

Research Article

# Population Pharmacodynamic Modeling of Eflornithine-Based Treatments Against Late-Stage *Gambiense* Human African Trypanosomiasis and Efficacy Predictions of L-eflornithine-Based Therapy

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Abstract. Effornithine is a recommended treatment against late-stage gambiense human African trypanosomiasis, a neglected tropical disease. Standard dosing of effornithine consists of repeated intravenous infusions of a racemic mixture of L- and D-effornithine. Data from three clinical studies, (i) effornithine intravenous monotherapy, (ii) nifurtimox-effornithine combination therapy, and (iii) effornithine oral monotherapy, were pooled and analyzed using a time-to-event pharmacodynamic modeling approach, supported by in vitro activity data of the individual enantiomers. Our aim was to assess (i) the efficacy of the effornithine regimens in a time-to-event analysis and (ii) the feasibility of an L-effornithine-based therapy integrating clinical and preclinical data. A pharmacodynamic time-to-event model was used to estimate the total dose of effornithine, associated with 50% reduction in baseline hazard, when administered as monotherapy or in the nifurtimox-effornithine combination therapy. The estimated total doses were 159, 60 and 291 g for intravenous effornithine monotherapy, nifurtimox-effornithine combination therapy and oral effornithine monotherapy, respectively. Simulations suggested that L-effornithine achieves a higher predicted median survival, compared to when racemate is administered, as treatment against late-stage gambiense human African trypanosomiasis. Our findings showed that oral L-effornithine-based monotherapy would not result in adequate efficacy, even at high dose, and warrants further investigations to assess the potential of oral L-effornithine-based treatment in combination with other treatments such as nifurtimox. An all-oral effornithine-based regimen would provide easier access to treatment and reduce burden on patients and healthcare systems in gambiense human African trypanosomiasis endemic areas.

**KEY WORDS:** enantiomers; neglected tropical diseases; nonlinear mixed-effects modeling; sleeping sickness; time-to-event analysis.

Carl Amilon and Mikael Boberg contributed equally to this work.

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# **INTRODUCTION**

Human African trypanosomiasis (HAT), also known as sleeping sickness, is recognized by the World Health Organization as a neglected tropical disease (1). HAT is a fatal parasitic disease unless treated. HAT, spread via the tsetse fly, is caused by either the *Trypanosoma brucei gambiense* or *Trypanosoma brucei rhodesiense* strains (2). However, the *Trypanosoma brucei gambiense* causes 98% of the total HAT cases (3). For gambiense HAT (g-HAT), 51 million people in sub-Saharan Africa are estimated to live in areas at risk of being infected, and over five million people live in areas with moderate or higher risk of infection (3). Effornithine is a recommended treatment against late-stage g-HAT, i.e., when the parasites have also infected the central nervous system (4, 5). Effornithine was initially developed for oncology indications and was later discovered as an effective antitrypanosomal therapy (6, 7). It is included in World Health Organization's model list of essential medicines (8). Currently, only an intravenous racemic mixture of L- and Deffornithine is a recommended treatment administered as monotherapy over 14 days, or as a combination with oral nifurtimox (NECT) for 7 days (5, 9-12). An oral effornithinebased treatment alternative would improve treatment access for patients and reduce the demand on healthcare resources. We have previously progressed the understanding of the enantioselective pharmacokinetics of effornithine both preclinically and clinically (13-15). Recently, we also established the enantioselective in vitro antitrypanosomal activity where L-effornithine showed a nine-fold greater antitrypanosomal potency compared to D-effornithine (16). The present study aimed to integrate current knowledge on enantioselective pharmacokinetics and potency, along pharmacodynamic timeto-event modeling of effornithine treatment success or failure in published clinical cohorts. Simulation framework was set up to evaluate the feasibility of potential clinical approaches to oral L-eflornithine treatment.

## MATERIALS AND METHODS

#### Pharmacodynamic Time-to-Event Modeling Approach

## Data Set

Individual treatment outcome data (cure or treatment failure) and effornithine dosing information were collected from three previously published clinical studies with late-stage g-HAT patients (Table I) (n = 1248 across the three studies). In study 1, racemic effornithine was administered intravenously as monotherapy (17); in study 2, intravenous racemic effornithine was combined with oral nifurtimox in the NECT regimen (18); and in study, 3 racemic effornithine was administered orally as monotherapy (19). Successful treatment was defined as (i) no parasite in cerebrospinal fluid, lymph or blood or (ii) if patients' self-assessments were considered at good health at the follow-up visit. Treatment failures were defined either as disease-related death or as recurrent infection. The studies included only confirmed late-stage g-HAT patients and were all conducted in endemic areas in Central or Western Africa.

#### Pharmacodynamic Time-to-Event Model Development

The pharmacodynamic modeling was performed using NONMEM v7.4 (ICON Development Solutions, Ellicott City, MD, USA) (20). Piraña v2.9.8, Rstudio v1.3.1093, the R software v4.1.1 (The R foundation for Statistical Computing), Perl-speaks-NONMEM (PsN) v4.8.1 (Department of Pharmaceutical Biosciences, Uppsala University, Uppsala, Sweden) (21) and Xpose v4.7.1 (22, 23) were used for model assessments. diagnostics, and visualization of results. Pharmacodynamic model parameters were obtained using the Laplacian estimation method. The objective function value (OFV) calculated by NONMEM is proportional to -2log likelihood of the data for the specific model. The drop in objective function value ( $\Delta OFV$ ) was assumed to be  $\chi^2$  distributed. Model discrimination between nested (hierarchical) models was determined by likelihood ratio testing based on  $\Delta OFV$ .  $\Delta OFV > 3.84$  was considered as a statistically significant improvement of the model with P < 0.05 for one degree of freedom. Model diagnostics were done by evaluating the Kaplan-Meier curve in a visual predictive check (n = 1.000) and bootstrap (n = 1.000)1,000) to resample the included clinical studies and obtain confidence intervals of the parameter estimates. The time-toevent analysis was performed with an assumed Weibull hazard distribution. The shape parameter was fixed to 1 for the clinical trial with orally administered racemic effornithine, as data were too limited to allow for estimation of this parameter. Total effornithine dose in each clinical study was assumed to be the driving factor of effect and was included as a time constant effect in the model; i.e., the probability of a specific pharmacodynamic outcome was dependent on total effornithine dose in grams (Table I). Outcome was implemented by interval censoring (treatment failure events) or right censoring at the end of 12 months of study follow-up (successful treatment). Patients lost to follow-up were right censored at the time of their last follow-up visit (24). The time-to-event analysis was performed using a survival function (S(t)), based on the baseline hazard ( $\varphi$ ) and the shape factor of the Weibull function  $(\gamma)$ , according to (Eq. 1). The probability (p(t)) of an event was calculated by a probability density function (Eq. 2).

$$S(t) = \Pr(T > t) = \exp\left(-Ln2\left(\frac{t}{\varphi}\right)^{\gamma}\right)$$
(1)

Table I. Clinical Trials Included in the Pharmacodynamic Time-to-Event Anal	ysis
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Study (reference) Therapy	1 (17) Intravenous effornithine monotherapy	2 (18) Intravenous effornithine + oral nifurtimox	3 (19) Oral eflornithine monotherapy
Dose (mg/kg)	100 or 150*	200	100 or 125
Dosing interval (h)	6	12	6
Treatment days	14	7	14
Total dose in study (g)	258	140	333**
Number of subjects	672	551	25
Bodyweight, median (kg)	46***	50****	51
Follow-up (months)	12	12	12

\*150 mg/kg for children < 12 years, \*\*median total dose administered in the study, \*\*\*bodyweight value from complete cohort (n = 1,055), \*\*\*\*assumed value since bodyweight not available

$$p(t) = \Pr(t = t) = Ln2 \times \frac{\gamma}{t} \times \left(\frac{t}{\varphi}\right)^{\gamma} \times \exp\left(-Ln2 \times \left(\frac{t}{\varphi}\right)^{\gamma}\right)$$
(2)

The inhibitory effect of efformithine treatment was implemented as a sigmoidal maximum inhibition response  $(I_{max})$  on the baseline hazard, i.e., dose-response model (Eq. 3).

Time to event = 
$$BASE \times \left(1 - \frac{I_{max} \times DOSE^n}{ID_{50}^n + DOSE^n}\right)$$
 (3)

The parameters estimated in this model were BASE, representing baseline hazard for event;  $ID_{50}$ , representing the dose associated with 50% reduction in baseline hazard; and DOSE, representing the total effornithine dose administered in each study to estimate the time-to-event (Table I). Model parameters  $I_{\text{max}}$  and sigmoidicity factor (*n*) were both fixed to 1, assuming full inhibition was possible with a fixed slope. The baseline hazard, Weibull shape and  $ID_{50}$  parameters were estimated separately for each clinical trial, since attempts to estimate these in a pooled modeling approach failed (i.e., incorporating all data from the three studies and deriving a global parameter estimate).

#### **Enantioselective Potency Prediction**

After dosing of racemic effornithine intravenously, the steady-state concentrations of L-effornithine and Deffornithine have been shown to be similar (13, 15), whereas oral dosing resulted in approximately 50% lower steady-state concentrations of L-effornithine compared to that of Deffornithine, i.e., a 1:2 L-effornithine:D-effornithine plasma exposure ratio (13-15). However, in vitro susceptibility data from a previous publication showed that L-effornithine has higher antitrypanosomal activity compared to D-effornithine (16). The original data from this in vitro study are freely accessible from the Swedish National Data Service (SND-ID: 2021-45) database (25). The enantiospecific potencies of Leffornithine, D-effornithine, and the 1:2 L-effornithine:Deffornithine concentration ratio associated with oral administration were estimated from these data using a mathematical modeling approach in the software Phoenix v8.3 (Certara, Princeton, NJ, USA). Potencies were estimated using an inhibitory  $I_{max}$  model that considers the competitive interaction for two ligands (L-eflornithine and Deflornithine) acting on the same target with same mode of action (26, 27) (Eq. 4). E<sub>0</sub> represents the effect, measured as relative fluorescence in the AlamarBlue serial drug dilution assay (28), at zero drug concentration and when measured background fluorescence in the assay was taken into consideration (i.e., media without parasites). C<sub>L-eflornithine</sub> and C<sub>D</sub>. effornithine correspond to the separate incubation concentrations. IC<sub>50L-eflornithine</sub> and IC<sub>50D-eflornithine</sub> correspond to the estimated L-eflornithine (5.5 µM) and D-eflornithine (49.6 µM) potencies.

$$Effect = E_0 \times \left( 1 - \left( \frac{\frac{C_{L-eflornithine}}{IC_{50_{L-eflornithine}}} \times \frac{C_{D-eflornithine}}{IC_{50_{D-eflornithine}}}}{1 + \frac{C_{L-eflornithine}}{IC_{50_{L-eflornithine}}} + \frac{C_{D-eflornithine}}{IC_{50_{D-eflornithine}}}} \right) + Background fluorescence$$
(4)

#### **Treatment Outcome Simulations**

The developed pharmacodynamic time-to-event model was used to simulate outcome scenarios for treatment with Leffornithine. All simulations were performed with a constant total L-effornithine dose at 333 g, i.e., similar to the total dose administered in study 3 and shown to be tolerated by latestage g-HAT patients. This corresponds to 100 to 125 mg/kg doses, four times daily, administered in study 3. To determine the clinical ID<sub>50</sub> parameter for L-effornithine in the simulations, the ID<sub>50</sub> parameter associated with racemic effornithine was adjusted for the derived *in vitro* potency using Eq. 4 to delineate the individual contributions from L-effornithine and D-effornithine. The study-dependent parameters, i.e., Weibull shape and baseline hazard, were fixed in the simulations.

## RESULTS

## **Pharmacodynamic Modeling Results**

The final pharmacodynamic model described the timeto-event (treatment failure) adequately for g-HAT patients in the three clinical studies. Estimated baseline hazards were 0.035, 0.026 and  $0.077 \text{ month}^{-1}$  for study 1 with intravenous effornithine, study 2 with intravenous effornithine combined

Table II. Pharmacodynamic Model Parameter Estimates

Parameter	Therapy (reference)			
	Intravenous effornithine monotherapy (17)	Intravenous effornithine + oral nifurtimox (18)	Oral effornithine monotherapy (19)	
BASE, month <sup>-1</sup> (90% CI) SHAPE (90% CI) ID <sub>50</sub> , g (90% CI)	0.035 (0.024 to 0.045) 2.53 (1.74 to 3.69) 159 (78.4 to 376)	0.026 (0.018 to 0.035) 1.93 (1.56 to 2.62) 60.0 (37.1 to 86.7)	0.077 (0.042 to 0.128) 1* (N/A) 291 (152 to 508)	

Parameters estimated by bootstrap (n = 1,000). \*Parameter fixed. BASE baseline hazard, SHAPE Weibull shape,  $ID_{50}$  total efformithine dose that reduce BASE by 50%, 90% CI 90% confidence interval, N/A not applicable



**Fig. 1.** Visual predictive check of final pharmacodynamic model for **a** intravenous racemic effornithine monotherapy, **b** intravenous racemic effornithine in combination with oral nifurtimox (NECT), and **c** oral racemic effornithine monotherapy. Black lines show the Kaplan-Meier curve for observed data and gray areas are the 95% confidence intervals obtained from 1,000 simulations with the pharmacodynamic time-to-event model. Note the different *y*-axis scale in Fig. 1c

with oral nifurtimox and study 3 with oral effornithine, respectively. Estimated ID<sub>50</sub> values were 159, 60 and 291 g for study 1, study 2, and study 3, respectively (Table II). Kaplan-Meier curves of observed clinical trial data overlaid with 95% confidence intervals obtained from simulations (n = 1,000) with the final pharmacodynamic model showed highest survival for NECT and lowest survival for the oral effornithine monotherapy (Fig. 1).

#### **Enantioselective Potency Prediction**

The adjustment of ID<sub>50</sub> was based on the in vitro 50% inhibitory concentration  $(IC_{50})$  ratio between L-effornithine (16) using freely accessible data from the Swedish National Data Service (SND-ID: 2021-45) database (25) and predicted IC<sub>50</sub> for the 1:2 L-effornithine:D-effornithine plasma exposure ratio observed in late-stage g-HAT patients after oral dosing of racemic effornithine (14) (Fig. 2). Additional model fits for L-effornithine and D-effornithine are provided in the supplementary material (Fig. S1, Table SI). The predicted  $IC_{50}$  for the 1:2 L-effornithine:D-effornithine plasma exposure ratio was 13.4 µM derived from Eq. 4 based on the experimental in vitro IC<sub>50</sub> values for L-effornithine and D-effornithine at 5.5  $\mu$ M and 49.6  $\mu$ M, respectively (16). The mathematical model was also able to estimate in vitro efficacy for racemic effornithine, i.e., at 1:1 ratio for L-effornithine and Deflornithine (Fig. 2), when compared to data from the literature (16, 25).

Additional model fits for L-effornithine and Deffornithine are provided in the supplementary material (Fig. S1). The predicted  $IC_{50}$  for the 1:2 L-effornithine:Deffornithine plasma exposure ratio was 13.4 µM derived from Eq. 4 based on the experimental *in vitro*  $IC_{50}$  values for L- effornithine and D-effornithine at 5.5  $\mu$ M and 49.6  $\mu$ M, respectively (16).

#### Predicted Survival for Oral L-effornithine as Monotherapy

Simulations were performed using the final pharmacodynamic time-to-event model, with the drug efficacy adjusted for enantiomer difference in *in vitro* potency, to predict survival after treatment with oral L-effornithine monotherapy. Estimated ID<sub>50</sub> for study 3 with oral racemic effornithine monotherapy at 291 g in the pharmacodynamic model was decreased by 2.46-fold (13.4  $\mu$ M/5.5  $\mu$ M) to 118 g in the simulations for oral L-effornithine monotherapy assuming an unchanged oral bioavailability for L-effornithine when administered as an enantiopure formulation (Supplementary material Table SII). The predicted survival at 12 months was higher for an L-effornithine treatment with median (95% CI) survival at 80% (64 to 92%) at a total dose of 333 g (corresponding to 100 to 125 mg/kg administered four times daily) compared to oral racemic effornithine monotherapy at 68% (48 to 84%) using the estimated pharmacodynamic model parameters from study 3 (19) (Fig. 3). The predicted 95% CI in survival ranged between 64 and 99% when assessed by the three simulated scenarios at a total Leflornithine dose of 333 g.

## DISCUSSION

The observed event-free proportion of patients in the two included intravenous effornithine studies was above 96% at the 12-month follow-up (Fig. 1), demonstrating the efficacy of these treatments against late-stage g-HAT. For the oral effornithine study population, the overall observed event-free proportion of patients was 76% at the end of the 12-month



**Fig. 2.** a Predicted *in vitro* efficacy for racemic effornithine (dashed turquoise line) with gray area showing 5th to 95th percentiles of experimental data from a previous study (16) shown here for visual assessment of model performance. **b** Predicted *in vitro* efficacy for the 1:2 L-effornithine:D-effornithine plasma exposure ratio (dashed purple line) to retrieve a potency estimate for racemic effornithine after oral administration. Predictions were made with a mathematical modeling approach using experimental *in vitro* data from a previous study (16) for L-effornithine (dashed green line) and D-effornithine (solid red line). Data were accessed from the Swedish National Data Service (SND-ID: 2021-45) database (25)



**Fig. 3.** Median predicted survival (%) in the studies for intravenous racemic effornithine monotherapy (black diamond), intravenous racemic effornithine in combination with oral nifurtimox (black triangle) and oral racemic effornithine monotherapy (black square) at 12 months. Median predicted survival (%) for oral L-effornithine monotherapy at 333 g total dose (green squares) at 12 months. Error bars represent the 95% confidence interval for the simulated scenarios (n = 1,000). The gray shaded area cover the predictions based on the NECT study

follow-up period. This is indicative of a sub-therapeutic treatment and/or a high risk of infection in the endemic area where the study was performed. The antiparasitic *in vitro* efficacy of effornithine is enantioselective (16), and the proportion of L- and D-effornithine enantiomers influences the treatment success to a great extent. Due to enantioselective absorption, oral administration of racemic effornithine results in 33/66 proportion of the L- and D-effornithine enantiomers, while intravenously administered racemic effornithine give a 50/50 ratio.

The developed pharmacodynamic time-to-event model adequately estimated the survival (absence of death or reinfection) for the three different clinical studies analyzed in the present study, based on the model selection criteria set out. The time-to-event analysis demonstrated that NECT was slightly superior to intravenous effornithine monotherapy, while both NECT and intravenous monotherapy were superior to oral effornithine monotherapy against late-stage g-HAT. This is in line with previous findings (9). In the oral monotherapy study with the highest probability of an event per time unit (BASE), the observed overall survival decreased to 80% or lower in four months (Fig. 1), which indicated high recurrent infection rates in this study population. As observed in Fig. 1 and shown by simulations with oral L-effornithine monotherapy (Fig. 3), the predicted median survival after 12-month follow-up is higher (80%) compared to oral racemic effornithine monotherapy (68%). However, due to the low sample size in study 3 (n = 25), the 95% confidence intervals are wide and overlap when predicted from this study, suggesting that L-effornithine might not be an efficacious oral monotherapy treatment.

In the oral monotherapy study with racemic effornithine, the oral bioavailability of the more active L-effornithine enantiomer (16) was too low to render adequate drug exposure and cure the late-stage g-HAT patients (14). In preclinical studies, the oral bioavailability for L-effornithine, when dosing racemic mixture, was 26-47% (13, 15), and similar absolute bioavailability for the more active Leffornithine enantiomer is plausible in late-stage g-HAT patients (14). The 1:2 ratio of absorbed L-effornithine and D-effornithine in the systemic circulation after oral dosing appears to be conserved across preclinical and clinical studies. On the other hand, the drug concentration ratio in cerebrospinal fluid to plasma was similar for L-effornithine and Deffornithine in late-stage g-HAT patients, indicative of a nonstereoselective uptake mechanism to the central nervous system (14). However, the lower exposure of L-effornithine in plasma would translate to lower concentrations in the cerebrospinal fluid compared to D-effornithine. For an enantiopure formulation with L-effornithine, a higher Leffornithine concentration in the cerebrospinal fluid is expected at equimolar doses of racemic mixture, as the proportions of L- and D-effornithine in the systemic circulation are 100/0, respectively, instead of 33/66.

In line with current treatment recommendations for effornithine monotherapy, dosing 400 mg/kg/day dosed every 6 h for 14 days resulted in a curative treatment outcome (12). A shorter treatment period for intravenous effornithine monotherapy of 7 days was not feasible due to an unacceptable rate of treatment failure (29). Intravenous monotherapy has been studied with less frequent dosing at 400 mg/kg/day dosed every 12 h (30). This regimen gave total effornithine concentration in cerebrospinal fluid below the suggested clinical cut-off value at 50  $\mu$ mol/L and lower frequency of successful treatment. Total effornithine doses higher than administered in the monotherapy studies have been associated with more side effects (31, 32). For instance, higher effornithine concentrations in the cerebrospinal fluid have been associated with convulsions (30, 33). If adverse effects such as vomiting, diarrhea, and/or nausea after oral administration are equally driven by the enantiomers, equimolar doses of racemic or L-effornithine could be tolerable for latestage g-HAT patients. However, tolerability would need to be assessed in future clinical studies. In late-stage g-HAT patients, the majority of drug related side effects for racemic effornithine was reversible by decreasing the dose or treatment discontinuation (33). Moreover, fewer major adverse events (fever, neutropenia, hypertension, diarrhea or infections) were observed for the NECT regimen compared to effornithine monotherapy (9, 34, 35). Whether systemic and/ or local gastrointestinal dose-limiting side effects observed in late-stage g-HAT patients after administration of oral racemic effornithine can be attributed to L-effornithine, D-effornithine or total effornithine dose is yet to be determined.

Currently, NECT is the only drug combination to treat late-stage g-HAT. This regimen is non-inferior to intravenous monotherapy despite less frequent dosing and shorter treatment duration of racemic effornithine, i.e., potentiating the clinical efficacy of effornithine (9). The higher in vitro efficacy for L-effornithine in combination with the nifurtimoxdependent potentiation is clinically relevant to investigate further in a prospective clinical study. For parasitic disease in general, combination treatments have been successfully used to manage emerging drug resistance, and the need of drug combinations will potentially increase since the risk for drug resistance development in parasites is lower when two or more drugs with different mechanisms of action are combined compared to monotherapy (36). Recent advances with fexinidazole (37, 38), an approved all-oral therapy against g-HAT for patients with leukocyte count <100 per  $\mu$ L in the cerebrospinal fluid, and acoziborole that is investigated in clinical studies are promising (39). Future drug combination strategies with, for instance, fexinidazole, effornithine, nifurtimox, and/or potentially acoziborole might be needed to decrease the potential risk for drug resistance development against g-HAT treatments.

The present study is not without limitations. Firstly, the baseline hazard in the pharmacodynamic model would preferably be determined from a placebo cohort living in an area with risk of infection. No placebo data were available in the studies nor the literature, likely due to ethical considerations. Attempts to estimate overall baseline hazard, Weibull shape, and ID<sub>50</sub> parameters for all treatment arms failed, as the parameter estimation precision in the pharmacodynamic model was poor. Therefore, the baseline hazard, Weibull shape, and ID<sub>50</sub> parameters for each study were estimated separately. Secondly, the Weibull distribution shape parameter for oral racemic effornithine was fixed to 1, as the limited data did not allow estimation of this parameter. The limited oral effornithine data available from only 25 patients resulted in relatively uncertain parameter estimates and survival predictions, as evident in the wide confidence intervals derived. More data in the orally dosed cohort may have improved the precision of the pharmacodynamic model and allowed an overall baseline hazard, Weibull shape, and ID<sub>50</sub> parameter estimation. Predictions made in the simulated scenarios were made with assumptions regarding studied populations and generalizability from the three clinical studies included to develop the pharmacodynamic time-toevent model as well as the predicted *in vitro* potency for the 1:2 L-effornithine:D-effornithine plasma exposure ratio. Thirdly, a pharmacokinetic-pharmacodynamic exposure-response model that link exposure variables or dynamic concentrations to outcome, instead of the developed doseresponse model, would provide a greater understanding of this relationship. Unfortunately, no individual patient pharmacokinetic data were available. Lastly, a confirmatory external data set from a clinical study would be desirable to validate the pharmacodynamic model predictions in the present study for L-effornithine.

## CONCLUSION

The time-to-event analysis showed that NECT was similar to intravenous effornithine monotherapy, and both were superior to oral effornithine monotherapy against latestage g-HAT. The oral bioavailability of the more active enantiomer, L-effornithine, when dosed as an oral racemic mixture was too low for successful treatment. The developed model predicted a higher survival after oral L-eflornithine monotherapy compared to oral racemic effornithine monotherapy. Oral L-effornithine, administered at a total dose of 333 g equal to 100 to 125 mg/kg doses four times daily for a late-stage g-HAT patient with 51 kg bodyweight, may achieve a median survival of 80% or higher. A potential future clinical study could investigate the maximum tolerated dose and minimum effective concentration of L-effornithine in plasma and/or cerebrospinal fluid to establish an optimal oral dosing frequency and treatment duration. The oral L-effornithine treatment could also be combined with nifurtimox and/or possibly other g-HAT treatments such as fexinidazole. Modeling and simulation presented here show that the potential for an oral effornithine-based treatment for latestage g-HAT would require an efficacy improvement beyond oral L-effornithine monotherapy at a high dose, and further research is warranted to determine if a future oral late-stage g-HAT treatment with L-effornithine-based combinations would be feasible or not.

## SUPPLEMENTARY INFORMATION

The online version contains supplementary material available at https://doi.org/10.1208/s12248-022-00693-2.

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## AUTHOR CONTRIBUTION

Substantial contributions to the conception or design of the work; or the acquisition, analysis, or interpretation of data for the work: C.A., M.B., J.T, A.A., M.A., R.J.L.

Drafting the work or revising it critically for important intellectual content: C.A., M.B., J.T, A.A., M.A., R.J.L.

Final approval of the version to be published: C.A., M.B., J.T, A.A., M.A., R.J.L.

Agreement to be accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved: C.A., M.B., J.T, A.A., M.A., R.J.L.**FUNDING** 

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# DECLARATIONS

**Conflict of Interest** Although co-author C.A. and R.J.L. are employed by AstraZeneca R&D in Gothenburg, Sweden, AstraZeneca had no influence over the study. The authors declare no competing interests.

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