# Charley M. Wu

Curriculum Vitae

## Academic Background

Current Position

2019 – **Post-Doctoral Fellow**, *Department of Psychology*, Harvard University, Cambridge, MA. Present

#### Previous Positions

- 2019 **Post-Doctoral Research Fellow**, *Center for Adaptive Rationality (ARC)*, Max Planck Institute for Human Development, Berlin, Germany.
- 2018 **Visiting Research Fellow**, Computational Cognitive Neuroscience Lab; hosted by Samuel J. Gershman, Harvard University, Cambridge, MA.
- 2016-2019 **Pre-Doctoral Research Fellow**, *Center for Adaptive Rationality (ARC)*, Max Planck Institute for Human Development, Berlin, Germany.
- 2014-2015 **Research Assistant**, Center for Adaptive Behavior and Cognition (ABC), Max Planck Institute for Human Development, Berlin, Germany.
  - 2014 **Student Research Scientist**, *PetaByte Research*, Budapest, Hungary.
- 2013-2014 **Research Assistant**, *Intelligent Software Agents and New Media Group*, Austrian Institute for Artificial Intelligence (OFAI), Vienna, Austria.
  - 2009 **Research Assistant**, *Center for Human Evolution, Cognition, and Culture (HECC)*, University of British Columbia, Vancouver, Canada.

## Education

- 2016-2019 **Dr. rer. nat. (Ph.D.) Psychology**, *Humboldt University of Berlin*, Berlin, Germany, *Summa Cum Laude*.
- 2013-2015 M.Sc. Cognitive Science, University of Vienna, Vienna, Austria, with Distinction.
- 2004-2009 B.A. Philosophy, University of British Columbia, Vancouver, Canada, Dean's List.

#### Honors and Awards

- 2019 **Dean's Competitive Fund for Promising Research**, *Harvard University*, Cambridge, MA, \$33,353 (written with and awarded to Sam Gershman).
- 2019 **Glushko and Samuelson Student Travel Grant**, 40th Annual Conference of the Cognitice Science Society, Montreal, QC, \$500.

- 2016-2019 **Pre-Doctoral Fellowship**, International Max Planck Research School on Adapting Behavior in a Fundamentally Uncertain World, Joint PhD Fellowship in Psychology, Economics, and Law, ∼€100,000.
- 2011-2012 **Joseph-Armand Bombardier Canada Graduate Scholarship**, Social Sciences and Humanities Research Council of Canada (SSHRC), Canada, \$17,500, Declined.

#### Publications

In Prep

submitted **Wu**, C. M., Schulz, E., Garvert, M. M., Meder, B., & Schuck, N. W. (submitted). Similarities and differences in spatial and non-spatial cognitive maps. *bioRxiv*. doi:10.1101/2020.01.21. 914556

**Wu**, C. M., Schulz, E., & Gershman, S. J. (submitted). Inference and search on graph-structured spaces. bioRxiv. doi:10.1101/2020.01.21.981399

Peer reviewed articles

2019 Analytis, P. P., **Wu**, C. M., & Gelastopoulos, A. (2019). Make-or-break: chasing risky goals or settling for safe rewards? *Cognitive Science*, *43*, e12743. doi:10.1111/cogs.12743

Schulz, E., **Wu**, C. M., Ruggeri, A., & Meder, B. (2019). Searching for rewards like a child means less generalization and more directed exploration. *Psychological Science*, 30(11), 1561-1572. doi:10.1177/0956797619863663

Tump, A. N., **Wu**, C. M., Bouhlel, I., & Goldstone, R. L. (2019). The evolutionary dynamics of cooperation in collective search. In A. Goel, C. Seifert, & C. Freksa (Eds.), *Proceedings of the 41st Annual Conference of the Cognitive Science Society* (pp. 883–889). Montreal, QB: Cognitive Science Society. (Joint first authorship.)

**Wu**, C. M., Schulz, E., Gerbaulet, K., Pleskac, T. J., & Speekenbrink, M. (2019). Under pressure: The influence of time limits on human exploration. In A. Goel, C. Seifert, & C. Freksa (Eds.), *Proceedings of the 41st Annual Conference of the Cognitive Science Society* (pp. 1219–1225). Montreal, QB: Cognitive Science Society. (Joint first authorship.)

**Wu**, C. M., Schulz, E., & Gershman, S. J. (2019a). Generalization as diffusion: human function learning on graphs. In A. Goel, C. Seifert, & C. Freksa (Eds.), *Proceedings of the 41st Annual Conference of the Cognitive Science Society* (pp. 3122–3128). Montreal, QB: Cognitive Science Society.

**Wu**, C. M., Schulz, E., & Gershman, S. J. (2019b). Searching for rewards in graph-structured spaces. In *Proceedings of the 2019 Conference on Cognitive Computational Neuroscience*. doi:10.32470/CCN.2019.1041-0

2018 Bouhlel, I., **Wu**, C. M., Hanaki, N., & Goldstone, R. L. (2018). Sharing is not erring: pseudoreciprocity in collective search. In T. T. Rogers, M. Rau, X. Zhu, & C. W. Kalish (Eds.), *Proceedings of the 40th Annual Conference of the Cognitive Science Society* (pp. 156–161). Austin, TX: Cognitive Science Society. (Joint first authorship.)

Schulz, E., **Wu**, C. M., Huys, Q. J., Krause, A., & Speekenbrink, M. (2018). Generalization and search in risky environments. *Cognitive Science*, 42, 2592–2620. doi:10.1111/cogs.12695

- **Wu**, C. M., Schulz, E., Garvert, M. M., Meder, B., & Schuck, N. W. (2018a). Connecting conceptual and spatial search via a model of generalization. In T. T. Rogers, M. Rau, X. Zhu, & C. W. Kalish (Eds.), *Proceedings of the 40th Annual Conference of the Cognitive Science Society* (pp. 1183–1188). Austin, TX: Cognitive Science Society.
- Wu, C. M., Schulz, E., Speekenbrink, M., Nelson, J. D., & Meder, B. (2018b). Generalization guides human exploration in vast decision spaces. *Nature Human Behaviour*, 2, 915–924. doi:10.1038/s41562-018-0467-4
- 2017 **Wu**, C. M., Meder, B., Filimon, F., & Nelson, J. D. (2017). Asking better questions: how presentation formats influence information search. *Journal of Experimental Psychology: Learning, Memory, and Cognition, 8,* 1274–1297. doi:doi:10.1037/xlm0000374
  - **Wu**, C. M., Schulz, E., Speekenbrink, M., Nelson, J. D., & Meder, B. (2017). Mapping the unknown: the spatially correlated multi-armed bandit. In G. Gunzelmann, A. Howes, T. Tenbrink, & E. J. Davelaar (Eds.), *Proceedings of the 39th Annual Meeting of the Cognitive Science Society* (pp. 1357–1362). Austin, TX: Cognitive Science Society.
- 2016 Barkoczi, D., Analytis, P. P., & Wu, C. M. (2016). Collective search on rugged landscapes: a crossenvironmental analysis. In A. Papafragou, D. Grodner, D. Mirman, & J. Trueswell (Eds.), Proceedings of the 38th Annual Conference of the Cognitive Science Society (pp. 918–923). Austin, TX: Cognitive Science Society.

### Invited Talks

- Feb. 2020 The Computational Principles of Efficient Human Exploration, University of California, Irvine Irvine, California.
- Feb. 2020 *Principles of Human Exploration and Generalization*, Max Planck Institute for Biological Cybernetics Tübingen, Germany.
- Feb. 2020 The Foundations of Efficient Human Exploration, University of Konstanz Konstanz, Germany.
- Jan. 2020 *Cognitive Mechanisms of Social Learning,* iSearch Retreat, Schloss Ringberg. Kreuth, Germany.
- Nov. 2019 *Domain General Principles of Efficient Human Exploration,* SimTech Colloquium, University of Stuttgart. Stuttgart, Germany.
- Nov. 2019 Domain General Principles of Generalization and Exploration , Cognitive Brain and Behavior Lunch, Harvard University.

  Cambridge, MA.
- May. 2019 Navigating Vast Decision Spaces with the Principle of Generalization, Machine Learning in Cognition at UCL (MLCog-UCL) Academic Society, University College London, UK.
- Jan. 2019 *Collective Search in Immersive Virtual Environments*, MPRG: iSearch Retreat, Schloss Ringberg. Kreuth, Germany.
- Jan. 2019 The Successor Representation, MPRG: NeuroCode, Max Planck Institute for Human Development. Berlin, Germany.
- Nov. 2018 Guiding Exploration Through Generalization, Cog Lunch, Department of Brain and Cognitive Sciences, MIT. Cambridge, MA.
- Nov. 2018 Generalization in Vast Spaces, Concats, New York University. New York City, NY.

- Nov. 2018 Generalization Guides Exploration in Vast Spaces, Fiery Cushman and Joshua Greene labs, Harvard University. Cambridge, MA.
- Sept. 2018 Guiding Exploration Through Generalization, Samuel Gershman Lab, Harvard University. Cambridge, MA.
- May. 2018 Generalization and Exploration: Insights from a spatial search task, Department of Psychiatry and Psychotherapy, Charité Universitätsmedizin. Berlin, Germany.
- Sept. 2017 Generalization and Exploration in Vast Spaces, Centre for Mind/Brain Sciences (CIMeC), University of Trento. Trento, Italy.
- May. 2017 Active Learning and Search in Unexplored Environments, MPRGL iSearch lab meeting, Max Planck Institute for Human Development. Berlin, Germany.
- Apr. 2017 Generalization Across Vast State Spaces: Human Exploration in Unknown Environments, Cognition Lab, University of Zürich, Zürich, Switzerland.
- Mar. 2017 Terra Incognito: Adaptive Learning and Information Search in Unknown Environments, The Center for Adaptive Rationality (ARC), Max Planck Institute for Human Development. Berlin, Germany.
- Feb. 2017 Adaptive Learning for Language Education, Babbel, Lesson Nine GmbH. Berlin, Germany.
- Nov. 2016 Mapping the Unknown: Human Spatial Exploration-Exploitation, Learning & Decision Making Lab, University College London, UK.

## Conference Presentations, Workshops, and Seminars

- Sep. 2019 **Wu, C.M.,** Schulz, E., & Gershman, S.J., *Searching for rewards in graph-structured spaces*, Poster presented at CCN 2019, Berlin, DE. [Poster].
- Jul. 2019 **Wu, C.M.,** Schulz, E., & Gershman, S.J., *Generalization as diffusion: human function learning on graphs*, Poster presented at CogSci 2019, Montreal, QB. [Poster].
- Jul. 2019 **Wu, C.M.,** Schulz, E., Gerbaulet, K., Pleskac, T.J., & Speekenbrink, M., *Under pressure:* the influence of time limits on human exploration, CogSci 2019, Montreal, QB.
- Jul. 2019 Tump, A.N., Wu, C.M., Bouhlel, I., & Goldstone, R.L., The Evolutionary Dynamics of Cooperation in Collective Search, CogSci 2019, Montreal, QB.
- Jul. 2019 **Wu, C.M.,** Schulz, E., Gerbaulet, K., Pleskac, T.J., & Speekenbrink, M., *Time pressure influences attitudes towards uncertainty*, MathPsych 2019, Montreal, QB. [Slides].
- Dec. 2018 **Wu, C.M.**, *Inference over graph structures using a diffusion kernel*, Berlin Machine Learning Seminar, Berlin, Germany.
- Jul. 2018 **Wu, C.M.,** Schulz, E., Garvert, M.M., Meder, B., & Schuck, N.W., *Connecting conceptual and spatial search*, CogSci 2018, Madison, WI.
- Jul. 2018 Bouhlel, I., **Wu, C.M.,** Hanaki, N., & Goldstone, R.L., *Sharing is not erring: Pseudo-reciprocal sharing in collective search*, CogSci 2018, Madison, WI.
- Jul. 2018 **Wu, C.M.,** & Meder, B., Nelson, J.D., *Navigating uncertainty through information search*, Poster presented at CogSci 2018, Madison, WI. [Poster].
- Jul. 2018 **Wu, C.M.,** Schulz, E., Speekenbrink, M., Nelson, J.D., & Meder, B., *Guiding exploration through generalization*, MathPsych 2018, Madison, WI.
- Mar. 2017 **Wu, C.M.,** Schulz, E., Speekenbrink, M., Nelson, J.D., & Meder, B., *Mapping the Unknown: The spatially correlated multi-armed bandit.*, CogSci 2017, London, UK.

- Mar. 2017 Wu, C.M., Schulz, E., Speekenbrink, M., Nelson, J.D., & Meder, B., Mapping the Un-known: Model-based and Model-free Approaches Towards Spatial Reinforcement Learning, TeaP 2017, Dresden, Germany.
- Mar. 2017 **Wu, C.M.**, Everybody GANs Now: Tutorial on Generative Adversarial Networks, Berlin Machine Learning Seminar, Berlin, Germany.
- Mar. 2017 **Wu, C.M.**, *Voyage into the Unknown: Adaptive Learning and Information Search*, IMPRS Thesis Workshop, Gut Gremmelin, Germany.
- Mar. 2017 **Wu, C.M.**, Adversarial Training: Math and Methods Tutorial, Center for Adaptive Behavior and Cognition (ABC), Berlin, Germany.
- Aug. 2016 Wu, C.M., Jurányi, Z., Gulyas, L., & Kampis, G., Blindfolded NLP: Unsupervised Learning for Automatically Generating Topic Labels, Identification, Location and Temporal Evolution of Topics Workshop, Budapest, Hungary.
- Jul. 2016 Wu, C.M., Schulz, E., Speekenbrink, M., Nelson, J.D., & Meder, B., Exploring the Unknown: Modeling Human Exploration-Exploitation Behavior, Poster presented at Computational and Mathematical Modeling of Cognition, Dobbiaco, Italy. [Poster].
- Mar. 2016 **Wu, C.M.**, *Gaussian Process Models: What do you do when you can't optimize?*, Berlin Machine Learning Seminar, Berlin, Germany.
- Feb. 2016 **Wu, C.M.**, Exploring Fitness Landscapes: How to discover good solutions to complex problems, IMPRS Thesis Workshop, Berlin, Germany.
- Feb. 2016 **Wu, C.M.,** Nelson, J.D., & Meder, B., *Characterizing Ruggedness in Fitness Landscapes*, ABC Conference, Berlin, Germany.
- Aug. 2015 **Wu, C.M.,** Meder, B., Nelson, J.D., & Filimon, F., *The effect of presentation formats on rational information search*, SPUDM 25, Budapest, Hungary.
- Jun. 2015 Wu, C.M., Meder, B., Filimon, F., & Nelson, J.D., The medium is the message: How presentation formats help people ask better questions, MEi: CogSci Conference, Ljubljana, Slovenia.
- Feb. 2015 Meder, B., **Wu, C.M.,** Nelson, J. D., & Filimon, F., *Presentation formats and information search*, Workshop on "Information, search, and causes: Rational and cognitive approaches", Turin, Italy.
- Jun. 2014 Wu, C.M., Skowron, M., & Petta, P., Reading between the lines: a vector space model of language using semantic role structures, Poster presented at MEi:CogSci Conference 2014, Kraków, Poland. [Poster].

## Teaching

- 2019-2020 **Representation Learning in Reinforcement Learning Seminar**, *Organizer and regular Speaker*, Harvard University, Center for Brain Science, Cambridge, MA. [Notes].
- 2015-2019 Berlin Machine Learning Seminar, Regular Speaker, Berlin, Germany.
  - 2018 **Introduction to Computational Modeling**, *Graduate and undergraduate workshop*, MPRG: iSearch Research Retreat, Bensdorf, Germany.
  - 2018 **Intro to Cognitive Modeling**, *Course*, Max Planck Institute for Human Development, Berlin, Germany. (Teaching Assistant to Dr. Björn Meder).
  - 2017 **Fast-and-frugal Trees and Models of Information Search**, *Workshop*, ABC Research Retreat, Schloss Ringberg, Germany.

- 2017 **Computational Models of Cognition**, *Graduate Lecture*, Berlin School of Mind and Brain (PhD Program), Humboldt University, Berlin, Germany.
- 2016-2017 **Math and Methods Tutorial Series**, *Organizer and regular speaker*, Center for Adaptive Behavior and Cognition (ABC), Berlin, Germany.
  - 2016 **A Statistical Framework for Model Comparisons**, *Tutorial*, ABC Research Retreat, Gut Gremmelin, Germany.

## Supervision

## Graduate Student Projects

**Lucy Lai**. Compositional sequence learning through generative structure learning. Department of Neuroscience, Harvard University. (2019-Present)

**Marcel Binz**. The emergence of compositional language through maximum entropy Reinforcement Learning. Department of Psychology, Philipps-Universität Marburg. (2019-Present)

**Imen Bouhlel**. Sharing is not erring: How environments can encourage pseudo-reciprocity in collective human search. Department of Economics, Université de Nice. (2016-Present)

**Alan Novaes Tump**. The evolutionary dynamics of cooperation in collective search. Center for Adaptive Rationality, Max Planck Institute for Human Development. (2018-2019)

**Ahmad Dawud**. *Collective search and rugged landscapes*. Institute of Cognitive Science, University of Osnabrück. (2017-2019)

**Alexander Djamali**. *Information search: Finding better questions*. Department of Physics, Ludwig Maximilian University of Munich. (2016-2017)

#### Dissertations

**Kimberly Gerbaulet.** Institute of Cognitive Science, University of Osnabrück. Masters Thesis: *Under pressure: the effect of time pressure on directed and random exploration.* (2018-2019)

## Professional Service

Organizer of the 17th annual Summer Institute on Bounded Rationality, Berlin, Germany (2018) PhD Representative for the Max Planck Institute for Human Development (2017-2018) Ad-hoc Reviewer for Nature Human Behaviour (1), Cognitive Computational Neuroscience (6), Cognitive Science Society (11), Mind & Society (1), and Futures & Foresight Science (1)

### Technical Skills

**Programming Languages:** R, Python, Matlab, Julia, JavaScript, HTML, jQuery, PHP, CSS, and LaTeX.

**Additional Software Skills:** MongoDB, MySQL, Tensorflow, SKlearn, GenSim, NLTK, Redis, and Adobe Creative Suite.

#### References

Prof. Dr. Fiery Cushman
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William James Hall, 33 Kirkland Street, Cambridge, MA 02138
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Prof. Dr. Samuel J. Gershman Department of Psychology and Center for Brain Sciences, University of Harvard Northwest Lab Building, 52 Oxford Street, Cambridge, MA 02138

# gershman[at]fas.harvard.edu

Dr. Björn Meder MPRG iSearch, Max Planck Institute for Human Development Lentzeallee 94, 14195 Berlin, Germany meder[at]mpib-berlin.mpg.de

Prof. Dr. Jonathan D. Nelson School of Psychology, University of Surrey 388 Stag Hill, Guildford GU2 7XH, UK jonathan.d.nelson[at]gmail.com