

OPEN ACCESS

EDITED BY

Oleksandra V. Ivashchenko, University Medical Center Groningen, Netherlands

REVIEWED BY

Zhonglin Lu,

University of Michigan, United States

*CORRESPONDENCE

Deni Hardiansyah

⊠ denihardiansyah@ui.ac.id

RECEIVED 29 August 2025 ACCEPTED 29 September 2025 PUBLISHED 09 October 2025

CITATION

Hardiansyah D, Patrianesha BB and Glatting G (2025) Population pharmacokinetic modeling in radiopharmaceutical therapy: a review. Front. Nucl. Med. 5:1695332. doi: 10.3389/fnume.2025.1695332

COPYRIGHT

© 2025 Hardiansyah, Patrianesha and Glatting. This is an open-access article distributed under the terms of the Creative Commons Attribution License (CC BY). The use, distribution or reproduction in other forums is permitted, provided the original author(s) and the copyright owner(s) are credited and that the original publication in this journal is cited, in accordance with accepted academic practice. No use, distribution or reproduction is permitted which does not comply with these terms.

Population pharmacokinetic modeling in radiopharmaceutical therapy: a review

Deni Hardiansyah^{1*}, Bisma Barron Patrianesha² and Gerhard Glatting³

¹Faculty of Mathematics and Natural Sciences, Medical Physics and Biophysics Division, Physics Department, Universitas Indonesia, Depok, Indonesia, ²Research Center for Safety, Metrology, and Nuclear Quality Technology, National Research and Innovation Agency (BRIN), KST B.J. Habibie, Tangerang Selatan, Indonesia, ³Medical Radiation Physics, Department of Nuclear Medicine, Ulm University, Ulm, Germany

Population pharmacokinetic (PopPK) has emerged as a robust framework for characterizing inter-individual variability in the absorbed dose estimates in radiopharmaceutical therapy (RPT). By enabling the analysis of biokinetic data from heterogeneous patient populations, PopPK allows individualized absorbed dose estimates while simultaneously leveraging population-level information. This review presents and evaluates the current applications of PopPK, such as nonlinear mixed-effects modeling (NLMEM) and Bayesian fitting methods in RPT, emphasizing its advantages over traditional individual-based modeling approaches. We summarize key studies that have implemented PopPK for modeling radiopharmaceutical biokinetics, with a focus on time-integrated activity (TIA) estimation, including single-time-point (STP) dosimetry, uncertainty analysis, as well as pharmacodynamic (PD) analysis. The flexibility of PopPK in handling sparse and irregularly sampled data makes it particularly relevant for clinical scenarios where comprehensive imaging schedules are impractical. However, despite its potential, the widespread adoption of PopPK in RPT remains limited due to challenges such as computational complexity and the need for specialized expertise. This review discusses critical aspects of PopPK implementation while emphasizing the importance of interdisciplinary collaboration in translating PopPK methodologies into clinical practice. Future directions include integrating PopPK into adaptive dosimetry frameworks and applying it in STP dosimetry and PD modeling to optimize treatment personalization. By providing a comprehensive overview of PopPK applications in RPT, this review aims to facilitate the integration of advanced modeling techniques into routine clinical workflows, ultimately supporting development of accurate and precise RPTs.

KEYWORDS

POPPK, RPT, NLMEM, STP, PKPD

1 Introduction

Radiopharmaceutical therapy (RPT) is commonly administered using fixed activity protocols or simple adjustments based on body surface area (1–3). However, evidence shows that absorbed doses can differ markedly between patients receiving the same administered activity, raising the risk of suboptimal tumor control or avoidable toxicity (3–12). Recognizing this, the European Council Directive 2013/59/EURATOM mandates patient-specific treatment planning and verification for all radiotherapeutic procedures, underscoring the necessity of individualized dosimetry approaches that

capture inter-individual variability in radiopharmaceutical distribution and clearance (13).

A central challenge in individualized dosimetry is the reliable estimation of time-integrated activity (TIA) from time-activity curves (TACs), particularly when imaging measurement data are sparse, a frequent condition in nuclear medicine practice. Incorporating prior knowledge into the TAC fitting process has been shown to improve the accuracy and precision of TIA and, consequently, absorbed dose estimates (14-17). Population pharmacokinetic (PopPK) modeling offers a powerful framework for achieving this. Unlike conventional individual fitting approaches, PopPK leverages data sharing across patients, fitting model parameters simultaneously at the population level while still yielding individualized estimates. This paradigm enhances the ratio of data to estimated parameters, thereby improving the accuracy of TIA estimates. Importantly, PopPK, specifically nonlinear mixed-effects modeling (NLMEM), is recognized by both the FDA and EMA as standard methodologies in drug development, particularly valuable for handling sparse data and heterogeneous measurement protocols (18, 19).

Several pioneering studies have highlighted the value of PopPK modeling in RPT. Hardiansyah et al. provided the first demonstrations that integration of population priors within PopPK framework significantly strengthens individual dosimetry in RPT (20). Merril et al. optimized sampling schedules for 131I therapy in Graves' disease (21), while Puszkiel et al. employed a three-compartment PopPK model to quantify the effects of amino acid co-infusion on [177Lu]Lu-DOTATATE pharmacokinetics and toxicity in neuroendocrine tumor patients (22). Devasia et al. (17) applied a bi-exponential function within NLMEM for singletime-point (STP) dosimetry of [177Lu]Lu-DOTATATE. They demonstrated reduced bias compared to the commonly used STP approach proposed by Hänscheid (23) and Madsen (24). Hardiansyah et al. introduced population-based model selection (PBMS) with PopPK modeling to improve the accuracy of absorbed dose estimates (25). More recently, Hardiansyah et al. introduced a population-based model selection framework within the NLMEM paradigm to optimize sum-of-exponential functions for ¹³¹I therapy in benign thyroid disease, demonstrating superior accuracy compared with standard individual fitting approaches recommended by the European Association of Nuclear Medicine (15). Collectively, these studies demonstrate the ability of NLMEM to combine population-level priors with patient-specific data, thereby enabling accurate and robust absorbed dose estimation. The methodological rigor and flexibility of NLMEM make it particularly well suited for routine clinical use, where simplified protocols and sparse data are the norm. Examples of NLMEM applications in RPT, along with software suitable for NLMEM analyses, are provided in the supplemental file (Supplementary Tables S1, S2).

2 Clinical relevance of PopPK in RPT

One of the major challenges in RPT dosimetry is the absence of a standardized approach for selecting fit functions

to calculate TIAs, a critical determinant of absorbed dose. In current practice, fit function selection is often guided by subjective "rules of thumb", primarily based on the number of available biokinetic data points. As highlighted in an EANM recommendation (26), at least three data points are required to fit a mono-exponential function with two estimated parameters in individual fitting methods. This aligns with the general principle outlined by Gear et al. (27), which emphasizes that the number of data points should exceed the number of parameters to avoid overfitting and ensure reliable uncertainty estimation.

Typically, radiopharmaceutical kinetics exhibit multiphasic behavior, including an uptake phase and multiple clearance phases (28, 29). Due to limited data availability and the reliance on subjective modeler judgment, simplified monoexponential or, at best, bi-exponential functions are often employed (30–32). Such subjective choices may introduce substantial variability in absorbed dose estimates and bias dose–effect relationships, ultimately undermining the reliability of clinical dosimetry.

Population pharmacokinetic (PopPK) modeling provides a systematic and objective alternative for analyzing radiopharmaceutical kinetics. Rather than relying on subjective judgment, fit functions can be identified through PBMS, which applies robust statistical criteria to determine the optimal model. This approach provides several advantages:

- 1. objectivity, relying on statistical measures such as goodness-of-fit tests and Akaike weights (33, 34);
- systematic evaluation, testing a range of models from simple single-phase to more complex multi-phase functions (35);
 PBMS NLMEM can also be used to test various structures of compartmental and physiologically-based pharmacokinetic models.
- accuracy, as PBMS NLMEM has been shown to outperform rule-of-thumb or individual-based model selection (IBMS) approaches (36), including parameter-sharing PBMS strategies (14, 28); and
- 4. reproducibility, since model choice is determined by the data and not by subjective judgment of the modeler, leading to more consistent TIA and absorbed dose estimates.

A key strength of PBMS within the NLMEM framework is its ability to pool biokinetic data from across patients. This increases the ratio of observations (N) to estimated parameters (K), enabling the construction of more complex yet stable models, while simultaneously reducing uncertainty in model selection. Importantly, this framework is particularly powerful under conditions of sparse sampling, a common condition in clinical nuclear medicine, where it could maintain good accuracy despite limited data (15, 25, 35, 37, 38). Given these advantages, PBMS–NLMEM holds strong potential not only for improving individualized dosimetry but also for serving as a robust reference framework system in RPT, ensuring standardization, reproducibility, and regulatory confidence.

3 Pharmacodynamic analysis

PopPK and pharmacodynamic (PD) modeling have emerged as powerful approaches to characterize drug behavior across heterogeneous patient populations (39–41). By quantifying interindividual variability and identifying covariates that influence drug disposition and response, these models are increasingly recognized as essential tools for optimizing dosing strategies and improving clinical outcomes in RPT. Recent studies have demonstrated the value of population PK/PD modeling in characterizing the kinetics of [177Lu]Lu-labeled radiopharmaceuticals and explaining interpatient variability in therapeutic outcomes (22, 42).

In one study, a PopPK model was applied to evaluate the impact of amino acid (AA) co-infusion on the pharmacokinetics of [177 Lu] Lu-DOTATATE in patients with gastroenteropancreatic neuroendocrine tumors (22). Using a three-compartment model, investigators found that AA co-infusion significantly increased the elimination rate constant (k_{10}), with substantial inter-individual variability (104%). This variability translated into differences in systemic exposure, which were associated with hematological toxicity, particularly lymphopenia observed on Day 15. Notably, the population-based framework enabled identification of covariate effects and highlighted the need for personalized supportive care strategies in peptide receptor radionuclide therapy.

A complementary study extended PopPK analysis to [177Lu]Lu-PSMA-I&T in patients with metastatic castration-resistant prostate cancer (mCRPC). Here, a five-compartment model informed by quantitative SPECT/CT data was developed to describe radiopharmaceutical uptake in tumors and normal organs (42). The model was subsequently integrated into a PK/PD framework by linking tumor-level drug concentrations to longitudinal PSA dynamics. As in the DOTATATE study, pronounced interindividual variability in tumor uptake was observed, with a progressive decline across treatment cycles. PSA response was captured using both direct and delayed drug-effect models, with tumor exposure emerging as a strong predictor of therapeutic efficacy. The incorporation of covariates such as renal function, tumor volume, and cycle number provided additional mechanistic insight into variability in treatment response.

Together, these studies underscore the clinical relevance of population PK/PD modeling in advancing precision medicine for RPT. Despite differences in radiopharmaceuticals, clinical indications, and endpoints, both investigations underscore the central role of individualized modeling in unraveling the complex interplay between drug exposure, biological response, and patient-specific factors. By enabling more accurate prediction of efficacy and toxicity, population PK/PD modeling supports the rational design of tailored dosing regimens, ultimately improving the therapeutic index of [177Lu]Lu-based radiopharmaceutical therapies.

4 Simplified dosimetry

PopPK provides a robust framework for simplified dosimetry in RPT (15, 17, 25, 35, 38). By estimating mean ("fixed") pharmacokinetic parameters across a patient cohort while

simultaneously quantifying inter-individual variability through "random" effects, NLMEM effectively borrow strength across subjects for optimizing the fitting. This stabilizes parameter estimates even when individual patients contribute only one or two imaging time points, thereby reducing reliance on laborintensive multi-time-point schedules. Figure 1 illustrates the PopPK framework for simplified dosimetry.

Several clinical studies have demonstrated the feasibility and accuracy of such NLMEM-driven approaches. In peptide receptor radionuclide therapy, simplified dosimetry with NLMEM showed that a single planar scan at ~47 h postinjection yielded a renal absorbed dose bias of 7%–8% compared to multi-time-point dosimetry, which was reduced to ~6% when two scans at 23 and 47 h were used (25, 38). These findings provide practical guidance to physicians in selecting one- vs. two-scan protocols depending on available resources and clinical need (38). Similarly, for [177Lu]Lu-PSMA-617, a single SPECT/CT acquired ~42 h post-injection produced renal absorbed dose estimates within an RMSE of ~10% compared to full-protocol dosimetry (35), supporting the feasibility of accurate simplified dosimetry with STP imaging for routine clinical workflows.

Other studies have employed PopPK principles using Bayesian fitting approaches to enhance STP dosimetry. For example, Patrianesha et al. demonstrated that integrating populationbased model selection into Bayesian fitting for [177Lu]Lu-PSMA-617 improved the accuracy of TIA estimation. A single SPECT/ CT measurement at 48 h post-injection yielded TIA values within an RMSE of 8% compared to the reference TIA derived from multi-time-point data, highlighting the ability of Bayesian-PopPK integration to deliver reliable absorbed dose estimates under clinically constrained sampling conditions. Together, these findings underscore the clinical utility of PopPK with NLMEM for enabling accurate, reproducible, and personalized simplified dosimetry. By reducing the imaging burden, these approaches can facilitate broader implementation individualized dosimetry in routine practice and support the transition from fixed-activity protocols toward precision-guided radiopharmaceutical therapy.

5 Uncertainty analysis

Uncertainty analysis is a critical component of RPT dosimetry, ensuring that patient-specific absorbed dose estimates are both reliable and clinically relevant (3, 27, 43). Jundi et al. proposed PopPK with a Bayesian fitting framework to estimate the precision of STP dosimetry in [177Lu]Lu-DOTATATE peptide receptor radionuclide therapy by applying a mono-exponential function to a single SPECT/CT acquisition (43). By incorporating prior distributions of the model parameters derived from multi-time-point population data fitting, their approach reliably estimated the precision of individual TIAs. STP dosimetry demonstrated lower TIA precision compared to TIA derived from multi-time-point dosimetry methods: the coefficient of variation (CV) of individual TIA standard

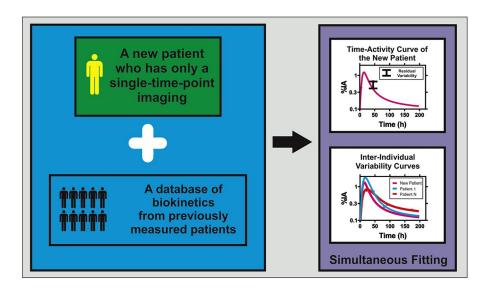


FIGURE 1
Conceptual framework of population pharmacokinetic modeling for single-time-point dosimetry in radiopharmaceutical therapy. The approach combines biokinetic data from a new patient with single-time-point imaging with a comprehensive biokinetic database from previous population studies. Through simultaneous fitting using nonlinear mixed-effects modeling, the method generates individualized time-integrated activity coefficients (TIACs) for the new patient while accounting for inter-individual variability observed in the population. The upper graph shows the predicted time-activity curve for the new patient, along with associated residual variability bounds. The lower graph demonstrates the inter-individual variability curves from the population database, illustrating how population pharmacokinetic modeling leverages shared information to enable accurate absorbed dose estimation using minimal individual patient data.

deviations ranged from 0.8%–49% with ATP fitting, but increased to 22%–33% with STP estimates using the PopPK Bayesian fitting method (43).

Building on this, Budiansah et al. systematically assessed both the accuracy and precision of STP dosimetry using PopPK with the NLMEM framework for PRRT (16). Here, uncertainty was rigorously propagated through a PBPK model embedded within an NLMEM framework. This enabled not only accurate estimation of population and individual kinetic parameters but also inclusion of both measurement and model-related errors in the uncertainty budget. By applying the law of propagation of uncertainty, total absorbed dose uncertainty was analytically derived from the variability of individual parameter estimates and their covariance structure. This methodology is particularly advantageous for reduced imaging schedules such as STP protocols, as it transparently quantifies the additional uncertainty introduced by sparse sampling, while still providing clinically meaningful confidence bounds treatment decisions.

As expected, the use of STP protocols resulted in a modestly lower precision compared to ATP fitting, as indicated by higher relative standard errors (RSEs) in both kidney and tumor absorbed dose estimates (16). Nonetheless, the availability of explicit uncertainty quantification is critical for individualized therapy planning, as it enables clinicians to gauge the robustness of absorbed dose estimates and make informed adjustments over successive treatment cycles. Such frameworks strengthen confidence in simplified dosimetry approaches, bridging the gap between clinical feasibility and scientific rigor.

6 Challenges and future perspectives

PopPK modeling in RPT dosimetry is hampered primarily by its computational complexity and the specialized expertise required (44). PopPK software, such as Monolix or NONMEM, requires advanced statistical knowledge and proficiency with dedicated software, skills that many nuclear medicine centers currently lack. At the same time, validating PopPK models requires comprehensive, high-quality pharmacokinetic data and robust quality-assurance protocols (44). Determining optimal sampling schedules, whether via serial imaging time points or blood draws, and establishing rigorous acceptance criteria for model performance further complicate implementation.

Another significant barrier is the scarcity of formal training and educational resources tailored to PopPK methods in the RPT context (45, 46). Most medical physicists and nuclear medicine physicians receive little to no exposure to PopPK model development or interpretation of population-based pharmacokinetic outputs. This knowledge gap not only slows the development but also undermines confidence in applying existing ones, reinforcing reliance on empirical, one-size-fits-all activity administration protocols.

Economic considerations add another layer of difficulty (45, 47). Many centers are still struggling to implement standard dosimetry workflows (48). They do not compensate for the additional time, personnel, and imaging resources required to collect the detailed data necessary for PopPK-based dosimetry. If standard dosimetry is already challenging, creating and maintaining high-quality population datasets to support PopPK

modeling is even more daunting. Without financial incentives, centers lack the motivation and funding to invest in the infrastructure necessary for personalized, model-driven dosing, despite its clear long-term benefits of improved tumor control and reduced toxicity (49, 50).

Looking forward, however, several converging trends promise to dissolve these hurdles. User-friendly commercial software platforms will embed robust PopPK frameworks into intuitive graphical interfaces, allowing clinicians to perform PopPK analysis without needing to understand the underlying complexity. Simplified dosimetry based on population models will reduce the number of required scans or blood draws, ease workflow burdens, while preserving the accuracy of the estimated absorbed dose. Meanwhile, machine learning-driven automation of covariate selection, model selection, and outlier detection will enable near-real-time treatment adaptation across multi-cycle therapies. As multinational interdisciplinary collaborative consortia establish standardized PopPK libraries, quality-assured datasets, and unified regulatory guidelines, and as reimbursement policies evolve to reward personalized dosimetry, RPT dosimetry will transition from empirical practice to a precision-medicine discipline. Ultimately, clinicians will rely on streamlined software workflows that require only basic operational skills to tailor administered activities dynamically for each patient, thereby achieving truly individualized therapy.

7 Conclusion

PopPK modeling represents a paradigm shift in RPT dosimetry, providing a rigorous framework to individualize treatment while addressing the practical constraints of routine clinical care. PopPK modeling enables the accurate estimation of the absorbed dose from simplified imaging protocols, reducing the need for intensive multi-time-point schedules while preserving the precision required for effective treatment planning. Clinically, the impact extends beyond technical accuracy. PBMS with PopPK offers standardized and reproducible dosimetry, supporting the development of a reference framework and reducing patient and institutional burden. Furthermore, PopPK-based uncertainty analysis provides clinicians with the precision of the absorbed dose estimates, facilitating informed adjustments in multi-cycle therapy and reinforcing clinical decision-making. Looking ahead, PopPK-guided dosimetry is poised to become the foundation of precision medicine in RPT. With advances in computation and AI integration, this approach will establish individualized dosimetry as a standard of care, comparable to external beam radiotherapy treatment planning, transforming RPT from an empirical practice into a precision-driven discipline that minimizes toxicity for a prescribed absorbed dose.

Author contributions

DH: Writing – original draft, Writing – review & editing. BP: Writing – original draft, Writing – review & editing. GG: Writing – review & editing.

Funding

The author(s) declare that financial support was received for the research and/or publication of this article. DH was supported by a PUTI Q1 grant 2025 from Universitas Indonesia (grant PKS-200/UN2.RST/HKP.05.00/2025). GG was supported by DAAD (German Academic Exchange Service), Förderkennzeichen 57657089.

Conflict of interest

DH and GG serve as consultants for ITM.

The remaining authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

Generative Al statement

The author(s) declare that Generative AI was used in the creation of this manuscript. The Generative AI was used to check the grammar in the manuscript, All writing was done by the authors.

Any alternative text (alt text) provided alongside figures in this article has been generated by Frontiers with the support of artificial intelligence and reasonable efforts have been made to ensure accuracy, including review by the authors wherever possible. If you identify any issues, please contact us.

Publisher's note

All claims expressed in this article are solely those of the authors and do not necessarily represent those of their affiliated organizations, or those of the publisher, the editors and the reviewers. Any product that may be evaluated in this article, or claim that may be made by its manufacturer, is not guaranteed or endorsed by the publisher.

Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fnume. 2025.1695332/full#supplementary-material

References

- Stokke C, Gabiña PM, Solný P, Cicone F, Sandström M, Gleisner KS, et al. Dosimetry-based treatment planning for molecular radiotherapy: a summary of the 2017 report from the internal dosimetry task force. *EJNMMI Phys.* (2017) 4(1):27. doi: 10.1186/s40658-017-0194-3
- 2. Danieli R, Milano A, Gallo S, Veronese I, Lascialfari A, Indovina L, et al. Personalized dosimetry in targeted radiation therapy: a look to methods, tools and critical aspects. *J Pers Med.* (2022) 12(2):205. doi: 10.3390/jpm12020205
- 3. O'Donoghue J, Zanzonico P, Humm J, Kesner A. Dosimetry in radiopharmaceutical therapy. *J Nucl Med.* (2022) 63(10):1467–74. doi: 10.2967/jnumed.121.262305
- 4. Wehrmann C, Senftleben S, Zachert C, Müller D, Baum RP. Results of individual patient dosimetry in peptide receptor radionuclide therapy with ¹⁷⁷Lu DOTA-TATE and ¹⁷⁷Lu DOTA-NOC. *Cancer Biother Radiopharm.* (2007) 22(3):406–16. doi: 10. 1089/cbr.2006.325
- 5. Flux GD, Chittenden SJ, Saran F, Gaze MN. Clinical applications of dosimetry for mIBG therapy. Q J Nucl Med Mol Imaging. (2011) 55(2):116–25.
- 6. Strigari L, Konijnenberg M, Chiesa C, Bardies M, Du Y, Gleisner KS, et al. The evidence base for the use of internal dosimetry in the clinical practice of molecular radiotherapy. Eur J Nucl Med Mol Imaging. (2014) 41(10):1976–88. doi: 10.1007/s00259-014-2824-5
- 7. Hardiansyah D, Begum NJ, Kletting P, Mottaghy FM, Glatting G. Sensitivity analysis of a physiologically based pharmacokinetic model used for treatment planning in peptide receptor radionuclide therapy. *Cancer Biother Radiopharm*. (2016) 31(6):217–24. doi: 10.1089/cbr.2016.2012
- 8. Maccauro M, Cuomo M, Bauckneht M, Bagnalasta M, Mazzaglia S, Scalorbi F, et al. The LUTADOSE trial: tumour dosimetry after the first administration predicts progression free survival in gastro-entero-pancreatic neuroendocrine tumours (GEP NETs) patients treated with [177Lu]Lu-DOTATATE. Eur J Nucl Med Mol Imaging. (2024) 52(1):291–304. doi: 10.1007/s00259-024-06863-y
- 9. Hebert K, Santoro L, Monnier M, Castan F, Berkane I, Assénat E, et al. Absorbed dose-response relationship in patients with gastroenteropancreatic neuroendocrine tumors treated with [1¹⁷⁷Lu]lu-DOTATATE: one step closer to personalized medicine. *J Nucl Med.* (2024) 65(6):923–30. doi: 10.2967/jnumed.123.267023
- 10. Warfvinge CF, Gustafsson J, Roth D, Tennvall J, Svensson J, Bernhardt P, et al. Relationship between absorbed dose and response in neuroendocrine tumors treated with [1¹⁷Lu]Lu-DOTATATE. *J Nucl Med.* (2024) 65(7):1070–5. doi: 10.2967/jnumed. 123.266991
- 11. Deshayes E, Karfis I, Santoro L, Mileva M, Danieli R, Hebert K, et al. Patient-specific dosimetry-driven PRRT: time to move forward!. *J Nucl Med.* (2025) 66(6):983. doi: 10.2967/jnumed.124.268880
- 12. Grkovski M, Krebs SS, O'Donoghue JA, Kuten J, Mauguen A, Shobeiri P, et al. Lesion absorbed dose-response relationship in patients with metastatic castration-resistant prostate cancer undergoing [1¹⁷/Lu]Lu-PSMA-617 radiopharmaceutical therapy. *J Nucl Med.* (2025) 66:1622–30. doi: 10.2967/jnumed.125.270170
- 13. Council of the European U. Council directive 2013/59/euratom of 5 december 2013 laying down basic safety standards for protection against the dangers arising from exposure to ionising radiation, and repealing directives 89/618/euratom, 90/641/euratom, 96/29/euratom, 97/43/euratom and 2003/122/euratom. Off J Eur Union. (2014) 13:1–73. https://eur-lex.europa.eu/eli/dir/2013/59/oj/eng
- 14. Patrianesha BB, Peters SMB, Hardiansyah D, Ritawidya R, Prive BM, Nagarajah J, et al. Single-time-point dosimetry using model selection and the Bayesian fitting method: a proof of concept. *Phys Med.* (2025) 129:104868. doi: 10.1016/j.ejmp.2024.104868
- 15. Hardiansyah D, Riana A, Hänscheid H, Beer AJ, Lassmann M, Glatting G. Nonlinear mixed-effects modelling and population-based model selection for 131 I kinetics in benign thyroid disease. *EJNMMI Phys.* (2025) 12(1):37. doi: 10.1186/s40658-025-00735-6
- 16. Budiansah I, Hardiansyah D, Riana A, Pawiro SA, Beer AJ, Glatting G. Accuracy and precision analyses of single-time-point dosimetry utilising physiologically-based pharmacokinetic modelling and non-linear mixed-effects modelling. *EJNMMI Phys.* (2025) 12(1):26. doi: 10.1186/s40658-025-00726-7
- 17. Devasia TP, Dewaraja YK, Frey KA, Wong KK, Schipper MJ. A novel time-activity information-sharing approach using nonlinear mixed models for patient-specific dosimetry with reduced imaging time points: application in SPECT/CT after ¹⁷⁷Lu-DOTATATE. *J Nucl Med.* (2021) 62(8):1118–25. doi: 10.2967/jnumed. 120.256255
 - 18. FDA. Guidance for Industry: Population Pharmacokinetics (1999).
- 19. EMA. Guideline on Reporting the Results of Population Pharmacokinetic Analyses. London, UK: CHMP (2007).
- Hardiansyah D, Maass C, Attarwala AA, Muller B, Kletting P, Mottaghy FM, et al. The role of patient-based treatment planning in peptide receptor radionuclide therapy. Eur J Nucl Med Mol Imaging. (2016) 43(5):871–80. doi: 10.1007/s00259-015-3248-6

- 21. Merrill S, Horowitz J, Traino AC, Chipkin SR, Hollot CV, Chait Y. Accuracy and optimal timing of activity measurements in estimating the absorbed dose of radioiodine in the treatment of Graves' disease. *Phys Med Biol.* (2011) 56(3):557–71. doi: 10.1088/0031-9155/56/3/003
- 22. Puszkiel A, Bauriaud-Mallet M, Bourgeois R, Dierickx L, Courbon F, Chatelut E. Evaluation of the interaction of amino acid infusion on ¹⁷⁷Lu-dotatate pharmacokinetics in patients with gastroenteropancreatic neuroendocrine tumors. *Clin Pharmacokinet*. (2019) 58(2):213–22. doi: 10.1007/s40262-018-0674-1
- 23. Hänscheid H, Lapa C, Buck AK, Lassmann M, Werner RA. Dose mapping after endoradiotherapy with (177)Lu-DOTATATE/DOTATOC by a single measurement after 4 days. *J Nucl Med.* (2018) 59(1):75–81. doi: 10.2967/jnumed.117.193706
- 24. Madsen MT, Menda Y, O'Dorisio TM, O'Dorisio MS. Technical note: single time point dose estimate for exponential clearance. *Med Phys.* (2018) 45(5):2318–24. doi: 10.1002/mp.12886
- 25. Hardiansyah D, Riana A, Beer AJ, Glatting G. Single-time-point dosimetry using model selection and nonlinear mixed-effects modelling: a proof of concept. *EJNMMI Phys.* (2023) 10(1):12. doi: 10.1186/s40658-023-00530-1
- 26. Sjögreen Gleisner K, Chouin N, Gabina PM, Cicone F, Gnesin S, Stokke C, et al. EANM dosimetry committee recommendations for dosimetry of ¹⁷⁷Lu-labelled somatostatin-receptor- and PSMA-targeting ligands. *Eur J Nucl Med Mol Imaging*. (2022) 49(6):1778–809. doi: 10.1007/s00259-022-05727-7
- 27. Gear JI, Cox MG, Gustafsson J, Gleisner KS, Murray I, Glatting G, et al. EANM practical guidance on uncertainty analysis for molecular radiotherapy absorbed dose calculations. *Eur J Nucl Med Mol Imaging*. (2018) 45(13):2456–74. doi: 10.1007/s00259-018-4136-7
- 28. Hardiansyah D, Riana A, Kletting P, Zaid NRR, Eiber M, Pawiro SA, et al. A population-based method to determine the time-integrated activity in molecular radiotherapy. *EJNMMI Phys.* (2021) 8(1):82. doi: 10.1186/s40658-021-00427-x
- 29. Steiner J, Nguyen B, Jafari F. A pharmacokinetic model determination of time activity curves in radiopharmaceutical therapy. *Mol Imaging.* (2024) 23:15353508241280015. doi: 10.1177/15353508241280015
- 30. Brosch-Lenz J, Delker A, Volter F, Unterrainer LM, Kaiser L, Bartenstein P, et al. Toward single-time-point image-based dosimetry of ¹⁷⁷Lu-PSMA-617 therapy. *J Nucl Med.* (2023) 64(5):767–74. doi: 10.2967/jnumed.122.264594
- 31. Kurkowska S, Brosch-Lenz J, Dewaraja YK, Frey E, Sunderland J, Uribe C. An international study of factors affecting variability of dosimetry calculations, part 4: impact of fitting functions in estimated absorbed doses. *J Nucl Med.* (2025) 66(3):441–8. doi: 10.2967/jnumed.124.268612
- 32. Grob D, Privé BM, Muselaers CHJ, Mehra N, Nagarajah J, Konijnenberg MW, et al. Bone marrow dosimetry in low volume mHSPC patients receiving Lu-177-PSMA therapy using SPECT/CT. *EJNMMI Phys.* (2024) 11(1):34. doi: 10.1186/s40658-024-00636-0
- 33. Kletting P, Schimmel S, Kestler HA, Hanscheid H, Luster M, Fernandez M, et al. Molecular radiotherapy: the NUKFIT software for calculating the time-integrated activity coefficient. *Med Phys.* (2013) 40(10):102504. doi: 10.1118/1. 4820367
- 34. Ivashchenko OV, O'Doherty J, Hardiansyah D, Cremonesi M, Tran-Gia J, Hippelainen E, et al. Time-activity data fitting in molecular radiotherapy: methodology and pitfalls. *Phys Med.* (2024) 117:103192. doi: 10.1016/j.ejmp.2023. 103192
- 35. Hardiansyah D, Yousefzadeh-Nowshahr E, Kind F, Beer AJ, Ruf J, Glatting G, et al. Single-time-point renal dosimetry using nonlinear mixed-effects modeling and population-based model selection in [177Lu]Lu-PSMA-617 therapy. *J Nucl Med.* (2024) 65(4):566–72. doi: 10.2967/jnumed.123.266268
- 36. Hardiansyah D, Riana A, Eiber M, Beer AJ, Glatting G. Population-based model selection for an accurate estimation of time-integrated activity using non-linear mixed-effects modelling. *Z Med Phys.* (2024) 34(3):419–27. doi: 10.1016/j.zemedi. 2023.01.007
- 37. Hardiansyah D, Riana A, Beer AJ, Glatting G. Single-time-point estimation of absorbed doses in PRRT using a non-linear mixed-effects model. *Z Med Phys.* (2023) 33(1):70–81. doi: 10.1016/j.zemedi.2022.06.004
- 38. Subangun RM, Hardiansyah D, Ibrahim RFI, Patrianesha BB, Hidayati NR, Beer AJ, et al. Few-time-points time-integrated activity coefficients calculation using non-linear mixed-effects modeling: proof of concept for [111 ln]ln-DOTA-TATE in kidneys. *Phys Med.* (2025) 129:104865. doi: 10.1016/j.ejmp.2024.104865
- 39. Mould DR, Upton RN. Basic concepts in population modeling, simulation, and model-based drug development-part 2: introduction to pharmacokinetic modeling methods. *CPT Pharmacometrics Syst Pharmacol.* (2013) 2(4):e38. doi: 10.1038/psp. 2013.14
- 40. Upton RN, Mould DR. Basic concepts in population modeling, simulation, and model-based drug development: part 3-introduction to pharmacodynamic modeling

methods. CPT Pharmacometrics Syst Pharmacol. (2014) 3(1):e88. doi: 10.1038/psp. 2013.71

- 41. Upton RN, Foster DJ, Abuhelwa AY. An introduction to physiologically-based pharmacokinetic models. *Pediatric Anesthesia*. (2016) 26(11):1036–46. doi: 10.1111/pan.12995
- 42. Siebinga H, de Wit-van der Veen BJ, de Vries-Huizing DMV, Vogel WV, Hendrikx J, Huitema ADR. Quantification of biochemical PSA dynamics after radioligand therapy with [177Lu]Lu-PSMA-I&T using a population pharmacokinetic/pharmacodynamic model. *EJNMMI Phys.* (2024) 11(1):39. doi: 10. 1186/s40658-024-00642-2
- 43. Jundi AF, Naqiyyun MD, Patrianesha BB, Mu'minah IAS, Riana A, Hardiansyah D. Uncertainty analysis of time-integrated activity coefficient in single-time-point dosimetry using Bayesian fitting method. *Nucl Med Mol Imaging*. (2024) 58(3):120–8. doi: 10.1007/s13139-024-00851-8
- 44. Siebinga H, de Wit-van der Veen BJ, Stokkel MDM, Huitema ADR, Hendrikx J. Current use and future potential of (physiologically based) pharmacokinetic modelling of radiopharmaceuticals: a review. *Theranostics*. (2022) 12(18):7804–20. doi: 10.7150/thno.77279

- 45. Divgi C, Carrasquillo JA, Meredith R, Seo Y, Frey EC, Bolch WE, et al. Overcoming barriers to radiopharmaceutical therapy (RPT): an overview from the NRG-NCI working group on dosimetry of radiopharmaceutical therapy. *Int J Radiat Oncol Biol Phys.* (2021) 109(4):905–12. doi: 10.1016/j.ijrobp.2020.12.002
- 46. Scott AM, Zeglis BM, Lapi SE, Scott PJH, Windhorst AD, Abdel-Wahab M, et al. Trends in nuclear medicine and the radiopharmaceutical sciences in oncology: workforce challenges and training in the age of theranostics. *Lancet Oncol.* (2024) 25(6):e250–e9. doi: 10.1016/S1470-2045(24)00037-8
- 47. Adedapo KS, Onimode YA, Ejeh JE, Adepoju AO. Avoidable challenges of a nuclear medicine facility in a developing nation. *Indian J Nucl Med.* (2013) 28(4):195–9. doi: 10.4103/0972-3919.121962
- 48. Peters S, Tran-Gia J, Agius S, Ivashchenko OV, Badel JN, Cremonesi M, et al. Implementation of dosimetry for molecular radiotherapy; results from a European survey. *Phys Med.* (2024) 117:103196. doi: 10.1016/j.ejmp.2023.103196
- 49. Flux G, Buscombe J. BNMS position statement on molecular radiotherapy. Nucl Med Commun. (2021) 42(10):1061–3. doi: 10.1097/MNM.000000000001458
- 50. Fisher DR. Perspectives on internal dosimetry for optimized radionuclide therapy. Cancer Biother Radiopharm. (2022) 37(3):161–3. doi: 10.1089/cbr.2021.0318