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Prospective validation of a novel dosing scheme for intravenous busulfan in adult patients undergoing hematopoietic stem cell transplantation

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*These authors contributed equally to this work and should be considered co-first authors. **ABSTRACT** The objective of this study was to externally validate a new dosing scheme for busulfan. Thirty-seven adult patients who received busulfan as conditioning therapy for hematopoietic stem cell transplantation (HCT) participated in this prospective study. Patients were randomized to receive intravenous busulfan, either as the conventional dosage (3.2 mg/kg daily) or according to the new dosing scheme based on their actual body weight (ABW) (23×ABW^{0.5} mg daily) targeting an area under the concentration-time curve (AUC) of 5924 µM·min. Pharmacokinetic profiles were collected using a limited sampling strategy by randomly selecting 2 time points at 3.5, 5, 6, 7 or 22 hours after starting busulfan administration. Using an established population pharmacokinetic model with NONMEM software, busulfan concentrations at the available blood sampling times were predicted from dosage history and demographic data. The predicted and measured concentrations were compared by a visual predictive check (VPC). Maximum a posteriori Bayesian estimators were estimated to calculate the predicted AUC (AUC_{PRFD}). The accuracy and precision of the AUC_{PRED} values were assessed by calculating the mean prediction error (MPE) and root mean squared prediction error (RMSE), and compared with the target AUC of 5924 μ M·min. VPC showed that most data fell within the 95% prediction interval. MPE and RMSE of AUC_{PRED} were -5.8% and 20.6%, respectively, in the conventional dosing group and -2.1% and 14.0%, respectively, in the new dosing scheme group. These findings demonstrated the validity of a new dosing scheme for daily intravenous busulfan used as conditioning therapy for HCT.

INTRODUCTION

Hematopoietic stem cell transplantation (HCT) is an important therapy for nonmalignant and malignant hematologic diseases. Busulfan is an alkylating agent widely used in combination with other cytotoxic drugs as a myeloablative conditioning regimen for HCT [1-4]. Busulfan has a relatively narrow therapeutic window [5,6]. A large variability in the bioavailability of oral busulfan has

This is an Open Access article distributed under the terms of the Creative Commons Attribution Non-Commercial License, which permits unrestricted non-commercial use, distribution, and reproduction in any medium, provided the original work is properly cited. Copyright © Korean J Physiol Pharmacol, pISSN 1226-4512, eISSN 2093-3827 been previously reported [7] and, can lead to toxicity, including hepatic veno-occlusive disease [8,9] as well as graft rejection or suboptimal antitumor activity [10].

To avoid the inherent problems of an oral formulation and improve dosing accuracy, an intravenous (i.v.) formulation of busulfan was developed, which provides a more predictable pharmacokinetic profile and therapeutic efficacy than oral busulfan administration [11,12]. A once-daily i.v. busulfan dosing

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regimen is possible and would be much more convenient and tolerable for both patients and caregivers than a 4 times daily dosage. In addition, several studies have suggested that the oncedaily regimen is equally safe and effective, as compared with the 4 times daily administration [13-15]. The area under the concentration-time curve (AUC) of busulfan correlates with the clinical outcomes [16,17]. A population analysis has previously been applied to investigate the pharmacokinetic characteristics of i.v. busulfan, and a final model for clearance based only on the actual body weight (ABW) of the patient has been proposed [18].

While internal validation is based on basic or more advanced methods such as data splitting and/or resampling techniques [19], external validation is known to be the most stringent method for the evaluation of the predictive ability of a developed model; this approach requires the availability of an external study [20-22]. However, external validation studies are relatively rare and have only been reported for 24 of 360 population pharmacokinetic models (6.7%) and for 9 of 118 pharmacodynamic models (7.6%) [22]. There is limited information available currently in relation to the external validation of the population pharmacokinetic model for busulfan in adult patients.

The objective of this study was to evaluate a new, simpler dosing scheme based on ABW for once daily i.v. busulfan (Busulfex[®], Orphan Medical, Minnetonka, MN, USA) as conditioning therapy for HCT based on population approaches and using the external validation method. A limited sampling strategy was applied to minimize the number of blood samples required from each patient.

METHODS

Study design

This study was approved by the institutional review board (IRB) of the Asan Medical Center. Informed consent was confirmed by the IRB. Adult patients who received i.v. busulfan on the first day of conditioning therapy for HCT were eligible for study participation. No other chemotherapeutic drugs were allowed on that day. A Karnofsky performance score of 70 or higher and adequate cardiac, hepatic, and renal functions were required for study inclusion. Patients were randomly assigned to 1 of 2 types of dosage regimens: the once daily i.v. conventional dosing scheme (reference arm) or the population model based dosing scheme (test arm). We employed a block randomization method including stratification according to the conditioning regimen (busulfan-cyclophosphamide [BuCy] versus busulfan-fludarabine [BuFlu] versus busulfan-fludarabine antithymocyte globulin [BuFluATG]).

For the BuCy regimen, i.v. busulfan was administered on days -7 to -4 and cyclophosphamide (60 mg/kg/day) on days -3 and -2. The time between the last dose of busulfan and the

first dose of cyclophosphamide was 27 hours. For the BuFlu regimen, we administered i.v. busulfan for 4 days (days -7 to -4) and fludarabine (30 mg/kg) for 5 days (days -6 to -2). For the BuFluATG regimen, we administered i.v. busulfan for 2 days (days -7 and -6), fludarabine (30 mg/kg) for 6 days (days -7 to -2), and antithymocyte globulin. Patients received 1 of 2 types of antithymocyte globulin, according to availability in Korea. Specifically, rabbit antithymocyte globulin (Thymoglobulin[®], IMTIX-SANGSTAT, Lyon, France) given as 1.5 mg/kg/day on days -4 to -2 with a matched sibling donor; 3.0 mg/kg/day on days -4 to -2 with an unrelated donor; and 3.0 mg/kg/day on days -4 to -1 with a haplo-identical familial donor; or horse antithymocyte globulin (Lymphoglobulin[®], IMTIX-SANGSTAT, Lyon, France) given as 7.5 mg/kg/day on days -4 to -2 with a matched sibling donor; 15.0 mg/kg/day on days -4 to -2 with an unrelated donor; and 15.0 mg/kg/day on days -4 to -1 with a haplo-identical familial donor.

Busulfan dosing schemes

Patients from the reference arm received the conventional dosage of i.v. busulfan (3.2 mg/kg) over 3 hours once a day, and all doses of busulfan were calculated using: (1) ABW if this was less than or equal to the ideal body weight (IBW); (2) IBW if ABW was higher than IBW, but within 120% of IBW; or (3) "IBW+0.40×(ABW- IBW)" if ABW exceeded IBW by more than 120% [15]. IBW was calculated using the following equations, where height measured in inches and weight in kilograms: (1) IBW (men)=50+2.3×(height-60); or (2) IBW (women)=45+2.3×(height-60). For patients in the test arm, the dose of i.v. busulfan was calculated using the new dosage equation, based on the results of a population pharmacokinetic model of i.v. busulfan with the aim of achieving a target AUC using a single daily dose of i.v. busulfan (AUC_{Target}). The AUC_{Target} of 5924 μ M·min was set at a 4-fold the median AUC achieved by 4 times daily i.v. busulfan as reported by a previous study [15]. According to the population pharmacokinetic model for busulfan, the final covariate model of clearance (CL) was as follows:

CL=0.947×ABW^{0.5}

with CL given in liters per hour and ABW in kilograms [18]. Considering the AUC_{Target} of 5924 μ M·min and population pharmacokinetic clearance model for busulfan, patients in the test arm received the appropriate daily dose of 23×ABW^{0.5} mg over 3 hours once a day to achieve the daily AUC_{Target}. For both study groups, busulfan was diluted in normal saline to 0.5 mg/ mL and infused via a pump through a central venous catheter.

Pharmacokinetic sampling and analysis

A limited sampling strategy using 2 samples obtained at

different times was prospectively implemented during the first cycle of busulfan treatment. Blood samples (5 mL) were taken from all patients at 2 time points with the first busulfan dosing only. Two sampling times were assigned randomly at 3.5, 5, 6, 7 or 22 hours from the start of the 3-hour busulfan infusion. Block randomization, with stratification for the dosage formula and conditioning regimen, was used. Samples were taken from a central venous line using pre-chilled heparin tubes and plasma separation was performed within 60 minutes. Plasma was separated by centrifugation at 2,500 rpm for 10 minutes at 4°C within 1 hour, placed in cryogenic vials, and stored at -40° C. Plasma busulfan concentrations were measured using a validated liquid chromatography with tandem mass spectrometry (LC-MS/ MS), as previously described [18]. Using the percentage deviation of the mean from the true value and the coefficient of variation as measures of accuracy and precision, respectively, intra- and interday accuracies were determined to be 89.96% to 102.28% and 92.79% to 101.14%, respectively. Intra- and interday precision values were determined to be 4.41% to 14.70% and 0.90% to 7.48%, respectively, with five replicates at each concentration level.

Prediction performance measures

The predictive performance of the population model was assessed by calculating the mean prediction error (MPE) and the root mean squared prediction error (RMSE) as follows:

$$MPE(\%) = \frac{1}{N} \sum \left(\frac{PRED - OBS}{OBS} \times 100 \right)$$
$$SE(\%) = \sqrt{\frac{1}{N} \sum \left(\frac{PRED - OBS}{OBS} \times 100 \right)^2}$$

where PRED and OBS were the predicted and observed concentrations, respectively. The MPE describes the bias of the estimates, while the RMSE describes their imprecision.

Prediction of concentrations

Using the established final population pharmacokinetic model [18], predicted concentrations of busulfan were calculated for each patient at the available blood sampling times for the given dosage history and demographic data, including sex, age, and body weight. These predictions were obtained by entering the structural model parameters into NONMEM 6.2.0 (GloboMax LLC, Ellicott City, MD, USA) with typical values of pharmacokinetic parameters and no residual errors. The predicted concentrations were compared with the corresponding measured concentrations by calculating bias (MPE) and imprecision (RMSE). A visual predictive check (VPC) was executed using the Perl-speaks-NONMEM (PsN) [23] to evaluate the predictability of the population pharmacokinetic model for busulfan.

Prediction of AUC

The AUC for the daily busulfan dose was predicted for each patient. This predicted AUC (AUC_{PRED}) was calculated as follows:

AUC_{PRED}=Dose_i/CL_{Bayesian}

where $Dose_i$ was the individual daily amount of busulfan administered and $CL_{Bayesian}$ was the maximum *a posteriori* Bayesian estimate of clearance for the validation patient. NONMEM was used to calculate $CL_{Bayesian}$ using the available concentration measurements with the original population parameter estimates as priors. The prediction error of AUC was calculated for each AUC_{PRED} by comparing with the AUC_{Target} as follows:

Prediction error= $(AUC_{PRED} - AUC_{Target})/AUC_{Target} \times 100$

where AUC_{Target} was 5924 μ M·min. The accuracy and imprecision of AUC_{PRED} from the population model were assessed by calculation of MPE and RMSE. The variability of AUC_{PRED} was compared between the reference arm and the test arm using relative standard error (RSE).

RESULTS

Thirty-seven adult patients were enrolled and received i.v. busulfan on the first day of conditioning therapy for HCT. Patient characteristics are presented in Table 1 and these did not differ significantly between the reference and test arms. A total of 74 busulfan plasma concentrations were measured.

The VPC revealed that the 95% prediction interval of the busulfan concentrations predicted by the population pharmacokinetic model adequately included the observed concentration data (Fig. 1). The relationships between the measured and predicted busulfan concentrations at each sampling time for each patient were well described by a basic diagnostic plot (Fig. 2). The MPE and RMSE values relating to the busulfan concentrations in all of the patients

Table 1. Patient characteristics

	Reference arm	Test arm
Number of subjects	19	18
Age (y)	47.1 ± 12.9^{a}	45.7±14.9
Height (cm)	161.8±8.6	163.6±10.6
Body weight (kg)	61.1±12.0	59.3 ± 7.6
Sex (Male/Female)	8/11	10/8
Conditioning regimen		
Busulfan-fludarabine-ATG	14	13
Busulfan-cyclophosphamide	2	3
Busulfan-fludarabine	3	2

^aMean±SD.

ATG, antithymocyte globulin.



Fig. 1. Visual predictive check of the busulfan population pharmacokinetic model in the reference arm and the test arm. The simulated 95% prediction interval is shaded and observations (plasma busulfan concentrations in μ M) are depicted as circles and the solid line depicts the model predicted median.

included in this external validation study were 3.73% and 32.37%, respectively. Within the subgroup that received the conventional dosing scheme, the MPE and RMSE values were 9.58% and 33.49%, respectively, while in the subgroup that received the new dosing scheme, these values were -2.44% and 31.15%, respectively.

A box plot of the AUC_{PRED} in the validation group using the population model is shown in Fig. 3. The MPE and RMSE values of AUC_{PRED} in all of the included patients were -2.0% and 17.7%, respectively. Within the conventional dosing scheme subgroup, the RMSE of AUC_{PRED} was 20.6%, this value was 14.0% in the subgroup that received the new dosing scheme (Table 2). The AUC_{PRED} for the new dosage scheme showed less variability than for the conventional dosage scheme (RSE 14.0% vs 21.6%). The MPE of AUC_{PRED} was -5.8% for the conventional dosing scheme and -2.1% using the new dosing scheme.

DISCUSSION

We have prospectively validated a new dosing scheme for i.v. busulfan given prior to HCT using a limited sampling strategy that included two busulfan concentration-time points for each adult patient. The applicability of this new dosing scheme, based on a population pharmacokinetic model, was externally validated by evaluating its achievement of AUC_{Target} , while the validity of the population pharmacokinetic model was evaluated for its ability to predict plasma busulfan concentration.

The predictability of busulfan concentrations using a population pharmacokinetic model was evaluated by a simulation-based diagnostic. The VPC revealed the similarity between the measured concentration of busulfan and the simulated concentration. In accordance with these results, the population model was able to



Fig. 2. Predicted versus measured plasma busulfan concentrations in the external validation dataset. Open and closed circles represent values for the patients in the test arm and the reference arm, respectively. The dashed line represents the line of identity.

provide accurate and precise concentration predictions for all of the patients included in this external validation study.

Regarding the evaluation of busulfan AUC targeting performance, AUC_{PRED} of the test arm with the new dosing scheme showed less variability than that of the conventional dosage regimen (RSE 14.0% vs 21.6%). The optimal AUC range for the oral busulfan 4 times daily regimen in adults and adolescents is 900 to 1500 µM·min [8-10,24,25]. A study of 4 times daily i.v. busulfan indicated that 86.2% of patient AUC values were within this range [26]. In our study, an AUC of 5924 µM·min which is a 4 fold median AUC of 4 times daily busulfan, from the learning dataset used to develop the final model was targeted for the new once daily regimen of busulfan. A lower overall survival and progression-free survival at 3 years and an increased nonrelapse mortality at 100 days was reported among patients who received conventional once daily busulfan (3.2 mg/kg), where the busulfan AUC was above 6000 µM·min [17]. Our data showed that patients given conventional dosage had an average AUC values less than 6000 µM·min, while patients given the novel dosing scheme had an average AUC values greater than 6000 µM·min.

A limited sampling strategy based on a Bayesian methodology for i.v. busulfan was developed previously, showing that two samples collected at 2.25 and 6 hours from the start of a 2-hour infusion predicted the AUC with no significant bias and with good precision [27]. In the same study, it was suggested that acceptable estimation of AUC was possible using only one plasma concentration within the first hour post-infusion where sampling after 3 hours post-dosing is less informative. In this study, we could not guarantee the execution of time-fixed blood sampling in the institution, so the limited sampling strategy based on



Fig. 3. Box plot showing the distribution of the predicted area under the concentration time curve (AUC) in the reference arm and the test arm. The dashed line represents the target AUC of 5924 μ M·min.

Table 2. The predicted mean area under the concentration time curve (AUC_{PRED}) for the external validation dataset and its bias and imprecision

	Reference arm (n=19)	Test arm (n=18)
AUC _{PRED} (µM·min)		
Mean±SD	5580.7±1204.6	6046.3±841.9
RSE	21.6%	14.0%
Median	5543.0	6121.3
Min	3487.4	4321.0
Max	8492.3	7383.0
MPE	-5.8%	-2.1%
RMSE	20.6%	14.0%

SD, standard deviation; RSE, relative standard error; MPE, mean prediction error; RMSE, root mean squared prediction error. Target AUC=5924 μ M·min

randomly selecting two time points was adopted and our findings indicated that this approach may be sufficient for a reasonable population pharmacokinetic model prediction.

The principal limitation of this study is that the external validation dataset was based on a small and relatively uniform patient population in one of the largest tertiary care hospitals in Korea, so that the value of AUC_{Target} of this study was not in accord with the result of other study [28]. However we often see the concentrations from the same sample vary more than 20% by the reporting labs. Considering the variability of reported concentrations between assay labs, we decided to use concentrations measured by our in-house laboratory only. Another limitation of included the lack of information of clinical outcomes about toxicity and non-relapse mortality. Therefore, further investigation in a larger population that includes younger

patients to evaluate the clinical outcomes is warranted.

In conclusion, this randomized and prospective study demonstrated the validity of a population pharmacokinetic model for busulfan using an external validation method and supported the applicability of the new dosing scheme of busulfan for conditioning therapy for HCT based on a population pharmacokinetic model.

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CONFLICTS OF INTEREST

The authors declare no conflicts of interest.

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