## Hongfu Liu

Department of Electrical & Computer Engineering Tel: +1 (617)-487-2429 College of Engineering, Northeastern University E-mail: liu.hongf@husky.neu.edu No.427, Richards Hall, 360 Huntington Ave., Boston, MA 02115 Homepage: hongfuliu.com **EDUCATION** Northeastern University Boston, MA, USA Ph.D. in Computer Engineering 09/2014 - nowAdvisor: Professor Yun Raymond Fu Beihang University Beijing, China M.Eng. in Management Science and Engineering 09/2011 - 06/2014 Advisor: Professor Junjie Wu Beihang University Beijing, China B.Eng. in Information Management and Information System 09/2007 - 06/2011 Beihang University Beijing, China B.S. in Applied Mathematics 09/2007 - 06/2011 Beihang University Beijing, China B.A. in Law 09/2007 - 06/2011 RESEARCH • Cluster Analysis: consensus clustering, constrained clustering, balanced clustering, INTERESTS 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 HONORS & • First Place Award in MS-Celel-1M Grand Challenge 2017 AWARDS International Conference on Computer Vision • 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

• Dean Fellowship

• ICDM Student Travel Award

Northeastern University
• Outstanding Graduate

Beihang University

IEEE Conference on Data Mining

Beijing Education Commission
• Outstanding Graduate Thesis

2015

2014

2014

2014

| National Scholarship  | 2013              |
|---|-------------------|
| Ministry of Education of China  |                   |
| • 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  | 2011              |
| School of Economics and Management in Beihang University  |                   |
| • Google Student Travel Award   | 2010              |
| Student Symposium on Machine Learning and Applications  |                   |
| • Citigroup Scholarship   | 2010              |
| Beihang University  |                   |
| • Kwang-Hua Scholarship   | 2009              |
| Beihang University  |                   |
| • Samsung Scholarship   | 2008              |
| Beihang University  | 2000              |
|   | D Cl .            |
| Microsoft Research Asia  Details: A significant of the significan | Beijing, China    |
| Data Scientist Intern, <i>Mentor</i> : Dr. Lintao Zhang & Dr. Qi Chen   | 06/2017 - 08/2017 |
| Project: Fast Clustering with Flexible Balance Constraints  | a                 |
| • Adobe Research  | San Jose, CA      |
| Data Scientist Intern, Mentor: Dr. Nikos Vlassis  | 05/2016 - 07/2016 |
| Project: Greedy K-means-based Consensus Clustering for Customer   | Segmentation      |

## **INDUSTRY** EXPERIENCE

## **TEACHING** EXPERIENCE

#### • LECTURER

- ♦ 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
- $\Diamond\ \mathit{Linear\ Algebra},\ \mathrm{Undergraduate},\ \mathrm{Fall\ 2012}$

## $\textbf{PUBLICATIONS} \ \bullet \ \text{JOURNAL PAPERS}$

## $\Diamond$ 2 TPAMI, 2 TKDE, 1 DMKD, 1 TKDD, 1 BMC, 1 TFS, 1 TIP, 1 IS

- 1. 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.
- 2. Hongfu Liu and Yun Fu. Consensus Guided Multi-View Clustering. ACM Transactions on Knowledge Discovery from Data (TKDD), 2018.
- 3. Xue Li and Hongfu Liu. Greedy Optimization for K-means-based Consensus Clustering. Tsinghua Science and Technology (TST), 2018.

- 4. **Hongfu Liu**, Zhiqiang Tao and Yun Fu. Partition Level Constrained Clustering. *IEEE Transactions on Pattern Analysis and Machine Intelligence* (**TPAMI**), 2017.
- 5. **Hongfu Liu**, Ming Shao, Sheng Li and Yun Fu. Infinite Ensemble Clustering. *Data Mining and Knowledge Discovery* (**DMKD**), 2017.
- 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.
- 8. Handong Zhao, **Hongfu Liu**, Zhengming Ding and Yun Fu. Consensus Regularized Multi-View Outlier Detection. *IEEE Transactions on Image Processing* (**TIP**), 2017.
- 9. 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.
- 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.
- 11. Junjie Wu, Shiwei Zhu, **Hongfu Liu** and Guoping Xia. Cosine Interesting Pattern Discovery. *Information Sciences* (IS), 2012.
- ♦ Under Review: 1 JMLR, 2 TPAMI, 2 TKDE, 1 TKDD, 1 TNNLS, 1 JOC, 1 TSP, 1 JSS, 1 IVC, 1 EJOR
  - 1. **Hongfu Liu**, Junxiang Chen, Jennifer G. Dy and Yun Fu. K-means Clustering for Complex Non-clustering Problem. *Journal of Machine Learning Research* (JMLR).
  - 2. **Hongfu Liu**, Ming Shao and Yun Fu. Feature Selection with Unsupervised Consensus Guidance. *IEEE Transactions on Knowledge and Data Engineering* (**TKDE**).
  - 3. **Hongfu Liu**, Ming Shao, Zhengming Ding and Yun Fu. Structure-Preserved Unsupervised Domain Adaptation. *IEEE Transactions on Knowledge and Data Engineering* (**TKDE**).
  - 4. **Hongfu Liu**, Junjie Wu, Zhiang Wu, Dacheng Tao and Yun Fu. Informative Consensus Clustering. *Journal on Computing* (**JOC**).
  - 5. Zhiqiang, Tao, **Hongfu Liu**, Huazhu Fu and Yun Fu. Multi-View Saliency-Guided Constrained Clustering for Image Cosegmentation. *IEEE Transactions on Pattern Analysis and Machine Intelligence* (**TPAMI**).
  - 6. 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**).
  - Zhiqiang Tao, Hongfu Liu, Sheng Li, Zhengming Ding and Yun Fu. Marginalized Multi-View Ensemble Clustering. IEEE Transactions on Neural Networks and Learning Systems (TNNLS).
  - 8. Handong Zhao, **Hongfu Liu**, Zhengming Ding and Yun Fu. Robust Graph Regularized Incomplete Multi-view Clustering. *IEEE Transactions on Pattern Analysis and Machine Intelligence* (**TPAMI**).
  - 9. Jun Li, **Hongfu Liu** and Yun Fu. Restricted Isometry Condition by Scale Null Space Property for Compressed Sensing. *IEEE Transactions on Signal Processing* (**TSP**).
  - 10. Hao Lin, **Hongfu Liu** and Junjie Wu. KCC: A MATLAB Package for K-means-based Consensus Clustering. *Journal of Statistical Software* (**JSS**).
  - 11. Yue Wu, **Hongfu Liu**, Jun Li and Yun Fu. Improving Face Representation Learning with Center Invariant Loss. *Image and Vision Computing* (**IVC**).
  - 12. Xue Li, **Hongfu Liu** and Bin Zhu. Evolutive Preference Analysis with Numerical Preference Relations. *European Journal of Operational Research* (**EJOR**)

13. Deqing Wang, Chenwei Lu, Junjie Wu, **Hongfu Liu**, Wenjie Zhang and Hui Zhang. Softly Associative Transfer Learning for Cross-domain Classification. *IEEE Transactions on Cybernetics* (**TC**).

#### • CONFERENCE PAPERS

- ♦ 3 KDD, 4 ICDM, 1 SDM, 4 IJCAI, 4 AAAI, 1 CIKM, 2 IEEE BigData, 1 HPCC, 1 ICSSSM Best Paper
- 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.
- 2. 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.
- 3. 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.
- 4. 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.
- 5. 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)
- 6. Zhiqiang Tao, **Hongfu Liu** and Yun Fu. Simultaneous Clustering and Ensemble. *In Proceedings of AAAI Conference on Artificial Intelligence* (**AAAI**), 2017.
- 7. 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.
- 8. **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.
- 9. **Hongfu Liu**, Haiyi Mao and Yun Fu. Robust Multi-View Feature Selection. *In Proceedings of IEEE International Conference on Data Mining* (**ICDM**), 2016.
- Hongfu Liu, Ming Shao and Yun Fu. Structure-Preserved Multi-Source Domain Adaptation. In Proceedings of IEEE International Conference on Data Mining (ICDM), 2016.
- 11. **Hongfu Liu**, Ming Shao and Yun Fu. Consensus Guided Unsupervised Feature Selection. *In Proceedings of AAAI Conference on Artificial Intelligence* (**AAAI**), 2016.
- 12. **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.
- 13. 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.
- 14. Handong Zhao, **Hongfu Liu** and Yun Fu. Incomplete Multi-modal Visual Data Grouping. In Proceedings of International Joint Conference on Artificial Intelligence (IJCAI), 2016.
- 15. **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)
- 16. **Hongfu Liu** and Yun Fu. Clustering with Partition Level Side Information. *In Proceedings of IEEE International Conference on Data Mining* (**ICDM**), 2015.
- 17. **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.

- 18. **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.
- 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.
- 20. **Hongfu Liu**, Yuchao Zhang and Xue Li. Consensus Ranking From a Utility View. In Proceeding of International Conference on Natural Computation (ICNC), 2013.
- 21. 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.
- 22. 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.
- 24. 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.
- 25. Yuchao Zhang, **Hongfu Liu** and Bo Deng. Evolutionary Clustering with DBSCAN. In Proceeding of International Conference on Natural Computation (ICNC), 2013.
- 26. 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 AND DOCTORAL CONSORTIUM PAPERS

- 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.

# ACADEMIC 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   | 2010         |
|              | Brandeis University, Waltham, MA  | 2018         |
|              | From Consensus Clustering to K-means Clustering   |              |
|              | Case Western Reserve University, Cleveland, OH  | 2018         |
| •            | • Consensus Clustering: A Tutorial  | 0015         |
|              | 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  | 2011         |
|              | Texas A&M University, College Station, TX   | 2017         |
| •            | • Infinite Ensemble Clustering  |              |
|              | Boston College, Chestnut Hill, MA   | 2017         |
| •            | • Complex Problem, K-means Solution   | 2017         |
|              | University of Illinois Urbana-Champaign, Champaign, IL  • Consensus Clustering: A K-means Clustering View   | 2017         |
| •            | Tufts University, Medford, MA   | 2017         |
|              | • Consensus Clustering for Industrial Applications  |              |
|              | JD, Beijing, China  | 2017         |
| •            | • Fast Clustering with Flexible Balance Constraints   |              |
|              | Microsoft Research Asia, Beijing, China   | 2017         |
| •            | • Spectral and Infinite Ensemble Clustering  IJMaga Partmonth North Partmonth MA  | 2017         |
| •            | UMass Dartmouth, North Dartmouth, MA  ■ Greedy K-means-based Consensus Clustering   | 2017         |
| •            | Adobe Research, San Jose, CA  | 2016         |
|              | • K-means-based Consensus Clustering and its Applications   |              |
|              | NEPSSS, Northeastern University, Boston, MA   | 2015         |
| <            | > Presentations at International Conferences  |              |
| •            | • International Joint Conference on Artificial Intelligence (IJCAI), Melbourne, Aus 2017  | tralia       |
|              | • IEEE Conference on Big Data (IEEE BigData), Washington, D.C.  | 2016         |
| •            | $\bullet$ ACM SIGKDD Conference on Knowledge Discovery and Data Mining $(\mathbf{KDD}),$ San  | Fran-        |
|              | cisco, CA   | 2016         |
|              | • AAAI Conference on Artificial Intelligence (AAAI), Phoenix, AZ  | 2016         |
|              | <ul> <li>IEEE Conference on Data Mining (ICDM), Atlantic City, NJ</li> <li>SIAM International Conference on Data Mining (SDM), Vancouver, Canada</li> </ul> | 2015<br>2015 |
|              | • International Joint Conference on Artificial Intelligence (IJCAI), Beijing, China   | 2013         |
|              | • IEEE Conference on Data Mining (ICDM), Dallas, TX   | 2013         |
|              | 8 ( - // //   |              |
| PROFESSIONAL | • Editorial Board   |              |
| ACTIVITIES   | ♦ Architecture and Design Review  |              |
|              | ♦ Annals of Mathematics and Physics   |              |
|              | ·   |              |
|              | • Publicity Chair   |              |
|              | ♦ International Workshop on Big Data Transfer Learning  | 2017         |
| •            | • Program Committee   |              |
|              | $\Diamond$ AAAI Conference on Artificial Intelligence ( <b>AAAI</b> )   | 2018         |
|              | ♦ IEEE International Conference on Multimedia Information Processing and Ret  |              |
|              | (MIPR)  | 2018         |
|              | <ul> <li>♦ AAAI Conference on Artificial Intelligence (AAAI)</li> <li>♦ International Joint Conference on Artificial Intelligence (IJCAI)</li> </ul>        | 2017<br>2017 |
|              | v international John Comercine on Artificial Intelligence (13CA1)   | 401 <i>1</i> |

| $\Diamond$ | International Conference on Machine Learning and Applications (ICMLA) | 2017 |
|------------|---|------|
| $\Diamond$ | International Joint Conference on Artificial Intelligence (IJCAI)     | 2016 |
| $\Diamond$ | International Conference on Machine Learning and Applications (ICMLA) | 2016 |

## • Journal Reviewer

- ♦ IEEE Transactions on Knowledge and Data Engineering (**TKDE**)
- ♦ IEEE Transactions on Neural Networks and Learning Systems (TNNLS)
- ♦ IEEE Transactions on Image Processing (**TIP**)
- $\Diamond$  IEEE Transactions on Cybernetics (**TC**)
- ♦ IEEE Computational Intelligence Magazine (CIM)
- ♦ IEEE Transactions on Emerging Topics in Computational Intelligence (TETCI)
- $\Diamond$  ACM Transactions on Knowledge Discovery from Data  $(\mathbf{TKDD})$
- ♦ Bioinformatics (**BMC**)
- $\Diamond$  Information Science (**IS**)
- $\Diamond$  Applied Computing and Informatics (**ACI**)
- ♦ Computer Methods and Programs in Biomedicine (CMPB)
- ♦ Human-centric Computing and Information Sciences (**HCIS**)
- $\Diamond\,$  Journal of Electronic Imaging  $(\mathbf{JEI})$
- ♦ International Journal on Artificial Intelligence Tools (IJAIT)