## Hongfu Liu

Michtom School of Computer Science Volen Center for Complex Systems 136 Brandeis University, 415 South St, Waltham, MA 02453

POSITION	Brandeis University Assistant Professor in Michtom School of Computer Science	Waltham, MA, USA 07/2018 - now
EDUCATION	Northeastern University Ph.D. in Computer Engineering Advisor: Professor Yun Raymond Fu	Boston, MA, USA 09/2014 - 04/2018
	Beihang University M.Eng. in Management Science and Engineering Advisor: Professor Junjie Wu	Beijing, China 09/2011 - 06/2014
	Beihang University B.Eng. in Information Management and Information System	Beijing, China 09/2007 - 06/2011
	Beihang University B.S. in Applied Mathematics	Beijing, China 09/2007 - 06/2011
	Beihang University B.A. in Law	Beijing, China 09/2007 - 06/2011

## RESEARCH INTERESTS

- Cluster Analysis: consensus clustering, constrained clustering, balanced clustering, multi-view clustering, interpretable clustering, big data clustering
- Outlier Detection: multi-view outlier detection, spammer detection, zombie user detection, bi-sampling outlier detection, jointly clustering and outlier detection
- Transfer Learning: heterogenous domain adaptation, unsupervised domain adaptation, structure-preserved domain adaptation
- Feature Selection: unsupervised feature selection, multi-view feature selection

## INDUSTRY EXPERIENCE

#### • Microsoft Research Asia

Beijing, China

Tel: +1 (731)-726-2735

Homepage: hongfuliu.com

E-mail: hongfuliu@brandeis.edu

Data Scientist Intern, Mentor: Dr. Lintao Zhang & Dr. Qi Chen 06/2017 - 08/2017 Project: Fast Clustering with Flexible Balance Constraints

• Adobe Research

San Jose, CA

Data Scientist Intern, *Mentor*: Dr. Nikos Vlassis

O5/2016 - 07/2016

Project: Greedy K-means-based Consensus Clustering for Customer Segmentation

## TEACHING EXPERIENCE

## • LECTURER

- $\Diamond$  Introduction to Big Data, Undergraduate & Graduate, Spring 2019
- ♦ Introduction to Data Mining, Undergraduate & Graduate, Fall 2018
- ♦ Introduction to E-Commerce, Undergraduate, Fall 2013
- ♦ Operation Research, Junior College Student, Fall 2011

#### • ASSISTANT

- ♦ Machine Learning and Pattern Recognition, Fall 2016
- ♦ Foundation of Visualization, Fall 2015
- ♦ Modern Programming Design, Undergraduate, Fall 2013
- ♦ Introduction to Java Programming, Undergraduate, Fall 2009, 2010, Spring 2013
- ♦ Management Information Systems, MBA, Spring & Fall 2011, Spring 2013
- ♦ Linear Algebra, Undergraduate, Fall 2012

#### **TUTORIAL**

1. Zhengming Ding, **Hongfu Liu** and Handong Zhao. Deep Multi-view Visual Data Analytics. AAAI Conference on Artificial Intelligence (**AAAI**), 2019.

#### ♦ 2 TPAMI, 5 TKDE, 1 DMKD, 2 TKDD, 1 BMC, 1 TFS, 2 TIP, 1 TNNLS

- 1. **Hongfu Liu**, Jun Li, Yue Wu and Yun Fu. Clustering with Outlier Removal. *IEEE Transactions on Knowledge and Data Engineering* (**TKDE**), 2019.
- 2. Zhiqiang Tao, **Hongfu Liu**, Huazhu Fu and Yun Fu. Multi-View Saliency-Guided Clustering for Image Cosegmentation. *IEEE Transactions on Image Processing* (**TIP**), 2019.
- 3. Weiren Yu, Zhengming Ding, Chunming Hu and **Hongfu Liu**. Knowledge Reused Outlier Detection. *IEEE Access*, 2019.
- Zhiqiang Tao, Hongfu Liu, Sheng Li, Zhengming Ding and Yun Fu. Marginalized Multi-View Ensemble Clustering. *IEEE Transactions on Neural Networks and Learn*ing Systems (TNNLS), 2019.
- 5. Deqing Wang, Chenwei Lu, Junjie Wu, **Hongfu Liu**, Wenjie Zhang and Fuzhen Zhuang. Softly Associative Transfer Learning for Cross-domain Classification. *IEEE Transactions on Cybernetics* (**TC**), 2019.
- 6. **Hongfu Liu**, Ming Shao and Yun Fu. Feature Selection with Unsupervised Consensus Guidance. *IEEE Transactions on Knowledge and Data Engineering* (**TKDE**), 2018.
- Zhiqiang Tao, Hongfu Liu, Sheng Li, Zhengming Ding and Yun Fu. Robust Spectral Ensemble Clustering via Rank Minimization. ACM Transactions on Knowledge Discovery from Data (TKDD), 2018.
- 8. Yue Wu, **Hongfu Liu**, Jun Li and Yun Fu. Improving Face Representation Learning with Center Invariant Loss. *Image and Vision Computing* (**IVC**), 2018.
- Hongfu Liu, Ming Shao, Zhengming Ding and Yun Fu. Structure-Preserved Unsupervised Domain Adaptation. IEEE Transactions on Knowledge and Data Engineering (TKDE), 2018.
- Joseph Robinson, Ming Shao, Yue Wu, Hongfu Liu, Timothy Gillis and Yun Fu. Visual Kinship Recognition of Families in the Wild. *IEEE Transactions on Pattern Analysis and Machine Intelligence* (TPAMI), 2018.
- 11. **Hongfu Liu** and Yun Fu. Consensus Guided Multi-View Clustering. *ACM Transactions on Knowledge Discovery from Data* (**TKDD**), 2018.
- 12. Xue Li and **Hongfu Liu**. Greedy Optimization for K-means-based Consensus Clustering. *Tsinghua Science and Technology* (**TST**), 2018.
- 13. **Hongfu Liu**, Zhiqiang Tao and Yun Fu. Partition Level Constrained Clustering. *IEEE Transactions on Pattern Analysis and Machine Intelligence* (**TPAMI**), 2017.
- Hongfu Liu, Ming Shao, Sheng Li and Yun Fu. Infinite Ensemble Clustering. Data Mining and Knowledge Discovery (DMKD), 2017.
- 15. **Hongfu Liu**, Junjie Wu, Tongliang Liu, Dacheng Tao and Yun Fu. Spectral Ensemble Clustering: Theoretical and Practical Evidence. *IEEE Transactions on Knowledge and Data Engineering* (**TKDE**), 2017.
- Hongfu Liu, Rui Zhao, Hongsheng Fang, Feixiong Chen, Yun Fu and Yuyang Liu. Entrpoy-based Consensus Clustering for Patient Stratification. *Bioinformatics* (BMC), 2017.
- 17. Handong Zhao, **Hongfu Liu**, Zhengming Ding and Yun Fu. Consensus Regularized Multi-View Outlier Detection. *IEEE Transactions on Image Processing* (**TIP**), 2017.
- 18. Junjie Wu, Ziang Wu, Jie Cao, **Hongfu Liu**, Guoqing Chen and Yanchuan Zhang. Fuzzy Consensus Clustering with Applications on Big Data. *IEEE Transactions on Fuzzy Systems* (**TFS**), 2017.
- 19. Junjie Wu, **Hongfu Liu**, Hui Xiong, Jie Cao and Jian Chen. K-means-based Consensus Clustering: A Unified View. *IEEE Transactions on Knowledge And Data Engineering* (**TKDE**), 2015.
- 20. Junjie Wu, Shiwei Zhu, **Hongfu Liu** and Guoping Xia. Cosine Interesting Pattern Discovery. *Information Sciences* (**IS**), 2012.

#### • CONFERENCE PAPERS

- ♦ 3 KDD, 4 ICDM, 1 SDM, 1 CVPR, 5 IJCAI, 5 AAAI, 1 CIKM, 3 IEEE Big-Data, 1 HPCC, 1 ICSSSM Best Paper
- 1. Zhiqiang Tao, **Hongfu Liu**, Jun Li and Yun Fu. Adversarial Graph Embedding for Ensemble Clustering. *In Proceedings of International Joint Conference on Artificial Intelligence* (**IJCAI**), 2019.
- 2. Zhengming Ding and **Hongfu Liu**. Marginalized Latent Semantic Encoder for Zero-Shot Learning. In Proceedings of IEEE Conference on Computer Vision and Pattern Recognition (CVPR), 2019.
- 3. Haitao Xiong, **Hongfu Liu**, Bineng Zhong and Yun Fu. Structured and Sparse Annotations for Image Emotion Distribution Learning. *In Proceedings of AAAI Conference on Artificial Intelligence* (**AAAI**), 2019.
- 4. **Hongfu Liu**, Ziming Huang, Yun Fu, Qi Chen, Mingqin Li, and Lintao Zhang. Fast Clustering with Flexible Balance Constraints. *In Proceedings of IEEE International Conference on Big Data* (IEEE BigData), 2018.
- 5. Jun Li, **Hongfu Liu** and Yun Fu. Predictive Coding Machine for Compressed Sensing and Image Denoising. *In Proceedings of AAAI Conference on Artificial Intelligence* (**AAAI**), 2018.
- 6. Yue Wu, Zhengming Ding, **Hongfu Liu**, Joseph Robinson and Yun Fu. Kinship Classification through Latent Adaptive Subspace. *In Proceedings of IEEE Conference on Automatic Face and Gesture Recognition* (**FG**), 2018.
- Jun Li, Hongfu Liu, Handong Zhao, and Yun Fu. Projective Low-rank Subspace Clustering via Learning Deep Encoder. In Proceedings of International Joint Conference on Artificial Intelligence (IJCAI), 2017.
- 8. Zhiqiang Tao, **Hongfu Liu**, Sheng Li, Zhengming Ding and Yun Fu. From Ensemble Clustering to Multi-View Clustering. *In Proceedings of International Joint Conference on Artificial Intelligence* (IJCAI), 2017.
- 9. Zhiqiang Tao\*, **Hongfu Liu\***, Huazhu Fu and Yun Fu. Image Cosegmentation via Saliency-Guided Constraint Clustering with Cosine Similarity. *In Proceedings of AAAI Conference on Artificial Intelligence* (**AAAI**), 2017. (\* means equal contribution)
- 10. Zhiqiang Tao, **Hongfu Liu** and Yun Fu. Simultaneous Clustering and Ensemble. *In Proceedings of AAAI Conference on Artificial Intelligence* (**AAAI**), 2017.
- 11. Sheng Li, **Hongfu Liu**, Zhiqiang Tao and Yun Fu. Multi-View Graph Learning with Adaptive Label Propagation. *In Proceedings of IEEE International Conference on Big Data* (**IEEE BigData**), 2017.
- 12. **Hongfu Liu**, Ming Shao, Sheng Li and Yun Fu. Infinite Ensemble for Image Clustering. In Proceedings of ACM SIGKDD international conference on Knowledge Discovery and Data mining (KDD), 2016.
- 13. **Hongfu Liu**, Haiyi Mao and Yun Fu. Robust Multi-View Feature Selection. *In Proceedings of IEEE International Conference on Data Mining* (**ICDM**), 2016.
- 14. **Hongfu Liu**, Ming Shao and Yun Fu. Structure-Preserved Multi-Source Domain Adaptation. *In Proceedings of IEEE International Conference on Data Mining* (**ICDM**), 2016.
- 15. **Hongfu Liu**, Ming Shao and Yun Fu. Consensus Guided Unsupervised Feature Selection. *In Proceedings of AAAI Conference on Artificial Intelligence* (**AAAI**), 2016.
- 16. **Hongfu Liu**, Yuchao Zhang, Bo Deng and Yun Fu. Bi-sampling Ensemble Outlier Detection. *In Proceedings of IEEE International Conference on Big Data* (**IEEE BigData**), 2016.
- Zhiqiang Tao, Hongfu Liu, Sheng Li and Yun Fu. Robust Spectral Ensemble Clustering. In Proceeding of ACM International Conference on Information and Knowledge Management (CIKM), 2016.
- 18. Handong Zhao, **Hongfu Liu** and Yun Fu. Incomplete Multi-modal Visual Data Grouping. In Proceedings of International Joint Conference on Artificial Intelligence (IJCAI), 2016.

- 19. **Hongfu Liu\***, Tongliang Liu\*, Junjie Wu, Dacheng Tao and Yun Fu. Spectral Ensemble Clustering. *In Proceedings of ACM SIGKDD international conference on Knowledge Discovery and Data mining* (**KDD**), 2015. (\* means equal contribution)
- 20. **Hongfu Liu** and Yun Fu. Clustering with Partition Level Side Information. *In Proceedings of IEEE International Conference on Data Mining* (**ICDM**), 2015.
- 21. **Hongfu Liu**, Junjie Wu, Dacheng Tao, Yuchao Zhang and Yun Fu. DIAS: A Disassemble-Assemble Framework for Highly Sparse Text Clustering. *In Proceedings of SIAM International Conference on Data Mining* (**SDM**), 2015.
- 22. **Hongfu Liu**, Cheng Gong and Junjie Wu. Consensus Clustering on big data. *In Proceedings of IEEE International Conference on Service Systems and Service Management* (ICSSSM Best Paper), 2015.
- 23. **Hongfu Liu**, Yuchao Zhang, Hao Lin and Junjie Wu. How Many Zombies Around You. In Proceedings of the IEEE International Conference on Data Mining (ICDM), 2013.
- 24. **Hongfu Liu**, Yuchao Zhang and Xue Li. Consensus Ranking From a Utility View. In Proceeding of International Conference on Natural Computation (ICNC), 2013.
- Junjie Wu, Hongfu Liu, Hui Xiong and Jie Cao. A Theoretic Framework of K-means-based Consensus Clustering. In Proceedings of International Joint Conference on Artificial Intelligence (IJCAI), 2013.
- 26. Yaqiong Wang, Hongfu Liu, Hao Lin, Junjie Wu, Zhiang Wu and Jie Cao. SEA: A System for Event Analysis on Chinese Tweets. In Proceedings of ACM SIGKDD International Conference on Knowledge Discovery and Data Mining (KDD), 2013.
- Yuchao Zhang and Hongfu Liu. A Reliable QoE-aware Framework for Cloud Service Monitoring and Ranking. In Proceedings of International Conference on Electrical and Information Technologies for Rail Transportation (EITRT), 2013.
- 28. Yuchao Zhang, **Hongfu Liu** and Bo Deng. SLA-Driven State Monitoring for Cloud Services. In Proceedings of the 15th IEEE International Conference on High Performance Computing and Communications (**HPCC**), 2013.
- 29. Yuchao Zhang, **Hongfu Liu** and Bo Deng. Evolutionary Clustering with DBSCAN. In Proceeding of International Conference on Natural Computation (ICNC), 2013.
- 30. Di Zhao, **Hongfu Liu**, Hongyi Li. A Method Based on Grey Correlation Clustering for Improving the Hierarchy of Analytic Hierarchy Process. *In Proceedings of IEEE/WIC/ACM International Conference on Web Intelligence and Intelligent Agent Technology* (WI-IAT), 2010.

### • WORKSHOP

- Yue Wu, Hongfu Liu, Yun Fu. Low-shot Face Recognition with Hybrid Classifiers. In Proceedings of International Conference on Computer Vision Workshop (ICCV-W), 2017.
- Yue Wu, Hongfu Liu, Jun Li and Yun Fu. Deep Face Recognition with Center Invariant Loss. In Proceedings of ACM Multimedia Thematic Workshop (MM-W), 2017.

#### **PATENTS**

- Hongfu Liu, Nikolaos Vlassis. Customer Segmentation Via Consensus Clustering US Patent. Filed: 11/12/2016.
- Junjie Wu, Hongfu Liu, Hong Li and Xiaoting Han. A Kind of Text Classification Method Based on Consensus Clustering CN Patent. Filed: 10/07/2015.

# HONORS & AWARDS

• Outstanding Self-Financed Students Abroad Chinese Government Award	2018
• First Place Award in MS-Celel-1M Grand Challenge	2017
International Conference on Computer Vision	2011
• IJCAI Student Travel Award	2017
International Joint Conference on Artificial Intelligence	
• KDD Student Travel Award	2016
ACM SIGKDD Conference on Knowledge Discovery and Data Mining	
• SIGIR Student Travel Award	2016
ACM International Conference Information and Knowledge Management	
• ICDM Student Travel Award	2016
IEEE Conference on Data Mining	
• AAAI Student Travel Award	2016
AAAI Conference on Artificial Intelligence	
• IEEE BigData Student Travel Award	2016
IEEE Conference on Big Data	
• Top 20 New Star in Data Mining	2016
Microsoft Academic Search	
• The inaugural Adobe Research Fellowship Finalist	2016
Adobe Research	
ICDM Student Travel Award  ICDM Student Travel Award	2015
IEEE Conference on Data Mining	0014
Dean Fellowship  North sectors, University	2014
Northeastern University	2014
• Outstanding Graduate Beijing Education Commission	2014
• Outstanding Graduate Thesis	2014
Beihang University	2014
• National Scholarship	2013
Ministry of Education of China	2010
• Top 10 Graduate	2013
School of Economics and Management in Beihang University	
• Data Mining Innovation Award	2013
China Internet Network Information Center	
• Airbus Scholarship	2012
Beihang University	
• Outstanding Volunteer Prize	2012
School of Economics and Management in Beihang University	
• Outstanding Undergraduate Thesis	2011
Beihang University	
• Outstanding Undergraduate	2011
Beijing Education Commission	
Board Scholarships  Only 1	2011
School of Economics and Management in Beihang University	2010
Google Student Travel Award      Graduat Community on Machine Learning and Applications	2010
Student Symposium on Machine Learning and Applications	0010
Citigroup Scholarship  Bailtana, Universitat	2010
Beihang University	2009
• Kwang-Hua Scholarship Beihang University	2009
• Samsung Scholarship	2008
Beihang University	2000
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## ACADEMIC $\mathbf{TALKS}$

♦ Invited Talks	
• From Consensus Clustering to K-means Clustering Baidu, Sunnyvale, CA	2018
• From Consensus Clustering to K-means Clustering	
University of Michigan-Dearborn, Dearborn, MI	2018
• From Consensus Clustering to K-means Clustering	
Tulane University, New Orleans, LA	2018
• From Consensus Clustering to K-means Clustering	
University of Miami, Coral Gables, FL	2018
• From Consensus Clustering to K-means Clustering	
Stevens Institute of Technology, Hoboken, NJ	2018
• From Consensus Clustering to K-means Clustering	
Rochester Institute of Technology, Rochester, NY	2018
• From Consensus Clustering to K-means Clustering	
San Diego State University, San Diego, CA	2018
• From Consensus Clustering to K-means Clustering	
Brandeis University, Waltham, MA	2018
• From Consensus Clustering to K-means Clustering	
Case Western Reserve University, Cleveland, OH	2018
• Consensus Clustering: A Tutorial	
The Ohio State University, Columbus, OH	2017
• K-means Solution for Complex Problem	
Texas State University, San Marcos, TX	2017
• K-means-based Consensus Clustering	
Texas A&M University, College Station, TX	2017
• Infinite Ensemble Clustering	_01
Boston College, Chestnut Hill, MA	2017
• Complex Problem, K-means Solution	2011
University of Illinois Urbana-Champaign, Champaign, IL	2017
• Consensus Clustering: A K-means Clustering View	2011
Tufts University, Medford, MA	2017
• Consensus Clustering for Industrial Applications	2011
JD, Beijing, China	2017
• Fast Clustering with Flexible Balance Constraints	2011
Microsoft Research Asia, Beijing, China	2017
• Spectral and Infinite Ensemble Clustering	_01
UMass Dartmouth, North Dartmouth, MA	2017
• Greedy K-means-based Consensus Clustering	2011
Adobe Research, San Jose, CA	2016
• K-means-based Consensus Clustering and its Applications	2010
NEPSSS, Northeastern University, Boston, MA	2015
	2010
♦ Presentations at International Conferences	
• International Joint Conference on Artificial Intelligence (IJCAI), Melbourne, Au	stralia
2017	
• IEEE Conference on Big Data ( <b>IEEE BigData</b> ), Washington, D.C.	2016
• ACM SIGKDD Conference on Knowledge Discovery and Data Mining ( <b>KDD</b> ), San	
cisco, CA	2010
• AAAI Conference on Artificial Intelligence (AAAI), Phoenix, AZ	2016
• IEEE Conference on Data Mining (ICDM), Atlantic City, NJ	2015
• SIAM International Conference on Data Mining (SDM), Vancouver, Canada	2015
• International Joint Conference on Artificial Intelligence (IJCAI), Beijing, China	2013
• IEEE Conference on Data Mining (ICDM), Dallas, TX	2013

2013

# PROFESSIONAL • Associate Editor ACTIVITIES

♦ IEEE Computational Intelligence Magazine (**IEEE CIM**)

	T 10.		T 1
•	Hidita	rial	Board

- ♦ Architecture and Design Review
- ♦ Annals of Mathematics and Physics

### • Publicity Chair

$\Diamond$	International	Workshop on Big	g Data	Transfer	Learning	2017

2019

## • Senior Program Committee

♦ AAAI Conference on Artificial Intelligence (**AAAI**)

## • Program Committee

♦ IEEE Conference on Big Data ( <b>IEEE BigData</b> )	2019
♦ ACM International Conference on Multimedia (MM)	2019
♦ Conference on Uncertainty in Artificial Intelligence ( <b>UAI</b> )	2019
♦ Neural Information Processing Systems (NeurIPS)	2019
♦ SIGKDD Conference on Knowledge Discovery and Data Mining ( <b>KDD</b> )	2019
♦ International Joint Conference on Artificial Intelligence (IJCAI)	2019
♦ IEEE Conference on Machine Learning (ICML)	2019
♦ IEEE Conference on Multimedia Information Processing and Retrieval (MIPR)	2019
♦ IEEE Conference on Data Mining ( <b>ICDM</b> )	2018
♦ IEEE Conference on Big Data ( <b>IEEE BigData</b> )	2018
♦ International Conference on Information Systems (ICIS)	2018
♦ Neural Information Processing Systems (NIPS)	2018
♦ AAAI Conference on Artificial Intelligence ( <b>AAAI</b> )	2018
♦ IEEE Conference on Multimedia Information Processing and Retrieval (MIPR)	2018
, , , , , , , , , , , , , , , , , , , ,	2017
♦ International Joint Conference on Artificial Intelligence (IJCAI)	2017
♦ International Conference on Machine Learning and Applications (ICMLA)	2017
♦ International Joint Conference on Artificial Intelligence (IJCAI)	2016
♦ International Conference on Machine Learning and Applications (ICMLA)	2016

## • Journal Reviewer

- ♦ IEEE Transactions on Pattern Analysis and Machine Intelligence (**TPAMI**)
- ♦ IEEE Transactions on Knowledge and Data Engineering (**TKDE**)
- ♦ IEEE Transactions on Neural Networks and Learning Systems (TNNLS)
- ♦ IEEE Transactions on Image Processing (**TIP**)
- ♦ IEEE Transactions on Biomedical Engineering (**TBME**)
- ♦ IEEE Transactions on Cybernetics (**TC**)
- ♦ IEEE Transactions on Big Data (**TBD**)
- ♦ IEEE Computational Intelligence Magazine (CIM)
- ♦ IEEE Transactions on Emerging Topics in Computational Intelligence (TETCI)
- ♦ ACM Transactions on Knowledge Discovery from Data (**TKDD**)
- ♦ ACM Transactions on the Web (**TW**)
- ♦ Scientific Reports (SR)
- ♦ Bioinformatics (**BMC**)
- ♦ Information Science (**IS**)
- $\Diamond$  Neural Networks (**NN**)
- ♦ Applied Computing and Informatics (ACI)
- ♦ Computer Methods and Programs in Biomedicine (CMPB)
- ♦ Human-centric Computing and Information Sciences (HCIS)
- ♦ Journal of Electronic Imaging (**JEI**)
- ♦ International Journal on Artificial Intelligence Tools (IJAIT)
- ♦ Pattern Analysis and Applications (**PAA**)
- ♦ Mathematical Problems in Engineering (MPE)