## Bryan Hooi

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#### EDUCATION

Carnegie Mellon University (2014 - present) • Ph.D. in Machine Learning

GPA: 4.00/4.00

Stanford University (2010 - 2014) • B.S. (Honors) in Mathematics with Distinction, M.S. in Computer

Science

Undergraduate GPA: 3.91/4.30 • Masters GPA: 4.20/4.30

## RESEARCH INTERESTS

• Scalable Machine Learning, Graph Mining, Anomaly Detection, Temporal Data

#### Honors and Awards

- 1. ECML-PKDD 2018 Runner-Up Best Student Data Mining Paper Award
- 2. CIKM 2017 Outstanding Reviewer Award
- 3. KDD 2016 Best Paper Award (Research Track) + CogX 2017 Best Student Paper in AI (for the same paper)
- 4. Undergraduate Research Award 2014, Stanford University (given for the top 2-3 honors theses in the mathematics department)
- 5. William Lowell Putnam Mathematical Competition 2012 (Top 120). Awarded the Two Sigma award for excellence in mathematics problem solving.
- 6. ACM-ICPC Programming Contest (Pacific-NW Regional): 2010 (4th) and 2011 (5th)
- 7. International Mathematical Olympiads 2006 and 2007 (Bronze medals)

## Refereed Conference Publications

- Bin Zhou, Shenghua Liu, <u>Bryan Hooi</u>, Xueqi Cheng, and Jing Ye. "BeatGAN: Anomalous Rhythm Detection using Adversarially Generated Time Series," International Joint Conference on Artificial Intellince (IJCAI) 2019.
- 2. Minji Yoon, <u>Bryan Hooi</u>, Kijung Shin and Christos Faloutsos. "Fast and Accurate Anomaly Detection in Dynamic Graphs with a Two-Pronged Approach," ACM SIGKDD Conference on Knowledge Discovery and Data Mining (KDD) 2019.
- 3. Marko Jereminov, <u>Bryan Hooi</u>, Amritanshu Pandey, Hyun Ah Song, Christos Faloutsos, and Larry Pileggi. "Impact of Load Models on Power Flow Optimization," IEEE Power & Energy Society General Meeting (PES) 2019.
- 4. <u>Bryan Hooi</u>, Kijung Shin, Shenghua Liu, and Christos Faloutsos. "SMF: Drift Aware Matrix Factorization with Seasonal Patterns," SIAM International Conference in Data Mining (SDM) 2019.
- Bryan Hooi and Christos Faloutsos. "Branch and Border: Partition-Based Change Detection in Multivariate Time Series," SIAM International Conference in Data Mining (SDM) 2019.
- Wenjie Feng, Shenghua Liu, Christos Faloutsos, <u>Bryan Hooi</u>, Huawei Shen, Xueqi Cheng.
  "Anomaly Detection in Large Graphs based on Vision-guided Summarization," Pacific-Asia Conference in Knowledge Discovery and Data Mining (PAKDD) 2019.
- Bryan Hooi, Dhivya Eswaran, Amritanshu Pandey, Marko Jereminov, Larry Pileggi, and Christos Faloutsos. "ChangeDAR: Online Localized Change Detection for Sensor Data on a Graph." ACM International Conference on Information and Knowledge Management (CIKM) 2018.
- 8. <u>Bryan Hooi</u>, Dhivya Eswaran, Hyun Ah Song, Amritanshu Pandey, Marko Jereminov, Larry Pileggi, and Christos Faloutsos. "GridWatch: Sensor Placement and Anomaly Detection in the Electrical Grid." European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in Databases (ECML-PKDD) 2018. **Runner-Up Best Student Data Mining Paper Award.**
- 9. Kijung Shin, Jisu Kim, <u>Bryan Hooi</u>, and Christos Faloutsos. "Think before You Discard: Accurate Triangle Counting in Graph Streams with Deletions." European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in Databases (ECML-PKDD) 2018.

- Aastha Nigam, Kijung Shin, Ashwin Bahulkar, <u>Bryan Hooi</u>, David Hachen, Boleslaw K. Szymanski, Christos Faloutsos, Nitesh V. Chawla. "ONE-M: Modeling the Co-evolution of Opinions and Network Connections." European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in Databases (ECML-PKDD) 2018.
- Pudi Chen, Shenghua Liu, Chuan Shi, <u>Bryan Hooi</u>, Bai Wang, Xueqi Cheng. "NeuCast: Seasonal Neural Forecast of Power Grid Time Series." International Joint Conference on Artificial Intelligence (IJCAI) 2018.
- 12. <u>Bryan Hooi</u>, Hyun Ah Song, Amritanshu Pandey, Marko Jereminov, Larry Pileggi, and Christos Faloutsos. "StreamCast: Fast and Online Mining of Power Grid Time Sequences." SIAM International Conference on Data Mining (SDM) 2018.
- Srijan Kumar, <u>Bryan Hooi</u>, Disha Makhija, Mohit Kumar, Christos Faloutsos, and V.S. Subrahmanian. "REV2: Fraudulent User Prediction in Rating Platforms." ACM International Conference on Web Search and Data Mining (WSDM) 2018.
- Pedro Costa, Aurlio Campilho, <u>Bryan Hooi</u>, Asim Smailagic, Kris Kitani, Shenghua Liu, Christos Faloutsos and Adrian Galdran. EyeQual: Accurate, Explainable, Retinal Image Quality Assessment." 16th IEEE International Conference On Machine Learning and Applications 2017.
- 15. Shenghua Liu, <u>Bryan Hooi</u>, Christos Faloutsos. "HoloScope: Topology-and-Spike Aware Fraud Detection." ACM International Conference on Information and Knowledge Management (CIKM) 2017.
- 16. Hemank Lamba, <u>Bryan Hooi</u>, Kijung Shin, Christos Faloutsos, and Jurgen Pfeffer. "ZOORANK: Ranking Suspicious Entities in Time-Evolving Tensors." European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in Databases (ECML-PKDD) 2017.
- 17. <u>Bryan Hooi</u>, Shenghua Liu, Asim Smailagic, and Christos Faloutsos. "BEATLEX: Summarizing and Forecasting Time Series with Patterns." European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in Databases (ECML-PKDD) 2017.
- 18. Hyun Ah Song, <u>Bryan Hooi</u>, Marko Jereminov, Amritanshu Pandey, Larry Pileggi, and Christos Faloutsos. "PowerCast: Mining and Forecasting Power Grid Sequences." European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in Databases (ECML-PKDD) 2017.
- Chi Ling Chan, Justin Lai, <u>Bryan Hooi</u> and Todd Davies. "The Message or the Messenger? Inferring Virality and Diffusion Structure from Online Petition Signature Data." Social Informatics (SocInfo) 2017.
- Marko Jereminov, Amritanshu Pandey, Hyun Ah Song, <u>Bryan Hooi</u>, Larry Pileggi, and Christos Faloutsos. "Linear Load Model for Robust Power System Analysis." IEEE International Conference on Innovative Smart Grid Technologies (ISGT) 2017.
- 21. Kijung Shin, <u>Bryan Hooi</u>, Jisu Kim, and Christos Faloutsos. "DenseAlert: Incremental Dense-Subtensor Detection in Tensor Streams." KDD 2017.
- 22. Tsubasa Takahashi, <u>Bryan Hooi</u>, and Christos Faloutsos. "AutoCyclone: Automatic Mining of Cyclic Patterns and Anomalies by Robust Tensor Factorization". World Wide Web (WWW) Conference 2017.
- 23. Kijung Shin, <u>Bryan Hooi</u>, Jisu Kim, and Christos Faloutsos. "D-Cube: Dense-Block Detection in Terabyte-Scale Tensors," ACM International Conference on Web Search and Data Mining (WSDM) 2017.
- Kijung Shin, <u>Bryan Hooi</u>, and Christos Faloutsos. "M-Zoom: Fast Dense-Block Detection in Tensors with Quality Guarantees," European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in Databases (ECML-PKDD) 2016.
- 25. Bryan Hooi, Hyun Ah Song, Alex Beutel, Neil Shah, Kijung Shin, and Christos Faloutsos. FRAUDAR: Bounding Graph Fraud in the Face of Camouflage. KDD 2016. KDD Best Paper Award (Research Track), and CogX 2017 Best Student Paper in AI.
- Bryan Hooi, Neil Shah, Alex Beutel, Stephan Gunnemann, Leman Akoglu, Mohit Kumar, Disha Makhija, and Christos Faloutsos. "BIRDNEST: Bayesian Inference for Ratings-Fraud Detection," SIAM International Conference on Data Mining (SDM) 2016,
- Bryan Hooi, Hyun Ah Song, Evangelos Papalexakis, Rakesh Agrawal, and Christos Faloutsos.
  "Matrices, Compression, Learning Curves: formulation, and the GROUPNTEACH algorithms," Pacific-Asia Conference on Knowledge Discovery and Data Mining (PAKDD) 2016.

 Meng Jiang, Alex Beutel, Peng Cui, <u>Bryan Hooi</u>, Shiqiang Yang, and Christos Faloutsos. "A General Suspiciousness Metric for Dense Blocks in Multimodal Data". IEEE International Conference on Data Mining (ICDM) 2015.

#### Refereed Journal Publications

- 1. Shenghua Liu, <u>Bryan Hooi</u>, and Christos Faloutsos. "A Contrast Metric for Fraud Detection in Rich Graphs." Transactions on Knowledge and Data Engineering (TKDE), 2018.
- Kijung Shin, <u>Bryan Hooi</u>, and Christos Faloutsos. "Fast, Accurate and Flexible Algorithms for Dense Subtensor Mining." ACM Transactions on Knowledge Discovery from Data (TKDD) 2018.
- Bryan Hooi, Kijung Shin, Hyun Ah Song, Alex Beutel, Neil Shah, and Christos Faloutsos.
  "Graph-Based Fraud Detection in the Face of Camouflage". ACM Transactions on Knowledge Discovery from Data (TKDD), 2017.
- 4. Meng Jiang, Alex Beutel, Peng Cui, <u>Bryan Hooi</u>, Shiqiang Yang, and Christos Faloutsos. "Spotting Suspicious Behaviors in Multimodal Data: A General Metric and Algorithms," IEEE Transactions on Knowledge and Data Engineering (TKDE) 2016.
- Evangelos E. Papalexakis, <u>Bryan Hooi</u>, Konstantinos Pelechrinis, and Christos Faloutsos.
  "Power-Hop: A Pervasive Observation for Real Complex Networks," PLoS ONE 11(3) 2016.

### Refereed Workshop Publications

- 1. Wenjie Feng, Shenghua Liu, Christos Faloutsos, <u>Bryan Hooi</u>, Huawei Shen and Xueqi Cheng. "EagleMine: Vision-Guided Mining in Large Graphs." KDD Outlier Detection De-constructed (ODD) Workshop 2018.
- 2. Shenghua Liu, <u>Bryan Hooi</u>, and Christos Faloutsos. "Fraud Detection using Graph Topology and Temporal Spikes." KDD Mining and Learning with Graphs (MLG) Workshop 2017.
- 3. Neil Shah, Alex Beutel, <u>Bryan Hooi</u>, Leman Akoglu, Stephan Gunnemann, Disha Makhija, Mohit Kumar, and Christos Faloutsos. "EdgeCentric: Anomaly Detection in Edge-Attributed Networks." IEEE International Conference on Data Mining (ICDM) Workshop on Data Mining for Cyber Security 2016.
- 4. <u>Bryan Hooi</u>, Hyun Ah Song, Evangelos Papalexakis, Rakesh Agrawal and Christos Faloutsos. "Education, Learning and Information Theory," IEEE ICDM Workshop on Data Mining for Educational Assessment and Feedback, 2015.

## Conference Submissions Under Review

- 1. <u>Bryan Hooi</u>, Kijung Shin, Hemank Lamba, and Christos Faloutsos. "TellTail: a Principled Scoring Function for Dense Subgraphs," ACM SIGKDD Conference on Knowledge Discovery and Data Mining (KDD), 2019 (under review).
- Xiangfeng Li, Shenghua Liu, Zifeng Li, Xiaotian Han, Chuan Shi, <u>Bryan Hooi</u>, He Huang and Xueqi Cheng. "FlowScope: Spotting Money Laundering in Big Graphs," ACM SIGKDD Conference on Knowledge Discovery and Data Mining (KDD), 2019 (under review).

## EMPLOYMENT AND ACTIVITIES

## Stanford University Department of Statistics (2013) Honors Thesis Project

- Used Bayesian inference to infer disease contact networks from genetic and epidemiological data, with up to 8% higher accuracy than previous work.
- Fitted the algorithm on data from the H1N1 pandemic and used the results to estimate the basic reproductive number of the disease.

## Google (2013)

## $Software\ Engineering\ Intern$

• Conducted data analysis projects and experiments: 1) improving the click prediction model using additional features; 2) analyzing the effect of user information for ad selection through experiments; 3) conducting a randomized experiment to quantify the effect of ads on user behavior.

## Stanford University Statistics Department (2012)Summer Research Project

- Constructed statistical models to analyze the structure of human commensal microorganism communities.
- Wrote R software for applying the Latent Dirichlet Allocation and Hierarchical Latent Dirichlet Allocation models to visualize hierarchical relationships in microbiome datasets.

#### National Univesity of Singapore (2008-2010)

## Trainer for Singapore International Mathematical Olympiad Team

 Trained a group of 20 students for the International Mathematical Olympiad. Planned syllabus, developed instructional materials, conducted lectures and problem-solving sessions, conducted training camp, and graded quizzes and competitions.

## PPH Community Services Center (2006-2010)

#### Volunteer Tutor

• Tutored underprivileged students in english, math and science twice a week. Organized lesson plans and delivered lessons both classroom style and one-to-one.

#### SERVICE

### Program Committee Member

- ACM International Conference on Information and Knowledge Management (CIKM) 2017
- International Conference on Advanced Data Mining and Applications (ADMA) 2017

#### Reviewer

- IEEE Access 2018, 2019
- IEEE Transactions on Pattern Analysis and Machine Intelligence (TPAMI) 2018, 2019
- ACM Transactions on Knowledge Discovery from Data (TKDD) 2019
- IEEE Transactions on Knowledge and Data Engineering (TKDE) 2019
- Applied Network Science 2019
- International Journal of Information Technology and Decision Making (IJITDM) 2019
- Data Mining and Knowledge Discovery (DMKD) 2019
- ACM Computing Surveys 2019

#### Organizer

• CMU Data Mining Seminar, 2017 - present

# Teaching

### Stanford University: Teaching Assistant

• CS261: Optimization and Algorithmic Paradigms (Winter 2013)

## Carnegie Mellon University: Teaching Assistant

- 36-350: Statistical Computing (Fall 2014, Fall 2015)
- 36-662: Data Mining (Spring 2015, Spring 2017)
- 36-201: Statistical Reasoning (Summer 2015)
- 10-702: Statistical Machine Learning (Spring 2016)
- 36-721: Hidden Markov Models (Fall 2016)
- 36-780: Deep Learning (Fall 2016)

# STUDENT MENTORING / ADVISING

- Ms. Minji Yoon, CMU PhD student
- Mr. Shubhranshu Shekhar, CMU PhD student
- Ms. Cindy Li, ECE PhD student

- Contributed to NSF proposal: Group Mining of Cardiovascular-Disease Sensor Data (submitted Nov 2017; with Asim Smailagic, Christos Faloutsos)
- Contributed to NSF proposal: Collaborative Research: "What's happening?" Summarization for Human-Driven Exploration of Massive Time Series Data (submitted Oct 2018; with Alexandros Labrinidis, Walter Lasecki, Danai Koutra, Christos Faloutsos)
- Contributed to Flipkart \$25K faculty grant (with Neil Shah, Dhivya Eswaran, Christos Faloutsos)

#### Talks

- Anomaly Detection in Graphs and Sensor Data. National University of Singapore, 2019.
- Anomaly Detection in Graphs and Sensor Data. Nanyang Technological University, 2019.
- Anomaly Detection in Graphs and Sensor Data. SIS Research Seminar, Singapore Management University, 2019.
- ChangeDAR: Online Localized Change Detection for Sensor Data on a Graph. CIKM 2018.
- Change DAR: Online Localized Change Detection for Sensor Data on a Graph. CMU Data Mining Seminar, 2018.
- GridWatch: Sensor Placement and Anomaly Detection in the Electrical Grid. ECML-PKDD 2018.
- ONE-M: Modeling the Co-evolution of Opinions and Network Connections. ECML-PKDD 2018.
- StreamCast: Fast and Online Mining of Power Grid Time Sequences. SDM 2018.
- ETS Models and StreamCast: Fast and Online Mining of Power Grid Time Sequences. CMU Databases Group Seminar, 2018.
- BEATLEX: Summarizing and Forecasting Time Series with Patterns. ECML-PKDD 2018.
- FRAUDAR: Bounding Graph Fraud in the Face of Camouflage. CMU AI Lunch, 2016.
- FRAUDAR: Bounding Graph Fraud in the Face of Camouflage. KDD 2016.
- BIRDNEST: Bayesian Inference for Ratings-Fraud Detection. SDM 2016.
- Matrices, Compression, Learning Curves: formulation, and the GROUPNTEACH algorithms. PAKDD 2016.
- Education, Learning and Information Theory. ICDM Workshop on Data Mining for Educational Assessment and Feedback 2015.

## Mailing Address

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