GvL-effect.

A few prior studies have shown a correlation between high early CsA concentration and increased relapse incidence^{19,20,22,49}. To our knowledge, this is one of few studies of a uniform cohort, solely including AML-patients allografted with URD and T-cell depleted with ATG, analyzing the impact of early CsA exposure on relapse incidence.

In the study by Craddock et al.²², AML patients, only with RIC, were included and alemtuzumab was used as T-cell-depletion. A subanalysis showed that increased median CsA exposure in the first 21 days post-HSCT was associated with an increased risk of relapse and decreased OS. No association between the incidence of aGvHD and CsA concentration was found. These results, in a similar cohort of AML patients, also using T-cell depletion in the conditioning, are in line with the findings in our study.

Additionally, two randomized studies of patients with acute leukemia, one in children²⁰ and the other in adults¹⁹, without T-cell depletion, showed a correlation between higher CsA doses and increased relapse incidence. For the adult patients, a follow-up almost three decades later²¹, showed that the intended GvHD-protection was still offset by increased leukemia relapse, organ toxicity and shorter disease free survival. A majority of the prior studies analyzing the impact of CsA exposure have included a mix of hematological malignancies. As the GvL-effect and relapse tendency differs between diseases⁵⁰, a comparison of the relapse risk between different diagnoses can be challenging. The refined Disease Risk Index have been used in some studies to compare relapse risk between diagnoses, but was actually developed to stratify patients to predict OS and not relapse per se⁵¹.

In our study, there is no clear reason why RFS and OS did not differ significantly between the studied groups, even though CIR was higher and relapse-related death more frequent, in the CsA_{high} group. An explanation may be that death from non-relapse causes was more common in the CsA_{low} group (42% versus 12%; p = 0.001), reflected by the numerically (n.s.) increased incidence of NRM in that group. Seven deaths from "other" causes were seen in the CsA_{low} group, but none in the CsA_{high} . It cannot be stated that the distribution of these deaths was purely coincidental, but no obvious explanatory association to CsA exposure can be made. These deaths have possibly contributed to NRM, resulting in similar RFS and OS. This is supported by the difference in TTR, in which relapse-free deaths were censored.

In contrast to many other studies, the differences in aGvHD were numerical, but not significant. The relatively small number of patients and the fact that our study was not designed for GvHD as primary endpoint, may both have contributed to this lack of difference. Furthermore, the length of CsA treatment was not registered, potentially affecting the results. It could also be speculated that ATG^{25,29,52} had a prophylactic effect against aGvHD, hypothetically reducing and evening out differences in aGvHD rates, otherwise seen without the impact of ATG.

Our study has limitations. Firstly, the retrospective design increases the risk of both known and unknown confounding factors. Secondly, the assessment of CsA median concentration to evaluate the CsA exposure, may be considered a weakness. For instance, utilizing the area under the curve may yield a more precise measure of CsA exposure. The concentration cut-off was chosen from EBMT recommendations and the total median CsA concentration in our study. However, the study findings remained consistent regardless of whether CsA exposure was defined using the concentration cut-off at 200 μ g/L, quartiles or as a continuous variable. Additionally, post-hoc analysis of the non-linear effect of CsA concentration on relapse, revealed that the selected cut-off value was appropriate. Thirdly, we chose to study the impact of CsA exposure the first month after HSCT, but the treatment length and later CsA levels could potentially also have affected the reults. Finally, outcomes may have been affected by differences in methods and supportive care between the transplantation centres.

In conclusion, to our knowledge, this is one of few studies focusing on a uniform cohort exclusively consisting of AML patients, allografted with URD and T-cell depleted with ATG, analyzing the impact of early CsA exposure on the relapse incidence. EBMT guidelines recommends a CsA target concentration of 200–300 μ g/L during the first month after HSCT. However, we found that a blood CsA concentration above 200 μ g/L during the first month after HSCT results in a higher incidence of AML relapse compared to lower concentrations when combined with ATG treatment. Although this finding needs to be evaluated in trials with more numerous groups and other AML HSCT cohorts, it indicates that the currently recommended CsA concentration interval post-HSCT should be more differentiated.

Data availability

The dataset analysed during the current study is available from the corresponding author on reasonable request.

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Author contributions

M.L. designed the study, collected and assembled the data, performed statistical analysis and wrote the manuscript. M.N. helped designing the study, collected and assembled the data, performed statistical analysis and commented the manuscript. RP and SW collected the data and commented on the manuscript. M.H. supervised research, analyzed data, and commented on the manuscript. P.A., J.J., S.L. and C.I. commented on the manuscript. All authors reviewed the manuscript and approved submission of the manuscript for publication purposes.

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