# Paul Duckworth

Oxford Robotics Institute, 23 Banbury Road, University of Oxford, UK

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#### RESEARCH ACTIVITIES

2021 - **Postdoctoral Research Assistant:** Department of Oncology

WITH: PROFESSOR KATHERINE VALLIS

Deep RL for Radiotherapy Planning, Cancer Research UK

University of Oxford, UK

2019 - **Postdoctoral Research Assistant:** Oxford Robotics Institute

WITH: PROFESSOR NICK HAWES

Planning under Uncertainty for Mobile Robotics

Projects: i) Offshore Robotics for Certification of Assets and ii) Robotics and AI in Nuclear

Co-Supervision: four dphil students and two fourth year eng projects.

University of Oxford, UK

2017 – 2019 **Postdoctoral Research Assistant:** Machine Learning Research Group.

WITH: PROFESSOR MICHAEL A. OSBORNE

Projects: i) Future of Healthcare and ii) Creative Algorithmic Intelligence

University of Oxford, UK

2013 – 2017 **Ph.D:** Machine Learning for Mobile Robotics

WITH: PROFESSOR ANTHONY G. COHN & PROFESSOR DAVID C. HOGG

Thesis: "Unsupervised Human Activity Analysis for Intelligent Mobile Robots"

University of Leeds, UK

Frontier Development Lab: Researcher (Jun 2021 - Aug 2021)

NASA & SETI Institute, CA, USA / Remote

Project: Space Medic: Causal Inference for Out-Of-Distribution Generalization

Data Study Group: Principal Investigator (Jan 2020 - Apr 2021)

Alan Turing Institute, London, UK / Remote

Project: Exploring AI Supported Decision-Making for Early Stage Diagnosis of Colorectal Cancer

### **EDUCATION**

2009 - 2010 MSc: Mathematics and Computational Science

PASS WITH DISTINCTION

Thesis: "Formal Verification of an Electromechanical System with Discontinuous Properties."

University of Manchester, UK

2005 – 2008 BSc: Mathematics and Statistics

FIRST CLASS HONOURS Lancaster University, UK

## TEACHING EXPERIENCE

Stipendiary Lecturer/Tutor, Brasenose College (Jan 2020 - )

University of Oxford, UK

Engineering Mathematics Tutor: P1/A1, Vector Calculus, ODEs & PDEs.

Study Abroad Programme, St Antony's College (Jan 2020 & 2022)

University of Oxford, UK

Interdisciplinary Winter School: Introduction to ML and AI's Impact on Jobs.

Teaching Assistant (Oct 2017 & May 2019)

University of Oxford, UK

AIMS CDT: Data Estimation & Inference course assistant.

Advanced Machine Learning MSc: Reproducibility challenge coursework assessor.

Teaching Assistant (Sep 2015 - Jul 2017)

University of Leeds, UK

Undergraduate courses: Introduction to Programming (Python) and Introduction to Web Technology (html). MSc Machine Learning module assistant: setting lab assignments and marking coursework.

## **S**OFTWARE

ADVANCED Python, PyTorch, TensorFlow, GPFlow, ROS, git, Pandas, sklearn, Linux

BASIC C++, Matlab, MongoDB, R, SAS

CONTRIBUTED QSRLib.readthedocs.io, STRANDS-Project.eu

## WORK EXPERIENCE

Machine Learning Researcher: Consultant (Apr 2017)

Mind Foundry, Oxford, UK

Statistical Programmer II (Sep 2010 - Sep 2013)

ICON Clinical Research, UK

Team lead of 20+ global programmers. Study resourcing, communications and delivery of analysis to clients.

Portfolio Modelling Analyst (Nov 2008 - Sep 2009)

HBoS, Lloyds Banking Group, UK

Building, maintenance and running of portfolio stress-testing forecast models to plan capital in varying economic climates.

## **SELECT INVITATIONS**

- Invited Reviewer: IEEE Transactions on Pattern Analysis and Machine Intelligence 2020.
- Invited Talk and Panellist at Rhodes Trust AI Frontiers Conference, Rhodes House, Oxford. (Jun 2019)
- PC member and reviewer: AAAI & IJCAI 2018. AAAI, ECAI & ICAPS 2019. IEEE IROS & ACS 2020
- Guest Lecture: Business Psychology MSc at Sigmund Freud University. (Mar 2019)
- Invited Talk: Robotics@Leeds Conf. 2018.
- Invited Reviewer: Special Issue of Journal of Computational Intelligence and Neuroscience 2018.

### PUBLICATIONS LIST

"Probabilistic Planning for AUV Data Harvesting from Smart Underwater Sensor Networks"

Budd, M., ... Harris, C., Duckworth, P. Hawes N. and Lacerda, B.

International Conference on Intelligent Robots and Systems (IROS) 2022

"Mission Planning in Unknown Environments as Bayesian Reinforcement Learning"

Budd, M., Duckworth, P., Hawes, N. and Lacerda, B.

Under Review.

"Planning for Risk-Aversion and Expected Value in MDPs"

Rigter, M., Duckworth, P., Lacerda, B. and Hawes, N.

International Conference on Automated Planning and Scheduling ICAPS 2022 Best Paper - Runner-up.

"Leveraging Invariance in non-i.i.d Federated Learning"

Duckworth, P., Ughi G., O'Donoghue O., Scheibenreif, L.,  $\dots$  and Sanders, L.

Under Review.

"Fedeated Causal Inference for Preducting Radiation Exposure in Out-of-Distribution Settings"

Ughi G., Duckworth, P., O'Donoghue O., Scheibenreif, L., ... and Sanders, L.

NASA Human Research Program IWS, 2022. Oral Presentation.

"Invariant Risk Minimisation for Cross-Organism Inference: Substituting Mouse Data for Human Data in Human Risk Factor Discovery"

O'Donoghue O., Duckworth, P., Ughi G., Scheibenreif, L., ... and Sanders, L.

Machine Learning 4 Health Workshop at **NeurIPS** 2021.

"Risk-Aware Motion Planning in Partially Known Environments"

Barbosa, F. S., Lacerda, B., Duckworth, P., Tumova, J., and Hawes, N.

In IEEE International Conference on Decision and Control CDC 2021

"Active Inference for Integrated State-Estimation, Control, and Learning"

Baioumy, M., Duckworth, P., Lacerda, B. and Hawes N.

In IEEE International Conference on Robotics and Automation ICRA 2021

"Time-Bounded Mission Planning in Time-Varying Domains with Semi-MDPs and GPs"

Duckworth, P., Lacerda, B. and Hawes, N.

In IEEE Conference on Robotic Learning CORL 2020

"Markov Decision Processes with Unknown State Feature Values for Safe Exploration using GPs"

Budd, M. and Lacerda, B. and Duckworth, P. and West, A. and Lennox, B. and Hawes, N.

In IEEE Intelligent Robots and Systems IROS 2020

"Towards Better Healthcare: What Could and Should be Automated?"

Fruehwirt, W. and Duckworth, P.

In Technological Forecasting & Social Change, Elsevier Journal 2021

Also appears in: AI for Social Good Workshop at NeurIPS 2019. Oral Presentation.

"Qualitative and quantitative approach to assess potential for automating administrative tasks in GPs" Willis, M., Duckworth, P., Coulter, A., Meyer, E.T. and Osborne, M.

In **BMJ Open** Journal 2020

"Adaptive manipulator control using active inference with precision learning"

Baioumy, M., Mattamala, M., Duckworth, P., Lacerda, B. and Hawes N.

In UK Robotics and Autonomous System (UK-RAS): Robots into the real world. 2020

"Unsupervised Human Activity Analysis for Intelligent Mobile Robots"

Duckworth, P., Hogg, D., and Cohn, A.

In Artificial Intelligence Elsevier Journal 2019.

"Inferring Work Task Automatability from AI Expert Evidence"

Duckworth, P., Graham, L., and Osborne, M.

In AI Ethics & Society (AAAI/ACM) 2019. Oral Presentation.

Also appears in: AI for Social Good Workshop at NeurIPS 2018. Oral Presentation.

"The Future of Healthcare Protocol Article"

Willis, M., Duckworth, P., Coulter, A., Meyer, E., Osborne, M.

In **JMIR** Research Protocols 2019.

"Grounding of Human Environments and Activities for Autonomous Robots"

Duckworth, P., Alomari, M., Bore, N., Hawasly, M., Hogg, D. C. and Cohn, A. G.

In International Joint Conferences on Artificial Intelligence IJCAI 2017. Best Video Award.

"Natural Language Grounding and Grammar Induction for Robotic Manipulation Commands"

Alomari, M., Duckworth, P., Hawasly, M., Hogg, D. C. and Cohn, A. G.

In ROBONLP Workshop at ACL 2017. Best Paper Award.

"Latent Dirichlet Allocation for Unsupervised Activity Analysis on an Autonomous Mobile Robot"

Duckworth, P., Alomari, M., Charles, J., Hogg, D. C. and Cohn, A. G.

In **AAAI** Conference on Artificial Intelligence 2017. Oral Presentation.

"Semi-supervised Natural Language Acquisition and Grounding for Robotic Systems"

Alomari, M., Duckworth, P., Hogg, D., and Cohn, A.

In **AAAI** Conference on Artificial Intelligence 2017.

"Unsupervised Activity Recognition using Latent Semantic Analysis on a Mobile Robot"

Duckworth, P., Alomari, M., . . .

In European Conference on AI **ECAI** 2016. **Best Student Paper Award** - Runner-up. Oral Presentation.

"The STRANDS project: Long-term autonomy in everyday environments"

Hawes, N., Burbridge, C., Jovan, F., Kunze, L., Lacerda, B., Duckworth, P., et. al.

In IEEE Robotics and Automation Magazine RAM. 2017.

"Unsupervised Learning of Qualitative Motion Behaviours by a Mobile Robot"

Duckworth, P., Gatsoulis Y., Jovan, F., Hawes, N., Hogg, D.C. and Cohn, A. G.

In International Conference on Autonomous Agents & Multiagent Systems AAMAS 2016. Oral Presentation.