# Dr Paula Parpart

## Curriculum Vitae

## Experience

2019-present Postdoctoral Researcher - Al and decision-making, Computational Neuroscience, Experimental Psychology, University of Oxford, Oxford, UK.

- o Human Information Processing lab, PI: Christopher Summerfield
- o My research developed a meta-learning neural network approach for learning human decision heuristics from scratch. Heuristics can be understood as regularizers or simple statistical models. We analyse a range of real-world datasets to understand under what cirumstances heuristic regularizers outperform more complex approaches.
- Other projects looked at reinforcement learning in humans and machines, and learning with stochastic gradient descent in mice and humans

## 2018-2019 Postdoctoral Researcher - Behavioural Patterns in Financial Big Data, Behavioural Science Unit, LLoyds Banking Group & Warwick Business School, UK.

- This project involved vast amounts of financial big data individual banking transactions by over 20 million customers - to ask questions about behavioural patterns on a longitudinal and big data scale.
- o I build new predictive models based on behavioural constructs for deployment within the bank, with commercial impact
- Responsible for communicating complex ideas to different teams & managing stakeholder relationships

#### 2016–2018 Founder & CEO at Brainpool.ai, London, UK.

- o I founded and build Brainpool AI out of UCL with two co-founders. It has grown into an established data science company in London and Toronto (Canada), operating a worldwide network of 500 academcis in data science and machine learning, spanning PhDs, post-docs, professors and professionals.
- o Brainpool bridges the gap between academia and industry by creating a platform for academics to consult with organisations in government, healthcare, retail, and finance. Partners include IBM and Nvidia and clients range from Sainsburys to Tier-1 investment banks, and one of the biggest social networks.
- Example projects include building a matching algorithm for a recruitment client, supervising a team of engineers to build neural network libraries for a large financial organisation, or identifying analytic use cases for a marine and energy company

- 2016–2017 **Teaching Fellow on MSc Cognitive Sciences**, Department of Experimental Psychology, UCL.
  - Co-directed Masters course responsible for 3 core moduels
  - Designed curriculum for core modules including Bayesian statistics, model comparison approaches to statistics, artificial ingelligence approaches to cognitie science, principles of cognition, learning & inference, MSc research seminar, third year decision-making labs & first year seminar etc.
  - Supervisor and co-supervisor for 10 MSc and BSc students' research theses
  - Won Teaching Award for Outstanding Researcher Development & Outstanding Personal Support at 2017 Choice Teaching Awards
  - Pastoral care and mentoring of students
- 2012–2015 **Medical Decision Making Project**, *St Andrews Healthcare Psychiatric Hospital*, Northampton, UK.
  - Project on improvement of clinicians risk assessment (jointly with Prof Brad Love, Lukasz Kopec): Anlaysed existing psychiatric test instrument and made improvement suggestions based on machine learning model developed during PhD.
  - 2012 **Behavioural Insights Consultant**, *Cabinet Office, UK Government*, London, UK. Industry placement by the UCL Centre for Financial Computing & Analytics PhD funding
    - Fraud prevention: Consulted on fraud detection models involving more data aggregation and improved statistical models such as Bayesian machine learning model developed during the PhD.
- 2007–2010 **Research Assistant**, *ABC Research Group, Max Planck Institute for Human Development*, Berlin, Germany.

#### Education

- 2013–2017 **PhD in Experimental Psychology**, *University College London*, UK, Title: Why less can be more: A Bayesian Framework for Heuristics Supervisors: Prof Bradley C. Love & Dr Maarten Speekenbrink.
- 2012–2013 MRes in Computer Science, *University College London*, UK, Part of the 4-year EPSRC PhD program in Financial Computing. Focus: Statistical Computing and Machine Learning.
- 2010–2011 **MSc in Cognitive and Decision Sciences**, *University College London*, UK, Supervisors: Dr Anne Hsu & Prof Nick Chater.
- 2006–2010 Vordiplom (eqvl. Bsc) in Psychology, Humboldt University Berlin, Germany.

#### **Publications**

#### Peer-reviewed articles

- 1. Summerfield, C. & Parpart, P., (2022), Normative principles for decision-making in natural environments. *Annual Review of Psychology 2022, 73:1*, Link
- 2. **Parpart, P.** & Summerfield, C., (in preparation), Neural simplicity: meta-learning heuristics for multiattribute choice.
- 3. **Parpart, P.**, Galgali, A., Saxe, A., Zatka-Haas, P., Lak, A., & Summerfield, C., (in preparation), Learning biases in mice and humans result from learning with stochastic gradient descent.

- 4. Muggleton, N., **Parpart, P.**, Newall, P., E., Leake, D., Gathergood, J., & Stewart, N. (2021), The association between gambling and financial, social and health outcomes in big financial data. *Nature Human Behaviour, 1-8* Link
- 5. **Parpart, P.**, Schulz, E., Speekenbrink, M. & Love, B. (under review), Active learning reveals underlying decision strategies. Preprint: bioRxiv
- 6. **Parpart, P.**, Jones, M. & Love, B.C. (2018), Heuristics as Bayesian inference under extreme priors. *Cognitive Psychology*, *102*, *127-144*, Link
- 7. Guarda, P., **Parpart, P.**, Harvey, N., & Juan Carlos Muñoz (2018), Understanding decisions about time in public transport. *Proceedings of the 40th Annual Meeting of the Cognitive Science Society. Austin, TX: Cognitive Science Society.*
- 8. **Parpart, P.**, Schulz, E., Speekenbrink, M. & Love, B. (2015), Active learning as a means to distinguish among prominent decision strategies. *Proceedings of the 37th Annual Conference of the Cognitive Science Society*, PDF
- 9. Cokely, E.T., **Parpart, P.**, & Schooler, L.J. (2009), On the link between cognitive control and heuristic processes. *Proceedings of the 31st Annual Conference of the Cognitive Science Society*. PDF

Peer-reviewed abstracts, presentations & posters 2020

12. **Parpart, P.**, Schulz, E. & Love, B. (2020), Active learning as a tool for model comparison in psychology. Workshop on Efficient Coding to Information Gain: Information-Theoretic Principles in Models of Human Decision Making, 42nd Annual Meeting of the Cognitive Science Society.

2018

- 13. **Parpart, P.**, Schulz, E. & Love, B. (2018), Robustness through sparsity: A comparison of decision heuristics. *Poster presented at the 40th Annual Meeting of the Cognitive Science Society. Austin, TX: Cognitive Science Society.*
- 14. **Parpart, P.** (2018), Reinterpreting heuristics as Bayesian inference. *Workshop on Contemporary Decision Making, 40th Annual Meeting of the Cognitive Science Society.*

2016

15. Kopec, L., **Parpart, P.**, Wallang, P. & Love, B.C. (2016), Less Information Can Improve Clinical Risk Assessments. *Society for Medical Decision Making Biennial European Conference, 2016, London, United Kingdom* 

2015

- 16. **Parpart, P.**, Schulz, E., Speekenbrink, M. & Love, B. (2015), Active learning as a means to distinguish among prominent decision strategies. *Talk presented at the 37th Annual Conference of the Cognitive Science Society, 2015, Pasadena, CA.*
- 17. **Parpart, P.**, Jones, M., & Love, B.C. (2015), Simple Heuristics as Special Cases of Bayesian Inference. *Poster presented at the Memory and Decision Making Workshop, University of Basel, Basel, Switzerland*

- 18. **Parpart, P.**, Jones, M., & Love, B.C. (2015), Simple Heuristics as Special Cases of Bayesian Inference. Simple Heuristics as Special Cases of Bayesian Inference. *Poster presented at the Cumberland Lodge PhD Conference, Windsor, United Kingdom* 2014
- 19. **Parpart, P.**, Jones, M., & Love, B.C. (2014), Heuristics as a Special Case of Bayesian Inference. *Talk at Decision Making Bristol 2014, University of Bristol, Bristol, United Kingdom*
- 20. **Parpart, P.**, Jones, M., & Love, B.C. (2014), Heuristics as Special Cases of Bayesian Inference. *Poster presented at the 36th Annual Conference of the Cognitive Science Society, 2014, Quebec City, Canada*
- 21. **Parpart, P.**, Jones, M., & Love, B.C. (2014), Heuristics as Special Cases of Bayesian Inference. *Talk at the Mathematical Psychology Conference 2014, Quebec City, Canada*
- 22. **Parpart, P.**, Jones, M., & Love, B.C. (2014), Heuristics as Special Cases of Bayesian Inference. Reconciling irrational and adaptive views of heuristics. *Talk at the Cumberland Lodge PhD Conference, Windsor, United Kingdom* 2013
- 23. **Parpart, P.**, Jones, M., & Love, B.C. (2013), Reconciling irrational and adaptive views of heuristics. Talk at the 34th International Conference on Subjective Probability, Utility and Decision Making (SPUDM24), ISCE, Barcelona, Spain
- Parpart, P., Jones, M., & Love, B.C. (2013), When is it rational to rely on heuristics? Poster presented at the 35th Annual Conference of the Cognitive Science Society, 2013, Berlin, Germany

#### 2011

- 25. **Parpart, P.**, & Cokely, E.T. (2011), When does Cognitive Control lead to Biases? Evidence from Memory and Stock Profit Estimation Tasks. *Poster presented at the 23rd International Conference on Subjective Probability, Utility and Decision Making (SPUDM23), Kingston Upon Thames, United Kingdom*
- 26. Okan, Y., Parpart, P., Cokely, E.T. & Garcia-Retamero, R. (2011), The effect of misleading graphs on the comprehension of health and political communications: Who is more susceptible to misinterpret data? Poster presented at the 23rd International Conference on Subjective Probability, Utility and Decision Making (SPUDM23), Kingston Upon Thames, United Kingdom
- 27. Okan, Y., Woller-Carter, M., Simon, S.R., Russell, K., Ghazal S., **Parpart, P.**, Garcia-Retamero R., Cokely, E.T. (2011), Overcoming distortions in political and health communication: Mechanisms of graph literacy. *Poster presented at the 83rd Annual meeting of the Midwestern Psychological Association, Chicago, IL*.

#### 2010

28. Parpart, P., & Cokely, E.T. (2010), Fluency and cognitive control in judgment: Influences of memory and elaborative encoding. Poster presented at the Proceedings of the 32nd Annual Conference of the Cognitive Science Society, 2010, Portland, Oregon

2008

- 29. Cokely, E.T., **Parpart, P.**, & Schooler, L.J. (2009), Mechanisms of superior judgment: Ironic effects of cognitive control. *Talk at the 23rd Annual Meeting of the Society for Judgment and Decision-Making, Boston, MA*.
- 30. Cokely, E.T., & **Parpart, P.** (2009), There is no "the" heuristic system: Modes of cognitive control in judgment and decision making. *Talk at the 16th European Society for Cognitive Psychology Conference, Krakow, Poland*
- 31. Cokely, E.T., & **Parpart, P.** (2009), Modes of cognitive control in judgment & decision making. *Talk at the 22nd Subjective Probability Utility Decision Making (SPUDM22) Conference, Reverto, Italy*
- 32. Cokely, E.T., & **Parpart, P.** (2008), There is no "the" heuristic system: Evidence of reflective heuristic processing. *Poster presented at the 49th Annual Meeting of the Psychonomic Society, Chicago, IL.*
- 33. Parpart, P. & Cokely, E.T. (2008), Individual differences and the use of fluency in judgment: Paradoxical evidence of reflective heuristic processing. *Poster presented at the 2nd Biennial Symposium on Personality and Social Psychology, Warsaw, Poland*

### Selected Invited Talks

- Aug 2020 **Parpart, P.**, Learning heuristics from scratch with neural networks. Invited Talk at the Computational Principles of Intelligence Lab (PI: Eric Schulz), Max Planck Institute for Biological Cybernetics, Tuebingen, Germany
- May 2018 **Parpart, P.**, Advances in machine learning and artificial intelligence. Invited keynote speaker at the 25th Anniversary of Kx Systems (Big data technology kdb+), New York City, New York
- Feb 2018 **Parpart, P.**, Who owns artificial intelligence? Invited Talk at the Digital Economy Network CDT Symposium by the EPSRC, Digital Catapult Centre, London, UK
- Jan 2018 **Parpart, P.**, Will Al be restricted by capitalism or is Al communist? Talk at the Al World Congress 2018, London, UK
- Dec 2017 **Parpart, P.**, Democratization of Al. Talk at Telegraph DEN Live Conference, London, UK
- Nov 2017 **Parpart, P.**, Brainpool Revolutionizing healthcare and the NHS with Al. Invited Talk at the Al Stage GIANT Healthcare Conference, London, UK
- Nov 2017 **Parpart, P.**, The future of data science. Invited Talk at the Doctoral Training Centre for Financial Computing & Analytics, UCL, London, UK
- Nov 2017 **Parpart, P.**, Brainpool democratizes access to elite AI and ML scientists. Invited Talk at Emerging Technologies: Machine Learning Academy, IDEA London, UK
- Oct 2017 **Parpart, P.**, The future of science-industry collaboration. Invited Talk at the Moore-Sloan Lunchtime talks (Tassos Noulas), Center for Data Science, NYU, New York

Sept 2017 **Parpart, P.**, A new model for Al consulting. Invited Talk at the EPSRC Entrepreneurship Workshop, Digital Catapult Center, London, UK

## Awards & Funding

- June 2019 **EPS Travel Grant**, Research stay at the Santa Fe Institute for Complex Systems, New Mexico, funded by the Experimental Psychology Society, United Kingdom.
  - 2017 **Teaching Award for Outstanding Reseacher Development & Outstanding Personal Support**, 2017 Student Choice Teaching Awards, UCL, Department of Experimental Psychology.
  - 2014 **Best Talk Prize Sully Scholarship**, *PhD upgrade prize*, UCL Department of Experimental Psychology.
  - 2014 **Best Talk Prize**, Award for best oral presentation at the annual conference of *UCL's postgraduate peer group*, Windsor, United Kingdom.
- 2012-2016 **EPSRC Financial Computing Grant**, *Full 4-year scholarship for PhD at UCL*, Centre for Doctoral Training in Financial Computing and Analytics, London, United Kingdom.
- 2010-2011 **German Government Graduate Scholarship (DAAD)**, Full scholarship for MSc at UCL, German Government Exchange Service, London, United Kingdom.
  - 2009 **NYU Student Scholarship**, Full scholarship for study abroad term at New York University, Humboldt University, Berlin, Germany.
  - 2008 **Poster Award**, Second Biennial Conference on Personality and Social Psychology, awarded by Prof. Michael W. Eysenck, Prof Maruszewski und Prof Gerald Matthews, Warsaw, Poland.
  - 2007 **Student Experiment Prize**, Student competition for Experimental study design, Humboldt University, Berlin, Germany.

## Research visits & workshops

- June 2019 **Complex Systems Summer School**, Santa Fe Institute for Complex Systems, University of Cambridge, New Mexico, US,
  4-week intensive project work in complexity sciences with focus on nonlinear dynamics, information theory, scaling theory, adaptation and evolution, networks, machine learning, agent-based models, and more. Project outcome: write-up for publication.
- Nov 2016 Isaac Newton Institute for Mathematical Sciences, University of Cambridge, Cambridge, UK, Invited participant at the 4-week workshop on "Probability and Statistics in Forensic Science"

  Organized by: Norman Fenton, Leila Schneps, David Balding, Richard Gill & David Lagnado.
- 2011, 2018 **Visitor**, *Center for Adaptive Rationality (ARC)*, Max Planck Insitute for Human Development, Berlin, Geramany.

## Programming & Tools

R, Python, Matlab, data visualization (ggplot2, matplotlib, D3), JavaScript, HTML, CSS, SQL, MySQL, Teradata, Stata, Aster, Java, PhP, SPSS, LaTEx, WinBugs, Mechanical Turk, Unipark, Qualtrics, psiTurk

## Scientific Reviewing

Ad hoc Journal of Experimental Psychology: LMC reviewer Cognitive Science Society Conference

Cognition

Book Review In Two Minds (Jonathan St. Evans)

## References

Prof Experimental Psychology
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