There were significant differences in response and pharmacokinetic characteristics to the peginterferon α2a treatment among Chronic Hepatitis B (CHB) patients. The aim of this study is to identify factors which could significantly impact the peginterferon α2a pharmacokinetic characteristics in CHB patients. There were 208 blood samples collected from 178 patients who were considered as CHB and had been treated with peginterferon α2a followed by blood concentration measurement and other laboratory tests. The covariates such as demographic and clinical characteristics of the patients were retrieved from medical records. Nonlinear mixed-effects modeling method was used to develop the population pharmacokinetic model with NONMEM software. A population pharmacokinetic model for peginterferon α2a has been successfully developed which shows that distribution volume (V) was associated with body mass index (BMI), and drug clearance (CL) had a positive correlation with creatinine clearance (CCR). The final population pharmacokinetic model supports the use of BMI and CCR-adjusted dosing in hepatitis B virus patients.
female = 2) were retrieved from medical records. Laboratory results in records, such as serum creatinine (SCR, \(\mu\)mol/L), creatinine clearance (CCR, mL/min, estimated according to the Cockcroft-Gault formula\(^9\)), aspartate transaminase (AST, U/L), alanine transaminase (ALT, U/L) and disease grade [Disease, hepatitis (APRI \(\leq 2\) = 1, Compensated Cirrhosis (APRI > 2) = 2] have been tested in one week before blood samples were collected. A total of 178 patients with 208 observations were obtained for analysis and the demographic background of patients for modeling was listed in Table 1.

In order to identify the relationship of all the covariates, matrix diagram was performed by SPSS software (version 16.0, SPSS Inc., Chicago, IL, USA) and the result was shown in Fig. 1. Several significant were observed from the Fig. 1, such as AST and ALT, CCR and AGE, CCR and WT, GNDR and HT, BMI and WT, WT and HT, etc. These correlations indicated that related covariates may have interaction when adding them into the population model.

**Population pharmacokinetic model.** The scatter plot of drug concentration versus time has been presented in Fig. 2. Due to the sparse data, it is difficult to identify the one- or two-compartmental model from this plot. Based on the objective function value (OFV) changes, the one-compartmental model was selected as the basic model. The following equations were used to describe this model:

\[
\frac{dX_a}{dt} = -K_a \times X_a \quad [X_{a(0)} = \text{Dose}] 
\]

\[
\frac{dX}{dt} = K_4 \times X_4 - CL \times C \quad [X_{(0)} = 0] 
\]

\[
C = \frac{X}{V} 
\]

where \(X_a\) and \(X\) respectively represent the drug amount in absorption compartment and the central compartment. \(K_a\) represents the drug absorption rate constant from the dosing site. \(C\) represents the plasma drug concentration and \(V\) represents the distribution volume. \(X_{a(0)}\) and \(X_{(0)}\) respectively represent the initial drug amount in absorption and the central compartment.

After forward inclusion and backward elimination, BMI and CCR were included in the resulting population pharmacokinetic model, and the final model was described by the following equations (Equation 4–Equation 6).

\[
CL = 0.094 \times \left(\frac{\text{CCR}}{91.39}\right)^{0.31} \times e^{0.17} \quad \text{(L/h)} 
\]

\[
V = 15.6 \times \left(\frac{\text{BMI}}{23.41}\right)^{1.81} \times e^{0.54} \quad \text{(L)} 
\]

\[
K_a = 0.028 \times e^{0.17} \quad \text{(1/h)} 
\]
In equation 4, the 0.094 (L/h) is the typical value of the CL, and 91.39 (mL/min) is the mean value of CCR. The 0.31 is the estimated coefficient which represents the relationship between the CCR and CL. In equation 5, 15.6 (L) means the V for an individual with the mean value of BMI (23.41 kg/m²), and 1.81 is the exponent between them (V and BMI). 0.028 (1/h) was the population typical value of $K_e$ (equation 6), and no covariate had an effect.

**Figure 1.** Relationship of all the candidate covariates. BMI: body mass index (kg/m²), HT: height (cm), AGE: age (year), WT: body weight (kg), ALT: alanine transaminase (U/L), AST: aspartate transaminase (U/L), CCR: creatinine clearance (mL/min), SCR: serum creatinine (μmol/L), GNDR: gender (male = 1; female = 2), Disease: disease grade [hepatitis (APRI ≤ 2) = 1, compensated cirrhosis (APRI > 2) = 2].

**Figure 2.** Scatter plot of drug concentration versus time. Each dot represents a data point.
The final model is two-compartmental model. Our data set was sparse and random, and it could not support a pharmacokinetic model. To the best of our knowledge, this is the first work shows that CCR had this significant influence on it to a statistically significant extent in this population. The parameter estimates of final population pharmacokinetic model were listed in Table 2. All parameters were estimated with acceptable precision [relative standard error (RSE)] with the range from 14.75% to 28.58%, less than 30.00%.

### Model evaluation and validation

In order to assess the population pharmacokinetic model, the goodness-of-fit of basic and final models was displayed in Fig. 3 (basic model: 3A, 3B, 3C and 3D; final model: 3A', 3B', 3C' and 3D'). Figure 3A and 3A' verify the relationship between observation (dependent variable, DV) and individual prediction (IPRED). Compared with the Fig. 3A, a more precise relationship can be observed in Fig. 3A'. The scatter plots of DV versus prediction (PRED) were displayed in Fig. 3B and 3B', and PRED of final model agrees well with DV. The diagnostic plots of conditional weighted residuals (CWRES) versus PRED and TIME (time after dose) show that CWRES in 3C' and 3D' are closer to zero line than 3C and 3D, indicating the final model fits the observations better. Two covariates were retained in the final model. Figure 4 displays the distribution of η1 (IIV for CL) and η2 (IIV for V) for basic (η1basic and η2basic) and final (η1final and η2final) population models. As the covariates were incorporated into the model, the variance of IIV for CL and V has become smaller. This indicates that part of IIV could be explained by the enrolled covariates.

In addition, the bootstrap was also performed and the results were listed with the final estimates in Table 2. Our bootstrap analysis shows a successful rate of 94.6% (946 out of 1000 were successful in minimization). The 95% confidence interval (95% CI) of bootstrap analysis shows an acceptable robustness in the final population pharmacokinetic model. Peginterferon α2a visual predictive check (VPC) with the 90% prediction interval (90% PI) using the final population model overlaid with the actual original observations is shown in Fig. 5. The dashed lines are 5th and 95th percentiles and the solid lines are predicted 50th percentile. The area between the 5th and 95th percentiles represents the 90% PI. About 90% of the original value lies within the 90% PI. The VPC plot infers adequate predictive properties of the final population model.

### Discussion

We aimed to investigate factors that may influence the pharmacokinetics of peginterferon α2a in the patient with HBV. However, the collected concentration data from the patients were random and sparse. The nonlinear mixed-effects modeling method is suitable for analyzing this kind of data set. A population pharmacokinetic model was developed in this study. The final model is a one-compartmental open model with first-order absorption and exponential IIV on all the pharmacokinetic parameters. Our study verifies two major findings. First, the BMI-dependent increases in V. Second, CL decreases due to the decreases in CCR. The final population pharmacokinetic model supports the use of BMI and CCR-adjusted dosing in HBV patients. The data obtained from the sparse pharmacokinetic sampling may not contain enough information to estimate Kc accurately. Hence, the estimated RSE% of Kc (28.58%) was greater than CL (14.75%) and V (16.78%). Forward inclusion - backward elimination method was used to evaluate the effects of covariates, and no covariate was added into Kc.

Schwarz et al. has reported the pharmacokinetics of peginterferon α2a in children with chronic hepatitis C. The final model is two-compartmental model. Our data set was sparse and random, and it could not support multiple-compartmental model. According to the OFV reduction, one compartment model was the best choice for us. They also found the linear influence of body weight on the apparent volume of distribution in the central compartment. BMI is defined as the body mass divided by the square of the body height, and it attempts to quantify the amount of tissue mass, such as muscle, fat, and bone. After BMI introduced into the V of the basic model, the reduction in OFV was 27.25. The incorporation of GNDR causes the decrease of 22.34 and WT induces the decrease of 22.34 in OFV. After BMI incorporated into the V, other covariates, such as WT, GNDR etc. did not influence V significantly (reduction of OFV less than 3.84). We believed that BMI has closer relative to V and it was selected as the final covariate to modify the parameter V.

Measuring SCR is a simple test and it is the indicator of renal function. However, SCR level can be influenced by many factors, such as gender, body weight, and age. Compared with SCR, CCR is a more precise indicator. Cockcroft-Gault formula is a commonly used surrogate marker to estimate the CCR. This formula, in turn, estimates glomerular filtration rate in mL/min. Based on the OFV change, CCR was retained in the CL of the final pharmacokinetic model. To the best of our knowledge, this is the first work shows that CCR had this significant influence on it to a statistically significant extent in this population.

| Parameter (unit) | Estimate | RSE% | 95% CI | IIV (CV%) | Bootstrap |
|------------------|----------|------|--------|-----------|-----------|
| CL (L/h)         | 0.094    | 0.175| 0.067–0.121 | 29.5      | 0.094     | 0.083–0.105 |
| V (L)            | 15.60    | 0.288| 10.50–16.70 | 101.0     | 16.70     | 10.50–22.20 |
| Kc (1/h)         | 0.028    | 0.288| 0.30–0.44   | 64.0      | 0.033     | 0.014–0.065 |
| CCR-CL           | 0.31     | 0.417| 0.20–0.41   | 28.8      | 0.28      | 0.04–0.55   |
| BMI-V            | 1.81     | 0.671| 0.83–2.79   | 1.98      | 0.65–2.98 |

Table 2. The parameters of final population pharmacokinetic model. The range was calculated by the equation estimate ± 1.96 SE. The 2.5th and 97.5th percentile of the ranked bootstrap parameter estimates.
Part of this drug may be eliminated by the kidney. Nevertheless, this needs to be further investigated.

Jen et al. has reported the population pharmacokinetic analysis of peginterferon α2b. They concluded that body weight had a modest positive effect on the clearance\textsuperscript{13}. Xu et al. also developed the population pharmacokinetics of peginterferon α2b in pediatric patients with chronic hepatitis C, and the final model indicating age-dependent increases in clearance and volume of distribution\textsuperscript{14}. Peginterferon α2a (40-kDa peg conjugated to interferon α2a) and peginterferon α2b (12-kDa linear peg moiety conjugated to interferon α2b) have different

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**Figure 3.** Goodness-of-fit of basic (A,B,C and D) and final (A',B',C' and D') models. DV: dependent variable (observation); IPRED: individual prediction; PRED: prediction; CWRES: conditional weighted residuals. Solid lines represent identity lines and dashed lines mean zero lines. (A and A'): observation versus individual predictions; (B and B'): observation versus predictions; (C and C'): conditional weighted residuals versus predictions; (D and D'): conditional weighted residuals versus time.
molecular weight. Consequently, the pharmacokinetic properties between peginterferon α2a and peginterferon α2b are barely comparable.

There are several limitations in our study. (1) Only 208 concentration data among 178 patients were collected. For the most of the enrolled patients, only one drug concentration was obtained. The limited data may

Figure 4. Distribution of \( \eta_1 \) (IIV for CL) and \( \eta_2 \) (IIV for V) for basic and final population models.

Figure 5. Visual predictive check plot of the final population model for drug concentration. Each dot means a data point; dotted lines are 5th and 95th percentiles and solid line are predicted 50th percentile. The area between the 5th and 95th percentiles represents the 90% prediction intervals.
restrict the reliability of the final model. (2) The drug efficacy was the most important information in the clinic. However, only 47.8% (85/178) of patients’ drug efficacy was available. This made it difficult to develop the pharmacokinetic-pharmacodynamic (PK-PD) model. (3) IL28 plays a role in immune defense against viruses15, and it may have a significant impact on the drug efficacy. In our further study, information about drug efficacy will be collected to support the PK-PD analysis.

In summary, a population pharmacokinetic model for peginterferon α2a in patients receiving multiple subcutaneous doses has been successfully developed. Our model provides a useful tool that can be applied to estimate individual CL and V for the HBV patients, and to adjust dosing regimens with covariate factors (BMI and CCR).

Methods

Clinical trial registry. This study was registered on July 12th, 2013 in Chinese Clinical Trial Registry (A register participated in the WHO International Clinical Trial Registry Platform, ChiCTR-RO-13004320) and conducted from October 2013 to June 2016.

Patient and treatment. Institutional Review Boards of 302 Military Hospital of China approved the study and written informed consents were obtained from all participants according to local regulations (for the patients under the age of 18, written informed consents were obtained from his/her guardian too). The study had been done in accordance with the principles of the Declaration of Helsinki and Good Clinical Practice. All authors had accessed to the study data, critically reviewed the manuscript at each draft, and approved the final draft for submission. The study protocol can be found in the Supplementary Information.

Individuals who were considered CHB with interferon treatment indications of “Guide to chronic Hepatitis B Prevention, China, 2012”18, HBsAg positive, HBeAg positive, Anti-HBeAg negative, HBV DNA ≥ 10^6 copy/ml, 2 × ULN ≤ ALT ≤ 10 × ULN, Serum total bilirubin ≤ 2 × ULN, age between 15 to 75, had not received any other antiviral therapy before this trial in past three months, could be enrolled into study. Any subjects that have one of these six features below are not qualified to this examination. (1) Any subjects have HCV or combine with either HDV or HIV; (2) Any subjects are taking other drug treatments which may have influences on the pharmacokinetics or pharmacodynamics of peginterferon α2a; (3) Any subjects have hepatic carcinoma and combine with either cardiac or renal or pulmonary or endocrine or blood or metabolic or gastrointestinal disease; (4) Any subjects are pregnant or lactating; (5) Any subjects had received other antiviral therapies in the past three months before this trial started; (6) Any subjects have poor compliance with medication. Peginterferon α2a was subcutaneously injected into patients once a week.

The T_max value of Peginterferon α2a is about 72 hours. In order to ensure all blood collection points evenly distributed at the absorption phase, near the peak concentration and distribution phase, every patient should be randomly assigned into three groups after administration with peginterferon α2a. Blood samples were collected within 48 hours, between 48 hours and 96 hours and after 96 hours. Specific blood collection time will be determined by research doctors after negotiating with patients. With patients’ consents, maximum four blood samples could be collected at different phases or different hospitalizations.

Peginterferon α2a concentration assay. Peginterferon α2a concentrations in serum samples were analyzed using a commercial Human IFN-α Multi-Subtype ELISA Kit (product#41105) with a detection limit of 15 pg/mL manufactured by Pestka Biomedical Laboratories, Inc.19

Basic pharmacokinetics model. Nonlinear mixed-effect modeling method was employed to develop the basic pharmacokinetic model for peginterferon α2a. All the plasma concentration-time data sets were fitted using the NONMEM software (Version 72, ICON Development Solutions, Ellicott City, MD, USA) with first-order conditional estimation with Interaction (FOCE-I) approach. IIV was described by an exponential variability model as follow20:

\[ P_i = P \times e^{\eta_i} \]  

where P represents the typical value of parameter and P_i is the i-th patient’s individual parameter. IIV is assumed to follow a log-normal distribution, and the random variable \( \eta_i \) is normally distributed with mean 0 and variance of \( \omega^2 \). Combined error model (proportional error and additive error) was used to calculate the residual error of the pharmacokinetic model:

\[ C_{ij} = C_{ij}^P \times (1 + \varepsilon_{1ij}) + \varepsilon_{2ij} \]

C_{ij}^P and C_{ij} respectively represent model prediction and individual observation in i-th patient’s j-th concentration. \( \varepsilon_1 \) characterizes the proportional error and is normally distributed with mean 0 and variances of \( \sigma_1^2 \); \( \varepsilon_2 \) describes the additive error and is also distributed with mean 0 and variances of \( \sigma_2^2 \).

One- and two-compartmental open models with first-order absorption and elimination were applied to fit the data set. Model comparisons were made using the OFV for model discrimination, with the significance level of 0.05 \( (df = 2, \Delta OFV = 5.99) \).

Final pharmacokinetic model. Based on the basic pharmacokinetic model, candidate covariates, including AGE, WT, CCR, SCR, BMI, HT, GNDR, AST, ALT and disease grade on the basic model were investigated. For categorical covariates, such as GNDR and disease grade, they were incorporated using indicator variables. Other covariates were continuous and they were included into the model in the following ways:
COV and MEAN\textsubscript{COV} respectively represent the covariate and the mean value of this covariate. $\theta$ is the coefficient which represents the relationship between COV and $P_i$. The effects of covariates were investigated using the forward inclusion-backward elimination approach. A forward inclusion was used and covariates with a decrease in the OFV by $\geq 3.88$ ($P = 0.05$) were incorporated one at a time. After adding all the “significant” covariates from the forward inclusion in one model, the backward elimination step was performed. Covariates that caused a change $\geq 6.3$ ($P = 0.01$) in the OFV when eliminated were kept in the model.

**Model evaluation and validation.** The visual method was used to evaluate the basic and final population pharmacokinetic models. Scatter plots of DV versus IPRED, DV against PRED, the CWRES against PRED and TIME were drawn by Microsoft Office Excel 2007 software. Furthermore, the stability of the final model was assessed using the bootstrap technique. 1000 datasets were generated using the re-sampling method, and they were analyzed using the NONMEM software. After obtaining the mean and standard error of the fixed-effect parameters, the population estimates obtained from the final model were compared with the median and 95% CI of the bootstrap replicates. A predictive performance of the final pharmacokinetic model was examined by VPC. Simulations of 1000 virtual data sets were performed in the final population model. The median and 90% PI of simulated values were overlaid on the observed concentrations.

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**Author Contributions**

J.B., J.L., E.Q. and Z.W. designed the study; J.B., D.C., S.L., J.H., and Y.Z. acquired the clinical data; J.L. and S.Z. tested peginterferon alfa-2a concentrations; J.B., X.L., S.Z., Z.Z., and Z.W. analyzed and interpreted the data; J.B., X.L. and J.L. wrote, reviewed, and/or revised of the manuscript; all authors read and approved the final manuscript.

**Additional Information**

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