

Research Article

Theme: Leveraging BCS Classification and in-silico Modeling for Product Development
Guest Editors: Divyakant Desai, John Crison, and Peter Timmins

Utility of Physiologically Based Modeling and Preclinical *In Vitro/In Vivo* Data to Mitigate Positive Food Effect in a BCS Class 2 Compound

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Abstract. Physiologically based pharmacokinetic (PBPK) modeling has become a useful tool to estimate the performance of orally administered drugs. Here, we described multiple *in silico/in vitro/in vivo* tools to support formulation development toward mitigating the positive food effect of NVS123, a weak base with a pH-dependent and limited solubility. Administered orally with high-fat meal, NVS123 formulated as dry filled capsules displayed a positive food effects in humans. Three alternative formulations were developed and assessed in *in vitro* and *in vivo* preclinical and/or clinical studies. By integrating preclinical *in vitro* and *in vivo* data, the PBPK model successfully estimated the magnitude of food effects and the predicted values were within $\pm 30\%$ of the observed results. A model-guided parameter sensitivity analysis illustrated that enhanced solubility and longer precipitation times under fed condition were the main reason for enhanced NVS123's exposure in presence of food. Eventually, exposure after an amorphous formulation was found to be not significantly altered because of remarkably enhanced intestinal solubility and reduced precipitation. Gastroplus population simulations also suggested that the amorphous formulation is promising in mitigating a clinically significant food effect. Overall, these efforts supported the rationale of clinical investigation of the new formulation, and more importantly, highlighted a practical application of PBPK modeling solving issues of undesirable food effects in weakly basic compounds based on preclinical *in vitro/in vivo* data.

KEY WORDS: amorphous formulation; food effects; physiologically based pharmacokinetic (PBPK) modeling; population simulation; precipitation.

INTRODUCTION

Food can induce various changes in physiological conditions, such as delayed gastric emptying, change of gastrointestinal (GI) pH, stimulation of bile flow, and interaction of intestinal influx or efflux transporters (1–4). Briefly, a food effect is manifested if the 90% confidence interval (CI) for the ratio of population means between fed and fasted treatments fails to meet the limits of 80–125% for either area under the curve (AUC) or maximum concentration (C_{\max}) (4). Positive food effects are commonly seen for Biopharmaceutics Classification System (BCS) Class 2 drugs which have low solubility and high permeability (2,5) and positive food

effects occur when a higher systemic exposure is observed under fed conditions compared with the fasted state. When a Class 2 drug is administered shortly after a meal is ingested, food may enhance the solubilization of drug in the intestinal lumen (e.g., via the formation of micelle) and inhibit the efflux transporters in the intestine, and thus improve the absorption. Conversely, food can delay gastric emptying and prolong intestinal transit time, resulting in a delayed t_{\max} of the drug product. Weak bases can be Class 2 compounds, and they can be highly soluble in the low-pH environment of the fasted stomach but poorly soluble at higher pH in the intestine. Therefore, in the presence of meal, compounds of weak bases are susceptible to variable dissolution and intestinal precipitation due to changes in GI pH and stimulated secretion of bile salts.

Compound NVS123 (Table 1) is a weakly basic, BCS Classes 2 to 4 molecule with a steep pH-dependent solubility profile where solubility limits for drug dissolution above pH 4 and the solubility can be as low as ~ 1 $\mu\text{g/mL}$ at pH 7. Moreover, while NVS123 dissolution in 0.1 N HCl or simulated gastric fluids (SGF) is nearly complete within 30 min, most dissolved drug can be susceptible for rapid precipitation in intestinal fluid. Hence, such a drug may be prone to incomplete oral absorption, reduced systemic exposure, and lack of dose proportionality in clinical trials. NVS123 is mainly eliminated by hepatic metabolism mediated by CYP3A4 and is not a substrate for intestinal efflux transporters (e.g., P-gp). A

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clinical food effect study using dry filled capsules showed a significant increase in C_{\max} and AUC by 1.8- and 1.6-fold after a high fat meal, respectively. The compound has a somewhat narrow therapeutic index, and thus high C_{\max} is undesirable. In this paper, we describe the application of biopharmaceutical tools such as *in vitro* two-step dissolution, canine food effect model, and physiologically based absorption simulation to support development of a solid dosage form to overcome the positive food effect. Prior publications have also reported the utility of physiologically based pharmacokinetic models (PBPK) to quantitatively predict the magnitude of food effects and estimate the concentration *vs.* time profiles for compounds in development project (6–8). However, few attempts have been considered to predict the effect of meal for formulations which contain various excipients and complex matrices. We hereby describe a novel PBPK model approach to guide the formulation design for mitigation of positive food effects by combining the *in vitro/in vivo* data. In addition, this mechanism-based PBPK model simulated the human concentration *vs.* time profiles of a promising dosage form of NVS123 in the presence or absence of meal, which laid the theoretical foundation for a future pivotal clinical study to evaluate the performance of the formulation on suppressing the food effect.

MATERIALS AND METHODS

Chemicals and Reagents

NVS123 was provided by Novartis Pharmaceuticals Corporation (East Hanover, NJ). All other reagents and chemicals were at least ACS reagent grade. Pentagastrin was purchased from Sigma (St. Louis, MO). The human FDA diet (two eggs, two bacon strips, two pieces of toast with butter/jelly, two slices of white bread hash brown potatoes, and 8 oz whole milk) was prepared on site, homogenized, and weighed about 580 g with ~1,100 calories. A custom high-fat dog food (~50 g) was scaled down from human FDA high diet (Sodexo Services, Wallingford, CT).

Computer Hardware and Software

GastroPlus (version 7.0, Simulations Plus, Inc, CA, USA) was run on a Lenovo computer with Intel® Core™ i5 processor. This program enables the prediction of rate and extent of oral drug absorption from the GI tract using the Advanced Compartmental Absorption Transit (ACAT) model based on an earlier absorption model originally established by Yu and Amidon (9). With the input of physicochemical properties (e.g., solubility, permeability, $\text{Log}P$, $\text{p}K_a$, and particle sizes), dissolution rates for solid formulations, and systemic PK parameters human concentration time profiles can be generated.

Formulations

Several NVS123 formulations were developed. A dry filled capsule (F1) was initially used for clinical evaluation, where the active drug substance was mixed with regular fillers and lubricants (e.g., lactose and magnesium stearate). In our early clinical studies, significant food effect is still the major obstacle for the improvement of patient compliances (the capsule must be taken without food). To address the positive food effect in the clinic,

three new capsule formulations for NVS123, including solid suspended formulation (F2), roller compaction (F3), and amorphous formulation (F4), were also sequentially developed. The crystalline form was used as the active pharmaceutical ingredient (API) for F1, F2, and F3. Clinical food effect data were available for F1, F2, and F3; F4 was only evaluated preclinically.

Two-Step *In Vitro* Dissolution and Precipitation Studies

The dissolution and precipitation behaviors of each formulation were evaluated using a two-step dissolution method. The USP type II dissolution apparatus was used for this study. Initially, the drug dissolution profiles under fasted or fed states were investigated with one unit of drug product (200 mg) in 250 ml of SGF media at a rotating speed of 100 rpm at 37°C. After 60 min, the pre-warmed (37°C) fasted or fed simulated small intestinal fluid (FaSSIF or FeSSIF) medium (2×, 250 mL) was added into the beaker under quick stirring for about 1 min. The pH in the mixture was adjusted to 6.8 or 5.8 by addition of 10 M NaOH for FaSSIF or FeSSIF medium, respectively. A 0.5-mL sample of the solution was taken out periodically from 0 to 180 min, and the same amount of the medium at the same temperature was replaced. The samples (~100 μL) were immediately filtered through a 0.45- μm PVDF filtration membrane. The filtrates were diluted with suitable volume of acetonitrile and the concentration of NVS123 was determined using HPLC with a UV detector.

Bridging *In Vitro*–*In Vivo* Dissolution

When evaluating the *in vivo* performance of formulations with complex excipients, understanding the relationship between *in vitro* and *in vivo* dissolution is a prerequisite for estimation of the drug input rate into the systemic circulation. It is well known that dissolution testing conditions (e.g., medium composition, paddle speed, apparatus, *etc.*) affects the *in vitro* dissolution rate which can be significantly different from apparent *in vivo* profiles. Such disconnection may be more pronounced under fed condition than under fasted condition. Immediately after food is ingested, the gastric pH increases from the basal values (~1 to 2 in the fasted stomach) because gastric acid is instantly buffered by meal constituents and then gradually decreases and returns to basal level because of increased gastric acid secretion stimulated by meal; the time required for latter process may be highly dependent on the type of meals (10). Therefore, considering that the complex GI physiology changes under fed conditions, it is difficult to anticipate the *in vivo* dissolution kinetics of a weakly basic compound based on the results of *in vitro* assays where dissolution media with fixed pH values are typically used. We optimized the parameter of the Weibull equation (11) using the Gastroplus optimization module to identify the best *in vivo* relevant dissolution profile (as *.crd files) that can capture the absorption phase of PK data. Briefly, the GastroPlus ACAT model which incorporated *in vitro* dissolution profiles described by the Weibull equations was used to predict the systemic availability *vs.* time curves. Conversely, the observed concentrations *vs.* time curves were deconvoluted to generate the systemic availability *vs.* time profiles. When the systemic availability as predicted by Gastroplus is in agreement with the deconvoluted systemic availability, the *in vitro* and *in vivo*

Table I. Physicochemical and Biopharmaceutical Properties of NVS123

Input parameter	Values
Caco-2 permeability	1.6×10^{-4} cm/min
Human permeability	10×10^{-3} cm/min
Dog effective permeability	30×10^{-3} cm/min
Molecular weight	>450
LogP	>4.5
pK_a	3–3.5
Mean particle size	20 μ m
pH-solubility profile	
pH 1.0	2 mg/mL
pH 6.8 (crystalline)	1 μ g/mL
pH 6.8 (amorphous)	0.01 mg/mL
Blood/plasma ratio ($R_{b/p}$)	0.7
Plasma unbound (%)	2
First-pass hepatic extraction (%)	7.0
Human plasma clearance (mL/min/kg)	1.0
Human volume of distribution (L/kg)	1.5

dissolution can be well correlated. Otherwise, the Weibull parameters of the dissolution profiles need to be adjusted to describe the deconvoluted *in vivo* dissolution profiles. For BCS Class 2 compounds, such as weak bases, the most common adjustment of dissolution curve for fed PK prediction is to decrease the release rate of the compound by increasing the time scaling and shape factors in the Weibull equations.

Dog Studies and Pharmacokinetic Analysis

All animal studies were conducted with the approval of Animal Care and Use Committee of Novartis or the contract research organization where we outsourced one arm of the dog study. The animal experiments are conducted in full compliance with local, national, ethical, and regulatory principles and local licensing regulations, per the spirit of Association for Assessment and Accreditation of Laboratory Animal Care. Beagle dogs ($n=4$ or 5) were dosed in a nonrandomized, single-sequence design, with at least a 7-day washout between treatments. Each dog received an intramuscular dose of pentagastrin (6 μ g/kg) 30 min prior to doing or feeding. For the fasted arm, dog was restrained from food overnight before the dosing and until 4 h after the dose. For the fed arm, the human FDA high-fat meal was homogenized (~580 g of paste and ~1,000 cal/serving), and an aliquot of 50 g of paste (~95 cal/serving) was given to dogs immediately after the administration of pentagastrin. All dogs completed the meal in 10 min. After dosage forms were orally administered, a 50-mL of sterile water was administered by oral syringe. Approximately 1.5–3 mL of venous whole blood was collected at 0 (pre-dose), 0.083, 0.25, 0.5, 1, 2, 4, 6, 8, 12, 24, and 48 h post-dose. Water was provided *ad libitum*. No sedatives or anesthetics were used for dosing purposes. The dog PK profiles after a single intravenous bolus dose of 1 mg/kg has also been studied previously. The serum concentrations of NVS123 were measured using a validated liquid chromatography/electrospray ionization tandem mass spectrometry (supplemental materials). The dog food effect studies for F1, F2, and F3 formulation were conducted internally while the dog

study for F4 was outsourced and conducted in a contract research organization under good laboratory practice.

Food Effect Studies in Healthy Subjects

A randomized, open-label, two-arm, four-period cross-over study was conducted to determine the effect of food on the pharmacokinetics after a single 200-mg oral dose of F1, F2, and F3 in healthy subjects. This study was conducted in accordance with the ethical principles of the Declaration of Helsinki. The study protocol and informed consent forms were approved by the local institutional review board.

The participants were healthy male or female subjects between 18 and 65 years of age without significant deviation from normal in medical history, physical examination, vital signs, cardiograms, and clinical laboratory determination. Subjects were not allowed to take any CYP3A4 enzyme inducing or inhibiting drugs within 4 weeks prior to study. In addition, no prescription drugs were allowed within 2 weeks prior to dosing, and no over-the-counter medication and herbal supplements were permitted within 72 h prior to dosing.

The healthy volunteers received the F1 capsule or two new formulations (e.g., F2 and F3) during four study periods and two treatment arms per the following regimens: (A1) a single oral dose of 200 mg F1 capsule was administered under fasted conditions (after an overnight fast of ~10 h), (B1) a single oral dose of 200 mg F1 capsule was taken under fed conditions (30 min after a FDA human high-fat meal with about 1,000 calories and 50% fat), (C1) a single oral dose of 200 mg F2 capsule under fasted conditions, and (D1) a single oral dose 200 mg F2 capsule under fed conditions; (A2) same dosing regimen as A1, (B2) same dosing regimen as B1, (C2) a single oral dose of 200 mg of F3 capsule under fasted conditions, and (D2) a single oral dose of 200 mg F3 capsule under fed conditions. A total of 40 healthy adult subjects were randomly assigned in equal numbers to four sequences of regimens A1, B1, C1, and D1 for treatment arm 1 and regimens A2, B2, C2, and D2 for treatment arm 2 of the study. Each dose of NVS123 was taken orally with 240 mL of water (see [Electronic Supplementary Materials](#) for sample size selection). All subjects were allowed to consume a standard lunch 4 h after the dose. The blood samples were scheduled to be collected pre-dose and at 0.5, 1, 2, 3, 4, 5, 6, 8, 10, 12, 24, 36, and 48 h post-dose. A 12-day washout period was applied to separate each dosing regimen assigned for each subject. The plasma concentrations of NVS123 were measured using a validated liquid chromatography/electrospray ionization tandem mass spectrometry (see [Electronic Supplementary Materials](#)).

Data Analysis of Observed and Simulated PK Data

The plasma concentration vs. time data were analyzed with noncompartmental analysis methods to calculate the PK parameters (e.g., AUC, C_{max} , t_{max} , etc.) using WinNonlin Phoenix software v6.1 (Pharsight Corporation, Mountain View, CA). To assess the food-related effects on NVS123 PK, a linear mixed effects model was fitted to the log-transformed PK parameters of $AUC_{0-\infty}$ and C_{max} of NVS123 using SAS 9.0 (SAS Institute Inc., Cary, NC, USA). In this model, sequence, period, and treatment were included

as fixed effects and subject was considered as a random effect. A food effect was identified if the fed state/fasting state arithmetic mean ratios of $AUC_{0-\infty}$ and C_{max} and their 90% confidence intervals were below 0.80 or above 1.25.

PK and Absorption Simulations

Biopharmaceutical Characterization of NVS123 Formulations

The performance of the formulations was simulated or modeled using ACAT model in GastroPlus v8.0. The model consisted of the numerical integration of differential equations to quantitatively describe multiple drug absorption processes, including release, dissolution, precipitation, re-dissolution, luminal degradation, and passage across GI membranes. The default GI physiology parameters under fasted and fed conditions within the ACAT model were used based on the average values obtained from published population data, including pH, volume, length, radius, transit time, and bile salt concentration. The physiology parameters used in the GastroPlus ACAT model have been listed in Table S1.

The experimental *in vitro* dissolution profiles for all formulations (Fig. 1) in SGF were incorporated directly in GastroPlus program under both fasted and fed condition. The *in vitro* dissolution profiles of each formulation in simulated gastric fluid were loaded as *.dsd files for both dog and human models. The Weibull release functions were then used to fit the *in vitro* dissolution data and the resulting Weibull release profiles (regarded as a dissolution profile) were further incorporated in the model as *.crd file. When needed, the Weibull release parameters for each dosing cohort (e.g., formulation and fasted/fed) were optimized to provide reasonably closest simulation to the observed mean PK profile after judged by visual inspection, correlation coefficient (R^2) between predicted and observed profiles, root of mean squared prediction error (RMSE), and the prediction deviation of the key PK parameters (C_{max} , t_{max} , and AUC). According to measured FaSSIF and FeSSIF solubilities, the solubility at a particular pH and bile salt concentrations at each GI segment was approximated using the following equation:

$$C_{sx} = C_{so} + SR \times SC_{aq} \times M_w \times [NaTC] \quad (1)$$

where [NaTC] is the millimolar concentration of sodium taurocholate used in the dissolution medium or defined in the GI compartment in the GastroPlus ACAT model, C_{sx} and C_{so} are the predicted drug biorelevant solubility and the intrinsic aqueous solubility in the unit of mg/ml, respectively, M_w is the molecular weight, SR is the bile salt solubility ratio, which can be estimated based using the equation developed by Mithani et al. (12).

Drug precipitation was described by the mean precipitation time (T_p) which represents mean time for particles to precipitate from solution when the local concentration exceeds the drug solubility. For BCS Class 2 weak basic compounds with pH-dependent solubility, like NVS123, compounds are susceptible for rapid precipitation in intestinal fluid. Under the fasted state, a relatively short precipitation time in intestinal is expected, whereas, under the fed state, bile

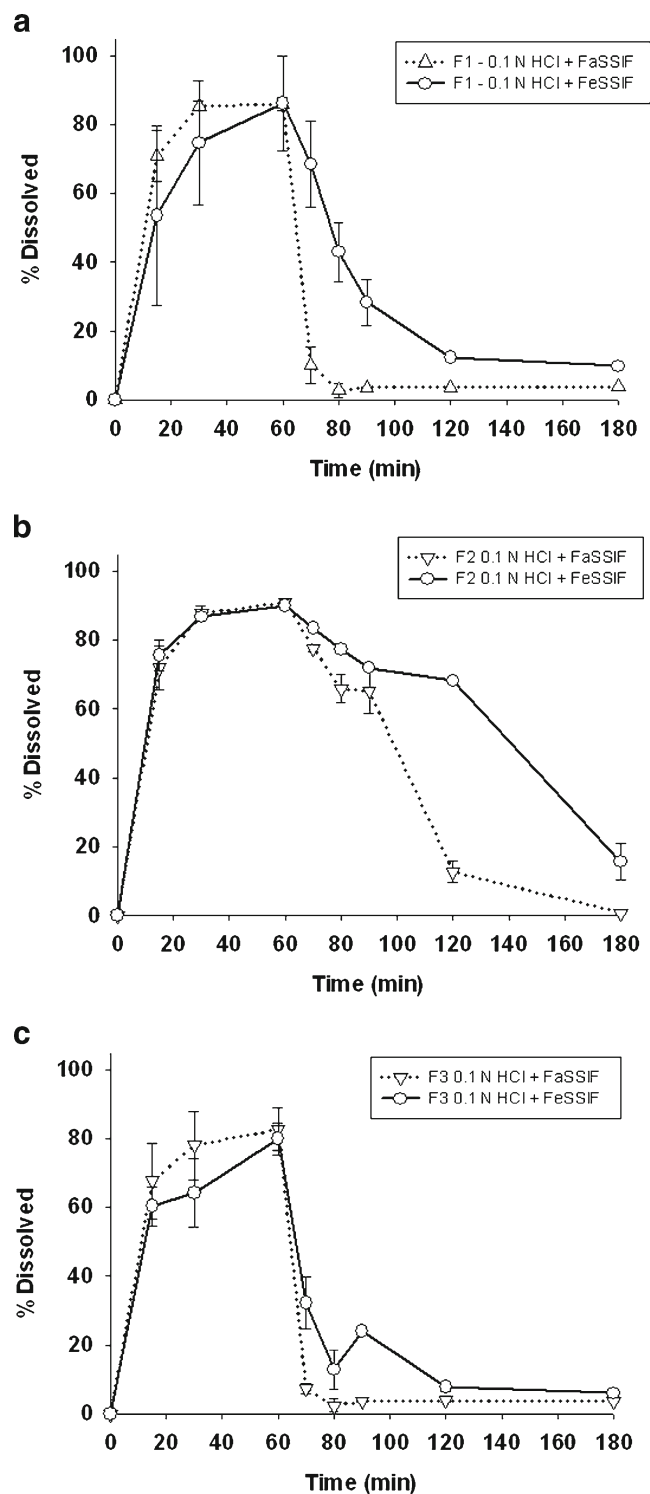


Fig. 1. *In vitro* two-step dissolution/precipitation profiles of three formulations of NVS123, including F1 (a), F2 (b), and F3 (c) formulations in SGF/FaSSIF or SGF/FeSSIF media

acids stimulated by food will sometimes slow the precipitation or stop it completely, resulting a relatively longer precipitation time. The values of T_p are difficult to measure quantitatively *in vitro* and were fitted against the observed data. Additionally, it was more important to know how to estimate the T_p values in human model based on the preclinical data. Dogs

have been used as surrogates to predict human food effects for multiple compounds (13,14), with adjustments of meal amount (e.g., 50 g) and doses along with a reduction of gastric pH using pentagastrin. With efforts to optimize a predictive canine food effect model, we may reasonably assume that T_p is likely similar between dogs and humans when preclinical studies are well designed. The values of mean T_p were optimized to fit to the dog concentration-time profile following each dosage regimen as dosing formulation under fasted or fed conditions using ACAT dog models. Then, the obtained values of T_p in dog models were incorporated in human GastroPlus model to simulate the absorption under corresponding dosing scenarios. By comparing the simulated results with observed human data, we could establish that T_p between dogs and humans may be similar. The precipitated drug particles were then assumed to be re-dissolved with the dissolution rate described by Wang-Flanagan model as follows (Eq. 2)

$$\frac{dM_D}{dt} = \frac{3D_w}{\rho} \times \frac{1}{r_t} \times \left(\frac{1}{r_t} + \frac{1}{T} \right) \times (C_s - C_l) \times M_{u,t} \quad (2)$$

where M_D is the dissolved amount, $M_{u,t}$ is the undissolved amount at time t , C_s is the solubility at a particular pH, C_l is the concentration of dissolved drug in gut lumen, ρ is the drug density, D_w is the diffusion coefficient, r_t is the current particle radius, and T is the diffusion layer thickness which is equal to the particle radius (15).

Disposition Parameters for NVS123 in Humans

PK data after oral administration of the F1 in each study arm under fasted state were fitted by compartmental PK model using PKPlus™ (Simulation Plus, CA, USA). It was found that one-compartmental disposition model with first-order absorption can well describe to the plasma concentration vs. time data. The oral human PK parameters were then calculated (arm 1: $V/F=5.07$ L/kg, $CL_{po}=CL_{iv}/F=0.219$ L h⁻¹ kg⁻¹; arm 2: $V/F=5.01$ L/kg, $CL_{po}=CL_{iv}/F=0.197$ L h⁻¹ kg⁻¹). The human PK profiles of NVS123 after i.v. doses have not been determined and thus absolute bioavailability data are not available. According to unpublished data from a human absorption, metabolism, and excretion study under fasted conditions, the excretion of intact NVS123 in feces is ~70% of the administered dose. As only ~1% of NVS123 was found in the bile of bile-duct cannulated rats after an intravenous dose (in-house data), hepatobiliary elimination of the parent compounds was assumed negligible in human. Therefore, the fraction absorption (F_a) of NVS123 under fasted state was about 30% based on a human ADME study. Assuming that drug degradation in the GI tract is minimal, the bioavailability (F) of NVS123 can be calculated based on the following equations (Eqs. 3 and 4).

$$F = F_a \times \left(1 - \frac{CL_{iv}/R_{b/p}}{Q_H} \right) = F_a \times \left(1 - \frac{CL_{po} \times F/R_{b/p}}{Q_H} \right) \quad (3)$$

After rearrangement of Eq. 3, we obtained Eq. 4.

$$F = \frac{F_a}{1 + \frac{F_a \times (CL_{po})/R_{b/p}}{Q_H}} \quad (4)$$

where $R_{b/p}$ is the blood to plasma distribution ratio (~0.7 based on an internal *in vitro* assay), Q_H is the hepatic blood flow (1.24 L h⁻¹ kg⁻¹), and CL_{iv} and CL_{po} are the plasma CL after a single intravenous and oral dose, respectively. Based on the calculated F value, the systemic clearance (CL_{iv}) and apparent volume of distribution (V_z) were derived from clinically observed CL_{po} and V_z/F . The calculated pharmacokinetic disposition parameters of NVS123 were summarized in Table 1.

Parameter Sensitivity Analysis

As a rule of thumb, we can assume that fed bioequivalence can be achieved for a BCS Class 2 weak basic drug if the F_a of the drug product is greater than 70% under fasted condition. To design a formulation that can mitigate the positive food effect, it was important to explore the interaction between the *in vivo* solubility and precipitation and their impacts on the extent of absorption. As described previously in Eq. 1, the *in vivo* solubility is assumed to correlate with the intrinsic solubility of the active pharmaceutical ingredient (API) at a particular pH and bile salt concentrations at each GI segment. Therefore, simulations were run using parameters sensitivity analysis (PSA) to compare the sensitivity of F_a to the bile salt SR and mean T_p after a single 200 mg oral dose of IR dosage form under fasted condition. The duodenum solubility, represented as the solubility in the GI tract, can be further calculated using Eq. 1 and simulated SR values. The PSA of F_a was shown in contour plots as a function of duodenal solubility and mean T_p .

Virtual Simulation for Pharmacokinetic Profiles and Fed Bioequivalence Studies

The model was employed to predict exposure in humans for the new formulations, F4. While F4 has been tested in canine food effect model, the human model was established using measured or adjusted *in vitro* dissolution profile and the T_p values fitted from the dog PK data. The population simulator was applied to run a virtual food effect bioequivalent trial simulation with 25 subjects in a crossover design. All selected physiological and PK parameters are randomly sampled from log-normal distribution with defined coefficient of variance of 20–30%. The population simulation can estimate 90% CI of C_{max} , AUC_{0-inf} , and the mean plasma concentration.

RESULTS

In Vitro Two-step Dissolution Tests

The two-step dissolution tests were studied in F1, F2, and F3 formulation to mimic the drug dissolution in stomach as well as the precipitation in small intestine under fasted and fed

conditions. Figure 1 showed the dissolved amount (as percentage of dose) at each time point from these formulations. In all of the tested formulations, NVS123 was nearly completely dissolved (>80%) within 1 h in SGF while precipitated after FaSSIF or FeSSIF were added into the dissolution beaker. It appeared that precipitation rate of NVS123 is slower in FeSSIF medium than that in FaSSIF medium, suggesting that the mean T_p is higher under fed condition than fasted condition in F1, F2, and F3 formulation. These results supported our modeling assumption that the difference of precipitation rate is a key-driven fact for the observed food effect.

Evaluation of the Oral PK and Precipitation Kinetics in Dogs

A two compartmental model best described the concentration-time profiles after an intravenous dose of 1 mg/kg in dogs, and the model was thereby used to calculate the PK parameters, such as CL, V_{ss} , and micro-constants (Table S2). From the observed PK data in dog food effect studies, a high-fat meal increased C_{max} and AUC of F1, F2, and F3 oral formulations, but yielded no significant changes for AUC with the F4 formulation (Table II). Interestingly, for each formulation tested in the dog studies, no significant difference was observed in drug onset (represented by t_{max}) between fed and fasted condition. The calculated PK disposition parameters were then incorporated in the Gastroplus ACAT model. Using the Gastroplus optimization module, the value of T_p was fitted against the mean observed dog oral PK profiles under fasted or fed conditions (Fig. 2). For all simulations for dog PK data, the R^2 was greater than >0.90 and RMSE were in reasonable range (Table II). For all formulations

except for the F4 formulation, the T_p (fitted against dog PK profile data) under the fed state was consistently higher than that under the fasted condition, suggesting that solubilized NVS123 remained in supersaturated state in the intestine for a longer time after high fat meals. Conversely, for formulation F4, T_p was significantly longer under fasted condition (~4,000 s) compared with other formulations and was not influenced by food (Table II).

Development of a Human Physiologically based Absorption Model

Correlations Between *In Vitro* Dissolution Profiles and *In Vivo* Dissolution Rate

The *in vitro* dissolution profiles successfully simulated the drug release and dissolution in all dog studies with and without the food intake. Therefore, we assumed that the changes of systemic exposure caused by meals were mainly associated with precipitation and intestinal solubility. In the clinical study with the F1 formulation, the *in vitro* dissolution appeared to correlate directly with *in vivo* dissolution if the drug product was taken without the food. However, the absorption rate was slower when meal was given prior to the dose, as evidenced by delayed t_{max} . Apparently, the *in vitro* profile tested in SGF (pH 1.6) did not describe the *in vivo* dissolution under fed condition, and hypothetical *in vivo* dissolution profiles (as a *.crd file in Gastroplus) were further optimized to fit the PK data and to match the deconvoluted systemic availability profiles. The adjusted profile reflected at least two dissolution phases in the presence of a high fat meal. Within 1 h after

Table II. Comparison of Simulated (SIM) vs. Observed (OBS) Mean Plasma PK Parameters of NVS123 in Dogs

Parameters	F1		F2		F3		F4	
	OBS	SIM	OBS	SIM	OBS	SIM	OBS	SIM
Dose (mg)								
Fasted	50	50	50	50	50	50	50	50
Fed								
C_{max} (ng/mL)								
Fasted	510	610	670	735	595	737	560	801
Fed	880	920	929	935	934	932	695	720
AUC _{0-inf} ($\mu\text{g}\times\text{h/mL}$)								
Fasted	3.22	3.20	4.57	4.71	3.31	3.81	3.15	2.80
Fed	6.60	6.10	7.02	6.12	7.75	6.16	2.89	3.13
t_{max} (h)								
Fasted	1	1.4	2	1.7	1.5	1.4	1	1.6
Fed	2	2.1	2	2	2	2.2	1.5	2.3
Precipitation time (s) ^a								
Fasted	N/A	1,000	N/A	1,800	N/A	1,500	N/A	4,000
Fed	N/A	3,500	N/A	3,000	N/A	3,000	N/A	4,000
Correlation coefficient (R^2) ^b								
Fasted	N/A	0.98	N/A	0.94	N/A	0.9	N/A	0.91
Fed	N/A	0.9	N/A	0.99	N/A	0.98	N/A	0.92
RMSE ^c								
Fasted	N/A	32.1	N/A	77.7	N/A	99.5	N/A	95.0
Fed	N/A	104	N/A	37.3	N/A	47.3	N/A	77.0

^a Precipitation time (T_p) was fitted against *in vivo* dog PK profiles in the model

^b Correlation coefficient between the observed concentration and simulated values

^c Root mean square prediction error (RMSE) of plasma concentration. $\text{RMSE} = \sqrt{\sum(\text{SIM} - \text{OBS})^2 / N}$ where N is the number of observed data points

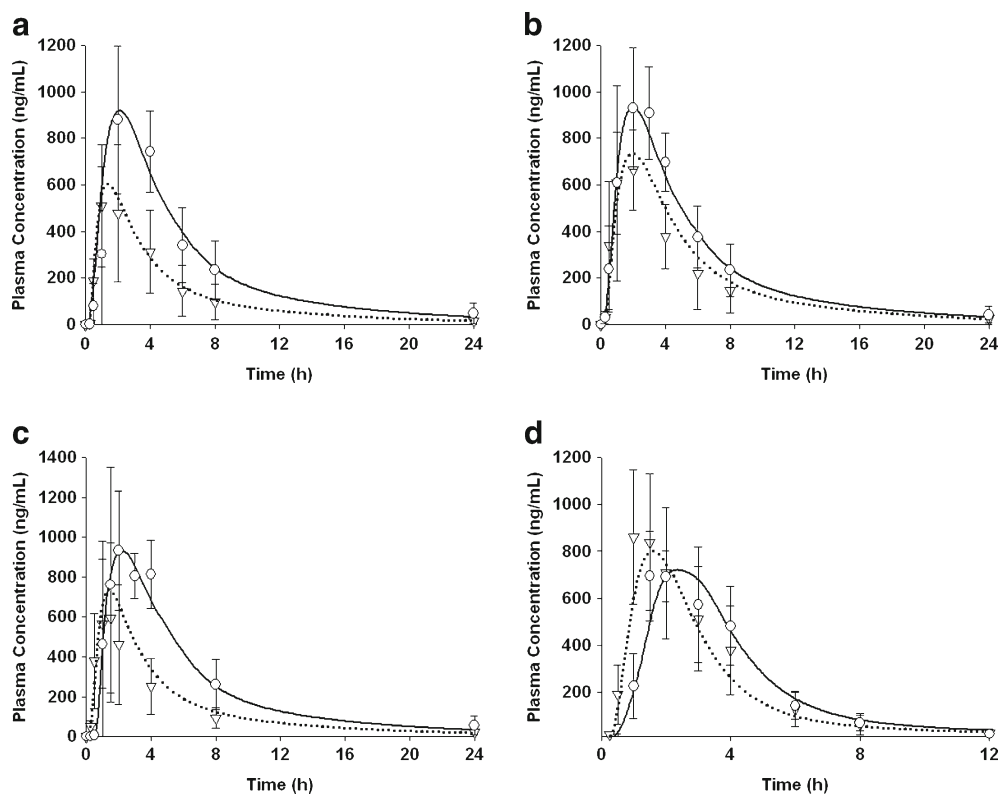


Fig. 2. Observed and simulated mean plasma concentrations after a single administration of 50 mg of NVS123 given as F1 (a), F2 (b), F3 (c), or F4 (d) formulation in dogs under fasted and fed state. Symbol annotation: *open triangles* observed fasted concentration with standard deviation; *open circles* observed fed concentration with standard deviation; *dotted curve* simulated mean fasted concentration; and *solid curve* simulated fed concentration

the dose, only a minor portion (<20%) of the API in the F1 dosage form was dissolved due to increased stomach pH after the meal. After 1 h to 2 h post-dose, the API gradually dissolved, but the rate was ~50% less than that under fasted state (Fig. 3). The simulated *in vivo* systemic availability profile was approximately in agreement with the deconvoluted profile. A similar approach was also successfully used to obtain the optimal dissolution profile for F2 and F3 formulation. Therefore, there was sufficient confidence to apply this approach to simulate the PK of F4 formulation with adjusted fed dissolution profile. The detailed Weibull parameters for different formulations have been listed in Table S3.

In Silico PBPK Absorption Model of Food Effect in F1, F2, and F3 Formulations

The mean PK profiles after oral administration of F1, F2, and F3 were simulated using the PK and physicochemical parameters listed in Table I and physiology parameters in Table S1, under both fasted and fed condition. The model captured the dog and human PK profiles under fasted and fed conditions for all tested formulations (Figs. 2 and 4; Tables II and III). For all simulations for human PK data, the R^2 was greater than >0.91 and RMSE were in reasonable range (Table III). A high-fat meal increased the oral absorption and systemic exposure following the administration of F1, F2, and F3 in dogs and humans. The simulated magnitude of food effects in

human in terms of changes on AUC, t_{max} , and C_{max} was less than 1.5-fold of the observed effects (Table III). The simulated extent of absorption (F_a) were 34.7%, 43.9%, and 38.5% under fasted state while 64.0%, 65.7%, and 59.9% under fed state for F1, F2, and F3 formulation, respectively. Overall, the physiologically based absorption model predicted the *in vivo* performance of new pharmaceutical formulations (e.g., F4) with confidence.

Sensitivity of the Extent of Drug Absorption to T_p and Intestinal Solubility

Although extensive formulation efforts have been made to increase the solubility/dissolution of NVS123 API which partly mitigated food effects, fed bioequivalence has not been achieved. PSA have been proven a potential powerful tool to implement quality by design by validating the key factors related to the formulation performance (16). Here, the PSA was represented by the contour plot under fasted condition with the interaction between duodenum solubility and T_p and their impacts on NVS123's extent of absorption. As expected, the contour plot clearly indicated that the effects of intestinal solubility and T_p were both significant to F_a (Fig. 5). These findings suggested that the ideal dosage form required providing sufficient intestinal solubility and/or mitigating drug precipitation. In general, it is very challenging to design a formulation which can maximize only one factor by either completely suppressing the precipitation ($T_p > 10,000$ s) or

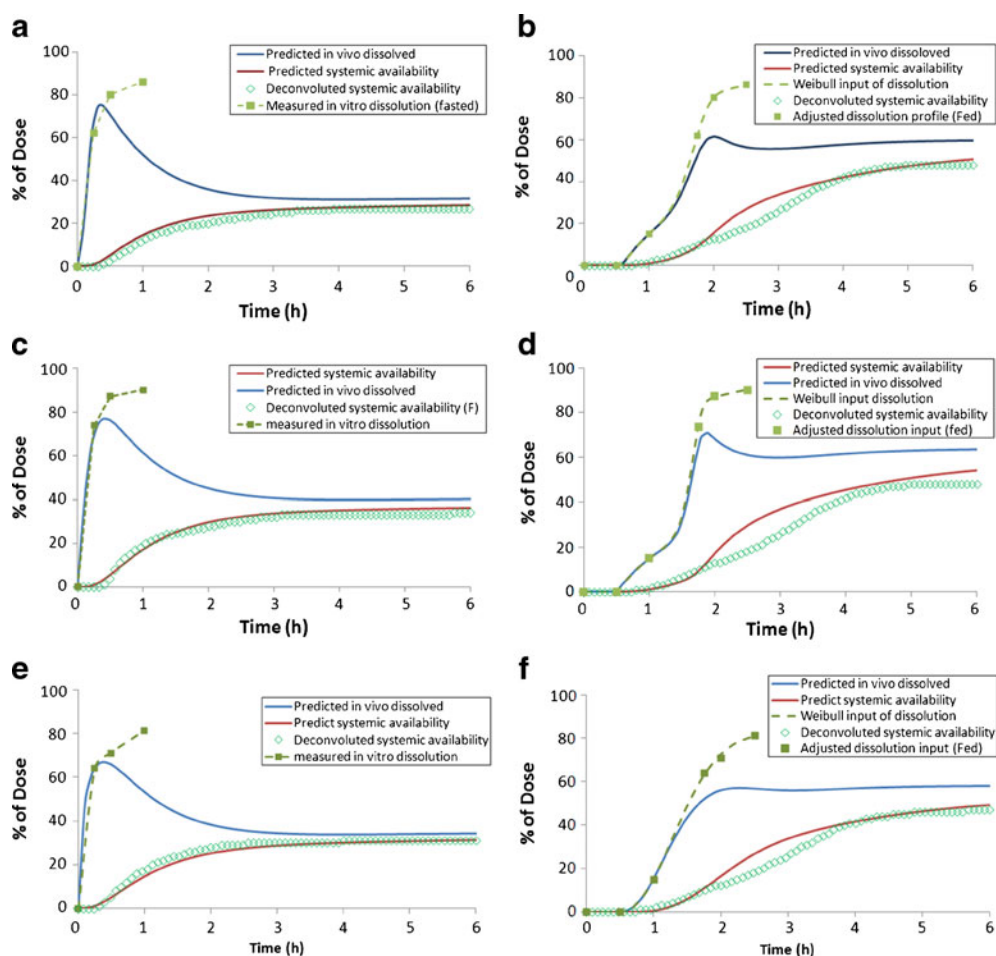


Fig. 3. Comparison of *in vitro* dissolution, adjusted Weibull input dissolution, and predicted *in vivo* dissolution as well as deconvoluted and predicted systemic availability for F1 (a, b), F2 (c, d), and F3 (e, f) formulation under fasted (a, c, e) and fed (b, d, f) state

dramatically enhance the intestinal solubility. A more practical approach is to balance the enhancement of solubility and the inhibition of precipitation. For the formulations with short T_p (e.g., F1, 1,000 s; F2, 1,800 s; and F3, 1,500 s) under fasted state, the targeted duodenum solubility for a favorable F_a under fasted condition ($F_a > 70\%$) is at least larger than 0.15 mg/mL, which is not very practical to achieve. A significantly longer T_p (~4,000 s) under fasted state was estimated in the dog study for formulation F4, and thereby a lower targeted solubility (>0.07 mg/mL) will be sufficient to reach desirable F_a . Based on the Eq. 1, theoretically calculated duodenum solubility of NVS123 in F4 is about 0.072 mg/mL. Therefore, F4 is likely a promising formulation with high *in vivo* absorption (>70% F_a) in the fasted state thus potentially eliminating the positive food effects. Overall, this knowledge provided important insights into formulation design and further allowed the formulation scientists to justify the acceptance criteria for the key factors contributing to the desired *in vivo* performance of drug products.

Virtual Food Effect Studies for the F4 Formulation

As observed in the preclinical food effect study, no significant PK shift was observed with F4 in presence and absence of a

meal. A theoretical understanding of the experimental results in the dog studies has also been manifested by the PSA. To validate further our predictions that could be influenced by other counteracting effects, virtual population food-effect bioequivalence trials were conducted. These virtual population studies randomly incorporate related parameters with predefined distribution to perform a stochastic simulation in which counteracting effects of many sensitivity parameters can be examined (16). The virtual tests were conducted after a single dose of 200 mg F4 formulation under fasted and fed state. The *in vitro* dissolution profile was directly used to simulate the PK profile under fasted condition while the dissolution profile was adjusted similarly as described previously in the simulation under fed condition (Fig. 6a). The F4 population food effect trials showed that food did neither significantly alter C_{max} nor AUC of NVS123 using the 80–125% criteria whereas the upper 90% CI of C_{max} and AUC ratio (fed vs. fasted) was slightly above the upper BE limits (Table IV; Fig. 6b). The mean values of F_a for F4 formulation were predicted to be 79.5% and 86.3% under fasted and fed state, respectively. This virtual simulation suggested that F4 formulation may be promising to eliminate clinically significant food effects. As a result of the modeling, a clinical study was proposed with the F4 formulation.

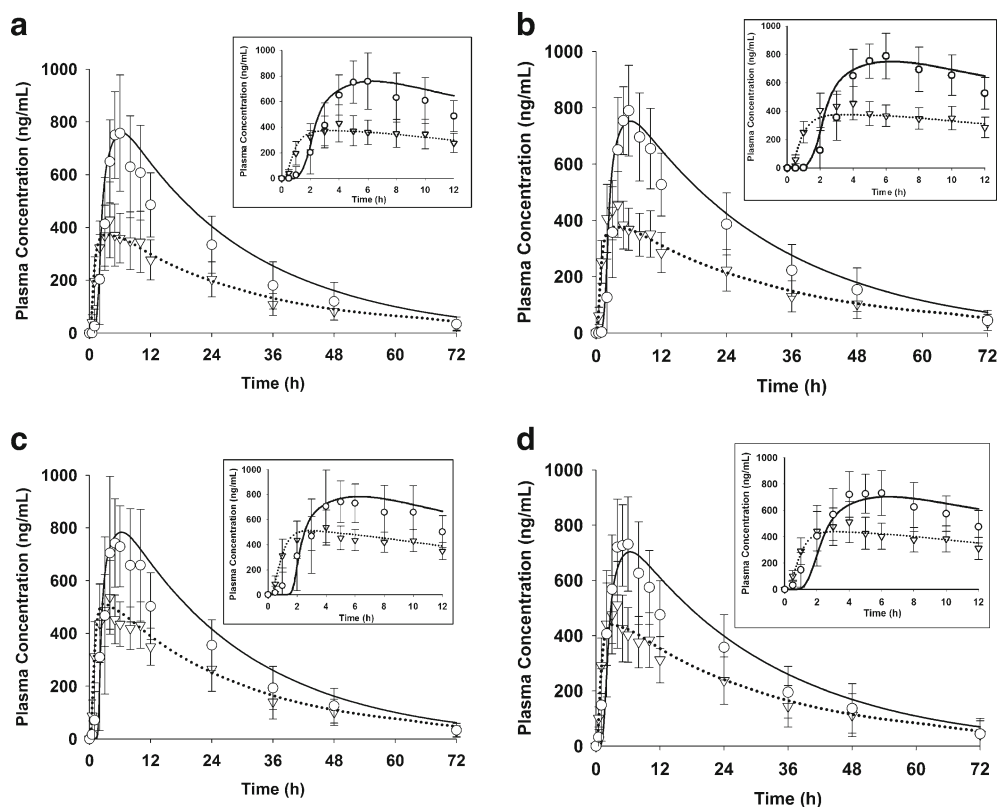


Fig. 4. Observed and simulated mean plasma concentrations after a single administration of 200 mg of NVS123 given as F1-arm 1 (a), F1-arm 2 (b), F2 (c), or F3 (d) formulation in humans under fasted and fed state. Symbol annotation: *open triangles* observed fasted concentration with standard deviation; *open circles* observed fed concentration with standard deviation; *dotted curve* simulated mean fasted concentration, and *solid curve* simulated fed concentration. *Insert panel:* observed and simulated mean plasma concentrations of each formulation from 0 to 12 h

DISCUSSION

Presence of a food effect can affect drug labeling (4) and convenience to the patient. A positive food effect is manifested by a higher systemic exposure when the drug is given with food compared with the fasted state and is mainly seen for BCS/BDDCS 2 drugs, such as NVS123. This work reported the utility of PBPK modeling for the formulation development of solid dosage formulations of a weakly basic compound. The *in silico* absorption model was developed based on the preclinical *in vitro* and *in vivo* findings. Based on the *in vitro* two-step dissolution/precipitation and *in silico* predicted biorelevant solubility, we have demonstrated that solubility and precipitation can significantly influence absorption and exposure in the fasted state. Under fed state conditions, NVS123 is anticipated to have higher solubility in the GI tract and may be supersaturated in the intestine for a longer time after high fat meals. According to our mechanistic understanding of the positive food effect of NVS123, we started the modeling with the market formulation of dry filled capsule (F1) in the canine food effect data, to generate T_p , a key parameter, for the human model. In addition, NVS123 drug dissolution behavior tends to be influenced by the food and formulations. The Gastroplus ACAT model was used to establish correlation between *in vitro* and *in vivo* dissolution. The food-related delayed drug dissolution was captured by

adjusting dissolved % vs. time profile with multiple phases of dissolution rates. Using these approaches, the current model successfully simulated the absorption and concentration vs. time curves for F1, F2, and F3 formulation under both fasted and fed condition.

One of the major challenges in developing a PBPK model is to estimate key parameters that are not easily measured directly, such as precipitation time and solubility in the GI tract. Preclinical animal models have been widely used to evaluate the performance of new dosage forms to support the decision-making for subsequent clinical study. However, most of the studies use the animal model as surrogates to estimate qualitatively the clinical outcomes in human. Here, we propose a method to estimate human precipitation time under fasted and fed condition by fitting PK data from dog food effect studies. Dog is the most studied species for predicting human food effects (17–19) because clinical service forms (e.g., capsule or tablet) can be directly administered to dogs. The T_p obtained from the optimized dog model was further incorporated into the human model and the resulted human model captured the mean observed data reasonably well under fasted and fed conditions for all of the three formulations. A high-fat meal increased the extent of absorption following the administration of F1, F2, and F3 formulation in dogs and humans. For all of the formulations tested in the clinic, the predicted T_p under fed

Table III. Comparison of Simulated (SIM) vs. Observed (OBS) Mean Plasma PK Parameters of NVS123 in Humans

Parameters	F1 (Arm 1)		F1 (Arm 2)		F2		F3	
	OBS	SIM	OBS	SIM	OBS	SIM	OBS	SIM
Dose (mg)								
Fasted	200	200	200	200	200	200	200	200
Fed								
C_{max} (ratio)								
Fed vs. fasted	1.76	2.03	1.72	2.05	1.38	1.53	1.38	1.66
FE of prediction ^a	1.16		1.19		1.11		1.21	
AUC _{0-inf} (ratio)								
Fed vs. Fasted	1.57	1.84	1.58	1.84	1.33	1.51	1.37	1.57
FE of prediction ^a	1.17		1.17		1.13		1.15	
t_{max} (ratio)								
Fed vs. fasted	1.50	1.91	1.50	1.80	1.25	2.25	1.50	2.06
FE of prediction ^a	1.27		1.20		1.80		1.38	
F_a (%)								
Fasted	N/A	34.7	N/A	34.7	N/A	43.9	N/A	38.5
Fed	N/A	64.0	N/A	64.0	N/A	65.7	N/A	59.9
F (%)								
Fasted	N/A	32.1	N/A	32.3	N/A	40.5	N/A	35.9
Fed	N/A	59.2	N/A	59.7	N/A	60.7	N/A	55.8
Precipitation time (s) ^b								
Fasted	N/A	1,000	N/A	1,000	N/A	1,800	N/A	1,500
Fed	N/A	3,500	N/A	3,500	N/A	3,000	N/A	3,000
Correlation coefficient (R^2) ^c								
Fasted	N/A	0.95	N/A	0.93	N/A	0.97	N/A	0.96
Fed	N/A	0.93	N/A	0.91	N/A	0.93	N/A	0.92
Root mean squared prediction error (RMSE) ^d								
Fasted	N/A	28.3	N/A	32.8	N/A	30.4	N/A	28.2
Fed	N/A	81.3	N/A	71.8	N/A	81.4	N/A	84.5

^a Fold error (FE) of the prediction. $FE = 10^{|\text{Log}(\frac{\text{Predicted}}{\text{Observed}})|}$

^b Precipitation time (T_p) in the human model was assumed to be similar to that in the dog model because of relatively similar intestinal pH and bile salt concentration. This assumption was verified by comparison of simulated and observed PK profiles (Fig. 3) and parameters (Table III)

^c Correlation coefficient between the observed concentration and simulated values

^d Root mean squared prediction error (RMSE) of plasma concentration. $RMSE = \sqrt{\frac{\sum (SIM - OBS)^2}{N}}$ where N is the number of observed data points

state were consistently higher than the values under fasted conditions. The simulated results support the fact that meals can stimulate bile flow and enhance solubility of poorly water-soluble compound in small intestine. The predicted magnitude of these food effects on AUC and C_{max} fell in less than 1.3-fold of the observed effects. This success case study has proved that the key parameters (e.g., T_p) in human PBPK model can be successfully estimated using preclinical PBPK model and results. On the other hand, the prediction accuracy using such an approach may depend on the compound properties and formulations. It is also critical that human relevant disposition parameters and physicochemical properties are used.

PSA plays an important role in the modeling and simulation process. It can provide the fundamental understanding of mechanism of absorption for particular drug products, which further guide the formulation strategy. The current PSA was depicted using a contour plot to illustrate the potential region with optimal intestinal solubility and precipitation time which is targeted by the further formulation design. Based on this analysis, if only focusing on the solubility enhancement, it may nearly impossible to design a formulation that can dramatically

increase the drug intestinal solubility over 0.25 mg/mL which is about >250-fold higher than the buffer solubility (1 $\mu\text{g/mL}$ at pH 7). A promising formulation design will need to balance the precipitation suppression and

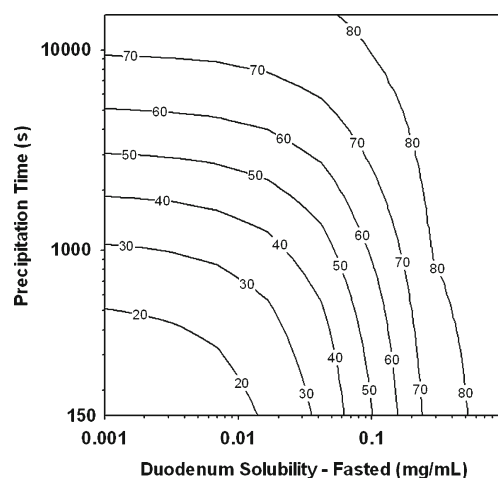


Fig. 5. Sensitivity analysis displayed as contour plot of fraction absorbed (F_a) as a function of precipitation time and duodenum solubility under fasted state (200 mg)

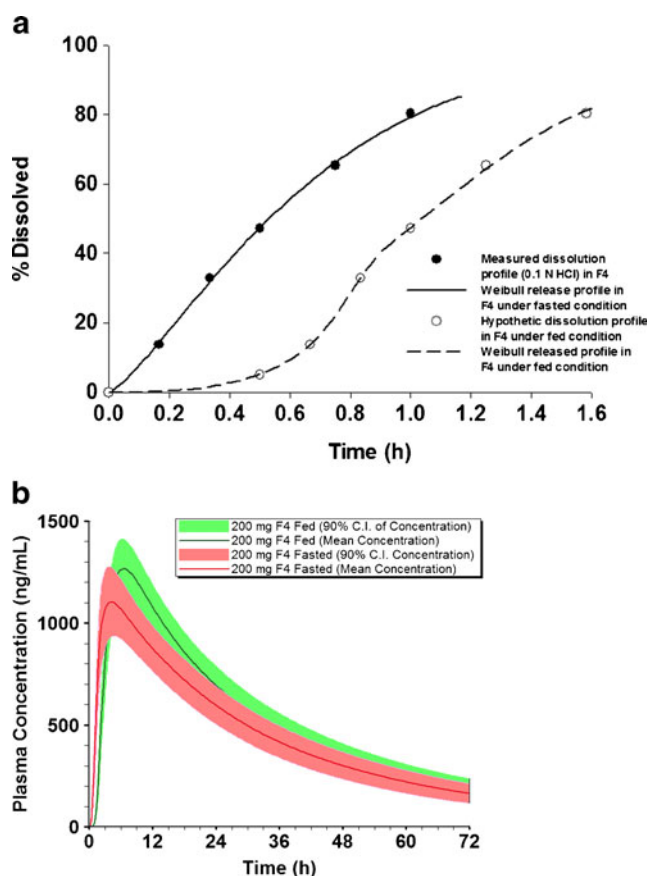


Fig. 6. **a** Comparison of *in vitro* dissolution and adjusted Weibull input dissolution for F4. **b** Simulated plasma concentration with 90% confidence interval (CI) after a single dose of F4 formulation (200 mg) under fasted and fed state

solubility enhancement. The positive food effects was partially reduced in the F2 and F3 formulation but not fully eliminated. These two formulations improved API GI solubility to some extent under fasted condition, whereas the API GI solubility under fed condition was also improved significantly. As the higher solubility under fasted conditions was not sufficient to enhance the F_a over 70%, the positive food effect remained. Another promising method of enhancing the solubility is to use different polymorphs for API, such as amorphous forms. It was found that AUC and C_{max} of F4 formulation were not significantly changed under fasted and fed condition in dogs, indicating that the new amorphous form dramatically improved the solubility/dissolution and reduced prolonged precipitation

(evidenced by fitted $T_p > 4,000$ s in dog model) of NVS123 in the intestine. As a result, the absorption is nearly complete (>87%) in the dog model under either fasted or fed state conditions. Prior to the clinical study, population simulations were conducted to estimate the clinical PK outcomes and potential clinical food effects. However, a debatable point of using pre-clinical canine models for evaluation of the formulation performance is whether the absorption and metabolism are different between different species. To this end, the pre-clinical results need to be further confirmed using human physiological absorption models prior to the decision of clinical evaluation. In all of the formulation tested in dogs and humans, the absorption of NVS123 is generally higher in dogs than that in humans under fasted and fed condition while the drug clearance and first pass elimination in dogs are higher than those in humans (e.g., NVS123 showed moderate blood CL in dogs but was predicted to show low blood CL in humans based on the hepatic extraction ratio). We showed a crossover virtual fed bioequivalence study using the population simulation module in the ACAT model which enabled introduction of population variability to the model. The virtual clinical trial simulation was capable of estimating important bioequivalent parameters including the mean values and 90% confidential intervals, which may further help to design clinical food effect studies. According to the simulated results, a clinical study of F4 is to be conducted.

CONCLUSIONS

The successful integration of multiple biopharmaceutical tools, such as two-step dissolution test, canine model and physiologically based *in silico* simulation allowed the mitigation of positive food effects in drug development. We simulated four formulations of NVS123 in a PBPK model and the simulations were in agreement with the currently available clinical PK data. Furthermore, the PSA and a virtual bioequivalence simulation allowed establishing model-guided formulation strategy and assisting the decision-making of clinical investigation. The work also highlighted that dog *in vivo* data, if appropriately translated and analyzed, can greatly support the implementation of human absorption model by providing key input parameters. Overall, the mechanism-based modeling with solid assumptions based on preclinical *in vitro* and *in vivo* results is a key bridging step for current formulation design prior to the clinical study, and it will greatly facilitate the implementation of Quality by design in drug development.

Table IV. Virtual Food Effect Study for F4 Formulation

Parameters	Fasted (values)		Fed (values)		Fed vs. fasted (ratio)	
	Mean	90% CI	Mean	90% CI	P.E.	90% CI
C_{max} (ng/mL)	1,141	[962, 1,322]	1,311	[1,163, 1,459]	1.14	[1.00, 1.28]
AUC_{0-inf} ($\mu\text{g}\times\text{h/mL}$)	43.8	[36.4, 51.1]	49.0	[41.5, 56.5]	1.12	[0.95, 1.28]
t_{max} (h)	5.0	[4.56, 6.21]	6.86	[6.48, 7.61]		

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Conflict of Interests None.

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