Email: santonicosmo@gmail.com | cosmo.santoni@imperial.ac.uk | Tel: +44 7444 403542

Applied mathematics researcher with expertise in statistical analysis, machine learning, and deep learning for complex systems modelling. Proficient in Python, R, and Julia, with a proven track record of applying advanced methods to inform national and international policy, including UK COVID-19 response and Global Fund malaria strategies.

#### PROFESSIONAL EXPERIENCE

### Malaria Technical Analyst - Machine Learning & Complex Systems, Imperial College London, U.K., 2023 -

- Delivered neural surrogate models (GRU/LSTM in PyTorch) that reduced runtime from 96 h HPC to 90 s on a single consumer GPU (≈3,840×) while matching in-house agent-based model *malariasimulation* (R^2 = 0.998 for prevalence), enabling real-time what-if analysis.
- Built an end-to-end ML pipeline (LHS generation → HPC batch sims → DuckDB/HDF5 data layer → training/eval → CLI & APIs) with AMP/CUDA and Optuna; reproducible, versioned artifacts and automated reports.
- Developed case-incidence estimators (XGBoost/Random Forest with Tweedie + long-tail weighting) achieving RMSE = 0.265, R^2 = 0.926 and R^2 = 0.941 on the top-5% high-incidence slice.
- Open-sourced MINTverse (segMINT, estiMINT, MINTe, MINTer): modular data/ML stack that standardises ingest → estimate → emulate and cuts time-to-insight from hours to seconds.
- Partnered with the Global Fund and World Health Organization to translate model outputs into deployment guidance for novel mosquito nets, linking ML metrics to program decisions.
- Scale: ~65k scenarios × 8 runs → ~524k simulations; 4,380 daily records × 12 metrics → ~2.3B rows (~28B values), all SQL-queryable in seconds; deterministic via checksums, cached models, versioned artifacts.

# Research Software Engineer - Pathogen Epidemiology Review Group, Imperial College London, UK., 2024 -

- Developed and executed software lifecycle management strategies to enhance code quality, maintainability, and
  efficiency. Led the integration of DevOps practices and quality-of-life features, such as virtual environments, CMDchecks, test-coverage targets, and package managers, to ensure consistent development and version
  compatibility. Presented project outcomes to multiple organizations, including Médecins Sans Frontières, World
  Health Organization, Public Health Canada, and data.org.
- Conducted lectures and workshops on programming principles, emphasising code management, test writing, and I/O validation to boost team expertise.
- Established team standards for open-source software practices, overseeing the review and management of pull requests and issues, focusing on bug fixes, performance enhancements, and alignment with research objectives.

## Research Scientist - Machine Learning, German Centre for Artificial Intelligence (DFKI), Germany, 2022 - 2023

- Led pioneering cross-disciplinary research utilising advanced Deep Neural Networks, including the development of Deep Neural Universal Differential Equations, to model and predict complex phenomena such as tumour growth, enhancing decision-making in healthcare contexts.
- Adapted the developed predictive frameworks for broader societal applications, including predicting criminal behaviour and the spread of gun violence, demonstrating the versatility and societal relevance of advanced Al tools.
- Integrated robust AI ethics and interpretability principles into model design and deployment, ensuring transparency, safety, and fairness in AI-driven healthcare and public safety applications.

# Research Assistant - COVID-19 Real Time Modelling, Imperial College London, U.K., 2021 - 2023

- Achieved the "SPI-M-O Award for Modelling and Data Support" on behalf of SAGE, presented by the UK
  Government's Chief Scientific and Medical Officers. Managed the development and testing of our open-source
  packages (OSS) and led daily and weekly development efforts, ensuring consistency of statistical approaches
  across our projects and OSS packages.
- Developed weekly comprehensive reports used by UK Government SPI-M-O & SAGE, providing essential statistical support to the UK government's crisis response during the pandemic.
- Collaborated with Prof. Neil Ferguson to lead the creation and development of deterministic and stochastic models
  and data pipelines for infectious disease transmission during the COVID-19 crisis, primarily using traditional and
  particle Markov Chain Monte Carlo (MCMC) methods for Bayesian inference.

## **TECHNICAL SKILLS & LANGUAGES**

- Languages: Python, R, Julia, C++, C#, SQL, Bash (Linux)
- ML / DL: PyTorch, TensorFlow/Keras, XGBoost, Optuna, NumPy, Pandas
- Data & Storage: DuckDB, HDF5
- HPC & Acceleration: CUDA, Automatic Mixed Precision (AMP); CPU/GPU clusters
- Tooling: Git/GitHub, CI/CD (GitHub Actions), Linux

#### **EDUCATION**

- PhD in Applied Mathematics, Imperial College London, U.K., January 2025 December 2027
   Thesis: "Large-Scale Acceleration of Real-Time Agent-Based System Simulations with Neural Surrogates and Graph Neural Networks"
- MSc. Epidemiology (Merit), Imperial College London, U.K., 2020 2021
- BSc. (Hons.) Mathematics with Economics (2:1), Aston University, U.K., 2015 2019

#### **PUBLICATIONS & REFERENCES**

#### **Publications:**

- Morgenstern, C., et al. (including Cosmo Santoni) "Severe acute respiratory syndrome (SARS) mathematical models and disease parameters: a systematic review and meta-analysis" The Lancet Microbe, DOI: https://doi.org/10.1101/2024.08.13.24311934
- Imai, N., Rawson, T., et al. (including Cosmo Santoni.) "Quantifying the impact of delaying the second COVID-19 vaccine dose in England: a mathematical modelling study" The Lancet Public Health, DOI: https://doi.org/10.1016/S2468-2667(22)00337-1
- Perez-Guzman, P. N., Knock, E., et al. (including Cosmo Santoni.) "Epidemiological drivers of transmissibility and severity of SARS-CoV-2 in England." Nature Communications, DOI: <a href="https://doi.org/10.1038/s41467-023-39661-5">https://doi.org/10.1038/s41467-023-39661-5</a>

### Manuscripts under Review:

- McCabe, R., et al. (including Cosmo Santoni) "The impact of ambiguously reported epidemiological parameters for infectious disease modelling and recommended best practices" **The Lancet Infectious Disease**
- Cosmo Santoni., et al. "Deep Neural Universal Differential Equations: A Novel Approach for Tumour Volume Growth in Complex Mathematical Systems" **Nature Machine Intelligence**

## **Published Software & Tools:**

- <u>MINTverse</u>: A modular Python/R toolkit—DuckDB data layer + PyTorch emulators + XGBoost/ranger—for real-time prevalence/case forecasting. Open-source. Production ready.
- <u>Epireview</u>: A tool to obtain the latest data, figures and tables from the Pathogen Epidemiology Review Group (PERG). PERG is an internationally recognised World Health Organization collaborative collective.
- Sircovid: Tools for Bayesian analysis of stochastic models using adaptive Metropolis-Hastings and particle MCMC.
- <u>Spimalot</u>: The models in this package can be used to estimate key epidemic parameters and predict the course of the epidemic under different intervention scenarios.
- MCState: Parameter inference for stochastic, compartmental models from data, using Monte Carlo methods.

#### **CONFERENCES & PRESENTATIONS**

- Epireview: Hands-on Workshop for Public Health & Epidemiology Researchers, Infectious Disease Modelling Conference, Bangkok, Thailand, November 2024
- Applying Neural Network Emulation to Assess the Impact of Pyrethroid-Pyrrole Bed Nets on Malaria in Africa, 9th International Conference on Infectious Disease Dynamics, Bologna, Italy, November 2023
- Investigating Parameterisation and Inference Trade-Offs in Stochastic and Deterministic Epidemic Models, 9th International Conference on Infectious Disease Dynamics, Bologna, Italy, November 2023

# **ACADEMIC SERVICE & VOLUNTARY WORK**

- Curator, Amphibian & Malaria Collections, Museum of Life Sciences, King's College London, U.K., 2025 -
- Departmental MRC GIDA Seminar Series Co-Organiser, Imperial College London, U.K., 2023 –
- MSc. Epidemiology Graduate Teaching Assistant, Imperial College London, U.K., 2021 2022
- Lay Grant Reviewer, University College London & Parkinson's UK, U.K., 2019 2022
- BSc. Mathematics Undergraduate Teaching Assistant, Aston University, U.K., 2017 2019