

# Lei Li

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## RESEARCH INTERESTS

machine learning, natural language understanding and generation.

## EDUCATION

**Carnegie Mellon University**, Pittsburgh, Pennsylvania USA

Ph.D., Computer Science Department, Sep. 2011

Dissertation: Fast algorithms for mining co-evolving time series. (recipient of ACM SIGKDD best dissertation award(runner-up))

M.S. in Science, May. 2009.

Advisor: Christos Faloutsos

**Shanghai Jiao Tong University**, China

B.S., Computer Science (ACM class), Sep, 2002 - Jun, 2006

Thesis: Semantic Search based on Probabilistic Description Logic Program.

Advisor: Yong Yu

## EMPLOYMENT

**ByteDance AI Lab**

ByteDance

Research Scientist and Director

**since 2016**

machine writing, machine translation, (near-dup) video search, creative ads, ML for user growth

We develop a robot writer: Xiaomingbot, which integrates machine learning, NLP, data mining to automatically create human-quality news articles in multiple domains and languages. It is covered by many media reports.

**Baidu USA**

Sunnyvale, CA

Principal Research Scientist

**Oct, 2014 - 2016**

Institute of Deep Learning, Baidu Research

focus on deep learning and natural language understanding

**University of California, Berkeley**

Postdoctoral Researcher in EECS department

**Oct, 2011 - Oct, 2014**

working with Stuart Russell

Bayesian inference for open universe probability models. Compiler for probabilistic programs.

**Carnegie Mellon University**

Visiting Researcher in Machine Learning Department

**Oct, 2012 - Aug, 2013**

working with Eric Xing

**IBM T.J. Watson Research Center**, Hawthorne, New York USA

Intern at Healthcare Transformation group.

**May, 2010 - Aug, 2010**

**Microsoft Research**, Redmond, Washington USA

Intern at Networked Embedded Computing group.

**Jun, 2009 - Aug, 2009**

**Google**, Mountain View, California USA

Intern at Adspam group.

**May, 2008 - Aug, 2008**

**APEX Data & Knowledge Management Lab**, Shanghai, China

Research Assistant, on *semantic search* and *semantic web*

**Jul, 2004 - Jun, 2006**

**Microsoft Research Asia**, Beijing, China

Intern, on *semantic file system* project.

**Aug, 2005 - Oct, 2005**

Three patents granted: Patent No. US7,502,785, US 7,634,471 and US 7,624,130

## PUBLICATIONS

### JOURNAL PAPERS

- [J1] Yasuko Matsubara, Yasushi Sakurai, B. Aditya Prakash, **Lei Li**, and Christos Faloutsos. Non-linear dynamics of information diffusion in social networks. *ACM Transactions on the Web*, 11(1), February 2017.
- [J2] **Lei Li**, Bin Fu, and Christos Faloutsos. Efficient parallel learning of hidden markov chain models on smps. *IEICE Transactions on Information and Systems*, E93.D(6):1330–1342, 2010.
- [J3] **Lei Li**, B. Aditya Prakash, and Christos Faloutsos. Parsimonious linear fingerprinting for time series. *The Proceedings of the Very Large Data Bases Endowment (VLDB)*, 3:385–396, September 2010.
- [J4] Fan Guo, **Lei Li**, Christos Faloutsos, and Eric P. Xing. C-dem: a multi-modal query system for drosophila embryo databases. *The Proceedings of the Very Large Data Bases Endowment (VLDB)*, 1:1508–1511, August 2008.

### CONFERENCE PAPERS

- [C1] Ning Miao, Hao Zhou, Chengqi Zhao, and **Lei Li**. Kernelized bayesian softman for text generation. In *Neural Information Processing Systems (NeurIPS)*, December 2019.
- [C2] Mingxuan Wang, Jun Xie, Zhixing Tan, Jinsong Su, Deyi Xiong, and **Lei Li**. Towards linear time neural machine translation with capsule networks. In *EMNLP*, November 2019.
- [C3] Zhichen Zhao, **Lei Li**, Bowen Zhang, Yuning Jiang, Li Xu, Meng Wang, and Weiying Ma. What you look matters: Offline evaluation of advertising creatives for cold start problem. In *The 28th ACM International Conference on Information and Knowledge Management (CIKM)*, November 2019.
- [C4] Yao Fu, Hao Zhou, Jiaze Chen, and **Lei Li**. Rethinking text attribute transfer: A lexical analysis. In *12th International Conference on Natural Language Generation (INLG)*, October 2019.
- [C5] Qing-Yuan Jiang, Yi He, Gen Li, Jian Lin, **Lei Li**, and Wu-Jun Li. SVD: A large-scale short video dataset for near duplicate video retrieval. In *International Conference on Computer Vision (ICCV)*, October 2019.
- [C6] Xin Wang, Jiawei Wu, Junkun Chen, **Lei Li**, Yuan-Fang Wang, and William Yang Wang. VATEX: A large-scale, high-quality multilingual dataset for video-and-language research. In *International Conference on Computer Vision (ICCV)*, October 2019. Oral Presentation.
- [C7] Rongxiang Wen, Hao Zhou, Shujian Huang, Yifan Xia, **Lei Li**, and Jiajun Chen. Correct-and-memorize: Learning to translate from interactive revisions. In *IJCAI*, August 2019. Oral Presentation.
- [C8] Yunfei Lu, Linyun Yu, Peng Cui, Chengxi Zang, Renzhe Xu, Yihao Liu, **Lei Li**, and Wenwu Zhu. Uncovering the co-driven mechanism of social and content links in user churn phenomena. In *the 25th SIGKDD Conference on Knowledge Discovery and Data Mining (KDD)*, New York, NY, USA, August 2019. ACM.
- [C9] Yu Bao, Hao Zhou, Shujian Huang, **Lei Li**, Lili Mou, Olga Vechtomova, Xinyu Dai, and Jiajun Chen. Generating sentences from disentangled syntactic and semantic spaces. In *the 57th Annual Meeting of the Association for Computational Linguistics (ACL)*, July 2019.
- [C10] Lin Qiu, Yunxuan Xiao, Yanru Qu, Hao Zhou, **Lei Li**, Weinan Zhang, and Yong Yu. Dynamically fused graph network for multi-hop reasoning. In *the 57th Annual Meeting of the Association for Computational Linguistics (ACL)*, July 2019.

- [C11] Huangzhao Zhang, Ning Miao, Hao Zhou, and **Lei Li**. Generating fluent adversarial examples for natural languages. In *the 57th Annual Meeting of the Association for Computational Linguistics (ACL) - short papers*, July 2019.
- [C12] Hao Wu, Jiayuan Mao, Yufeng Zhang, Weiwei Sun, Yuning Jiang, **Lei Li**, and Wei-Ying Ma. Unified visual-semantic embeddings: Bridging vision and language with structured meaning representations. In *CVPR*, June 2019. Oral Presentation.
- [C13] Ning Miao, Hao Zhou, Lili Mou, Rui Yan, and **Lei Li**. CGMH: constrained sentence generation by metropolis-hastings sampling. In *AAAI*, January 2019.
- [C14] Wei Cao, Dong Wang, Jian Li, Hao Zhou, Yitan Li, and **Lei Li**. BRITS: Bidirectional recurrent imputation for time series. In *Neural Information Processing Systems (NeurIPS)*, December 2018.
- [C15] Haoyue Shi, Hao Zhou, Jiaze Chen, and **Lei Li**. On tree-based neural sentence modeling. In *Conference on Empirical Methods in Natural Language Processing (EMNLP)*, October 2018.
- [C16] Gen Li, Shikun Xu, Xiang Liu, **Lei Li**, and Changhu Wang. Jersey number recognition with semi-supervised spatial transformer network. In *IEEE Conference on Computer Vision and Pattern Recognition workshops, Computer Vision in Sports*, pages 1864–1871, June 2018.
- [C17] Jiawei Wu, **Lei Li**, and William Yang Wang. Reinforced co-training. In *Proceedings of the 2018 Conference of the North American Chapter of the Association for Computational Linguistics: Human Language Technologies (NAACL-HLT)*, pages 1252–1262, . Association for Computational Linguistics, June 2018.
- [C18] Yusuf B. Erol, Yi Wu, **Lei Li**, and Stuart Russell. A nearly-black-box online algorithm for joint parameter and state estimation in temporal models. In *The Thirty-First AAAI Conference on Artificial Intelligence*, July 2017.
- [C19] Yi Wu, **Lei Li**, Stuart J. Russell, and Rastislav Bodik. Swift: Compiled inference for probabilistic programming languages. In *25th International Joint Conference on Artificial Intelligence (IJCAI)*, July 2016.
- [C20] Zihang Dai, **Lei Li**, and Wei Xu. Cfo: Conditional focused neural question answering with large-scale knowledge bases. In *ACL*, July 2016.
- [C21] Zefu Lu, **Lei Li**, and Wei Xu. Twisted recurrent network for named entity recognition. In *Bay Area Machine Learning Symposium*, 2015.
- [C22] Hieu Pham, Zihang Dai, and **Lei Li**. On optimization algorithms for recurrent networks with long short-term memory. In *Bay Area Machine Learning Symposium*, 2015.
- [C23] Yi Wu, **Lei Li**, and Stuart J. Russell. Bfit: From possible-world semantics to random-evaluation semantics in open universe. In *Neural Information Processing Systems, Probabilistic Programming workshop*, 2014.
- [C24] Simon Shaolei Du, Yilin Liu, Boyi Chen, and **Lei Li**. Maxios: Large scale nonnegative matrix factorization for collaborative filtering. In *Neural Information Processing Systems, workshop on Distributed Machine Learning and Matrix Computations*, 2014.
- [C25] Da-Cheng Juan, **Lei Li**, Huan-Kai Peng, Diana Marculescu, and Christos Faloutsos. Beyond poisson: Modeling inter-arrival times of requests in a datacenter. In *The Pacific-Asia Conference on Knowledge Discovery and Data Mining (PAKDD)*, 2014.
- [C26] **Lei Li**, Bharath Ramsundar, and Stuart Russell. Dynamic scaled sampling for deterministic constraints. In *16th International Conference on Artificial Intelligence and Statistics*, 2013.
- [C27] Sharad Vikram, **Lei Li**, and Stuart Russell. Handwriting and gestures in the air, recognizing on the fly. In *ACM Conference on Human Factors in Computing Systems (CHI) Extended Abstracts*, 2013.
- [C28] Mark Rogers, **Lei Li**, and Stuart J. Russell. Multilinear dynamical systems for tensor time series. In *Advances in Neural Information Processing Systems 26*, 2013.
- [C29] Siyuan Liu, **Lei Li**, and Ramayya Krishnan. Hibernating process: Modelling mobile calls at multiple scales. In *IEEE International Conference on Data Mining*, 2013.

- [C30] Bin Fu, Jialiu Lin, **Lei Li**, Christos Faloutsos, Jason Hong, and Norman Sadeh. Why people hate your app - making sense of user feedback in a mobile app store. In *KDD '13: Proceeding of the 19th ACM SIGKDD International Conference on Knowledge Discovery and Data Mining*, New York, NY, USA, 2013. ACM.
- [C31] Yusuf Erol, **Lei Li**, Bharath Ramsundar, and Stuart J. Russell. The extended parameter filter. In *Proceedings of the 30th International Conference on Machine learning*, 2013.
- [C32] Yasuko Matsubara, **Lei Li**, Evangelos E. Papalexakis, David Lo, Yasushi Sakurai, and Christos Faloutsos. F-trail: Finding patterns in taxi trajectories. In *The Pacific-Asia Conference on Knowledge Discovery and Data Mining (PAKDD)*, pages 86–98, 2013.
- [C33] Keith Henderson, Brian Gallagher, Tina Eliassi-Rad, Hanghang Tong, Sugato Basu, Leman Akoglu, Danai Koutra, Christos Faloutsos, and **Lei Li**. Rolx: Structural role extraction and mining in large graphs. In *KDD '12: Proceeding of the 18th ACM SIGKDD International Conference on Knowledge Discovery and Data Mining*, New York, NY, USA, 2012. ACM.
- [C34] Yasuko Matsubara, Yasushi Sakurai, B. Aditya Prakash, **Lei Li**, and Christos Faloutsos. Rise and fall patterns of information diffusion: Model and implications. In *KDD '12: Proceeding of the 18th ACM SIGKDD International Conference on Knowledge Discovery and Data Mining*, New York, NY, USA, 2012. ACM.
- [C35] Siyuan Liu, **Lei Li**, Christos Faloutsos, and Lionel Ni. Mobile phone graph evolution: Findings, model and interpretation. In *IEEE International Conference on Data Mining, workshop on Data Mining Technologies for Computational Collective Intelligence*, 2011.
- [C36] Keith Henderson, Brian Gallagher, **Lei Li**, Leman Akoglu, Tina Eliassi-Rad, Hanghang Tong, and Christos Faloutsos. It's who you know: Graph mining using recursive structural features. In *KDD '11: Proceeding of the 17th ACM SIGKDD International Conference on Knowledge Discovery and Data Mining*, New York, NY, USA, 2011. ACM.
- [C37] **Lei Li**, Chieh-Jan Mike Liang, Jie Liu, Suman Nath, Andreas Terzis, and Christos Faloutsos. Thermo-cast: A cyber-physical forecasting model for data centers. In *KDD '11: Proceeding of the 17th ACM SIGKDD International Conference on Knowledge Discovery and Data Mining*, New York, NY, USA, 2011. ACM.
- [C38] **Lei Li** and B. Aditya Prakash. Time series clustering: Complex is simpler!. In *Proceedings of the 28th International Conference on Machine learning*, 2011.
- [C39] Yasushi Sakurai, **Lei Li**, Yasuko Matsubara, and Christos Faloutsos. Windmine: Fast and effective mining of web-click sequences. In *SIAM International Conference on Data Mining*, 2011.
- [C40] **Lei Li**. Fast algorithms for time series mining. In *26th IEEE International Conference on Data Engineering, PHD Workshop*, pages 341–344, 2010.
- [C41] Keith Henderson, Tina Eliassi-Rad, Christos Faloutsos, Leman Akoglu, **Lei Li**, Koji Maruhashi, B. Aditya Prakash, and Hanghang Tong. Metric forensics: a multi-level approach for mining volatile graphs. In *KDD '10: Proceedings of the 16th ACM SIGKDD international conference on Knowledge discovery and data mining*, KDD '10, pages 163–172, New York, NY, USA, 2010. ACM.
- [C42] **Lei Li**, James McCann, Nancy Pollard, and Christos Faloutsos. Bolero: a principled technique for including bone length constraints in motion capture occlusion filling. In *Proceedings of the 2010 ACM SIGGRAPH/Eurographics Symposium on Computer Animation*, SCA '10, pages 179–188, Aire-la-Ville, Switzerland, Switzerland, 2010. Eurographics Association.
- [C43] **Lei Li**, James McCann, Nancy Pollard, and Christos Faloutsos. Dynammo: Mining and summarization of coevolving sequences with missing values. In *KDD '09: Proceeding of the 15th ACM SIGKDD international conference on Knowledge discovery and data mining*, New York, NY, USA, 2009. ACM.
- [C44] Fan Guo, **Lei Li**, and Christos Faloutsos. Tailoring click models to user goals. In *Proceedings of the 2009 workshop on Web Search Click Data*, WSCD '09, pages 88–92, New York, NY, USA, 2009. ACM.
- [C45] Wanhong Xu, Xi Zhou, and **Lei Li**. Inferring privacy information via social relations. In *IEEE 24th International Conference on Data Engineering workshops*, pages 525–530, 2008.

- [C46] **Lei Li**, Wenjie Fu, Fan Guo, Todd C. Mowry, and Christos Faloutsos. Cut-and-stitch: efficient parallel learning of linear dynamical systems on smps. In *KDD '08: Proceeding of the 14th ACM SIGKDD international conference on Knowledge discovery and data mining*, pages 471–479, New York, NY, USA, 2008. ACM.
- [C47] Yasushi Sakurai, Rosalynn Chong, **Lei Li**, and Christos Faloutsos. Efficient distribution mining and classification. In *SIAM International Conference on Data Mining*, pages 632–643, 2008.
- [C48] **Lei Li**, James McCann, Christos Faloutsos, and Nancy Pollard. Laziness is a virtue: Motion stitching using effort minimization. In *The 29th Annual Conference of the European Association for Computer Graphics, Short Paper Proceedings*, 2008.
- [C49] **Lei Li**, Qiaoling Liu, Yunfeng Tao, Lei Zhang, Jian Zhou, and Yong Yu. Providing an uncertainty reasoning service for semantic web application. In *Asia-Pacific Web Conference*, pages 628–639, 2006.

#### TECHNICAL REPORTS

- [T1] **Lei Li** and Stuart J. Russell. The blog language reference. Technical report UCB/EECS-2013-51, EECS Department, University of California, Berkeley, May 2013.
- [T2] **Lei Li**. *Fast algorithms for mining co-evolving time series*. PhD thesis, Carnegie Mellon University, 2011.

#### WORKSHOP & POSTERS:

Mark Rogers, Lei Li, Stuart Russell. Dynamic Tensor Systems for Weather Prediction. Workshop on Understanding Climate Change. 2012 (Mark got student travel award)

Fast Algorithms for Mining Co-evolving Time Series. KDD 2011, Doctoral Event. San Diego, CA. 2011. (poster, recipient of travel grant)

Fast Algorithms for Mining Co-evolving Motion Capture Sequences. SDM 2010 Doctoral Forum. Columbus, OH. (poster, recipient of travel grant)

Lei Li. Fast Algorithms for Time Series Mining. ICDE 2010 Ph.D workshop. Long Beach, LA, 2010. (recipient of travel fellowship)

DynoMMo: Mining with Missing Values in Coevolving Time Series. Parallel Data Lab retreat 2009 (poster).

#### MEDIA COVERAGE

1. Disrupted Journalism, DisruptionHub. July 20, 2017. (mentioning our in-house developed Xiaomingbot) [link](#)
2. Robot gives competitive edge to tech application, China Daily, September 4, 2016. (similar coverage by 83 reports. about our news writing robot: Xiaomingbot, some examples see below)
3. Prolific Robot Journalist Covers 450 Olympic Stories. Newsweek. August 26, 2016. (coverage of our in-house developed writing robot Xiaomingbot) [link](#)
4. The Future of Writing? China's AI Reporter Published 450 Articles During Rio Olympics, Futurism, August 26, 2016. [link](#)
5. Robot Reporter Covered The Olympics For A Chinese News Outlet, Popular Science, August 25, 2016. (coverage of our in-house developed writing robot Xiaomingbot) [link](#)
6. China Sends AI Reporter to Cover the Rio Olympics – Blows Every Journalist Out of the Water, Nextshark, August 25, 2016. [link](#)
7. A Chinese news outlet used an incredibly efficient “robot reporter” to cover the Olympics. Quartz. August 24, 2016. [link](#)
8. China's A.I. Olympics Reporter Could Replace Journalists, Inverse, August 24, 2016. [link](#)
9. Breaking down China's most popular news app, Toutiao, AbacUSNews, Oct. 2, 2018. (mentioning Xiaomingbot) [link](#)

10. The Insanely Popular Chinese News App That You've Never Heard Of, MIT Technology Review, January 26, 2017. (Mentioning Xiaomingbot) [link](#)

## PATENTS

1. Systems and methods for human inspired simple question answering, filed 2016.05, US20170109355A1, (pending)
2. Extracting semantic attributes, Patent No. US7,502,785, issued Mar 2009.
3. System and method for exploring a semantic file network, Patent No. US 7,624,130, issued Nov, 2009.
4. Adaptive grouping in a file network, Patent No. US 7,634,471, issued Dec 2009.

## TALKS

1. Invited Talk: Machine Writing and Constrained Text Generation, CCF-AI workshop at Beijing Jiao Tong University, June 2019.
2. Invited Talk: Machine Writing and Constrained Sequence Generation, Arizona State University, Tempe, AZ, April 2019.
3. Invited Talk, Constrained Sentence Generation, School of Data Science, Fudan University, Shanghai, March 2019.
4. Invited Talk: Recent Progress in Natural Language Representation Learning and Generation, InfoQ AICon, Beijing, December 21, 2018.
5. Invited Talk: Learning to generate better news, translation, and advertisement. CSDN AI NEXTCon, Beijing, November 13, 2018.
6. Invited Talk: AI for Content Creation and Interaction, Department of Computer Science, University of Illinois Urbana Champaign, November 2018.
7. Invited Talk: AI for Content Creation and Interaction, Viterbi School of Engineering, University of Southern California, October 2018.
8. Invited Talk: Incubating Innovative IT Talents - an academic-industry fused perspective. Computer Education Conference, CCF, Hefei, China, July 2018.
9. Invited Talk: AI for Content Creation and Discovery, Computer Science Department, University of California at Davis, California, April, 2018.
10. Invited Talk: Machine Writing and Language Generation, Computer Science Department, Fudan University, March, 2018.
11. Invited Talk: AI for Content Creation and Interaction, ShanghaiTech University, March, 2018
12. Invited Talk: AI for Content Creation and Interaction, Southeast University, March, 2018
13. Invited Talk: AI for Content Creation and Interaction, Nanjing University, March, 2018
14. Invited Talk: AI for Content Creation and Interaction, Nanjing Normal University, March, 2018
15. Invited Talk: AI-assisted Content Creation, CAAI MIFS (Machine Intelligence Frontier Symposium), Beijing, October, 2017.
16. Invited Talk: AI-Assisted Content Creation and Commenting, Institute of Computing at China Academy of Science, Beijing, September, 2017.
17. Invited Talk: AI-powered Information Creation, Distribution, and Interaction, AI Computing Conference, Beijing, September, 2017.
18. Invited Talk: AI Research at Toutiao, Data Science in China, KDD, Halifax, 2017.
19. Invited Talk: Learning to Understand and Generate Language, AIWorld Conference, Beijing, October, 2016.
20. Invited Talk: Status and Challenges towards general AI. China Conference on Artificial Intelligence. Beijing, August 26-27, 2016.
21. Invited Talk: AI for Content Creation and Sharing, CCF-GAIR (Global Conference on AI and Robotics), Shenzhen, August, 2016.

22. Invited Talk: Learning for Dialog and Question Answering, Shanghai Jiao Tong University, Shanghai, June, 2016.
23. Invited Talk: Large-scale Learning for Language Understanding, University of Science and Technology in China, Hefei, May, 2016.
24. Invited Talk: Learning for Language and Visual Understanding, CAAI-GAITC (Global AI Technology Conference), Beijing, April, 2016.
25. Invited Keynote: Deep Learning – Towards More Intelligent Machines, China Computer Federation Young Computer Scientists and Engineers Forum, April, 2015.
26. BLOG language and compiled inference. Computer Science department, Stanford University, and separately at Tsinghua University 2015.
27. BLOG language and efficient inference. Berkeley Programming Language Retreat, Santa Cruz, 2014
28. Scalable Probabilistic Inference for Complex Dynamical Models. Invited talk at Ohio State University, New York University, Emory University, Google (Mountain View), 2014.
29. Invited Fish Bowl Seminar: Fast Algorithms for Mining Co-evolving Time Series. , Texas A&M University, 2013.
30. DBLOG: an Open Universe Probabilistic Programming Language for Relational Modeling, The Second EITA Young Investigator Conference, Palo Alto, CA, Jul 2012.
31. Forecasting with Cyber-physical Interactions in Data Centers. CMU Parallel Data Lab. Sep, 2011.
32. Proactive Detection of Insider Threats with Graph Analysis and Learning (CMU representative), DARPA ADMAS program kickoff conference, Arlington, VA. Jun, 2011.
33. Fast Algorithms for Mining Co-evolving Time Series. Case Western Reserve University, PARC, Yahoo!, SIAT 2011.
34. Parsimonious Linear Fingerprinting for Time Series. CMU machine learning lunch, 2010.
35. PLiF: Parsimonious Linear Fingerprinting for Time Series. Zhejiang University, China. Sep, 2010.
36. Fast Algorithms for Mining Co-evolving Time Series. SMU, NUS, HKUST, SJTU, Dec 2009.
37. Mining with Missing Values in Coevolving Time Series. MSR redmond, May 2009.
38. Efficient Parallel Learning of Linear Dynamical Systems on SMPs. CMU machine learning lunch, 2008.

## AWARDS

1. 2017 2nd-class WU Wenjun Award in AI for the project Internet information summarization and machine writing key technologies (including AI writer Xiaomingbot), the premier award by China Association of Artificial Intelligence.
2. 2017 China Computer Federation Distinguished Speaker.
3. 2012 SIGKDD Doctoral Dissertation Award (runner-up), the Association for Computing Machinery.
4. 1st place, China National Olympiad in Informatics, Jiangsu, 2001. (full score)
5. 1st class award, China National Physics Olympiad, Jiangsu, 2001.

## TEACHING EXPERIENCE

1. Guest Lecture, Deep Natural Language Generation, graduate class in Machine Learning, Tsinghua University, May 15, 2019.
2. Guest Lecture, Deep Natural Language Generation, graduate class in NLP, Peking University, May 8, 2019.
3. Guest Lecture, Personalized Recommendation Systems in Practice, undergrad Data Mining class, Tsinghua University. April 26, 2019
4. Guest Lecture, Deep Learning for Language Understanding and Generation, graduate Machine Learning class, Tsinghua University. November 13, 2018.
5. Guest Lecture, Deep Learning for Language Understanding and Generation, graduate Machine Learning class, Tsinghua University. April 25, 2018.



6. Guest Lecture, Deep Learning for Question Answering, graduate Machine Learning class, Tsinghua University. March 13, 2017.
7. China Computer Federation Advanced Disciplines Lectures (Tutorial): Deep Learning for Answering Questions, December 2016.
8. Lecturer in Probabilistic Programming for Advanced Machine Learning Summer School, Portland, OR, USA, 2014. (total 12hrs lecture during two weeks)
9. Tutorial: Indexing and Mining Time Sequences. Washington DC, KDD 2010. (with Christos Faloutsos)
10. Teaching Assistant for
  - 10701 Machine Learning, instructor Ziv Bar-Joseph, CMU, Spring 2009.
  - 15415 Database Applications, instructor Christos Faloutsos, CMU, Fall 2008.
  - Modern DBMS Implementation, SJTU, Fall 2005.
  - Operating System Project(nachos), SJTU, Fall 2005.
  - Modern Compiler Implementation, SJTU, Spring 2005.

## PROFESSIONAL SERVICE

### SENIOR PC AND ORGANIZERS:

1. AAAI 2020 SPC
2. KDD Sponsorship Co-Chair 2020
3. EMNLP 2019 Area Chair, NLP Applications and Text Mining
4. CIKM 2019 SPC, Industrial Track
5. KDD Sponsorship Co-Chair 2019
6. AAAI 2019 SPC
7. CCAI (China Conference on Artificial Intelligence) 2019, Chair for Forum on Innovative Applications of AI
8. KDD Hands-on Tutorial Co-Chair 2018
9. IJCAI 2017 SPC
10. KDD Cup Co-Chair 2017
11. CCAI (China Conference on Artificial Intelligence) 2017, Co-Chair for Young Scientist Forum
12. CAAI-IEEE MIFS (Machine Intelligence Frontier Symposium) Co-Chair, 2016
13. CAAI Byte Tech AI Symposium, PC Co-Chair, Beijing, January 2019.
14. Organizer for 2018 Byte Cup International Machine Learning Competition. Task: News Title Generation. 1072 teams with 2175 participants from 35 countries. (Hosted by CAAI, ByteDance, & Tsinghua Knowledge Engineering Lab), [link](#)
15. Organizer for 2016 Byte Cup International Machine Learning Competition. Task: Expert Recommendation for Community Questions. 1000 teams with 1600 participants. (Hosted by CAAI, ByteDance, & Tsinghua Knowledge Engineering Lab), [link](#)

### PROGRAM COMMITTEE:

1. KDD 2015, 2016, 2019.
2. ICDM 2015 Demos
3. ICML 2014
4. ECMLPKDD 2014, 2015
5. SDM 2013, 2014
6. IJCAI 2011, 2013, 2016, 2017, 2019
7. AAAI 2017, 2018, 2019
8. NeurIPS 2016
9. CIKM 2017
10. NAACL 2018
11. COLING 2016



12. EMNLP 2019

13. NLPCC 2019

JOURNAL REVIEWER: Transactions on Multimedia 2014, TVCJ 2014, Neural Computing 2013, TOSN 2013, 2014, TKDE 2012 - 2016, SADM 2012, Data Mining and Knowledge Discovery 2011, 2012, 2014, TOMCCAP 2009

PROPOSAL REVIEWER: Reviewer for US National Science Foundation proposal, 2010.