# Extensions, Validation, and Clinical Applications of a Feedback Control System Simulator of the Hypothalamo-Pituitary-Thyroid Axis

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**Background:** We upgraded our recent feedback control system (FBCS) simulation model of human thyroid hormone (TH) regulation to include explicit representation of hypothalamic and pituitary dynamics, and updated TH distribution and elimination (D&E) parameters. This new model greatly expands the range of clinical and basic science scenarios explorable by computer simulation.

*Methods:* We quantified the model from pharmacokinetic (PK) and physiological human data and validated it comparatively against several independent clinical data sets. We then explored three contemporary clinical issues with the new model: combined triiodothyronine  $(T_3)$ /thyroxine  $(T_4)$  versus  $T_4$ -only treatment, parenteral levothyroxine (L- $T_4$ ) administration, and central hypothyroidism.

*Results*: Combined  $T_3/T_4$  therapy—In thyroidectomized patients, the L-T<sub>4</sub>-only replacement doses needed to normalize plasma T<sub>3</sub> or average tissue T<sub>3</sub> were 145 µg L-T<sub>4</sub>/day or 165 µg L-T<sub>4</sub>/day, respectively. The combined T<sub>4</sub> + T<sub>3</sub> dosing needed to normalize both plasma and tissue T<sub>3</sub> levels was 105 µg L-T<sub>4</sub> + 9 µg T<sub>3</sub> per day. For all three regimens, simulated mean steady-state plasma thyroid-stimulating hormone (TSH), T<sub>3</sub>, and T<sub>4</sub> was within normal ranges (TSH: 0.5–5 mU/L; T<sub>4</sub>: 5–12 µg/dL; T<sub>3</sub>: 0.8–1.9 ng/mL). Parenteral T<sub>4</sub> administration—800 µg weekly or 400 µg twice weekly normalized average tissue T<sub>3</sub> levels both for subcutaneous (SC) and intramuscular (IM) routes of administration. TSH, T<sub>3</sub>, and T<sub>4</sub> levels were maintained within normal ranges for all four of these dosing schemes (1× vs. 2× weekly, SC vs. IM). Central hypothyroidism—We simulated steady-state plasma T<sub>3</sub>, T<sub>4</sub>, and TSH concentrations in response to varying degrees of central hypothyroidism, reducing TSH secretion from 50% down to 0.1% of normal. Surprisingly, TSH, T<sub>3</sub>, and T<sub>4</sub> plasma concentrations remained within normal ranges for TSH secretion as low as 25% of normal.

*Conclusions*: Combined  $T_3/T_4$  treatment—Simulated standard L-T<sub>4</sub>–only therapy was sufficient to renormalize average tissue  $T_3$  levels and maintain normal TSH,  $T_3$ , and  $T_4$  plasma levels, supporting adequacy of standard L-T<sub>4</sub>–only treatment. Parenteral  $T_4$  administration—TSH,  $T_3$ , and  $T_4$  levels were maintained within normal ranges for all four of these dosing schemes (1× vs. 2× weekly, SC vs. IM), supporting these therapeutic alternatives for patients with compromised L-T<sub>4</sub> gut absorption. Central hypothyroidism—These results highlight how highly nonlinear feedback in the hypothalamic-pituitary-thyroid axis acts to maintain normal hormone levels, even with severely reduced TSH secretion.

# Introduction

**O**<sup>UR</sup> RECENTLY PUBLISHED FEEDBACK CONTROL system (FBCS) simulation model of human thyroid hormone regulation (1), shown here in Figure 1, had limited predictive capabilities, because it did not explicitly include the dynamics of brain components. We simulated the closed-loop system in that work by replacing the thyroid stimulating hormone (TSH)– and thyrotropin-releasing hormone (TRH)–related submodels—the portions of Figure 1 in the dashed box marked "Brain Submodels"—with human TSH time-course data, and developed a quantified model of the remaining thyroid hormone (TH) submodels. We used this fixed TSH data, which characterizes the output of this group of subsystem components, together with levothyroxine (L-T<sub>4</sub>) oral doses, as dual inputs in the earlier model, and quantified it completely from human clinical data. This permitted simulation of time-varying free and bound triiodothyronine (T<sub>3</sub>(*t*)) and T<sub>4</sub>(*t*)—but not TSH(*t*) levels in plasma and tissues. We did assess several bioequivalence and replacement hormone

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**FIG. 1.** Overall feedback control system model of thyroid hormone regulation, with three source organ blocks—the hypothalamus (HYP), anterior pituitary (ANT PIT), and thyroid glands (THYROID)—and three sink blocks—for TRH, TSH, and  $T_3$  and  $T_4$  distribution and elimination (elimination = metabolism and excretion) (D&E). TRH, thyrotropinreleasing hormone; TSH, thyroid-stimulating hormone;  $T_3$ , triiodothyronine;  $T_4$ , thyroxine; SR, secretion rate; p, plasma or portal plasma for TRH-related components; DA, dopamine; SRIH, somatastatin.

questions using this model, but further application scenarios were limited to cases where complete time-course TSH(t) data are available for conditions of interest, or when the feedback loop is open, for example, as in thyroidectomized individuals—in which case TSH is inoperative. Explicit models for all six blocks in Figure 1 are needed to more fully address clinical and basic science questions *in silico*, that is, by computer simulation.

We develop, quantify, and validate a quasi-mechanistic representation of the four remaining brain submodel blocks in Figure 1 here, using human closed-loop data for quantifica-



**FIG. 2.** Simplified brain submodel, structured and quantified from plasma thyroid-stimulating hormone (TSH), triiodothyronine (T<sub>3</sub>), and thyroxine (T<sub>4</sub>) concentration data. TSH secretion and distribution and elimination are explicit, thyrotropin-releasing hormone (TRH) is implicit, plasma T<sub>3</sub> and T<sub>4</sub> are inputs, and plasma TSH<sub>p</sub> is the model output. A new variable: equivalent T<sub>3</sub> in brain, denoted T<sub>3B</sub>, represents T<sub>3</sub> directly or indirectly affecting TSH secretion and located anywhere in brain.

tion and validation of a simplified aggregate of hypothalamus and pituitary components combined, schematized in Figure 2. This new brain submodel is incorporated into the whole FBCS model of the hypothalamic-pituitary-thyroid (H-P-T) axis, thereby rendering it capable of simulating a wider variety of clinical and experimental scenarios, because it characterizes the secretion and distribution and elimination (D&E) (metabolism + excretion) dynamics of all three FBCS variables—TSH(*t*) as well as  $T_3(t)$  and  $T_4(t)$ , in plasma and tissue pools. We independently validate the new model by comparing it to a variety of other clinical data, reassess predictions made with the earlier model, and also apply it to two additional problems of current clinical interest–regulated responses of all three hormones to parenteral L-T<sub>4</sub> administration and central hypothyroidism.

# Methods I: Model Development, Quantification, and Validation

### Brain submodels

Lumped hypothalamo-pituitary TSH secretion submodel. Plasma TSH is the primary clinical measure of thyroid function, and therefore must be depicted as a controllable variable, rather than as fixed data, because the primary goal of our extended model is to predict TSH responses to other model/system variables affecting it, such as TH. To accomplish this, we need to adequately describe TSH secretion and D&E dynamics in the closed-loop system, over physiological and pathophysiological ranges, in response to  $T_3$ ,  $T_4$ , and other inputs depicted in Figure 1.

Hypothalamic TRH drives pituitary TSH secretion. Unfortunately, sufficient details on hypothalamic component dynamics are unattainable at present, because we lack the data to distinguish it from the pituitary. For example, timecourse pituitary portal plasma TRH concentration data, reflecting endogenous TRH secreted by the hypothalamus under physiological conditions, are not measurable, motivating our aggregation approach. Available data can provide a simplified submodel that captures overall pituitary TSH dynamics and the signals that control TSH secretion.

We combined the TRH secretion, TRH D&E, and TSH secretion submodel blocks of Figure 1 into the single, lumped submodel illustrated within the dashed-line box in Figure 2, with a single-output, TSH secretion rate, driven implicitly by TRH, and dual suppressor inputs—plasma T<sub>3</sub> and T<sub>4</sub> concentrations,  $T_{3p}(t)$  and  $T_{4p}(t)$ . TSH secretion is represented as a harmonic oscillator damped by T<sub>3</sub> signals in pituitary and other unspecified brain regions. In this quasi-mechanistic input–output model representation, the identity and pathways for all such T<sub>3</sub> signals are unknown, so we define a single, lumped variable representing equivalent T<sub>3</sub> in relevant portions of the brain, that is, anterior pituitary, hypothalamus, and so on, which affect TSH secretion, directly and via intermediate pathways. We designate this "brain T<sub>3</sub>" as T<sub>3B</sub>(*t*), with its time dependence shown explicitly.

$$SR_{TSH}(t) = \left(B_0 + A_0 \sin\left(\frac{2\pi}{24}t - \phi_{\text{phase}}\right)\right) e^{-T_{3B}(t)} \qquad (1)$$

In this equation,  $SR_{TSH}(t)$  is the total TSH secretion rate, and  $B_0$  is the basal TSH secretion rate with no TH. The second term on the right is the circadian TSH secretion rate component, all



**FIG. 3.** Nonlinear thyroid hormone distribution and elimination submodel for triiodothyronine (T<sub>3</sub>) and thyroxine (T<sub>4</sub>) secretion, binding, distribution, interconversion, and elimination in the human. Protein binding submodels are given by  $FT_4 = (A + BT_4 + CT_4^2 + DT_4^3)T_{4p}$  and  $FT_3 = (a + bT_4 + cT_4^2 + dT_4^3)T_{3p}$  [see Ref. (1) for details]. TBG, T<sub>4</sub>-binding globulin; HSA, human serum albumin; TTR, transthyretin.

damped by brain T<sub>3</sub>, represented as the negative exponent, T<sub>3B</sub>(*t*), in the nonlinear exponential term.  $2\pi/24$  is the circadian frequency (period 24 hours),  $\phi_{\text{phase}}$  is the TSH secretion circadian phase [such that maximum TSH occurs at ~2 AM (2)], and  $A_0$  governs the magnitude of circadian oscillations. Effects of TRH are represented implicitly in the sinusoidal daily circadian rhythm and the basal TSH secretion levels.<sup>a</sup>

A second equation depicts the dynamics of the unmeasurable and equivalent  $T_{3B}(t)$ , written in terms of normalized measurable plasma TH levels that presumably regulate  $T_{3B}(t)$ . We normalized peripheral plasma TH levels,  $T_{4p}(t)$  and  $T_{3p}(t)$ —to compensate for the roughly 50-fold difference in their plasma concentrations—by dividing them by predose steady-state peripheral plasma levels  $T_{4pSS}$  and  $T_{3pSS}$ , which helps in quantifying this submodel.

$$\dot{\mathbf{T}}_{3\mathrm{B}}(t) = \frac{k_4}{\mathrm{T}_{4\mathrm{pSS}}} \mathrm{T}_{4\mathrm{p}}(t) + \frac{k_3}{\mathrm{T}_{3\mathrm{pSS}}} \mathrm{T}_{3\mathrm{p}}(t) - k_{\mathrm{degT3B}} \mathrm{T}_{3\mathrm{B}}(t) \qquad (2)$$

The first term of Eq. 2 represents the combined effects of peripheral plasma  $T_4$  (i.e.,  $T_{4p}$ ) on  $T_{3B}$  appearance in brain, aggregating peripheral plasma  $T_4$  influx with its intracellular conversion to brain  $T_3$ ,  $T_{3B}(t)$ , at combined fractional rate  $k_4$  ( $t^{-1}$ ). The second term similarly represents the influx of peripheral plasma  $T_3$  (i.e.,  $T_{3p}$ ) into brain, at effective fractional rate  $k_3$  ( $t^{-1}$ ). In the third term,  $k_{\text{degT3B}}$  is the fractional rate of degradation of  $T_{3B}(t)$ .

TSH D&E submodel A simple one-compartment model adequately describes TSH D&E, with a PCR of  $46.1 \, mL/$ 

min (half-life of 55 minutes) and a distribution volume of 3.5 L (3–5).

TH D&E submodel update Primary components of our earlier simulation model (1) included submodels for  $T_3$  and  $T_4$  secretion (which remain the same in the new model) and for TH D&E, illustrated together in Figure 3. The D&E submodel included TH D&E (metabolism and excretion) in and from plasma, fast and slow tissue pools—including nonlinear  $T_4$  to  $T_3$  conversion and plasma protein binding processes, all as detailed in the equations and compartmental relationships in Figure 3. In the TH D&E submodel, we used *in vitro*-derived  $K_m$  values (6) for the deiodinase reactions, because physiological  $K_m$  values are unknown. We revisit this submodel here, to explore effects of alternative  $K_m$  values reported as being more physiological (6–8), for  $T_4$  deiodination by type I deiodinase (D2).

For practical reasons, K<sub>m</sub> values are estimated from *in vitro* enzymatic studies, most often performed with dithiothreitol (DTT) as cofactor for the reaction, at concentrations ( $\sim 20 \text{ mM}$ ) in excess of what is likely to exist in vivo for the equivalent and unknown in vivo cofactor (7). In vitro-derived Km values for D1 with T<sub>4</sub> have been reported in the 2  $\mu$ M range (6), based on use of  $\sim 20 \text{ mM}$  DTT. DTT does work in assays with reverse T<sub>3</sub> (rT<sub>3</sub>) as substrate for D1 at much lower concentrations (0.5 mM) but not with T<sub>4</sub> (7). In contrast, Goswami and Rosenberg (8) used 5 mM glutathione, believed to be a much more physiological cofactor, and estimated the  $K_{\rm m}$  for D1 with T<sub>4</sub> to be 100 times smaller, that is,  $K_{mD1}(T_4) \approx 20$  nM. This is the same fold difference found by Sharifi and St. Germain (7) in comparing  $K_{\rm m}$  estimates for D1 with rT<sub>3</sub> at 20 mM versus no added cofactor, suggesting that  $K_{mD1}(T_4) \approx 20 \text{ nM}$ , rather than 2 mM, is a better estimate for physiological applications.

In the present work, we updated the value of  $K_{\rm m}$  for D1 with T<sub>4</sub>, now 20 nM instead of 1.9  $\mu$ M, based on the above arguments. To check our earlier results with the updated  $K_{\rm m}$  value, we optimally reestimated all TH SR and D&E sub-

<sup>&</sup>lt;sup>a</sup>We ignore ultradian, 1–2 hours pulsatile TSH oscillations, assuming their small magnitude does not significantly affect downstream TH signals in our model. Additionally, ultradian, unlike circadian rhythms, are not in phase from individual to individual. Our primary database consists of hormone dynamics for the population average. Individual ultradian rhythms are "smoothed out," with only circadian rhythms prominent in mean data.



**FIG. 4.** Updated thyroid submodel fitted to pharmacokinetic data (n = 33) (10). Model simulations are shown as solid line and data as squares; thyroxine ( $T_4$ ) on the left, triiodothyronine ( $T_3$ ) on the right.

model parameters, using the same kinetic database as before, but with  $K_{mD1}(T_4) \approx 20 \text{ nM}$ , and reevaluated our predictive results based on this updated model. Results are given below.

Unfortunately, D2 (and D3) only works *in vitro* with DTT, and there are no data using glutathione as cofactor for the other deiodinases. Although we have no better estimate at this time for the D2  $K_{\rm m}$  with T<sub>4</sub> as substrate [i.e., 1.5 nM (9)], we did test the sensitivity of our earlier results to this  $K_{\rm m}$  estimate, by optimally refitting the model to ±10-fold and ±100-fold changes in  $K_{\rm m}$  values used for D2 with T<sub>4</sub>. Results are given below.

# Data and model quantification

Primary data Our primary closed-loop database consists of 33 sets of PK data, collected simultaneously for  $hTSH_p(t)$ ,

 $T_{3p}(t)$ , and  $T_{4p}(t)$ , over 120 hours in euthyroid volunteers (half male, half female), beginning with baseline levels the day prior to dosing (day -1), in response to three different oral doses of L-T<sub>4</sub>, 400, 450, and 600  $\mu$ g, on day 0 (10). Subjects were fasted from 10 PM on day 2 to noon on day -1 and also from 10 PM on day -1 to noon on day 0, putting them in the fasting state until 4 hours after dosing. The data shown averaged in Figures 4 and 5 were generously supplied by the authors (10).

Brain submodel quantification Previously, we used the three plasma TSH data sets (circles in Fig. 5) as input forcing functions and quantified the thyroid and TH D&E submodel from  $T_3$  and  $T_4$  plasma data (Fig. 6, top left) (1). For the new



**FIG. 5.** Optimized brain submodel thyroidstimulating hormone (TSH(*t*)) responses fitted simultaneously to data (n = 33) from three pharmacokinetic studies using 400, 450, and 600 µg levothyroxine (L-T<sub>4</sub>) dosing (10). These data also illustrate the nonlinear properties of the TSH-saturating response characteristics, fitted well by the model.





**FIG. 6.** Brain (bottom left) and thyroid (top left) submodels combined to make the complete feedback control system (FBCS) model (right). Triiodothyronine ( $T_3$ ), thyroxine ( $T_4$ ), and thyroid-stimulating hormone (TSH) data used as input forcing functions, with the submodels encompassed and replaced by the input forcing function boxed in gray. The complete FBCS model on the right also includes submodels for subcutaneous (SC), intramuscular (IM), and intravenous (IV) exogenous inputs, used in our clinical applications.

brain submodel, we reversed the roles of the data sets, using  $T_3$  and  $T_4$  plasma discrete-time data (shown as squares in Fig. 4) as input forcing functions, rendered continuous time using linear splines (11), and optimally fitted the new brain submodel to plasma TSH output data (Fig. 6, bottom left). Extensive numerical analyses<sup>b</sup> of the brain submodel revealed that all parameters but two are uniquely quantifiable (identifiable) from the data;  $k_3$  and  $k_4$  are not separately quantifiable from our input–output data, which motivated a search for model simplification. Silva and coworkers reported roughly half of TH effect on TSH secretion in steady state due to plasma-derived  $T_3$ , the remainder to plasma-derived  $T_4$  to  $T_3$ 

conversion in rat pituitary (13–18), and other data suggest a similar relationship in humans (19–23), together implying  $k_3 \approx k_4$  in Eq. 2. We fitted the unknown brain submodel parameters ( $B_0$ ,  $A_0$ ,  $\phi_{\text{phase}}$ ,  $k_4$ ,  $k_3$ , and  $k_{\text{degT3B}}$  in Eqs. 1 and 2) to the TSH plasma data for all three doses simultaneously. We initiated the search with  $k_3 = k_4$  and tested values of  $k_3$  ranging  $\pm 30\%$  above and below  $k_4$ . We used the program SAAM II (11) for parameter optimization, as before (1).

# Complete FBCS H-P-T axis model

We incorporated the new quantified brain submodels and updated and requantified TH SR and D&E submodels into an overall FBCS simulation model, thereby forming the complete, updated closed-loop FBCS simulation model illustrated in Figure 6. To check whether the combined submodels behave as well in concert as they do individually, we simulated responses of the complete FBCS model to 400, 450, and 600  $\mu$ g doses of simulated oral L-T<sub>4</sub> and compared these predictions to the simulations by each submodel individually, as well as to the real PK data (10).

<sup>&</sup>lt;sup>b</sup>An established numerical identifiability analysis approach (12) was used to explore the brain submodel parameter space for feasible solutions with finite parameter estimation variances. A range of physiologically reasonable values for the *k*'s were tested by generating perfect simulated data for each trial and reestimating the parameters and their variances. Infinite (or very large) variances indicate unidentifiability.

## FEEDBACK CONTROL SYSTEM SIMULATOR FOR THE H-P-T AXIS

TABLE 1. PARAMETER NOMENCLATURE, UNITS, VALUES, ESTIMATES, VARIABILITIES (%CV), AND SOURCES

Parameter	Estimate	Units	%CV	Submodel	Source
k <sub>degT3B</sub>	0.037	$h^{-1}$	12.6	TSH SR	Fitted to Blakesley et al. (10) data
φ <sub>phase</sub>	-3.71	$h^{-1}$	1.04	TSH SR	Fitted to Blakesley et al. (10) data
$A_0$	581	$\mu$ mol/h	61.4	TSH SR	Fitted to Blakesley et al. (10) data
$B_0$	1166	$\mu$ mol/h	60.7	TSH SR	Fitted to Blakesley et al. (10) data
$k_3 = k_4$	0.118	$\mu$ mol/h	6.43	TSH SR	Fitted to Blakesley et al. (10) data
$k_{\text{degTSH}}$	0.756	$h^{-1}$	_	TSH D&E	Ridgway et al. (5), Odell et al. (4), Kuku et al. (3)
V <sub>dTSH</sub>	3.5	L	—	TSH D&E	Ridgway et al. (5), Odell et al. (4), Kuku et al. (3)
Vp	3	L	_	TH D&E	
K <sub>mD1fast</sub>	0.03	μmol	—	TH D&E	Updated by [Sharifi and St. Germain (7), Goswami and Rosenberg (8)]
K <sub>mD1slow</sub>	1.0	$\mu$ mol	—	TH D&E	Updated by [Sharifi and St. Germain (7), Goswami and Rosenberg (8)]
K <sub>mD2slow</sub>	0.075	μmol	_	TH D&E	Bianco <i>et al.</i> (9)
$V_{\rm maxD1fast}$	$3.85 \times 10^{-4}$	$h^{-1}$	30.6	TH D&E	Refitted to Blakesley et al. (10) data
V <sub>maxD1slow</sub>	$6.63 \times 10^{-4}$	$h^{-1}$	6.27	TH D&E	Refitted to Blakesley et al. (10) data
$V_{\rm maxD2slow}$	0.00109	$h^{-1}$	6.27	TH D&E	Refitted to Blakesley et al. (10) data
S <sub>3</sub>	$3.71 \times 10^{-4}$	$\mu mol^{-1}$	6.49	TH SR	Refitted to Blakesley et al. (10) data
S <sub>4</sub>	0.00168	$\mu mol^{-1}$	7.4	TH SR	Refitted to Blakesley et al. (10) data
gut1	1.3	$h^{-1}$	_	T <sub>4</sub> GUT	DiStefano and Mak (26)
gut2	0.119	$h^{-1}$	16.3	$T_4$ GUT	DiStefano and Mak (26) refitted to Blakesley et al. (10) data
gut3	0.881	$h^{-1}$	2.2	$T_4$ GUT	DiStefano and Mak (26) refitted to Blakesley et al. (10) data
<i>k</i> <sub>T3absorp</sub>	0.882	$h^{-1}$	7.2	T <sub>3</sub> GUT	Fitted to Ueda et al. (25) data
k <sub>T3deg</sub>	0.118	$h^{-1}$	7.2	T <sub>3</sub> GUT	Fitted to Ueda et al. (25) data
k <sub>T3dissol</sub>	1.78	$h^{-1}$	32.0	T <sub>3</sub> GUT	Fitted to Ueda et al. (25) data
k <sub>SC</sub>	0.034	$h^{-1}$	—	SC INPUT	Hays (27)
k <sub>IM</sub>	0.068	$h^{-1}$	—	IM INPUT	Hays (27)

Only the new brain submodel and updated TH D& E submodel parameters are shown here; the remaining 22 are in Table 1 of Ref. (1). TSH, thyroid-stimulating hormone; SR, secretion; D&E, distribution and elimination; TH, thyroid hormone; T<sub>4</sub>, thyroxine; T<sub>3</sub>, triiodothyronine; SC, subcutaneous; IM, intramuscular,  $%CV = \text{coefficient of variation} = 100 \times \frac{\text{standard deviation}}{\text{parameter value}}$ .

#### Model validation

We further tested the new FBCS model against a variety of clinical data sets (20,24,25) not used in its development. These included

1. Normal and abnormal steady-state hormone levels: We simulated steady-state plasma  $T_{3pSS}$ ,  $T_{4pSS}$ , and  $TSH_{pSS}$  concentrations in normal healthy subjects, and in thyroidectomized patients treated with L-T<sub>4</sub>, and compared the corresponding simulated hormone concentrations to real clinical data (10,20).

2. Normal circadian TSH data: We simulated normal (unperturbed) steady-state plasma  $T_{3p}(t)$ ,  $T_{4p}(t)$ , and  $TSH_p(t)$  responses over 24 hours and compared these to corresponding data collected from normal subjects (24).

3. Predicting the TSH response to oral  $T_3$  dosing: Validation of FBCS responses to oral  $T_3$  required an additional gut absorption submodel, to represent pathway dynamics from an exogenous oral  $T_3$  input into the  $T_3$  plasma pool shown in Figure 3. We adapted a  $T_3$  absorption model (1,26) to compute the  $T_3$  absorption and dissolution rates, assumed unknown, by fitting this submodel to time-course plasma  $T_3$ data taken in normal subjects after 75  $\mu$ g oral  $T_3$  (25). Using the complete FBCS model augmented with the  $T_3$  absorption submodel, we then compared simulated TSH<sub>p</sub>(t) responses to simulated 75  $\mu$ g oral  $T_3$  and compared these results predictively to real TSH PK data (25) after the same dose. We emphasize here that the TSH PK data were not used for quantifying the  $T_3$  absorption rate, but only for predictive validation purposes.

### Methods II: Clinical Applications of the Simulator

#### Combined $T_3/T_4$ treatment—updated

We expanded the simulation study done earlier with the simpler TH submodel alone (1), now using the updated and complete FBCS H-P-T axis model. We recomputed the L-T<sub>4</sub>– only doses needed to normalize (a) plasma T<sub>3</sub>, (b) lumped-tissue T<sub>3</sub> levels (from Fig. 3), and (c) a combined T<sub>3</sub> and T<sub>4</sub> regimen that approximately normalizes both plasma and lumped-tissue T<sub>3</sub> levels. With the updated and more complete model, we were able to simulate plasma TSH(*t*) responses as well as update our earlier plasma T<sub>3</sub> and T<sub>4</sub> predictions.

# Parenteral T<sub>4</sub> administration

Following the lead of Hays (27), we simulated subcutaneous (SC) and intramuscular (IM) administration of L-T<sub>4</sub>, using simple one-compartment models with an absorption half-life of 20.4 hours for SC administration, and an IM absorption rate twice that of SC (27,28)—rate constants  $k_{SC} = \ln 2/20.4 =$  $0.034 h^{-1}$  and  $k_{IM} = 0.068 h^{-1}$ ; see Figure 6. We computed the simulated L-T<sub>4</sub> dose needed to normalize lumped-tissue T<sub>3</sub> levels, when administered once or twice weekly, and either subcutaneously or intramuscularly. We also simulated plasma T<sub>3</sub>, T<sub>4</sub>, and TSH responses to each of these four regimens.

	Original thyroid s	submodels	Updated thyroid submodels		% Change from
Parameter	Estimate	%CV	Estimate	%CV	orig. estimate <sup>a</sup>
τ	6h		8 h		+33
D1 Km	$1.9\mu\mathrm{M}$	_	20 nM	_	-98.9
D2 $K_{\rm m}$	1.5 nM	_	1.5 nM	_	0.00
D1 $V_{\rm max}$ fast pool	$0.00999 \mathrm{h^{-1}}$	10.44	$0.000385\mathrm{h}^{-1}$	30.6	-96.1
D1 $V_{\text{max}}$ slow pool	$0.0279  \mathrm{h^{-1}}$	7.87	$0.000663  \mathrm{h}^{-1}$	6.27	-97.6
D2 $V_{\text{max}}$ slow pool	$0.000746\mathrm{h}^{-1}$	7.87	$0.00109  \mathrm{h}^{-1}$	6.27	+46.1
S <sub>3</sub>	$0.000336 \mathrm{h}^{-1}$	4.33	$0.000371\mathrm{h}^{-1}$	6.49	+10.4
S <sub>4</sub>	$0.00174\mathrm{h^{-1}}$	7.21	$0.00168  \mathrm{h}^{-1}$	7.4	-3.45
$T_4$ absorption rate	$0.882{ m h}^{-1}$	2.23	$0.881{ m h}^{-1}$	2.2	0.00

TABLE 2. COMPARISON OF OPTIMUM PARAMETER ESTIMATES FOR OUR ORIGINAL THYROID SUBMODELS(1) WITH OPTIMUM ESTIMATES USING THE UPDATED D1  $K_{\rm m}$  20 nM

<sup>a</sup>%Change =  $100 \times (\text{new estimate-old estimate})/\text{old estimate}$ .

# Central hypothyroidism

We simulated secondary hypothyroidism by first decreasing the magnitude of the sinusoid ( $A_0$ ) in the TSH secretion rate equation (Eq. 1) to 25% of normal, thereby decreasing the nighttime TSH surge, as is often seen in central hypothyroidism (29). Additionally, we decreased the overall TSH secretion rate ( $SR_{TSH}$ ) to 50%, 25%, 10%, 1%, and 0.1% of normal to simulate varying levels of secondary hypothyroidism.

# Results

#### Brain submodel quantification

Numerical testing of the brain submodel parameters  $k_3 \approx k_4$  constraint for Eq. 2 yielded very similar fits and parameter estimates for values of  $k_3$  30% above and below  $k_4$  (or vice versa), so  $k_3 = k_4$  in further simulations presented here. Figure 5 shows optimized plasma TSH(*t*) outputs for the new brain submodel, compared with TSH PK data. These were optimized by simultaneous fitting of data from experiments done with all three L-T<sub>4</sub> doses, to capture the nonlinearities, using T<sub>3</sub> and T<sub>4</sub> input forcing functions. Optimized parameter estimates and statistics for the brain submodel are given in Table 1.

# Thyroid submodels—effects of deiodinase $K_m$ values on model precision and predictive value

 $K_{mD1}$  update Optimum parameter estimates of the original and updated models are compared in Table 2. The estimated D1  $V_{max}$  values in both fast and slow tissue pools fell roughly 100-fold, paralleling the change in  $K_{mD1}$  to 20 nM. The time-delay estimate  $\tau$  for the thyroidal secretion responses to TSH stimulation that yielded the best fit to the data (Fig. 4) was centered at 8 hours, compared with 6 hours previously. A 6- to 8-hour range gave nearly identical results in both models, a range supported by several studies (30–33), as well as our own data in Figures 4 and 5.

D2 with T<sub>4</sub> estimate of  $V_{max}$  in the slow pool increased 46%. The TH secretion "gain" parameters changed 3–10%, and the remaining parameter estimates were unchanged. The quality of the model fitted to the data was essentially unchanged with the updated submodel included, as established from program optimization criteria, which were essentially the same for both models,<sup>c</sup> and illustrated in Figure 4. Reevaluation of earlier model predictions indicated no changes to our previous bioequivalence and replacement hormone results (1).

 $K_{mD2}$  sensitivities Newly optimized TH D&E and SR submodel parameter estimates for ±10-fold and ±100-fold changes in  $K_m$  values used for D2 with T<sub>4</sub> are given in Table 3. Small differences in several optimum parameter estimates are noted, but these had negligible effects on the weighted residual sum of squares (Table 3) and primary model predictions. For this reason, we retain the original  $K_{mD2}(T_4)$  in the new model.

# Complete FBCS H-P-T axis model

Aggregation of submodels Simulation of plasma  $T_{3p}(t)$ ,  $T_{4p}(t)$ , and  $TSH_p(t)$  responses to 400, 450, and  $600 \,\mu g \, L-T_4$  dosing using the complete FBCS model was essentially indistinguishable from optimized simulation responses to the same inputs by individual submodels shown in Figures 4 and 5. All model equations and parameter values are given together in the Appendix.

#### Model validation

1. Steady-state hormone level predictions: Comparisons of simulated steady-state hormone levels for normal subjects and treated thyroidectomized patients versus real steady-state hormone data are shown in Figure 7. Simulated results were nearly identical to measured steady-state hormone concentrations in patients from our primary database and matched clinical range data very well, both as shown in Figure 7.

2. *Predicting normal circadian TSH data*: Predicted normal TSH circadian rhythms matched measured data (24) well, as shown in Figure 8.

3. Predicting TSH response to  $T_3$  dosing: Resulting  $T_3$  absorption was 88% and dissolution  $1.78 h^{-1}$  when fitted to  $T_3$  plasma data (Fig. 9A). Gut parameter estimation results are

<sup>&</sup>lt;sup>c</sup>Two model comparison measures were used: the Akaike Information Criterion (AIC: -0.83 vs. -0.89) and the optimization criterion function (-3.6 vs. -3.7), for the updated and original submodels, both reported in SAAM II optimization results (11).

# FEEDBACK CONTROL SYSTEM SIMULATOR FOR THE H-P-T AXIS

TABLE 3. SENSITIV	ITIES OF OPTIMAL	Model Par	ameter Estimate	s for the <b>T</b>	hyroid and TH C	Ø&E Submoe	dels to $\pm 10\%$ and	${ m D} \pm 100\% { m Va}$	RIATIONS IN D2 K	$_{M}(T_{4})$
	$D2 \mathrm{~K}_m + 100$	%(	$D2 \mathrm{K}_m + 10$	%1	Original D2 K	m est.	D2 $K_m - 10$	%(	$D2 K_m - 100$	%
Parameter	Estimate	%CV	Estimate	%CV	Estimate	%CV	Estimate	%CV	Estimate	%CV
<b>ب</b>	8 h		8h		8 h		8 h		8h	
D1 $K_{\rm m}$	20  nM		20 nM		20 nM		$20 \mathrm{nM}$		$20\mathrm{nM}$	
D2 $K_{\rm m}$	$15 \mathrm{nM}$		15 nM		$1.5\mathrm{nM}$		15 nM		15 nM	I
D1 V <sub>max</sub> fast pool	$0.000241{ m h}^{-1}$	59.3	$0.000264{ m h}^{-1}$	49.3	$0.000385{ m h}^{-1}$	30.6	$0.000419{ m h}^{-1}$	27.6	$0.000423{ m h}^{-1}$	27.3
D1 V <sub>max</sub> slow pool	$0.000582{ m h}^{-1}$	7.20	$0.000636{ m h}^{-1}$	6.55	$0.000663{ m h}^{-1}$	6.27	$0.000666{ m h}^{-1}$	6.25	$0.000666{\rm h}^{-1}$	6.25
D2 V <sub>max</sub> slow pool	$0.0121{ m h}^{-1}$	7.20	$0.00214{ m h}^{-1}$	6.55	$0.00109{ m h}^{-1}$	6.27	$0.000974{ m h}^{-1}$	6.25	$0.000963{ m h}^{-1}$	6.25
S <sub>3</sub>	$0.000452{ m h}^{-1}$	7.07	$0.000422{ m h}^{-1}$	6.58	$0.000371{ m h}^{-1}$	6.49	$0.000359{ m h}^{-1}$	6.53	$0.000357  { m h}^{-1}$	6.53
$S_4$	$0.00160{ m h}^{-1}$	7.90	$0.00162{ m h}^{-1}$	7.71	$0.00168{ m h}^{-1}$	7.4	$0.00169{ m h}^{-1}$	7.33	$0.00169{ m h}^{-1}$	7.32
T <sub>4</sub> absorption rate	$0.880{ m h}^{-1}$	2.20	$0.880{ m h}^{-1}$	2.20	$0.881{ m h}^{-1}$	2.2	$0.881{ m h}^{-1}$	2.20	$0.881{ m h}^{-1}$	2.20
Total objective	-3.72		-3.78		-3.81		-3.81		-3.81	
T <sub>4</sub> , thyroxine.										

given in Table 1. The predicted  $TSH_p(t)$  response to oral  $T_3$ closely matched measured plasma TSH data, as shown in Figure 9B.

# Simulator clinical applications

Updated combined T<sub>3</sub>/T<sub>4</sub> treatment The simulated L-T<sub>4</sub>only dose needed to normalize plasma T<sub>3</sub> to prethyroidectomy levels was  $165 \mu g \text{ L-}T_4/day$ , the L-T<sub>4</sub>-only dose needed to normalize lumped-tissue  $T_3$  levels was  $145 \,\mu g$ L-T<sub>4</sub>/day, and the combined L-T<sub>4</sub>+T<sub>3</sub> dose needed to normalize both plasma and lumped-tissue  $T_{\rm 3}$  levels (as well as plasma T<sub>4</sub> levels) was  $105 \mu g \text{ L-T}_4 + 9 \mu g \text{ T}_3$  per day. In all three regimens, average steady-state-simulated plasma  $T_{3}$ ,  $T_4$ , and TSH were all within their normal ranges ( $T_4$ : 5–  $12 \,\mu g/dL$ ; T<sub>3</sub>: 0.8–1.9 ng/mL; and TSH: 0.5–5 mU/L).

Parenteral T<sub>4</sub> administration Lumped-tissue T<sub>3</sub> levels were roughly normalized using simulated dosings of  $800 \,\mu g$ L-T<sub>4</sub> weekly and 400  $\mu$ g twice weekly, for both the SC and IM routes, similar to the 750 and 375  $\mu$ g reported by Hays (27). In all four regimens (once vs. twice weekly, SC vs. IM), plasma T<sub>3</sub>, T<sub>4</sub>, and mean TSH were maintained within their normal ranges (T<sub>4</sub>: 5-12 µg/dL; T<sub>3</sub>: 0.8-1.9 ng/mL; and TSH: 0.5-5 mU/L). Once weekly, IM administration of L-T<sub>4</sub> showed the largest fluctuation in plasma TSH levels, with nighttime peaks as high as 8 mU/L near the end of the week; twice weekly, SC administration by contrast showed the smallest fluctuation in TSH plasma levels, which stayed within 1.5-4.5 mU/L.

Central hypothyroidism Results for TSH secretion suppression ranging from 0.1% to 50% of normal are given in Figure 10. Steady-state plasma TSH levels stayed (barely) within the normal range throughout the simulations, though plasma T<sub>4</sub> dropped below the normal range as TSH secretion was reduced below 25%, and plasma T<sub>3</sub> dropped below the normal range below 1% TSH secretion. As expected, timecourse plasma TSH dropped rapidly after reducing TSH secretion, due to its relatively short half-life in blood. This was followed by a slow return of TSH toward normal, due to relatively slower TH negative feedback response dynamics, all as shown in the inset in Figure 10.

# Discussion

### New simulator development and validation

We built this model on the framework established by Eisenberg et al. (1), the major update being explicit representation and quantification of the brain submodels not included earlier. The new simulator incorporates circadian and basal TSH secretion, as well as nonlinear T<sub>3</sub> and T<sub>4</sub> regulation of TSH secretion and-for the first time-it has been fully quantified from a substantial quantity of clinical data, over a wide range of physiological and pathophysiological conditions. Earlier FBCS models of thyroid hormone regulation were similarly structured [e.g., Refs. (34-39)], but severely encumbered by lack of quantitative data for model building or verification.

We quantified the brain submodels using physiological and PK data and combined these new submodels with our updated TH submodels, thereby providing a quantified



**FIG. 7.** Feedback control system model validation study results. Predicted steady-state concentrations of thyroid-stimulating hormone (TSH), triiodothyronine ( $T_3$ ), and thyroxine ( $T_4$ ) in normal euthyroids and thyroidectomized patients treated with 150 µg levothyroxine (L- $T_4$ ) (circles) versus steady-state hormone data (triangles) (10) and typical clinical ranges (bars) (20).

simulation model of the complete closed-loop system. The nonlinear TH D&E submodel was updated with a more physiological deiodinase  $K_m$  value (7), which did not affect the fit of the model to the data, but did alter the relative amounts of T<sub>4</sub> converted to T<sub>3</sub> in slow versus fast tissues. The extended simulation model, with TSH(*t*) now included as a response variable, is capable of exploring many more physiological and clinical conditions; it no longer requires specific, case-by-case experimental TSH data.

We did not include ultradian TSH oscillations in our model because apparent smoothing characteristics of downstream



**FIG. 8.** Feedback control system (FBCS) model validation study results. Predicted normal circadian thyroid-stimulating hormone (TSH) versus independent TSH data (not used in fitting the FBCS model) from three individuals [triangles and diamonds from (24), circles from (42)]. Also shown (squares) are the mean TSH data from the larger database used to fit the FBCS model (10).

thyroid gland and D&E components likely damp out any effects of these oscillations on feedback regulation. Further, as ultradian rhythms are not in phase between individuals, our model—which is based on the dynamics of a subject population average—further smoothes these smaller variations.

We validated the new FBCS model by independent comparisons with data not used in its development. Simulated steady-state plasma  $T_3$ ,  $T_4$ , and TSH concentrations in euthyroids and treated thyroidectomized patients were well within normal ranges and also closely matched normal steady-state data from actual subjects (10). In treated thyroidectomized (open-loop) patients, steady-state  $T_3$  and  $T_4$ predictions were nearly identical to our previous simulation results (1). Normal daily TSH<sub>p</sub>(*t*) circadian variation simulations also closely matched independent plasma TSH data taken from normal human subjects (24) (Fig. 8); and simulated normal daily  $T_3$  and  $T_4$  showed circadian variation of smaller magnitude, consistent with clinical data for human subjects (20,40).

We also validated the complete FBCS model against independent TSH response data following an oral  $T_3$  challenge (25).  $T_3$  dissolution and absorption into plasma from gut was modeled using a two-compartment gut  $T_3$  submodel and quantified from  $T_3$  plasma appearance data after 75  $\mu$ g oral  $T_3$  (25). This test was important because, while effects of  $T_3$  on TSH secretion are explicit in the brain submodel, the overall FBCS model was optimized only to  $T_4$  response data, not  $T_3$ . Simulated plasma TSH<sub>p</sub>(*t*) response to an oral 75  $\mu$ g  $T_3$  dose matched real TSH data quite closely (Fig. 9), providing independent validation for the previously untested  $T_3$  regulatory pathway of the model.

#### Simulator applications

Combined  $T_3/T_4$  treatment—updated In simulated thyroidectomized subjects, we found  $165 \,\mu g \ L-T_4/day$  normal-



**FIG. 9.** (**A**) Fit of additional triiodothyronine (T<sub>3</sub>) absorption model to T<sub>3</sub> data (n = 28) taken after 75  $\mu$ g oral T<sub>3</sub> (25). T<sub>3</sub> absorption was fit to 88%. (**B**) Feedback control system model validation study results. Predicted thyroid-stimulating hormone (TSH) concentrations in normal subjects after 75  $\mu$ g oral T<sub>3</sub>, compared with TSH data from (25), following same input.

ized plasma T<sub>3</sub>, 145 µg L-T<sub>4</sub>/day normalized lumped-tissue T<sub>3</sub>, and 105 µg L-T<sub>4</sub> + 9 µg T<sub>3</sub> per day normalized both plasma and lumped-tissue T<sub>3</sub> levels, as well as plasma T<sub>4</sub> levels. All three regimens are quite close to our earlier simulation predictions (1) of 162 µg L-T<sub>4</sub>/day, 141 µg L-T<sub>4</sub>/day, and 103 µg L-T<sub>4</sub>/day + 6 µg T<sub>3</sub>/day, respectively. And all three regimens maintained plasma TSH, T<sub>3</sub>, and T<sub>4</sub> within normal ranges. Previously, we had compared combined L-T<sub>4</sub> + T<sub>3</sub> therapy versus L-T<sub>4</sub>-only therapy, by simulating T<sub>3</sub> levels only in tissue and plasma, without the benefit of a closed feedback loop (1). We had no explicit model of the H-P brain components, so we could not simulate corresponding plasma TSH levels.

Interestingly, the daily TSH circadian range—from nighttime peak to daytime nadir—was somewhat higher (2.3– 5.0 mU/L) with combined  $T_3/T_4$  treatment versus 0.5–1.3 and 1.1-2.7 mU/L for the two L-T<sub>4</sub>–only regimens. The combined treatment circadian range more closely matches our simulations and clinical data for euthyroid normal subjects (~2– 6 mU/L; see Figs. 8 and 5), but all three regimens maintained TSH levels within the normal range. This effect is likely due to high-normal T<sub>4</sub> levels, observed both in our simulations and in patients undergoing L-T<sub>4</sub>-only therapy (20), providing additional TSH suppression. These results may serve to explain clinical observations that euthyroid patients on L-T<sub>4</sub>-only therapy were subjectively more content when their TSH was low-normal (41)—the simulated T<sub>4</sub>-only regimen that normalizes tissue T<sub>3</sub> levels yields a lower average TSH concentration than our normal subject simulations and data.

Parenteral  $T_4$  administration We confirmed and expanded on Hays' recent analysis of these alternate drug administration routes (27). Simulated 800  $\mu$ g L- $T_4$  weekly and 400  $\mu$ g L- $T_4$  twice weekly (by SC or IM routes) normalized lumped-tissue  $T_3$  levels, only slightly higher than Hays' results (750  $\mu$ g L- $T_4$  once and 375  $\mu$ g L- $T_4$  twice weekly). Whereas Hays used only  $T_4$  subsystem kinetics, we were able to simulate TSH and  $T_3$  as well, finding that daily average plasma TSH as well as  $T_3$  and  $T_4$  remained within normal ranges for all four dosing scenarios. These simulations provide further evidence that L- $T_4$  can be administered parenterally once or twice weekly in patients with diminished L- $T_4$  gut absorption, maintaining TSH and TH levels in blood and tissues within normal ranges.



**FIG. 10.** Effects of central hypothyroidism on steady-state thyroid-stimulating hormone (TSH), thyroxine ( $T_4$ ), and triiodothyronine ( $T_3$ ). Hormone levels versus TSH secretion at 100%, 50%, 25%, 10%, 1%, and 0.1% of normal. Inset (top): Predicted time-course of plasma TSH response to reducing TSH secretion to 1% of normal at t = 0. Grey shading indicates normal range for each hormone.

Central hypothyroidism Steady-state hormone concentrations in response to various degrees of central hypothyroidism (Fig. 10) were within normal ranges for TSH secretion down to 25% of normal. Simulated TSH levels showed an initial drop to nearly zero (see Fig. 10) immediately after reducing TSH secretion, before returning toward normal, illustrating the powerful feedback effects at work, even when TSH secretion is greatly diminished.

IN SUMMARY, we have demonstrated that the new simulator captures the essential features of H-P-T axis dynamics over a fairly wide range of linear and nonlinear operation, both physiological and pathophysiological. Independent validation against data not used in model development suggests that it is capable of accurate predictions and it is thus potentially useful for exploring other unanswered questions about TH regulation in health and disease.

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#### **Disclosure Statement**

No competing financial interests exist.

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# Appendix

Brain submodel equations (see Methods section)	
$SR_{TSH}(t) = (B_0 + A_0 \sin(\frac{2\pi}{24}t - \phi_{phase}))e^{-T_{3B}(t)}$	Eq. 1
$T\dot{S}H_{p} = SR_{TSH} - k_{degTSH}TSH_{p}$	See TSH D&E submodel in Methods
$\dot{\mathbf{T}}_{3B}(t) = \frac{k_4}{\mathbf{T}_{4pSS}} \mathbf{T}_{4p}(t) + \frac{k_3}{\mathbf{T}_{3pSS}} \mathbf{T}_{3p}(t) - k_{\text{degT3B}} \mathbf{T}_{3B}(t)$	Eq. 2
Thyroid submodel equations [see Fig. 3 and Ref. (1)	]
$SR_3(t) = S_3 TSH(t - \tau) \qquad SR_4(t) = S_4 TSH(t - \tau)$	See Fig. 3 and Eq. 6 in Ref (1)
$\dot{T}_{4p} \equiv \dot{q}_1 = SR_4 + k_{12}q_2 + k_{13}q_3 - (k_{31}^{free} + k_{21}^{free})FT_4 + gut3T_{4dissolv} + k_{SC}T_{4SC} + k_{IM}T_{4IM}$	See Fig. 3 and Ref. (1)
$\dot{q}_2 = k_{21}^{\text{free}} \text{FT}_4 - \left(k_{12} + k_{02} + \frac{V_{\text{maxD1fast}}}{K_{\text{mD1fast}} + q_2}\right) q_2$	See Fig. 3 and Ref. (1)
$\dot{q}_3 = k_{31}^{\text{free}} \text{FT}_4 - \left(k_{13} + k_{03} + \frac{V_{\text{maxD1slow}}}{K_{\text{mD1slow}} + q_3} + \frac{V_{\text{maxD2slow}}}{K_{\text{mD2slow}} + q_3}\right) q_3$	See Fig. 3 and Ref. (1)
$\dot{T}_{3p} \equiv \dot{q}_4 = SR_3 + k_{45}q_5 + k_{46}q_6 - (k_{64}^{free} + k_{54}^{free})FT_3 + k_{T_3absorp}T_{3dissolv}$	See Fig. 3 and Ref. (1)
$\dot{q}_5 = k_{54}^{\text{free}} \text{FT}_3 + \frac{V_{\text{maxD1fast}} q_2}{K_{\text{mD1fast}} + q_2} - (k_{45} + k_{05}) q_5$	See Fig. 3 and Ref. (1)
$\dot{q}_{6} = k_{64}^{\text{free}} \text{FT}_{3} + \frac{V_{\text{maxD1slow}} q_{3}}{K_{\text{mD1slow}} + q_{3}} + \frac{V_{\text{maxD2slow}} q_{3}}{K_{\text{mD2slow}} + q_{3}} - (k_{46} + k_{06})q_{6}$	See Fig. 3 and Ref. (1)
${ m FT}_3=ig(a+b{ m T}_4+c{ m T}_4^2+d{ m T}_4^3ig)T_{3p}$	See Fig. 3 and Eq. 4 in Ref. (1)
$\mathrm{FT}_4 = \left(A + B\mathrm{T}_4 + C\mathrm{T}_4^2 + D\mathrm{T}_4^3\right)T_{4p}$	See Fig. 3 and Eq. 5 in Ref. (1)
Gut and SC/IM input submodels [see Methods and Ref.	(1)]
$\dot{T}_{4solid} = u_{exog} - gut1T_{4solid}$	See Methods and Ref. (1)
$\dot{T}_{4dissolv} = gut1T_{4solid} - (gut2 + gut3)T_{4dissolv}$	See Methods and Ref. (1)
$\dot{\mathbf{T}}_{3\text{solid}} = u_{\text{exog}} - k_{\text{T}_3 \text{dissolv}} \mathbf{T}_{3\text{solid}}$	See Methods
$\dot{\mathbf{T}}_{3 \text{dissolv}} = k_{\text{T}_3 \text{dissolv}} \mathbf{T}_{3 \text{solid}} - (k_{\text{T}_3 \text{absorp}} + k_{\text{T}_3 \text{deg}}) \mathbf{T}_{3 \text{dissolv}}$	See Methods
$\dot{\mathrm{T}}_{\mathrm{4SC}} = u_{\mathrm{exog}} - k_{\mathrm{SC}} \mathrm{T}_{\mathrm{4SC}}$	See Methods

See Methods

 $\dot{\mathbf{T}}_{4\mathrm{IM}} = u_{\mathrm{exog}} - k_{\mathrm{IM}}\mathbf{T}_{4\mathrm{IM}}$ 

Original TH Submodel Parameter Values [Details Given in Table 1 of Ref. (1)].

$$\begin{split} A &= 0.000289; B = 0.000214 \,\mu \text{mol}^{-1}; C = 0.000128 \,\mu \text{mol}^{-2}; D = -8.83 \times 10^{-6} \,\mu \text{mol}^{-3}; \\ a &= 0.00395; b = 0.00185 \,\mu \text{mol}^{-1}; c = 0.000610 \,\mu \text{mol}^{-2}; d = 0.000505 \,\mu \text{mol}^{-3}; \\ k_{02} &= 0.0189 \,\text{h}^{-1}; k_{05} = 0.207 \,\text{h}^{-1}; k_{12} = 0.868 \,\text{h}^{-1}; k_{13} = 0.108 \,\text{h}^{-1}; k_{45} = 5.37 \,\text{h}^{-1}; \\ k_{46} &= 0.0689 \,\text{h}^{-1}; \,k_{21\text{free}} = 1503 \,\text{h}^{-1}; \,k_{31\text{free}} = 584 \,\text{h}^{-1}; \,k_{54\text{free}} = 2043 \,\text{h}^{-1}; \,k_{64\text{free}} = 127 \,\text{h}^{-1}; \\ k_{21} &= 0.544 \,\text{h}^{-1}; \,k_{31} = 0.211 \,\text{h}^{-1}; \,k_{54} = 9.24 \,\text{h}^{-1}; \,k_{64} = 0.573 \,\text{h}^{-1} \end{split}$$