Open-Source and Open-Science to Progress the Integration of Pharmacometrics and Systems Pharmacology

Matthew Riggs, Ph.D. Chief Science Officer

Metrum Research Group

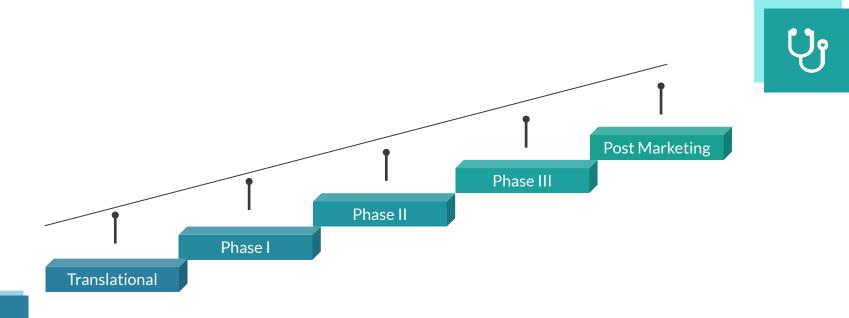
Monday, 26 August 2019





Drug Development

Starts as an idea ... becomes a medicine (if it deserves to be)



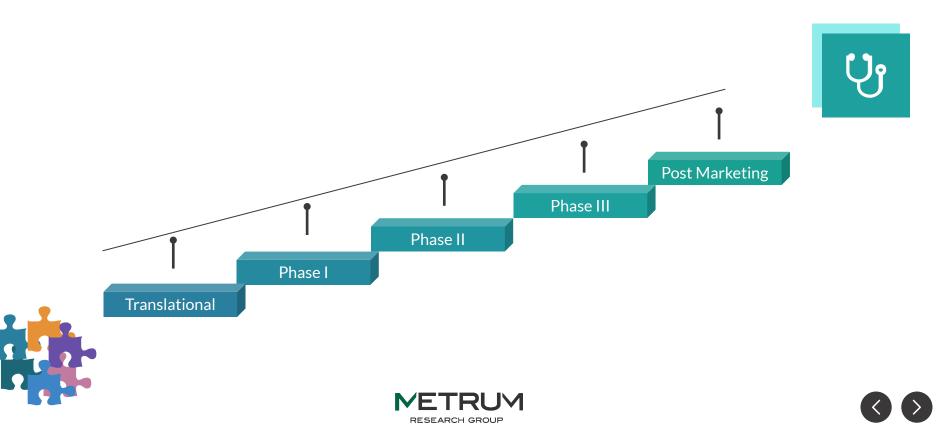
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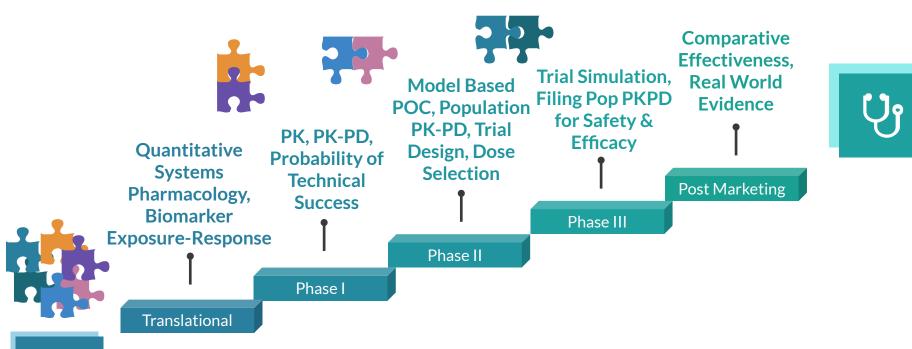


Drug Development

The idea though can be a puzzle at the start



Modeling and Simulation: inform decision support as pieces are fit together



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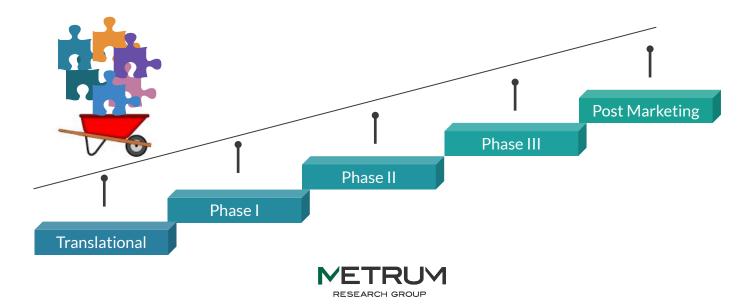


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Modeling and Simulation: how do we make our models all the better?

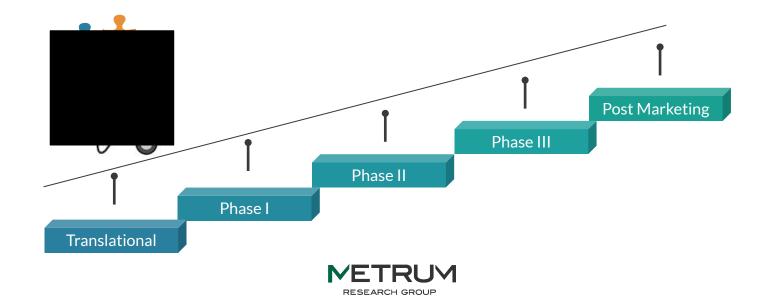
Pretend

Scenario 1: *Company A* develops a model that helps to carry the pieces more easily through development. They called this a "one-compartment barrow", and boast at ACoP10 that it accelerated development into Phase 1 ...



Modeling and Simulation: how do we make our models all the better?

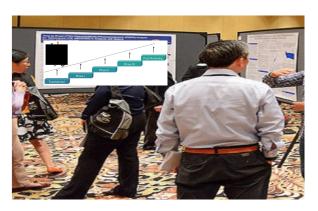
Scenario 1: ... but they hide the model. Because how else can Company A make money off the drug?



Modeling and Simulation: how do we make our models all the better?

Scenario 1: ... the repercussions: Company B, C, D, ... Z see the fancy presentation at ACoP10 and want a "one-compartment barrow", too.

From bootlegged photos, they go to work...



"It looked like it had a sled arch on the bottom with some kind of hook; a labmate did a model like that in grad school. I can work with my adviser and we'll have it recreated in no time; shouldn't take more than 2 weeks" Company X

"Let's form an internal working group..." Company H

"There's this private-public consortium, we give them all of our data, then they develop a model that they'll sell back later as a black box" Companies O, M, Y

"Pfft, I'll use machine learning; it can solve anything, even without data..." Company G





Modeling and Simulation: how do we make our models all the better?

Scenario 1: ... 6 months later....

We need to show management some progress!



"I know but with the new semester about to start and 3 more NIH grant applications, it's slow but they are making progress (I think?)..." Company X

"Our working group has reached out and engaged key stakeholders, leveraged synergies, and is ensuring with resource utilization that the modeling will be impactful ..." Company H

"Legal only let us share summary level placebo data and the goals alignment is, well, complicated... but, we've trademarked the term 'OC barrow' and assured management that we're streamlining efficiencies." Companies O, M, Y

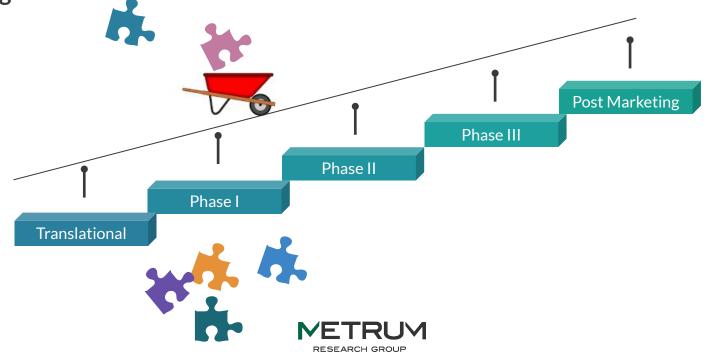
"I've trained my AI algorithm to perfectly fit both data points..." Company G





Modeling and Simulation: how do we make our models all the better?

Scenario 1: ... meanwhile, back at Company A... "well, we didn't see that (AE) coming"



Modeling and Simulation: how do we make our models all the better?

Scenario 1: ... Company A... "we're exiting this therapeutic area, close everything up and send it to archive..."



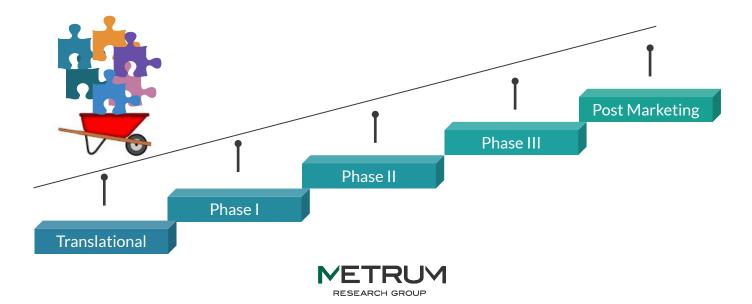




Modeling and Simulation: how do we make our models all the better?

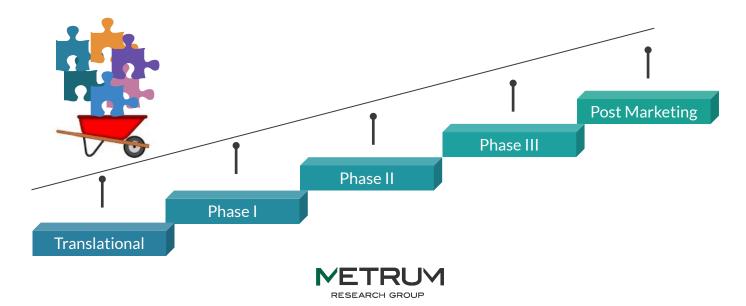
Pretend

Scenario 2: *Company* A develops a model that helps to carry the pieces more easily through development. They called this a "one-compartment barrow", and boast at ACoP10 that it accelerated development into Phase 1...



Modeling and Simulation: how do we make our models all the better?

Scenario 2: ... and they know the model could be made even better, so they share it on (DDMoRe, github, biomodels, ...). Because how better can *Company* A multiply their progress from program to program?



Modeling and Simulation: how do we make our models all the better?

Scenario 2: ... the advancement: Company B, C, D, ... Z see the fancy presentation at ACoP10 and want a "one-compartment barrow", too.

From the open-source code, they go to work...



"If we add a second wheel up front it will be less likely to tip over..." Company X

"Let's build and add a Shiny app to help visualize the results and path forward..." Company H

"You know, if we share ideas: what do you think about 4 wheels and an engine..." Company O, M, Y

"And we could add an algorithm for better fitting and then use those new verification and validation standards to show its cross-application performance..." Company G





Modeling and Simulation: how do we make our models all the better?

Scenario 2: ... 6 months later....

We can't wait to show management the progress!



"This is great, everyone on the team is playing around with the model. That steering wheel Shiny app that H added was great ..." Company X

"We've identified other therapeutic areas that this will work for, too ..." Company H

"That VVUQ stuff sounded too complicated but now that the whole community is using the model, we're more confident that (investors, regulators, payers) will be asking for the results, too ... " Company O, M, Y

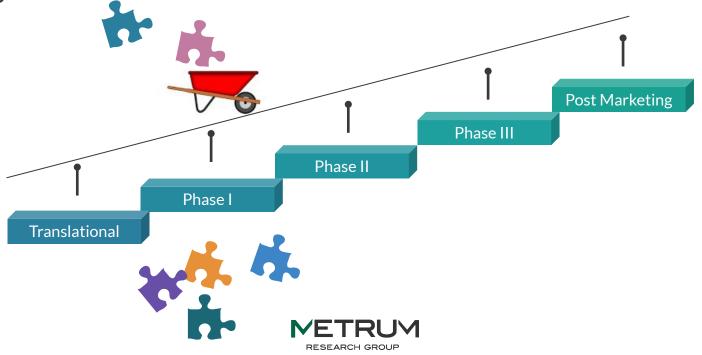
"Oh, that "enhanced barrow", as you're calling it now, is going to like a clunky old pickup truck when you see what we're about to add next ..." Company G





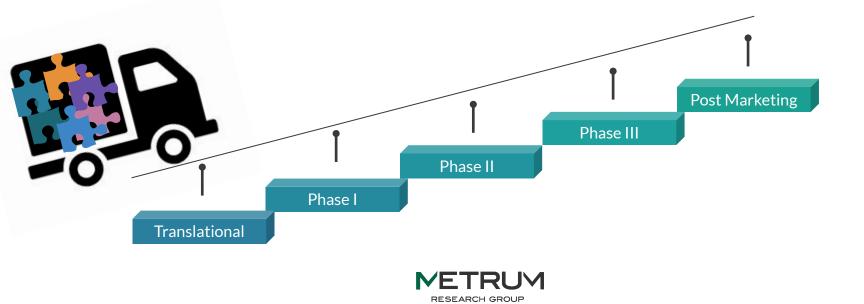
Modeling and Simulation: how do we make our models all the better?

Scenario 2: ... meanwhile, back at Company A... "well, we didn't see that (AE) coming"



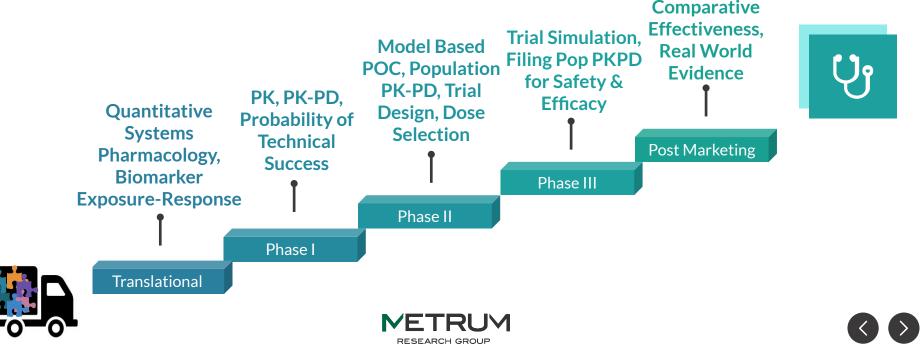
Modeling and Simulation: how do we make our models all the better?

Scenario 2:... Companies A-Z... "we may be exiting this therapeutic, though with improved model-informed decision support we're so much more confident in these next development programs..."



Ok sure, it's idealistic, though ... how could it really work?

Open-Source and Open-Science to Progress the Integration of Pharmacometrics and Systems Pharmacology



Examples: integrated Pharmacometrics and Systems Pharmacology (iPSP)

Mineral and Bone Health Model

Cardio-Renal Model

ERK Model

OSPSuite

When Learn/Confirm Leads to Expand/Understand: The **Expanding Role of Quantitative** Systems Pharmacology in the **Betterment of Therapeutics** Development

Matthew M. Riggs1

Our earnest ambitions to advance therapeutics for patients worldwide often begin by asking two questions: "Is the treatment safe?" and "Is the treatment efficacious?" The next question, however, is can we do even better? Moving beyond "Is the treatment ... ?" to "Why is the treatment ...?" and "How can we use that information to make the treatment even better?" We will examine how learn/confirm leads to expand/understand with the expanding role of quantitative systems pharmacology.

peutics for patients worldwide often begin by asking two questions: "Is the treatment types,2 and offered new hopes toward curing safe?" and "Is the treatment efficacious?" We design programs to answer those questions that anticipate and answer challenges We have achieved sustained response for Optimization of Parathyroid Hormone ment on confirmation, as this immediately

Our earnest ambitions to advance thera- previously deadly viral infection,1 provided platforms assessing survival across cancer rare diseases,3 to name a few.

The next question, however, is can we do even better? Should we continue challengthat are often far more complicated than ing ourselves beyond "Is the treatment ... ?" these seemingly simple questions may imply. to "Why is the treatment ...?" and "How Box" views scientific progress as consist-Development designs are streamlined for can we use that information to make the ing of, and requiring, alternating steps efficiencies while gathering as much data treatment even better?" We are given a reas possible to support approval of the new sounding yes to the question of "Can we being learning from experience, and the medication as safe relative to measurable do better?" in the report by Khurana et al. 4 latter being confirmation of what has been improvement in patient outcome. Progress on the "Use of a System's Pharmacology learned."" He continues "The understandfrom our efforts has been remarkable. Model Based Approach Towards Dose able focus of commercial drug develop-

Therapy in Hypoparathyroidism." That report provides a teaching example of how to conduct and position quantitative systems pharmacology (OSP) modeling that resonates whether in discovery or regulatory review, namely: (i) understand the unanswered question(s), (ii) use a validated-forpurpose model to challenge alternative hypotheses, and (iii) take those expanded learnings to progress therapeutics.

COMMENTARY

To begin, the authors extend an exist ing open-source, multiscale QSP model⁵ as their foundation. The model was first extended to include dosing of exogenously administered parathyroid hormone (PTH) and a compartment capturing urinary calcium output. The model was then validated for purpose using sponsor phase I data. The investigators used this in silico platform to explore the mechanisms by which the intended treatment provides effectiveness, while seeking an optimum kinetic balance of physiologic feedbacks to minimize an untoward effect in the kidneys (hypercalciuria).

The details of how Khurana et al.4 progressed to this point are important. First, though, let us further consider the notion of continuing beyond "Is the treatment ... ?" to "Can we make it even better?" In the absence of sheer chance, this requires clear understanding of the mechanisms, or what we can consider as physiologic and pharmacologic rules, by which the treatment is operating. In his seminal 1997 commentary, Dr Lewis Sheiner begins with: "George of induction and deduction: the former

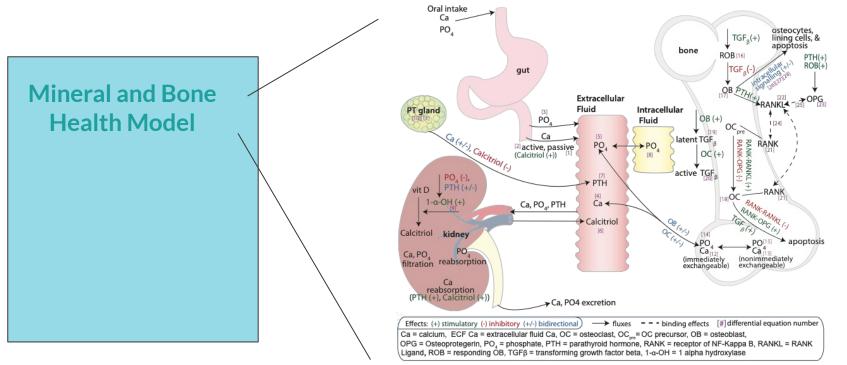
¹Metrum Research Group LLC, Tariffville, Connecticut, USA. Correspondence: Matthew M. Riggs (mattr@metrumrg.com)

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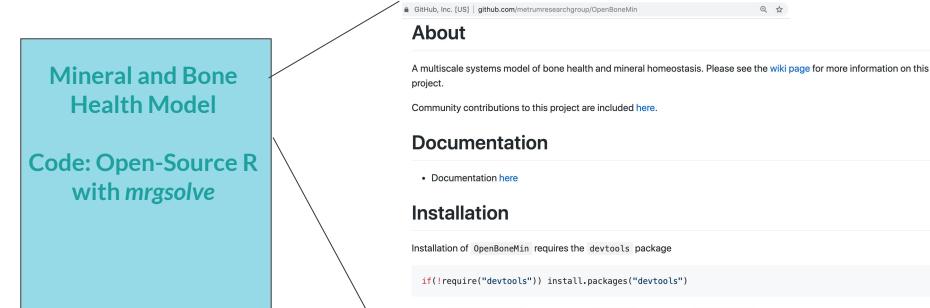
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https://ascpt.onlinelibrary.wiley.com/doi/10.1002/cpt.1287



Peterson and Riggs. Bone 2010

Promoting Open-Source, Open Science Community Involvement on GitHub: <u>https://github.com/metrumresearchgroup/OpenBoneMin</u>

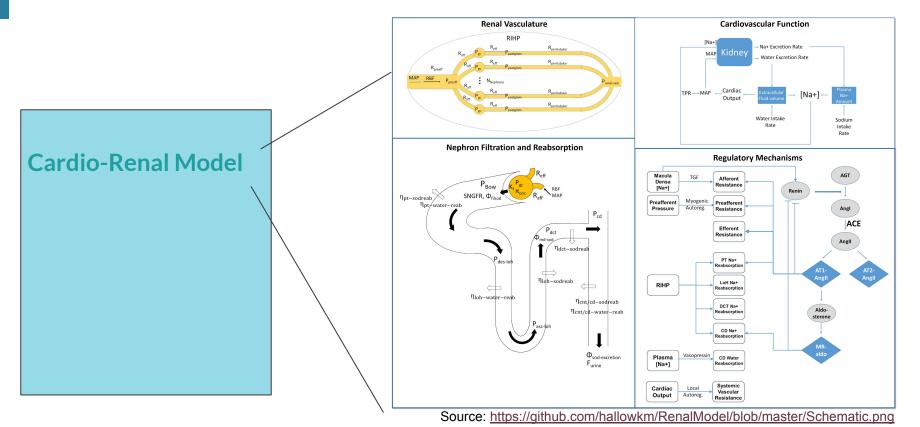


Use the install_github function inside devtools to install the OpenBoneMin package from GitHub to your local machine

devtools::install_github("metrumresearchgroup/OpenBoneMin")



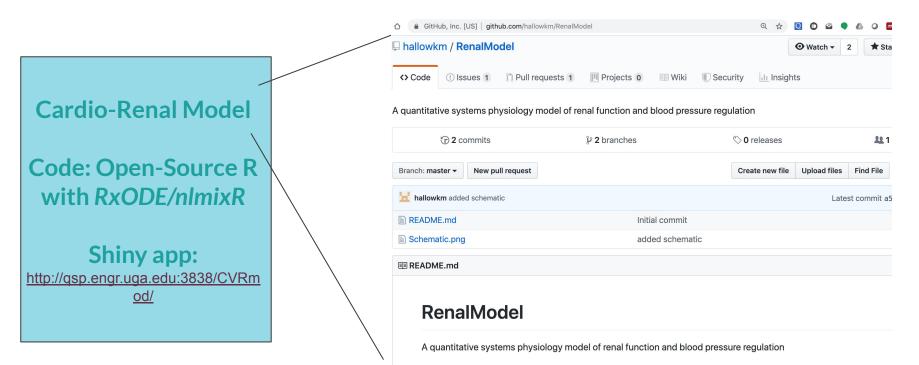




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Promoting Open-Source, Open Science Community Involvement on GitHub: <u>https://github.com/hallowkm/RenalModel</u>



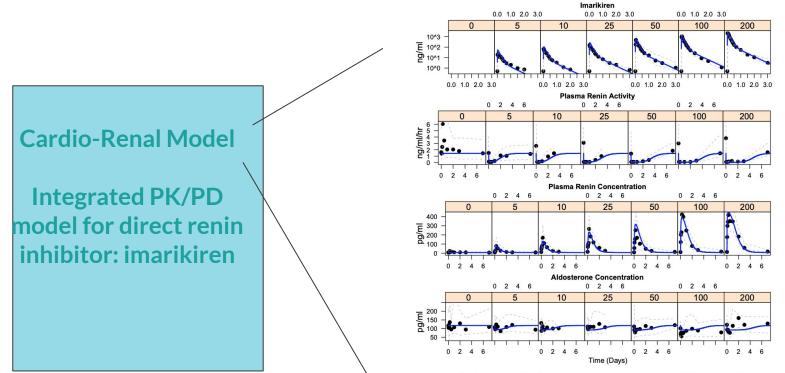




Journal of Pharmacokinetics and Pharmacodynamics (2019) 46:15-25

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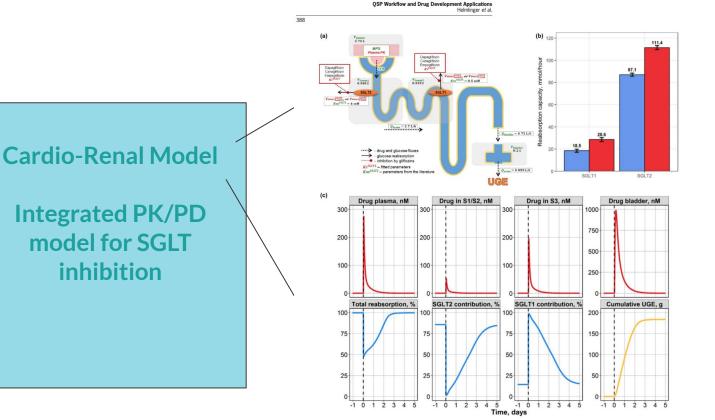
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Gebremichael, Y., Lahu, G., Vakilynejad, M., & Hallow, K. M. (2019). J Pharmacokinet Pharmacodyn, 46(1), 15–25.

Fig. 2 Plasma concentration-time profile of imarikiren for doses ranging from 5 to 200 mg (top row). Pharmacodynamics response of renin inhibition as shown by PRA (second row), PRC (third row), and aldosterone (fourth row). Panel labels indicate the dose in mg. Solid blue curves represent model fit for the typical individual and filled circles represent clinical data. The dashed gray curves in the figure represent the 5 and 95% quantiles of the clinical data (Color figure online)





Brady, J. A., & Hallow, K. M. (2017). Model-Based Evaluation of Proximal Sodium Reabsorption Through SGLT2 in Health and Diabetes and the Effect of Inhibition With Canagliflozin. J Clin Pharmacol.

Hallow, K. M., Greasley, P. J., Helmlinger, G., Chu, L., Heerspink, H. J., & Boulton, D. W. (2018). Evaluation of renal and cardiovascular protection mechanisms of SGLT2 inhibitors: model-based analysis of clinical data. *Am J Phys. Ren Phys*, 315(5), F1295–F1306.

Hallow, K. M., Helmlinger, G., Greasley, P. J., McMurray, J. J. V., & Boulton, D. W. (2018). Why do SGLT2 inhibitors reduce heart failure hospitalization? A differential volume regulation hypothesis. *Diabetes, Obesity & Metabolism, 20*(3), 479–487.

Helmlinger, G., Sokolov, V., Peskov, K., Hallow, K. M., Kosinsky, Y., Voronova, V., ... Penland, R. C. (2019). Quantitative Systems Pharmacology: An Exemplar Model-Building Workflow With Applications in Cardiovascular, Metabolic, and Oncology Drug Development. *CPT: PSP*, 8(6), 380–395.



Fig 4 of Helmlinger, G., Sokolov, V., Peskov, K., Hallow, K. M., Kosinsky, Y., Voronova, V., ... Penland, R. C. (2019). CPT: PSP, 8(6), 380–395.

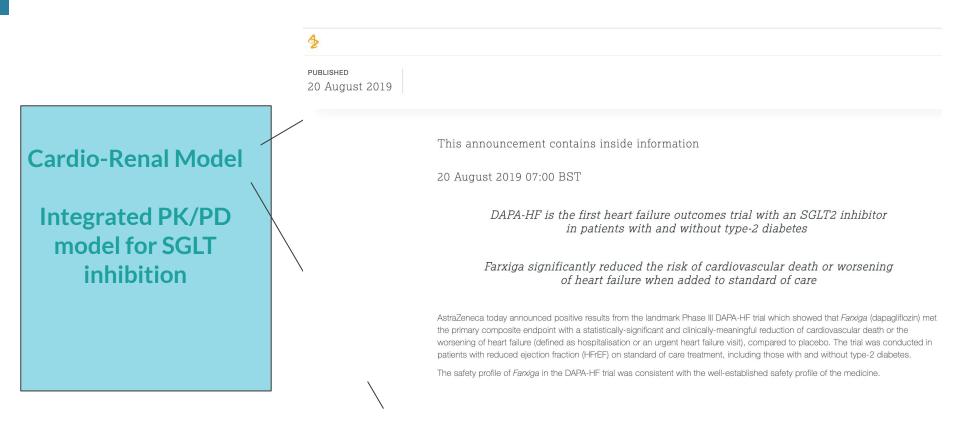
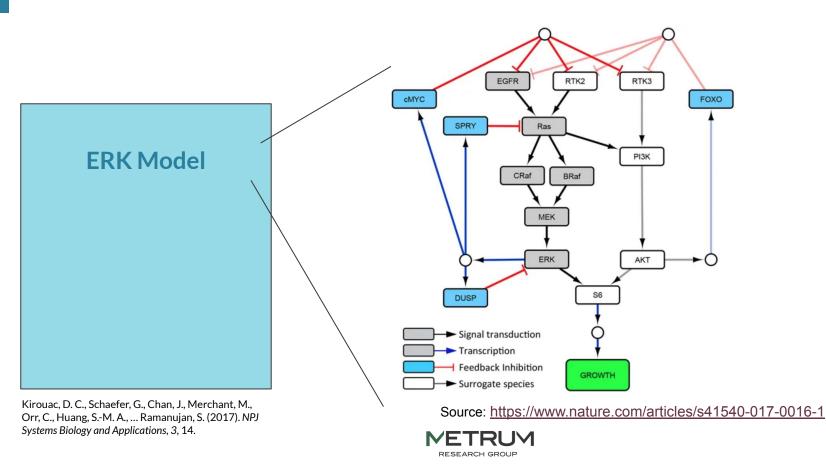


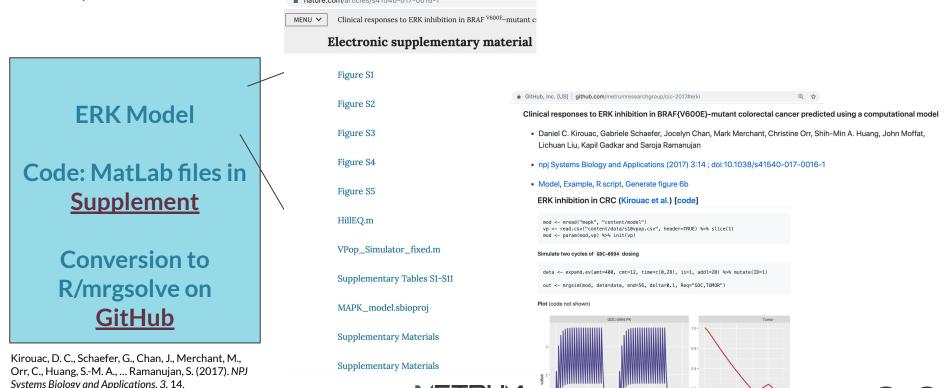


Fig 4 of Helmlinger, G., Sokolov, V., Peskov, K., Hallow, K. M., Kosinsky, Y., Voronova, V., ... Penland, R. C. (2019). CPT: PSP, 8(6), 380–395.





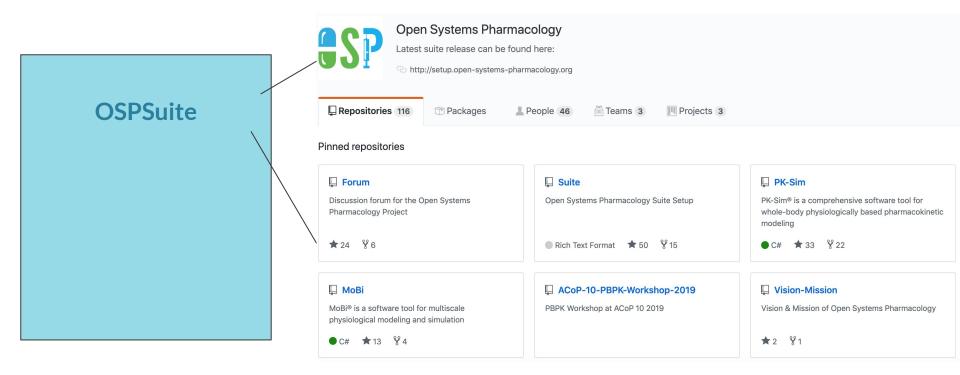
Promoting Open-Source, Open Science through Supplementary Materials (and GitHub)



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Promoting Open-Source, Open Science Community Involvement on GitHub: <u>https://github.com/Open-Systems-Pharmacology</u>



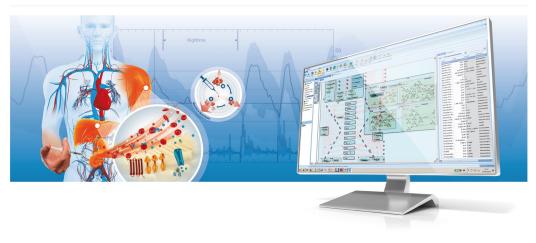


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GitHub, Inc. [US] github.com/Open-Systems-Pharmacology/Glucose-Insulin-Model

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Welcome to the Glucose Insulin model



The physiologically-based whole-body model of the glucose-insulin-glucagon regulatory system

Within this repository, we distribute the physiologically-based whole-body model of glucose-insulin-glucagon regulation based



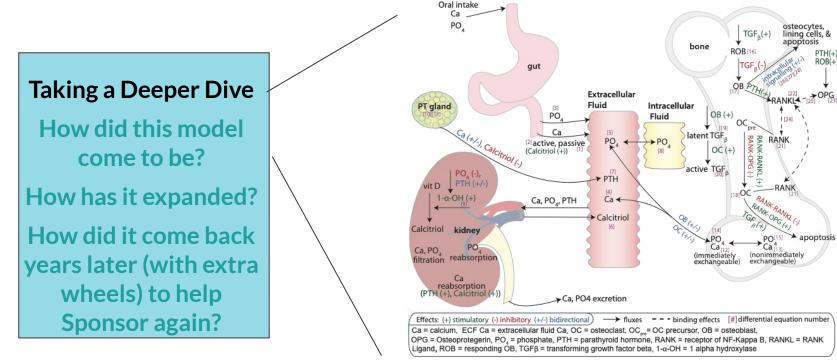


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OSPSuite

PBPK Models (PK-Sim)

Bio Models (MoBi)



Peterson and Riggs. Bone 2010

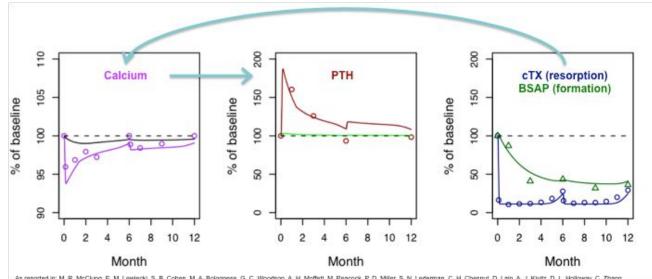


iPSP: A Case Study

The question: Can we better understand (and predict) the inter-rational effects of dmab and the time-courses of on/off t effects?

Denosumab: RANKL inhibition

- ↓ Bone Resorption
- Can we better understand the other changes (e.g., bone formation marker, serum calcium and PTH)? Should we be concerned?



As reported in: M. R. McClung, E. M. Lewiecki, S. B. Cohen, M. A. Bolognese, G. C. Woodson, A. H. Moffett, M. Peacock, P. D. Miller, S. N. Lederman, C. H. Chesnut, D. Lain, A. J. Kivitz, D. L. Holloway, C. Zhang, M. C. Peterson, P. J. Bekker, and AMG 162 Bone Loss Study Group. Denosumab in postmenopausal women with low bone mineral density. N Engl J Med, 354(8):821–31, Feb 2006.

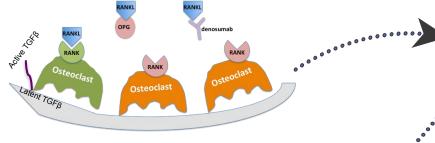




iPSP: A Case Study

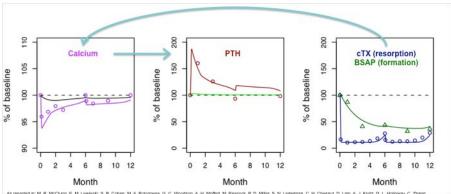
The question: Can we better understand (and predict) the inter-rational effects of dmab and the time-courses of on/off t effects?

Denosumab: RANKL inhibition



- Calcium release from bone
- -↓ Serum calcium
- \downarrow Ca sensing in PT gland
- PTH release (calcium-sparing)

- ↓ available RANKL
- ↓ RANK--RANKL interaction
- ↓ Osteoclast activity (sCTx)
- **↓** Activation of TGF-β
- ↓ Osteoblast activity (BSAP)
- ↑ bone mineral density (BMD)



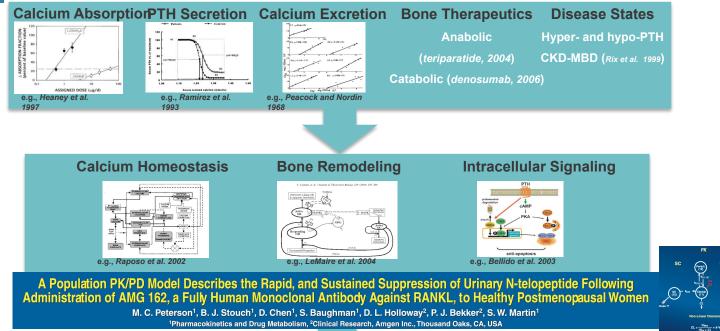
As reported in: M. R. McClung, E. M. Lewlecki, S. B. Cohen, M. A. Bolognese, G. C. Woodson, A. H. Moffett, M. Peacock, P. D. Miler, S. N. Lederman, G. H. Chesnut, D. Lain, A. J. Kivitz, D. L. Holloway, C. Zhang, M. C. Peterson, P. J. Bekker, and AMG 162 Bone Loss Study Group. Denosumab in postmenopausal women with low bone mineral density. N Engl J Med, 354(8):821–31, Feb 2006.





iPSP: Integrate Existing Data & Models

Literature and in-house information is often available to inform model parameter and disease state effects





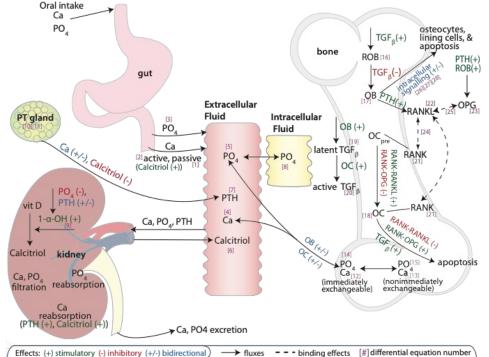
Multiscale Model

Peterson MC and Riggs MM (2010) A physiologically based mathematical model of integrated calcium homeostasis and bone remodeling. Bone 46:49-63.



iPSP: A Case Study

The question: Can we better understand (and predict) the inter-rational effects of dmab and the time-courses of on/off effects?



The energy (-) inhibitory (+) bidirectional) \longrightarrow nuxes - - binding effects (#) differential equation number Ca = calcium, ECF Ca = extracellular fluid Ca, OC = osteoclast, OC_{pre} = OC precursor, OB = osteoblast, OPG = Osteoprotegerin, PO₄ = phosphate, PTH = parathyroid hormone, RANK = receptor of NF-Kappa B, RANKL = RANK [Ligand, ROB = responding OB, TGFβ = transforming growth factor beta, 1-α-OH = 1 alpha hydroxylase

Multiscale Model

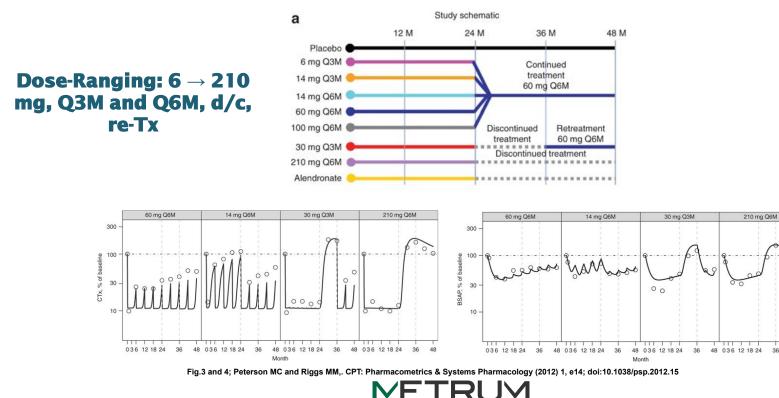
Peterson MC and Riggs MM (2010) A physiologically based mathematical model of integrated calcium homeostasis and bone remodeling. Bone 46:49-63.





iPSP: On/Off Treatment Effects

$\textbf{Denosumab: RANKL inhibition} \rightarrow \textbf{Bone Marker Changes}$

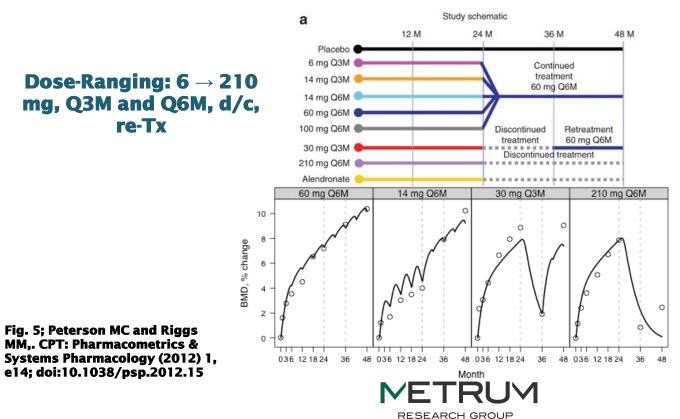


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iPSP: Expand to Predict Clinical Outcome

Denosumab: RANKL inhibition \rightarrow Bone Markers \rightarrow BMD Change



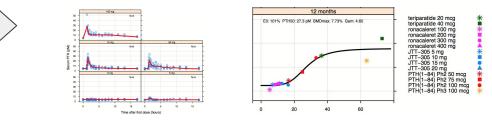


Open iPSP Calcilytic, target for osteoporosis?Page 37 Question: Were prior results a "class effect" or was this still a viable target?



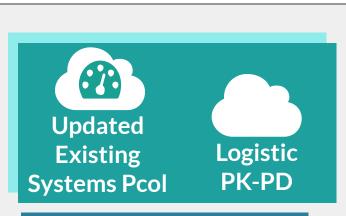
Evaluate prior tests' persistent hyperPTH and minimal BMD changes. Can PK / binding improve target PT gland capacity limits maximal PTH response

Limited maximal PTH response (confirmed in Ph 1) = would likely limit BMD response



K. Baron, M. Riggs, R. Sawamura, T. Shimizu, F. Okada, J. Zhou, T. Shibayama, and M. Jansen. An evaluation of calcilytic effects on parathyroid hormone and bone mineral density response using a physiologically-based, multiscale systems pharmacology model. J. Bone Miner. Res. 28, (Suppl 1, 2013).

Open iPSP GnRH modulation for endometriosis? Question: Can we design a shorter trial? Which biomarker(s) to target response to optimize efficacy while staying below a threshold for BMD loss?



Evaluate time and magnitude of changes in candidate biomarkers. Define therapeutic index. "... targeting the GnRH pathway to achieve the desired range of serum estrogen levels would be difficult to achieve; therefore, the research program was halted before any compound entered the clinic."

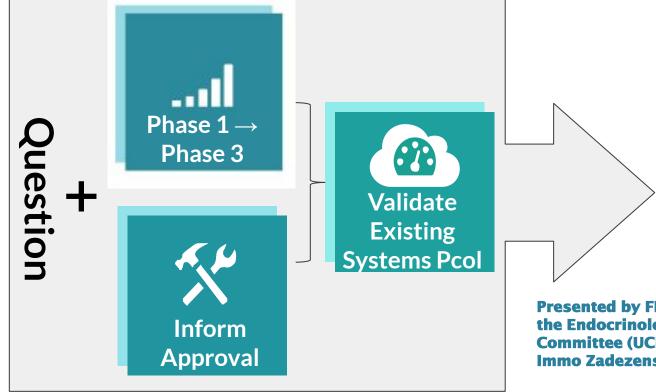
P. A. Milligan, M. J. Brown, B. Marchant, S. W. Martin, P. H. van der Graaf, N. Benson, G. Nucci, D. J. Nichols, R. A. Boyd, J. W. Mandema, S. Krishnaswami, S. Zwillich, D. Gruben, R. J. Anziano, T. C. Stock, and R. L. Lalonde. Model-based drug development: a rational approach to efficiently accelerate drug development. Clin Pharmacol Ther, 93(6):502–14, Jun 2013.





Open iPSP PTH, replacement in hypoPTH

Question: Is QD dosing the safest and most effective dosing regimen?



Model validation using sponsor data; then simulate varied dosing regimens to compare predicted impact on calciuria

Presented by FDA September 12, 2014 Meeting of the Endocrinologic and Metabolic Drugs Advisory Committee (UCM413617) by Manoj Khurana, PhD Immo Zadezensky, PhD Nitin Mehrotra, PhD





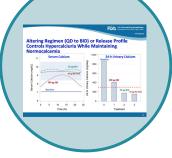
Model Evaluation With added confidence, investigate the question

Open science opens doors

FDA U.S. Food and Drug Administration Protecting and Promoting Public Health

www.fda.gov

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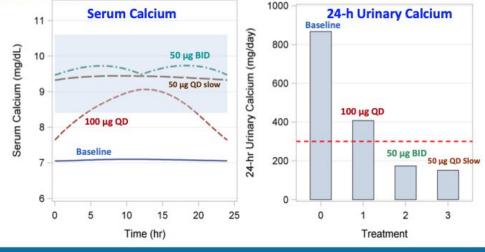


PTH for Hypoparathyroidism

Clinical data

FDA suggested BID or sustained release likely to retain efficacy while minimizing risk of hypercalciuria





Presented at FDA September 12, 2014 Meeting of the Endocrinologic and Metabolic Drugs Advisory Committee (UCM413617) by Manoj Khurana, PhD Immo Zadezensky, PhD Nitin Mehrotra, PhD VETRUM

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Open iPSP PTH, replacement in hypoPTH Question: Is QD dosing the safest and most effective dosing regimen?

II-75 Development of a Quantitative Systems Pharmacology Model to Support Dosing of rhPTH(1-84), a Recombinant Human Parathyroid Hormone, in Adult Patients with Hypoparathyroidism

Thomas Peyret,¹ Benjamin Rich,¹ JF Marier,¹ Nicole Sherry,² Richard Finkelman,² Ivy Song²

*Certara Strategic Consulting, Princeton, NJ; *Shire Human Genetic Therapies, Inc., Lexington, MA, USA, a member of the Takeda group of companies

Model Customization #2: Calcium Reabsorption

Various publications have reported a lower renal reabsorption of calcium in patients with hypoPT.[2] The effect is believed to be due to lower number of sites of hormone action in renal tubules, where it promotes calcium reabsorption. Based on this mechanism of action, the QSP model was customized as follows:

$$\begin{aligned} \text{CaReabsActive} &= \frac{CaReabs_{max} \times Ca_{serum}}{CaReabs_{50} + Ca_{serum}} \times PTHeffect \\ PTHeffect &= \frac{PTHeffect_{max} \times PTH_{plasma}}{PTHeffect_{50} + PTH_{plasma}} \end{aligned}$$

Where CaReabs50 = Caserum needed to achieve 50% of CaReabsmax; CaReabsActive = rate of calcium active renal reabsorption (mmol/h); CaReabsActive; Caserum = Calcium serum concentration (mM) (T16 in model code); PTHplasma = PTH plasma concentration (pM); PTHeffect = effect of PTH on Calcium renal active reabsorption (unitless); PTHeffect50 = PTHplasma needed to achieve 50% of PTHeffectmax (T17 in model code); PTHeffectmax = maximum PTHeffect.

In the original QSP model, the maximum effect of PTH on calcium renal active reabsorption, PTHeffectmax, was fixed to 1.06147 (106% of reference reabsorption) and the PTH concentration needed to achieve 50% PTHeffectmax was scaled. In the current QSP model, the following values were used:

Figure 1. QSP Model Qualification - Study SHP634-101^[3]

PAGE 28 (2019) Abstr 9002 [www.page-meeting.org/?abstract=9002]

CONCLUSIONS

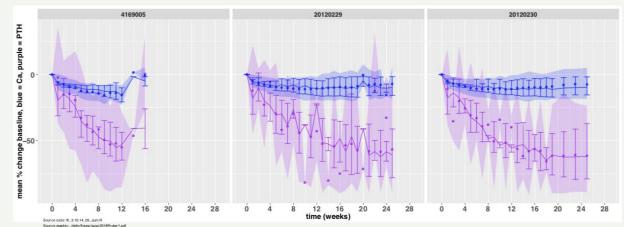
Both QD and BID dosing regimens of rhPTH(1-84) at daily doses from 25 μ g to 100 μ g markedly reduced urinary calcium excretion and the possibility of hypercalciuria while maintaining serum calcium level in target range as compared to the SOC.

Although these modeling simulations appear to show that rhPTH(1-84) BID dosing regimens may predict a lower likelihood of hypercalciuria than the QD dosing regimens, clinical data are needed, and a clinical study is planned to confirm these findings.



Open iPSP: Integrate System, Disease, Drug Model comes full circle, applied now to another Amgen-Sponsored Program Chronic Kidney Disease-Mineral Bone Disorder

Long-Term Predictive Checks



Despite continued decline in PTH (e.g., beyond weeks 4-6), feedback controls lead to leveling and partial rebound in Ca.

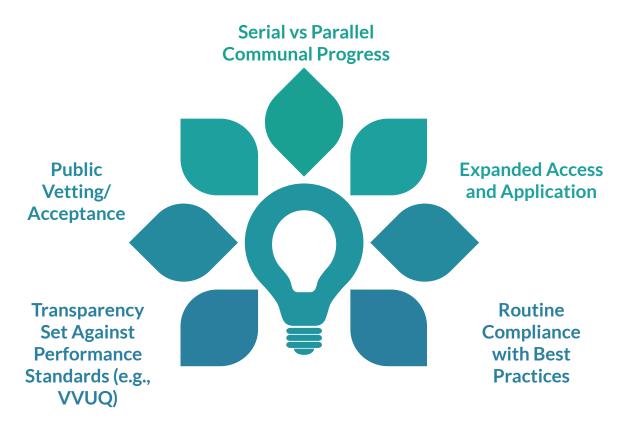
Figure 2: *Predictive check: change from baseline (percentage) for serum calcium (blue) and PTH (purple)* Phase 3 Study 20120229 was included as external validation. Observed data: solid circle (mean) and 10th - 90th percentile range (shaded region); Simulated data: mean (solid line) and 10th - 90th percentile range (error bars).

Riggs MM, Baron KT, Melhelm M (2018) Multiscale physiology-based modeling of mineral bone disorder in patients with chronic kidney disease and secondary hyperparathyroidism on hemodialysis: application to etelcalcetide treatment effects on calcium homeostasis. ACoP9 Abstract #T-078.





iPSP Open-Source and Open-Science







Questions?





Headquarters: 2 Tunxis Rd. Suite 112 Tariffville, CT 06081

Cambridge Innovation Center (CIC) 1 Broadway, Cambridge, MA 02142

+1 860 735 7043

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S www.metrumrg.com

Matthew Riggs, Ph.D. mattr@metrumrg.com



