## Michael C. Hughes

#### **Education**

Brown University Ph.D., Computer Science.	2016
Brown University M.S., Computer Science.	2012
Olin College of Engineering  B.S. Electrical & Computer Engineering	2010

## Research Experience

#### **Assistant Professor of Computer Science**

Tufts University, Medford, MA

2018 - present

- o Conduct research in statistical machine learning methods and applications to health informatics.
- Advise Ph.D., M.S., and B.S. students in machine learning research projects.
- Teach machine learning courses targeted at advanced undergraduates (COMP 135 Intro to ML) and graduate students (COMP 150 Bayesian Deep Learning).

#### Postdoctoral fellow: Machine learning to improve clinical decisions in healthcare

Adviser: Prof. Finale Doshi-Velez (Harvard)

2016 - 2018

- o Developed semi-supervised models for characterizing and treating depression (with Dr. Perlis and Dr. McCoy).
- Applied time-series models to predict ventilator interventions in the ICU for public dataset of >36,000 patients.
- o Created methods for training deep models so they are more interpretable to clinicians or other users.

#### Postdoc project: Estimating carbon biomass from LiDAR waveforms

Adviser: Prof. Erik Sudderth & Prof. Jim Kellner (Brown U., Ecology & Evolutionary Biology) 2016

- Predicted forest biomass from LiDAR waveforms to better understand land use and climate change.
- o Modeled waveforms and biomass predictions jointly via nonparametric regression using our BNPy toolbox.
- o Intended for use in NASA's upcoming Global Ecosystem Dynamics Investigation (GEDI).

#### Ph.D. thesis: Reliable and scalable variational inference for Bayesian nonparametrics

Adviser: Prof. Erik Sudderth

2016

- o Thesis Title: Reliable and scalable variational inference for nonparametric mixtures, topics, and sequences
- Developed optimization algorithms for Bayesian nonparametric models that scale to millions of examples.
- o Optimized lower bound on marginal likelihood, thus penalizing too simple and too complex explanations.
- o Escaped local optima via data-driven proposals that add useful new clusters and remove redundant ones.
- o Applied to topic models of 2 million NY Times articles and sequential models of the whole human genome.
- o Implemented algorithms in open-source package: Bayesian Nonparametrics for Python (BNPy).

#### Master's project: Sequential Models for Video and Motion Capture

Adviser: Prof. Erik Sudderth 2012

- o Developed methods to discover common actions from many videos of humans performing household exercises.
- o Improved existing inference algorithms with data-driven Metropolis-Hastings proposals.

## **Highlighted Publications**

- 1. "Prediction-Constrained POMDPs." Joseph Futoma, Michael C. Hughes, and Finale Doshi-Velez. Reinforcement Learning under Partial Observability (RLPO) workshop at NeurIPS 2018, 2019.
- "Semi-Supervised Prediction-Constrained Topic Models." Michael C. Hughes, Gabriel Hope<sup>d</sup>, Leah Weiner<sup>d</sup>, Thomas H. McCoy Jr, Roy H. Perlis, Erik B. Sudderth, and Finale Doshi-Velez. Artificial Intelligence and Statistics (AISTATS), 2018.
- "Beyond Sparsity: Tree Regularization of Deep Models for Interpretability." Mike Wu<sup>u</sup>, Michael C. Hughes, Sonali Parbhoo, Maurizio Zazzi, Volker Roth, and Finale Doshi-Velez. Association for Advancement of Artificial Intelligence (AAAI), 2018.
- 4. "From Patches to Images: A Nonparametric Generative Model." Geng Ji<sup>d</sup>, Michael C. Hughes, and Erik B. Sudderth. International Conference on Machine Learning (ICML), 2017.
- "Predicting Intervention Onset in the ICU with Switching State Space Models." Marzyeh Ghassemi, Mike Wu<sup>u</sup>, Michael C. Hughes, Peter Szolovits, and Finale Doshi-Velez. AMIA Summit on Clinical Research Informatics, 2017.

Superscripts indicate mentored student's role: u = undergraduate, m = masters, d = doctoral. Complete publication list at end of this document.

## **Highlighted Preprints**

- "Prediction-Constrained Training for Semi-Supervised Mixture and Topic Models." Michael C. Hughes, Leah Weiner<sup>d</sup>, Gabriel Hope<sup>d</sup>, Thomas H. McCoy, Roy H. Perlis, Erik B. Sudderth, and Finale Doshi-Velez. arXiv e-print, 2017.
- 2. "Fast Learning of Clusters and Topics via Sparse Posteriors." Michael C. Hughes and Erik B. Sudderth. arXiv e-print, 2016.
- 3. "BNPy: Reliable and scalable variational inference for Bayesian nonparametric models." Michael C. Hughes and Erik B. Sudderth. 3rd NIPS Workshop on Probabilistic Programming, 2014.

#### **Honors and Awards**

Top 200 Reviewer Award, NeurIPS 2018

2018

 Recognized as one of top 200 of more than 3500 expert reviewers at the top international machine learning conference.

Best Paper Award, SoCal NLP Symposium 2018

2018

o Awarded for 2 page summary of our AISTATS 2018 paper.

Nominee for AMIA Clinical Informatics Research Award

2017

o 1 of 7 papers nominated at AMIA's 2017 Joint Summits on Translational Science, out of >50 papers.

#### NSF Graduate Research Fellowship Award

2011

o Three year award to fund Ph.D. studies. Covers tuition and provides research stipend.

#### NDSEG Graduate Research Fellowship Award

2011

• Three year funding award. Declined to accept NSF fellowship.

#### **Professional Service**

Invited Tutorial

2018

- o Machine Learning for Clinicians: Advances for Multi-Modal Health Data at MLHC '18
- Designed to help clinicians understand enough modern machine learning to collaborate successfully with ML researchers.

#### Workshop Organizer

2018

- o Machine Learning for Health workshop at NeurIPS '18 (NeurIPS ML4H 2018)
- o Full-day workshop with invited keynotes and accepted papers involving clinicians, statisticians, and computer scientists
- o Helped with website, PR, and continuity in peer-review process from previous years.

#### Workshop Organizer

2017

- o Machine Learning for Health workshop at NIPS '17 (NIPS ML4H 2017)
- o Full-day workshop with invited keynotes and panels involving clinicians, statisticians, and computer scientists.
- o Organized peer-review process for 118 submitted papers.

#### Workshop Organizer

2016

- o Practical Bayesian Nonparametrics workshop at NIPS '16.
- o Full-day workshop with invited speakers, contributed talks, two panel discussions, and lively poster session.
- $\circ$  Led decisions on >25 submitted papers based on peer review.

#### Invited Panelist

2016

Software panel at Advances in Approximate Bayesian Inference workshop at NIPS '16.

#### Program Committee / Reviewer

- o 2019 NIPS, AISTATS, ICLR
- o 2018 NIPS (reviewer award), AAAI, AISTATS, ICLR, AMIA CRI
- o 2017 NIPS, ICML, AAAI
- o 2016 NIPS
- o 2015 NIPS, ICML
- o 2014 NIPS, ICML
- o 2013 NIPS (reviewer award)

## **Teaching and Mentorship**

#### Tufts CS Dept.

Course: COMP 135 Introduction to Machine Learning

Spring 2019

- o Taught core principles of machine learning to about 50 students
- o Course format: 3 open-ended projects, weekly homeworks, and 2 exams

#### Tufts CS Dept.

Course: COMP 150 Bayesian Deep Learning

Fall 2018

- o Taught advanced topics seminar to about 18 students
- o Course format: weekly homeworks for first month, then 2-month open-ended team project

#### Harvard University SEAS

Research Mentor 2016-2017

- o Mentored undergraduate senior thesis projects on Bayesian nonparametric inference.
- o Frederick Widjaja. 2017 honors thesis: Streaming Variational Inference for the Indian Buffet Process.
- o Madhu Vijay. 2017 honors thesis: Characterizing Posterior Uncertainty for the Indian Buffet Process.

#### **Brown University**

Research Mentor 2014-2016

- o Mentored students on projects related to Bayesian nonparametric clustering and the BNPy Python package.
- o William Stephenson. 2015 undergraduate honors thesis: Variational Inference for Hierarchical Dirichlet Process based Nonparametric Models.
- o Sonia Phene. 2015 undergraduate honors thesis: Multiprocessor Parallelization of Variational Inference for Bayesian Nonparametric Topic Models.
- o Mengrui Ni. 2015 masters project: Variational Inference for Beta-Bernoulli Dirichlet Process Mixture Models.
- o Mert Terzihan. 2015 masters project.

#### Lead Graduate TA for CS 142: Intro to Machine Learning

Fall 2013

- o Led weekly 1 hour recitation session to review key concepts for 50+ students.
- o Designed homework assignments and exam questions.

## **Outreach Experience**

#### **TEALS** and Boston Latin Academy

Roxbury, MA

Volunteer AP Computer Science Instructor

2014-2016

- o Taught 1-2 classes / week for 2 years via TEALS "CS in every high school" initiative sponsored by Microsoft.
- Developed hands-on lessons to excite students from diverse backgrounds about computational thinking.
- o Mentored full-time teacher Ingrid Roche as she transitioned from media arts to AP computer science (Java).

#### Harvard Humanitarian Initiative

Cambridge, MA

Signal Program Fellow

2014

- o Developed prototype detector for common housing structures in sub-Saharan Africa from satellite images.
- o Intended for humanitarian oversight of conflict areas where burning structures is common attack pattern.
- o Featured in TEDx talk: https://youtu.be/u719rBw0nwU

#### **Olin College Engineering Discovery**

Needham, MA

Co-Founder and Curriculum Director

2007-2010

- o Managed 15 undergrads in developing hands-on lessons for 4th-8th graders.
- Hosted workshops for 30 children to design, build, and launch bottle rockets.
- Pioneered green energy workshop which earned over \$750 in outside funding.

## **Industry Experience**

Google Mountain View, CA

Software Engineering Intern

Summer 2013

- o Improved walking/biking/running classifier using smartphone accelerometer data.
- o Led collection of dataset from dozens of individuals for classifier evaluation via custom Android app.

# All Conference Publications (in reverse chronological order, most recent first)

- "Semi-Supervised Prediction-Constrained Topic Models." Michael C. Hughes, Gabriel Hope<sup>d</sup>, Leah Weiner<sup>d</sup>, Thomas H. McCoy Jr, Roy H. Perlis, Erik B. Sudderth, and Finale Doshi-Velez. Artificial Intelligence and Statistics (AISTATS), 2018.
- "Beyond Sparsity: Tree Regularization of Deep Models for Interpretability." Mike Wu<sup>u</sup>, Michael C. Hughes, Sonali Parbhoo, Maurizio Zazzi, Volker Roth, and Finale Doshi-Velez. Association for Advancement of Artificial Intelligence (AAAI), 2018.
- 3. "From Patches to Images: A Nonparametric Generative Model." Geng Ji<sup>d</sup>, Michael C. Hughes, and Erik B. Sudderth. International Conference on Machine Learning (ICML), 2017.
- 4. "Right for the Right Reasons: Training Differentiable Models by Constraining their Explanations." Andrew Slavin Ross<sup>m</sup>, Michael C. Hughes, and Finale Doshi-Velez. International Joint Conference on Artificial Intelligence (ICJAI), 2017.
- "Predicting Intervention Onset in the ICU with Switching State Space Models." Marzyeh Ghassemi, Mike Wu<sup>u</sup>, Michael C. Hughes, Peter Szolovits, and Finale Doshi-Velez. AMIA Summit on Clinical Research Informatics, 2017.
- "Scalable Adaptation of State Complexity for Nonparametric Hidden Markov Models." Michael C. Hughes, William Stephenson<sup>u</sup>, and Erik B. Sudderth. Neural Information Processing Systems (NIPS), 2015.
- 7. "Reliable and Scalable Variational Inference for the Hierarchical Dirichlet Process." Michael C. Hughes, Dae II Kim, and Erik B. Sudderth. Artificial Intelligence & Statistics (AISTATS), 2015.
- 8. "Memoized Online Variational Inference for Dirichlet Process Mixture Models." Michael C. Hughes and Erik B. Sudderth. Neural Information Processing Systems (NIPS), 2013.
- 9. "Effective Split-Merge Monte Carlo Methods for Nonparametric Models of Sequential Data." Michael C. Hughes, Emily Fox, and Erik B. Sudderth. Neural Information Processing Systems (NIPS), 2012.
- 10. "The Nonparametric Metadata Dependent Relational Model." Dae II Kim, Michael C. Hughes, and Erik B. Sudderth. International Conference on Machine Learning (ICML), 2012.

## All Journal Publications (in reverse chronological order)

- "Refinery: An Open Source Topic Modeling Web Platform." Daeil Kim, Benjamin F. Swanson, Michael C. Hughes, and Erik B. Sudderth. JMLR Machine Learning Open Source Software (MLOSS), 2017.
- "Joint Modeling of Multiple Time Series via the Beta Process with Application to Motion Capture Segmentation." Emily Fox, Michael C. Hughes, Erik B. Sudderth, and Michael I. Jordan. Annals of Applied Statistics, Vol. 8(3), 2014.

## All Workshop Papers (in reverse chronological order)

- 1. "Prediction-Constrained POMDPs." Joseph Futoma, Michael C. Hughes, and Finale Doshi-Velez. Reinforcement Learning under Partial Observability (RLPO) workshop at NeurIPS 2018, 2019.
- "Rethinking clinical prediction: Why machine learning must consider year of care and feature aggregation." Bret Nestor, Matthew B. A. McDermott, Geeticka Chauhan, Tristan Naumann, Michael C. Hughes, Anna Goldenberg, Marzyeh Ghassemi. Machine Learning for Healthcare (ML4H) workshop at NeurIPS 2018, 2019.
- 3. "Prediction-Constrained Topic Models for Antidepressant Prediction." Michael C. Hughes, Gabriel Hope<sup>d</sup>, Leah Weiner<sup>d</sup>, Thomas H. McCoy, Roy H. Perlis, Erik B. Sudderth, and Finale Doshi-Velez. NIPS Workshop on Machine Learning for Health (NIPS ML4H), 2017.
- "Associations between aboveground forest biomass and waveform LiDAR metrics: implications for modeling footprint-level biomass using Global Ecosystem Dynamics Investigation data." J. Kellner, J. B. Blair, L. Duncanson, L., S. Hancock, M. A. Hofton, M. C. Hughes, S. Marselis, S., J. Armston, E. B. Sudderth, H. Tang, L. Weiner<sup>d</sup>, and R. Dubayah. American Geophysical Union, Fall General Assembly, 2016.
- 5. "Supervised topic models for clinical interpretability." Michael C. Hughes, Huseyin Melih Elibol, Thomas McCoy, Roy Perlis, and Finale Doshi-Velez. NIPS Workshop on Machine Learning for Health (NIPS ML4H), 2016.
- 6. "Nonparametric Discovery of Activity Patterns from Video Collections." Michael C. Hughes and Erik B. Sudderth. CVPR Workshop on Perceptual Organization in Computer Vision (POCV), 2012.