

# Population Pharmacokinetic–Pharmacodynamic Relationships of Sarilumab Using Disease Activity Score 28-Joint C-Reactive Protein and Absolute Neutrophil Counts in Patients with Rheumatoid Arthritis

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# Abstract

**Background** Sarilumab is a human monoclonal antibody blocking the interleukin-6 receptor alpha (IL- $6R\alpha$ ) approved for the treatment of moderately to severely active rheumatoid arthritis in adults with inadequate response or intolerance to other disease-modifying antirheumatic drugs.

Objective The aim of the current analysis was to describe sarilumab exposure-response relationships.

**Methods** Population pharmacokinetic/pharmacodynamic (PopPK/PD) models were developed describing the time course of the 28-joint disease activity score by C-reactive protein (DAS28-CRP) and absolute neutrophil count (ANC) using data from phase I–III studies (NCT01011959, NCT01061736, NCT01709578, NCT01768572) after subcutaneous sarilumab 50–150 mg every week or 100–200 mg every 2 weeks.

**Results** The time course of DAS28-CRP and ANC after sarilumab administration was described by semi-mechanistic, indirect-response models. Drug effect was predicted to be numerically greater at median exposure for the 200 mg every 2 weeks regimen versus the 150 mg every 2 weeks regimen, for both DAS28-CRP (50% vs. 47%) and ANC reduction from baseline (39% vs. 31%), with the latter showing less fluctuations within a dosing interval. Four covariates were retained in the final models: body weight, baseline rheumatoid factor status, anti-cyclic citrullinated peptide status, and concomitant methotrexate. There was no clinically meaningful influence of investigated covariates for either model.

**Conclusion** The PopPK/PD models showed numerically greater reductions in DAS28-CRP and ANC with sarilumab 200 mg every 2 weeks than with 150 mg every 2 weeks. There was no clinically meaningful influence of investigated covariates. These data contribute to the totality of evidence that supports a sarilumab subcutaneous starting dose of 200 mg every 2 weeks, with a subsequent reduction to 150 mg every 2 weeks in the event of laboratory abnormalities such as neutropenia.

# 1 Introduction

Rheumatoid arthritis (RA) is a chronic systemic autoimmune disease that can lead to irreversible joint damage, and is estimated to affect approximately 20 million people worldwide [1]. Interleukin (IL)-6 is a key multifunctional cytokine involved in the pathogenesis of inflammation and joint damage in RA [2]. The actions of IL-6 are mediated through classical cell signaling initiated through the membrane-bound IL-6 receptor alpha (IL-6R $\alpha$ , the expression of which is limited to only a few cell types) and through

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trans-signaling, whereby IL-6 binds to the soluble IL-6R $\alpha$ , which then forms a signaling complex with glycoprotein 130 (gp130; which is expressed on most cell types). Inhibition of IL-6 signaling ameliorates the pathologic processes driven by persistently elevated IL-6 levels [2].

Sarilumab is a human immunoglobulin G1 (IgG1) monoclonal antibody that binds selectively to both membranebound and soluble IL-6R $\alpha$  forms, blocking binding to the IL-6R $\alpha$  and IL-6-mediated signaling [3–7]. Sarilumab is approved for the treatment of moderately to severely active RA in adult patients with an inadequate response (IR) to other disease-modifying antirheumatic drugs (DMARDs), as monotherapy or in combination with a conventional synthetic DMARD [8, 9]. The approval of sarilumab was based on phase III studies that showed sarilumab rapidly improves signs and symptoms of RA (measured using a variety of clinical endpoints, including 28-joint disease activity score

#### **Key Points**

Using data from phase I–III studies among patients with rheumatoid arthritis treated with sarilumab, population pharmacokinetic/pharmacodynamic (PopPK/PD) models were developed to describe the time course of the 28-joint disease activity score by C-reactive protein (DAS28-CRP) and absolute neutrophil count (ANC).

The time course of both DAS28-CRP and ANC after sarilumab administration was described by semi-mechanistic, indirect-response models.

The PopPK/PD models showed numerically greater reductions in DAS28-CRP and ANC with sarilumab 200 mg every 2 weeks than with 150 mg every 2 weeks. These data contribute to the totality of evidence that support a sarilumab subcutaneous starting dose of 200 mg every 2 weeks, with a subsequent reduction to 150 mg every 2 weeks in the event of laboratory abnormalities (such as neutropenia).

Four covariates were retained in the final models: body weight, baseline rheumatoid factor status, anti-cyclic citrullinated peptide status, and concomitant methotrexate. None of these covariates had a clinically meaningful influence on the time course of DAS28-CRP or ANC during sarilumab treatment, indicating dose adjustments are not required for these patient demographics or disease characteristics.

by C-reactive protein [DAS28-CRP]), improves physical functioning, inhibits irreversible joint destruction, and is well tolerated [3–5]. Empirical exposure–response modeling showed a consistent trend toward improvement in clinical outcomes for subcutaneous sarilumab 200 mg every 2 weeks compared with subcutaneous sarilumab 150 mg every 2 weeks, including greater American College of Rheumatology (ACR) responses, and improvements in DAS28-CRP, Clinical Disease Activity Index (CDAI), Health Assessment Questionnaire Disability Index (HAQ-DI), and modified Total Sharp Score (mTSS) [10, 11].

In animals, IL-6 administration causes rapid mobilization of neutrophils from the marginated pool and release of neutrophils from the bone marrow into the blood circulation [12]. Consistent with this, IL-6R $\alpha$  blockade has been associated with a reversible decrease in absolute neutrophil count (ANC). Reduced ANC is a potential safety concern. Although phase III studies were not powered to compare safety endpoints, the frequency and magnitude of ANC reductions were numerically greater with 200 mg every 2 weeks compared with the lower 150 mg every 2 weeks dose. However, clinical studies have shown that there is no relationship between the decrease in ANC observed during treatment with subcutaneous sarilumab 150 or 200 mg every 2 weeks and the incidence of serious and non-serious infections [3–5, 13].

This paper reports the development of semi-mechanistic population pharmacokinetic/pharmacodynamic (PopPK/ PD) models that describe the relationship between drug concentration and change in DAS28-CRP (efficacy parameter) and ANC (safety parameter) over time following sarilumab administration in patients with RA, and identifies covariate factors influencing PK/PD relationships. This work was undertaken to corroborate the lack of need for dose adjustment based on patient demographics or baseline disease characteristics for adult patients with RA, and to add to the overall evidence to support sarilumab dose recommendations.

# 2 Methods

A sequential approach was used by first developing a PopPK model [14], followed by the development of a PopPK/PD model using individual sarilumab PK parameters derived from the PopPK model as the exposure input and the observed DAS28-CRP scores and ANC as clinical PD endpoints for efficacy and safety, respectively. PopPK parameters and individual estimates were computed assuming no effect of PD parameters on PK.

# 2.1 Patients

The previous PopPK model was developed based on PK data up to a predefined cut-off date from 1770 patients with RA who participated in phase I, II, and III studies [14]. For the current PopPK/PD analysis for DAS28-CRP, data up to the time of primary efficacy (disease activity) endpoint assessment (24 weeks) were pooled from 2082 patients (17,229 individual DAS28-CRP values) with RA enrolled in one phase II study (NCT01061736 Part A [MOBIL-ITY]) and two phase III studies (NCT01061736 Part B [MOBILITY] and NCT01709578 [TARGET]) [Tables 1 and 2]. DAS28-CRP data were not available for the phase I, single-dose studies. Data for the PopPK/PD analysis for ANC were pooled from 1672 patients with RA enrolled in one phase I study (NCT01011959), one phase II study (NCT01061736 Part A [MOBILITY]), and three phase III studies (NCT01061736 Part B [MOBILITY], NCT01709578 [TARGET], and NCT01768572 [ASCERTAIN]) [Tables 1 and 2]. All clinical studies were performed in accordance with the principles of the Declaration of Helsinki and all applicable amendments by the World Medical Assemblies 
 Table 1 Clinical studies included in the PopPK/PD analyses

Sarilumab PopPK/PD Using DAS28-CRP and ANC

Clinical study identifier	Treatment doses and regimens <sup>a</sup>	Population	Number of patients included in the PK/ PD analyses <sup>b</sup>
PopPK/PD analysis for DAS28-C.	RP		
NCT01061736 Part A (phase II)	Placebo Sarilumab 100 or 150 mg SC qw Sarilumab 100, 150, or 200 mg, SC q2w 12-week treatment duration	RA patients with MTX-IR	254 (approximately 50 patients per arm)
NCT01061736 Part B (phase III)	Placebo Sarilumab 150 or 200 mg, SC q2w 52-week treatment duration	RA patients with MTX-IR	1284 (approximately 350 patients/arm)
NCT01709578 (phase III)	Placebo Sarilumab 150 or 200 mg, SC q2w 24-week treatment duration	RA patients with TNF-IR	544 (approximately 174 patients per arm)
PopPK/PD analysis for ANC			
NCT01011959 (phase I)	Placebo Sarilumab 50, 100, or 150 mg SC qw Sarilumab 100, 150, or 200 mg SC q2w 5-week treatment duration	RA patients	42 (7–8 patients/cohort)
NCT01061736 Part A (phase II)	Sarilumab 100 or 150 mg SC qw Sarilumab 100, 150, or 200 mg, SC q2w 52-week treatment duration	RA patients with MTX-IR	203 (approximately 50 patients/arm)
NCT01061736 Part B (phase III)	Placebo Sarilumab 150 or 200 mg, SC q2w 24-week treatment duration	RA patients with MTX-IR	968 (approximately 350 patients/arm)
NCT01709578 (phase III)	Placebo Sarilumab 100, 150, or 200 mg, SC q2w 24-week treatment duration	RA patients with TNF-IR	364 (approximately 174 patients/arm)
NCT01768572 (phase III) <sup>c</sup>	Sarilumab 150 or 200 mg, SC q2w 24-week treatment duration	RA patients with TNF-IR	95 (sarilumab, approximately 50 patients/arm; tocilizumab, approximately 100 patients)

ANC absolute neutrophil count, DAS28-CRP 28-joint disease activity score by C-reactive protein, IR inadequate response, MTX methotrexate, PopPK/PD population pharmacokinetic/pharmacodynamic, qw weekly, q2w every 2 weeks, RA rheumatoid arthritis, SC subcutaneous, TNF tumor necrosis factor

<sup>a</sup>For placebo treatment, background RA therapy was administered; for active treatments, sarilumab was administered on top of background RA therapy

<sup>b</sup>Number of patients in the final data set

<sup>c</sup>Study included a tocilizumab treatment arm; these data were not included in the current analysis

and the International Conference of Harmonisation Guidelines for Good Clinical Practice.

Patients treated with sarilumab for whom PK data were not available were excluded from the PopPK/PD analysis. Patients from NCT01709578 were not included in the PopPK model building as data from this study were not available by the predefined cut-off date for PopPK model building [14]. Therefore, the individual PK parameters for these patients were computed using an empirical Bayesian estimation approach (or maximum a posteriori).

# 2.2 Clinical Endpoints

The DAS28-CRP is a compositive score based on tender and swollen joints, serum levels of CRP, and the patient global health assessment, and was calculated at baseline and weeks 2 and 4, and then every 4 weeks across the three studies. ANC was derived as the sum of absolute counts of bands and absolute segmented neutrophils by multiplying the percentage of bands and segmented neutrophils by the total leukocyte count, and recorded at baseline, weeks 2, 4, 6, 8, 10, and 12, and then every 4 weeks across the five studies. Table 2Demographiccharacteristics of the patientsincluded in the final datasetfor the development of theDAS28-CRP and ANC PopPK/PD models

Covariate or characteristic	PopPK/PD analysis for DAS28-CRP Final data set $(n=2082)$	PopPK/PD analysis for ANC Final data set $(n = 1672)$
Patient population MTX-IR/TNF-IR [n (%)]	544 (26.1)/1538 (73.9)	459 (27.5)/1213 (72.6)
Mean (SD) age, years	51.6 (12.0)	51.7 (12.1)
Mean (SD) body weight, kg	74.6 (18.8)	74.1 (18.7)
Mean baseline DAS28-CRP	-	6.03 (0.903)
Mean (SD) baseline IL-6, pg/mL <sup>a</sup>	41.8 (67.2)	41.1 (64.5)
Mean (SD) baseline CRP, mg/L	24.1 (25.1)	23.8 (25.6)
Mean (SD) baseline PHYVAS	64.6 (16.8)	-
Mean (SD) baseline HAQ score	1.68 (0.640)	-
Female [ <i>n</i> (%)]	1709 (82.1)	1374 (82.2)
Caucasian [n (%)]	1741 (83.6)	1418 (84.8)
Smoker $[n (\%)]^{b}$	278 (13.4)	238 (14.2)
MTX [n (%)]	2058 (98.8)	1634 (97.7)
Baseline ACCP positive $[n (\%)]^{c}$	337 (16.5)	263 (16.4)
Prior biologic treatment $[n (\%)]^d$	824 (39.6)	591 (38.5)
Prior corticosteroid treatment $[n (\%)]$	1346 (64.6)	1067 (63.8)

ACCP anti-cyclic citrullinated peptide, ANC absolute neutrophil count, CRP C-reactive protein, DAS28-CRP 28-joint disease activity score by C-reactive protein, HAQ Health Assessment Questionnaire, IL-6 interleukin-6, IR inadequate responders, MTX methotrexate, PHYVAS Physician's Global Assessment of Disease Activity, PopPK/PD population pharmacokinetic/pharmacodynamic, SD, standard deviation, TNF, tumor necrosis factor

<sup>a</sup>DAS28-CRP model n=1537, ANC model n=1213; baseline IL-6 data were not available in study NCT01709578

<sup>b</sup>DAS28-CRP model n = 2081

<sup>c</sup>DAS28-CRP model n = 2047, ANC model n = 1603

<sup>d</sup>ANC model n = 1535

# 2.3 Bioanalysis

Concentrations of functional sarilumab in serum (i.e. sarilumab with one or two sites available for target binding, representing the pharmacologically active form), were measured using a validated immunoassay with a lower limit of quantification of 0.294 mg/L [14]. Immunogenicity was assessed using a validated, titer-based, bridging immunoassay. Samples that were positive in the antidrug antibody (ADA) assay (sensitivity based on the mouse monoclonal positive control was approximately 63.5–116.3 ng/mL) were assessed for neutralizing antibodies (NAbs) using a validated competitive ligand binding assay (sensitivity based on the monoclonal positive control antibody, and the rabbit polyclonal antibody was approximately 150 and 257 ng/mL, respectively).

# 2.4 Model Building

Indirect-response models were used to describe the time course of DAS28-CRP and ANC during treatment with sarilumab administered as subcutaneous doses of 50, 100, or 150 mg every week, or 100, 150, or 200 mg every 2 weeks using data pooled across studies, as shown in Table 1.

For the PopPK/PD analysis for both DAS28-CRP and ANC, the structural model was chosen on the basis of the examination of the objective function value (OFV), the inspection of conditional weighted residuals (CWRES) and individual weighted residuals (IWRES), the inspection of prediction and individual prediction versus observed plots, and visual inspection of the fits. Based on graphical evaluation (histograms and/or quantile-quantile plots of parameters), interindividual variability was modeled using a constant coefficient of variation or proportional error model (i.e. log-normal distribution). In modeling residual variability, errors between the observed and predicted PD (DAS28-CRP or ANC) values,  $\varepsilon$ , obtained using the individual's model predicted PD parameters, were assumed to arise from a symmetric distribution with a mean of zero and a variance of  $\sigma^2$ . Visual inspection of the distribution of CWRES versus population-predicted PD values and program output were used to assist in determining the structure of the residual variability model. The interindividual variability was evaluated for each model parameter.

The time course of DAS28-CRP following administration of subcutaneous sarilumab was best described by an indirect-response model linking sarilumab concentrations with DAS28-CRP via an inhibitory effect on the DAS28-CRP production rate ( $k_{in}$ ). The DAS28-CRP PopPK/PD model (Fig. 1) was parameterized with a first-order rate constant for the loss of response ( $K_{out}$ ), a maximum drug-induced effect ( $E_{max}$ ), and a sarilumab concentration at 50% of maximum drug inhibitory effect (IC<sub>50</sub>). The background treatment effect of concomitant DMARD therapies was included as a parameter in the model, termed PLB and expressed in sarilumab concentration units of mg/L.

The time course for ANC following subcutaneous administration of sarilumab was best described by an indirect-response model linking sarilumab concentrations with the ANC via stimulation of the elimination rate of neutrophils, i.e. disappearance from the bloodstream. The structure of the model was informed by the observation that IL-6R inhibition leads to neutrophil margination without loss of neutrophil function [19]. The ANC PopPK/PD model was parameterized with  $K_{out}, E_{max}$ , a sarilumab concentration for 50% of the maximum drug-induced effect (EC<sub>50</sub>), and a Hill coefficient ( $\gamma$ ) (Fig. 1).

After the structural model selection, covariates were evaluated using a stepwise forward-addition and

backward-deletion approach. Covariates providing a significant change (p < 0.001) in the OFV when introduced into the model were retained. A backward deletion was performed to assess the covariate–parameter relationship. Only covariates associated with a significant change in the OFV (p < 0.001) were retained in the final PopPK/PD models. The following covariates of interest were evaluated: demographics (sex, age, race, body weight, smoking status); biomarker (baseline CRP, baseline IL-6); disease status (baseline rheumatoid factor [RF], baseline anti-cyclic citrullinated peptide [ACCP] status, baseline DAS28-CRP, baseline HAQ-DI); medication (prior corticosteroid treatment, prior biologic treatment, concomitant methotrexate); patient population (methotrexate-IR/DMARD-IR, tumor necrosis factor [TNF] therapy-IR); and ADA and NAb status (both positive or negative).

## 2.5 Data Handling

If any covariates were missing, the patient data were deleted from the analysis for categorical covariates and the missing value was computed from the population median



**Fig. 1** DAS28-CRP and ANC PopPK/PD model structure. ANC absolute neutrophil count, C concentration, CL clearance, DAS28-CRP 28-joint disease activity score by C-reactive protein,  $\gamma$  Hill coefficient for sigmoidicity,  $EC_{50}$  concentration at 50% of  $E_{\max}$ ,  $E_{\max}$  maximum drug effect,  $I_{max}$  maximum drug effect,  $IC_{50}$  concentration at 50% of  $I_{\max}$ ,  $K_a$  first-order absorption rate constant,  $K_{in}$  zero-

order production rate,  $K_m$  Michaelis–Menten constant,  $K_{out}$  first-order degradation rate, *PopPK/PD* population pharmacokinetic/pharmacodynamic, *Q* intercompartmental clearance, *SC* subcutaneous,  $V_m$  maximum rate. DAS28-CRP model: Eff(C) =  $E_{max} \times (C + \text{placebo})^{\gamma/}$ (IC<sub>50</sub><sup> $\gamma$ </sup> + (C + placebo)<sup> $\gamma$ </sup>). ANC model: Eff(C) =  $E_{max} \times C^{\gamma/}$ (EC<sub>50</sub><sup> $\gamma$ </sup> +  $C^{\gamma}$ ) for continuous covariates. If a strong correlation existed between any other covariates, a linear regression could be used to calculate the covariate value. As all covariates were tested at baseline, there was no need to carry observations forward or back for missing values.

For any covariate data that were completely unavailable for any individual study, or any categorical covariate that was < 10% of the total included patients, a post hoc approach was employed that used descriptive statistics of the individual model parameters by covariate category and plot of individual values of model parameters versus covariates (box plots for categorical covariates and scatter plots for continuous covariates). Since baseline IL-6 data were not available in the NCT01709578 and NCT01768572 studies, and NAb data were not available in phase I and II studies, a post hoc approach was used for these covariates. It was assumed that the distributions of other covariates across the different levels within that covariate were approximately balanced.

#### 2.6 Model Evaluation

The final PopPK/PD models were verified by evaluation of goodness-of-fit plots, visual predictive check (VPC), and bootstrap analyses. Bootstrap analyses were conducted for DAS28-CRP and ANC using 1000 bootstrap sets drawn with replacement (resampling) from the original datasets for the respective analysis. For each of the 1000 bootstrap sets, the population PD parameters were estimated and the corresponding mean, median, standard deviation (SD), and 2.5th/97.5th percentiles were calculated. To validate each PopPK/PD model, the mean parameter estimates obtained in the final model of the original dataset were compared with median parameters from bootstraps. Analyses were performed using NONMEM® version 7.2 (ICON plc, Dublin, Ireland) running on a Linux cluster of multiprocessor computers. All runs were performed using the first-order conditional estimate method with interaction option.

#### **3 Results**

# 3.1 28-Joint Disease Activity Score by C-Reactive Protein (DAS28-CRP) Population Pharmacokinetic/Pharmacodynamic (PopPK/ PD) Model

The final PopPK/PD model parameter estimates translated into a 55.9% maximum decrease in DAS28-CRP score from baseline, with an IC<sub>50</sub> of 2.32 mg/L (Table 3), and included four covariates on baseline DAS28-CRP (baseline

CRP level, baseline physician's global assessment of disease activity, baseline HAQ-DI, and body weight), one covariate on  $E_{\text{max}}$  (baseline CRP level), and one covariate on  $K_{\text{out}}$  (corticosteroid treatment at baseline).

DAS28-CRP baseline values and  $E_{max}$  decreased with a decrease in baseline CRP. DAS28-CRP baseline values were 6.6% lower in patients with a baseline CRP of 8.17 mg/L (25th percentile) and 7.5% higher in patients with a baseline CRP of 31.2 mg/L (75th percentile), compared with patients with a baseline CRP of 15.7 mg/L (median);  $E_{\text{max}}$  was 0.7% lower and 0.8% higher, respectively. DAS28-CRP baseline values also decreased with a decrease in baseline physicians global assessment score (1.1% lower with a score of 54 and 0.9% higher with a score of 77, compared with a median score of 66), a decrease in baseline HAO-DI score (3.9%) lower with a score of 1.25 and 2.9% higher with a score of 2.13, compared with a median score of 1.75), and a decrease in body weight (0.9% lower in those weighing 61 kg and 0.8% higher in those weighing 84.3 kg, compared with a body weight of 72.8 kg). The  $K_{out}$  value was 26% higher in patients with prior corticosteroid treatment compared with those without  $(0.0333 \text{ vs. } 0.0264 \text{ day}^{-1})$ , resulting in minimal DAS28-CRP changes (<1%) at week 24. Thus, the effect of these covariates on the time course of DAS28-CRP was small and not clinically meaningful.

Sex, age, race, baseline RF, baseline ACCP status, prior treatment with biologics, concomitant methotrexate, or patient population (methotrexate or TNF $\alpha$  antagonist IRs) were not identified as significant covariates in the final PopPK/PD model. Additionally, (post hoc) baseline IL-6 level, ADA status, and NAb status had no appreciable impact.

## 3.1.1 DAS28-CRP PopPK/PD Model Predicted Versus Observed Evaluation

The goodness-of-fit, CWRES, and normalized prediction distribution error (NPDE) evaluation results (Fig. 2a–c) indicate that the final DAS28-CRP PopPK/PD model was consistent with the observed data, except for the cohort of patients initially randomized to placebo who subsequently received sarilumab 200 mg every 2 weeks. The VPC (Fig. 2d) and bootstrap analysis (Table 3) showed that simulated DAS28-CRP time profiles (2.5th, 50th, and 97.5th percentiles) fitted the observed data well.

The effect of sarilumab on DAS28-CRP was predicted to be 50.3% at the median trough concentration of the 200 mg every 2 weeks regimen and 46.5% at the median trough concentration of the 150 mg every 2 weeks regimen (Fig. 3). At week 24, the model-estimated mean (SD) DAS28-CRP was 3.19 (1.05), compared with an observed value of 3.24 Parameter

BASE Log ( $E_{max}$ ) IC<sub>50</sub>, mg/L  $K_{out}$ , day<sup>-1</sup>

PLB, mg/L BLCRP on BASE BLPHYVAS on BASE BLHAQ on BASE Weight on BASE BLCRP on Log(E<sub>max</sub>) PRICORT on K<sub>out</sub>

Table 3	Parameter estimates	for the DAS28-C	RP PopPK/PD m	odel
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Final model pop	Final model population mean		Bootstrap estimate
Estimate	%RSE	95% CI	Median (95% CI)
6.06	0.32	6.03–6.10	6.07 (6.03–6.10)
0.237	19.8	0.143-0.331	0.246 (0.157-0.384)
2.32	17.6	1.51-3.14	2.41 (1.74-3.29)
0.0264	4.61	0.0239-0.0289	0.0264 (0.0233-0.0301)
1 (fixed)	NA	NA	
0.991	19.1	0.612-1.37	1.03 (0.737-1.40)
0.0564	4.49	0.0513-0.0614	0.0563 (0.0514-0.0614)
0.105	6.41	0.0913-0.118	0.105 (0.0834-0.127)
0.0779	5.15	0.0689-0.0859	0.0778 (0.0695-0.0858)
0.0522	20.2	0.0311-0.0733	0.0512 (0.0305-0.0738)
0.333	34.5	0.103-0.562	0.321 (0.154-0.535)
1.26	5.50	1.12-1.40	1.27 (1.10–1.48)

	Final model interindividual variability (%)			Bootstrap interindividual variability (%)
	Estimate	%RSE	Shrinkage (%)	8.03 (7.48-8.54)
BASE	8.05	6.86	31.3	70.8 (63.5–93.5)
$Log (E_{max})$	71.2	8.26	40.5	157 (44.2–183)
IC <sub>50</sub> , mg/L	158	13.4	42.3	84.2 (78.1–92.3)
$K_{\rm out}$ , day <sup>-1</sup>	84.2	6.11	31.9	107 (49.4–161)
PLB, mg/L	105	38.1	75.8	107 (49.4–161)
Residual variability				
Additive term, mg/L	0.647	0.70	11.0	0.646 (0.632–0.662)

BASE baseline, BLCRP baseline C-reactive protein, BLHAQ baseline Health Assessment Questionnaire, BLPHYVAS baseline Physician's Global Assessment of Disease Activity, CI confidence interval, DAS28-CRP 28-joint disease activity score by C-reactive protein, DMARD disease modifying antirheumatic drug,  $E_{max}$  maximum drug-induced effect,  $\gamma$  hill coefficient for sigmoidicity,  $IC_{50}$  concentration of 50% of  $E_{max}$ ,  $K_{out}$  first-order rate constant,  $Log(E_{max})$  log-transformed maximum drug effect, NA not applicable, PLB placebo/background treatment effect of concomitant DMARDs in sarilumab concentration units, PopPK/PD population pharmacokinetic/pharmacodynamic, PRICORT prior corticosteroid treatment, %RSE relative standard error (100%\*SE/estimate), SE standard error

(1.30) for sarilumab 150 mg every 2 weeks and 3.01 (1.02) versus 3.01 (1.25) for sarilumab 200 mg every 2 weeks, respectively. Compared with a 150 mg every 2 weeks dose, a greater proportion of patients at 200 mg every 2 weeks maintained sarilumab trough concentrations above that needed for half maximal effect for DAS28-CRP (82% vs. 54%).

# 3.2 Absolute Neutrophil Count (ANC) PopPK/PD Model

The final PopPK/PD model parameter estimates translated into a maximal decrease in circulating ANC from baseline of 60% and the lowest possible ANC level of  $2.15 \times 10^{9}$ /L, with an IC<sub>50</sub> of 10.3 mg/L (Table 4). The model included one covariate on baseline ANC (smoking status), one covariate on  $E_{\text{max}}$  (baseline corticosteroid treatment), and one covariate on  $K_{out}$  (body weight). The baseline ANC value was 15.1% higher in patients who were smokers than in patients who were non-smokers (6.19 vs.  $5.38 \times 10^{9}$ /L). The  $E_{\text{max}}$  value was 18.1% lower in patients with prior corticosteroid treatment than patients without prior corticosteroid treatment (1.23 vs. 1.50), translating into a 55% and 60% maximal decrease of ANC in patients with and without prior corticosteroid treatment, respectively. Additionally, compared with patients with a body weight of 71 kg (median), the  $K_{out}$  value was 12.4% lower in patients with a body weight of 61.0 kg (25th percentile) and 15.7% higher in those with a body weight of 83.9 kg (75th percentile). However, this did not translate to a meaningful change in ANC (< 1%) at week 24. Thus, the effect of these covariates on the PD parameters was small, with none having a clinically meaningful influence on ANC.

Sex, age, race, baseline RF, baseline ACCP status, baseline DAS28-CRP, prior treatment with biologics, concomitant methotrexate treatment, or patient population (methotrexate or TNF $\alpha$  antagonist IRs) were not identified as significant covariates in the final PopPK/PD model. Additionally, (post hoc) baseline IL-6 level, ADA status, and NAb status had no appreciable impact.

# 3.2.1 ANC PopPK/PD Model Predicted Versus Observed Evaluation

The goodness-of-fit, CWRES, and NPDE evaluation results (Fig. 4a–c) indicate that the final ANC PopPK/PD model was consistent with the observed data, except for the cohort of patients initially randomized to placebo who subsequently received sarilumab 200 mg every 2 weeks. The results of the VPC (Fig. 4d) and bootstrap analysis (Table 4) showed that simulated ANC time profiles(2.5th, 50th, and 97.5th percentiles) track observed trends very well, especially for the 150 mg every 2 weeks and 200 mg every 2 weeks regimens and represent a good qualification of the PopPK/PD model developed in the present analysis.

Within a dose interval, ANC decreased to the nadir and recovered toward baseline in a dose- and concentrationdependent manner, with higher fluctuations for the 150 mg every 2 weeks dose regimen than for the 200 mg every 2 weeks regimen (Fig. 5). Compared with a 150 mg every 2 weeks dose, a greater proportion of patients at 200 mg every 2 weeks maintained sarilumab trough concentrations above that needed for half maximal effect for ANC reduction (60% vs. 28%). The reduction in the ANC from baseline was predicted to be slightly higher at the median trough concentration of 200 mg every 2 weeks (39%) than the median trough concentration of 150 mg every 2 weeks (31%) at steady state. At week 24, the model-estimated mean (SD) ANC was 4.10 (1.94), compared with an observed value of 4.24 (2.31) for sarilumab 150 mg every 2 weeks and 3.68 (1.83) versus 3.79 (2.19) for sarilumab 200 mg every 2 weeks, respectively.

# **4** Discussion

The time course observed in patients for DAS28-CRP and ANC following sarilumab subcutaneous administration was well described, with indirect-response population PopPK/PD models linking concentrations of sarilumab with DAS28-CRP via an inhibitory effect on the 'production rate' of DAS28-CRP ( $K_{in}$ ), or with ANC via stimulation of the 'elimination rate' of neutrophils ( $K_{out}$ ). The DAS28-CRP model is consistent with the mode of action of sarilumab in

**Fig. 2** DAS28-CRP PopPK/PD model. **a** Goodness-of-fit analysis; **b** normalized prediction distribution error; **c** conditional weighted residuals; **d** visual predictive check. *CWRES* conditional weighted residuals, *DAS28-CRP* 28-joint disease activity score by C-reactive protein, *NPDE* normalized prediction distribution error, *PopPK/PD* population pharmacokinetic/pharmacodynamic, qw every week, q2w every 2 weeks. In **a**, dashed blue line indicates y=x, solid blue line indicates y=0, solid red line indicates tendency. In **d**, solid red line represents the median of observations; solid dashed lines represent the 2.5th and 97.5th percentiles of observations; and pink and gray areas represent the confidence intervals of the median and 5<sup>th</sup> and 95th percentiles of predictions. Placebo+200 mg q2w defines the cohort of patients initially randomized to placebo who subsequently received sarilumab 200 mg q2w

terms of inhibition of disease progression  $(K_{in})$ . Similarly, the ANC model is consistent with the postulated 'margination' of functioning neutrophils from the circulation, the central compartment  $(K_{out})$  [15, 16]. For DAS28-CRP, the final model included four covariates on baseline DAS28-CRP (baseline CRP level, baseline physician's global assessment of disease activity, baseline HAQ-DI, and body weight), one covariate on  $E_{\rm max}$  (baseline CRP level), and one covariate on  $K_{out}$  (corticosteroid treatment at baseline). The final ANC PopPK/PD model included one covariate of baseline ANC (smoking status), one covariate of  $E_{max}$  (baseline corticosteroid treatment), and one covariate of  $K_{out}$  (body weight). None of the identified covariates had a clinically meaningful influence on the time course of DAS28-CRP or ANC during sarilumab treatment, indicating dose adjustments are not required for these patient characteristics. These observations are consistent with the PopPK analysis described previously [14], where none of the covariates evaluated, including body weight, had any clinically meaningful effect on the PK of sarilumab.

Simulated time profiles validated the predictive ability of the PopPK/PD models. For DAS28-CRP, there was a slight underprediction at the later time points (> 24 weeks) for the sarilumab treatment groups. For the placebo group, the simulated values generally underpredicted the observed values (except for values derived from patients in the placebo group who rescued with open-label sarilumab 200 mg every 2 weeks from week 12 onwards in the case of lack of efficacy [per protocol], which were overpredicted).

Efficacy results from phase III clinical studies favored a 200 mg every 2 weeks dosing regimen over the 150 mg every 2 weeks regimen [3–5]. In TARGET (patients with moderately to severely active RA who had an IR or intolerance to anti-TNF therapy), the mean change from baseline in DAS28-CRP score at week 24 was – 2.4 (standard error 0.11) for patients treated with sarilumab 150 mg and – 2.8 (0.11) for those treated with sarilumab 200 mg every 2 weeks. The proportion of patients achieving DAS28-CRP responses













Table 4 Parameter estimates for the ANC PopPK/PD model

Parameter	Population mean			Bootstrap estimate	
	Estimate	%RSE	95% CI	Median (95% CI)	
BASE	5.38	1.05	5.27-5.50	5.37 (5.26–5.51)	
E <sub>max</sub>	1.50	4.62	1.36-1.64	1.44 (1.26–1.72)	
<i>EC</i> <sub>50</sub> , mg/L	10.3	6.16	9.00-11.5	10.3 (7.53–14.1)	
$K_{out}$ , day <sup>-1</sup>	2.17	35.3	0.638-3.71	211 (1.67-2.88)	
Г	0.862	4.55	0.783-0.940	0.840 (0.747-0.961)	
Smoking on BASE <sup>a</sup>	1.15	2.64	1.09-1.21	1.16 (1.10-1.21)	
Weight <sup>b</sup> on $K_{out}^{a}$	0.875	12.2	0.662-1.09	0.866 (0.219-0.964)	
PRICORT on $E_{\text{max}}^{a}$	0.819	4.63	0.743-0.895	0.850 (0.755-0.948)	
	Interindividual variability (%)			Bootstrap interin- dividual variability (%)	
	Estimate	%RSE	Shrinkage (%)	Median (95% CI)	
BASE	32.1	4.61	12.9	32.1 (30.5–33.5)	
$E_{\rm max}$	61.9	6.83	30.6	61.2 (54.9-67.9)	
EC <sub>50</sub> , mg/L	36.9	28.0	74.0	39.5 (21.1-51.0)	
$K_{\rm out}$ , day <sup>-1</sup>	227	43.7	79.3	232 (198–279)	
Г	80.4	8.89	42.3	83.2 (63.8–101)	
Residual variability					
Proportional term (%)	28.2	0.8	7.14	28.3 (27.6–28.9)	

ANC absolute neutrophil count, BASE baseline ANC, CI confidence interval,  $EC_{50}$  concentration at 50% of  $E_{max}$ ,  $E_{max}$  maximum drug-induced effect,  $\gamma$  Hill coefficient for sigmoidicity,  $K_{out}$  first-order rate constant for loss of ANC rate, PopPK/PD population pharmacokinetic/pharmacody-namic, *PRICORT* prior corticosteroid treatment, %*RSE* relative standard error (100%\*SE/estimate), *SE* standard error

<sup>a</sup>Covariates included in the final PopK/PD model as a power function

<sup>b</sup>Expressed relative to a median weight of 71 kg

of < 2.6 and  $\le 3.2$  at week 24 was 24.9% and 32.6%, respectively, in the sarilumab 150 mg every 2 weeks group, and 28.8% and 40.2%, respectively, in the 200 mg every 2 weeks group [3]. Similarly, in MOBILITY, conducted in methotrexate-IR patients with moderate to severe RA, the proportion of patients achieving DAS28-CRP responses of < 2.6 and  $\leq 3.2$  at week 24 was 27.8% and 39.8%, respectively, in the sarilumab 150 mg every 2 weeks group, and 34.1% and 49.1% in the 200 mg every 2 weeks group [4]. In the latter study, the proportion of patients without radiographic progression of structural joint damage, which is irreversible, at week 24 was higher among those patients treated with sarilumab 200 mg every 2 weeks (56.6%) than among those patients treated with 150 mg every 2 weeks (46.3%) [3–5]. Consistent with these clinical observations, the PopPK/PD model showed a numerically greater reduction in DAS28-CRP at the median trough concentration for the 200 versus 150 mg every 2 weeks regimens.

Clinical studies have also shown that sarilumab is associated with a decrease in ANC, which is reversible and manageable by dose adjustment [3-5]. Consistent with this, the ANC time course was described by an indirect-response model with a rapid decrease within 1-2 weeks of initiating subcutaneous sarilumab (200 and 150 mg every 2 weeks), with ANC levels stabilizing after 4 weeks of treatment. This PopPK/PD analysis showed that the 150 mg every 2 weeks regimen would result in a marginally smaller reduction in ANC and a more rapid return toward baseline compared with the 200 mg every 2 weeks regimen. The observed effect on  $K_{\rm out}$  for sarilumab can be explained by margination of neutrophils from the vascular circulation to the vascular wall or other tissue [17]. A reversible decrease in ANC has also been reported for another IL-6 receptor blocker, tocilizumab, indicating that this phenomenon is a consequence of inhibition of IL-6 signaling [15, 16]. A previous analysis has indicated that the pharmacological effect on ANC levels for both subcutaneous sarilumab and intravenous tocilizumab is immediate and relatively short-lasting after a single dose with an apparent saturation of effect and pharmacological tolerance [13]. The apparent saturation of effect is evidenced by the temporal PopPK/PD relationship for ANC versus sarilumab concentrations, with ANC values returning toward baseline even as sarilumab concentrations continued to increase. After a single 200 mg dose of subcutaneous sarilumab, a return to baseline in ANC was achieved at around 2 weeks postdose. A return toward baseline ANC was also noted for intravenous tocilizumab, with baseline levels achieved at around 1 month following a single intravenous dose. However, regardless of the decrease in ANC, no relationship between decrease in ANC and infection, including serious infection, has been identified in clinical trials for sarilumab, indicating that neutrophils remain available and functioning in case of an infection and can 'demarginate' [3–5, 13].

**Fig. 4** ANC PopPK/PD model. **a** Goodness-of-fit; **b** normalized prediction distribution error; **c** conditional weighted residuals; and **d** visual predictive check. *ANC* absolute neutrophil count, *CWRES* conditional weighted residuals, *NPDE* normalized prediction distribution error, *PopPK/PD* population pharmacokinetic/pharmacodynamic, qwevery week, q2w every 2 weeks. In **a**, dashed blue lines indicate y=x, solid blue line indicates y=0, solid red line indicates tendency. In **d**, solid red line represents the median of observations; solid dashed lines represent the 2.5th and 97.5th percentiles of observations; and pink and gray areas represent the confidence intervals of the median and 5th and 95th percentiles of predictions

Further support that marginated neutrophils remain viable in case of infection is provided by previous studies, which have shown that neutrophils retain their functional capacity (such as respiratory burst or chemotaxis) under IL-6Ra blockade with tocilizumab [18, 19].

In clinical trials, ADAs were reported for 5.7% of patients treated with sarilumab 150 mg every 2 weeks, 4.0% of those treated with sarilumab 200 mg every 2 weeks, and 1.9% of those who received placebo [8, 9]; NAbs were reported for 1.6%, 1.0%, and 0.2% of patients, respectively [8, 9]. No correlation was observed between ADA development and either loss of efficacy or the emergence of adverse reactions.

The prescribing guidance for subcutaneous sarilumab in the EU and the US is 200 mg every 2 weeks, with adjustment to 150 mg every 2 weeks for the management of neutropenia (as well as thrombocytopenia and liver enzyme elevations) [8, 9], due to the favorable benefit/risk profile for this regimen based on the results of the phase III clinical trials and subsequent long-term follow-up [3, 4, 8, 9, 13]. The current PopPK/ PD analysis contributes to the totality of evidence that supports this starting dose, with a numerically greater DAS28-CRP reduction (and better potential to prevent irreversible joint damage) predicted at the median exposure of 200 mg every 2 weeks compared with 150 mg every 2 weeks. This analysis also supports the dose reduction scheme in the event of laboratory abnormalities (such as neutropenia, which is reversible) due to greater ANC reduction at a median exposure of 200 mg every 2 weeks rather than 150 mg every 2 weeks.

# 5 Conclusions

The PopPK/PD model presented here for DAS28-CRP and ANC, in combination with previously reported exposure–response analysis conducted using data from phase III studies, is consistent with a subcutaneous sarilumab 200 mg every 2 weeks dosing regimen, with a decrease to 150 mg every 2 weeks in the event of laboratory abnormalities such as neutropenia. Four covariates were retained in the final models: body weight, baseline RF status, ACCP status, and concomitant methotrexate. There was no clinically meaningful influence of investigated covariates for either model,





Fig. 4 (continued)

**Fig. 5** ANC time profiles (observed vs. model predicted). *ANC* absolute neutrophil count, *P5* 5th percentile, *P95* 95th percentile, *q2w* every 2 weeks



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indicating dose adjustments are not required for these patient characteristics.

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Data availability Qualified researchers may request access to patientlevel data and related study documents, including the clinical study report, study protocol with any amendments, blank case report form, statistical analysis plan, and dataset specifications. Patient-level data will be anonymized and study documents will be redacted to protect the privacy of trial participants. Further details on Sanofi's data sharing criteria, eligible studies, and the process for requesting access can be found at: https://www.clinicalstudydatarequest.com

#### **Compliance with Ethical Standards**

**Conflict of interest** Christine Xu and Vanaja Kanamaluru are employees of Sanofi Genzyme and may hold stock and/or stock options in the company. Lei Ma was an employee of Sanofi Genzyme at the time of this work and may hold stock and/or stock options in the company. Anne Paccaly is an employee of Regeneron Pharmaceuticals, Inc and may hold stock and/or stock options in the company. None of the authors have any non-financial conflicts of interest to disclose.

**Ethics approval** For each individual study, all procedures were in accordance with the ethical standards of the relevant institutional and/ or national research committee and with the 1964 Declaration of Helsinki and its later amendments or comparable ethical standards.

**Consent to participate** Informed consent was obtained from all individual participants included in the individual studies.

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