Michael Chin-Chia Yeh

https://mcyeh.github.io/ o myeh003@ucr.edu

PROFESSIONAL EXPERIENCE

2018/09 -Visa Research Staff Research Scientist Palo Alto, California

• Time Series Data Mining

The time series generated from the transaction database can provide critical insights for payment processing companies. To utilize such information effectively, I have developed machine learning models for time series data under various contexts for transactional time series. The following topics are studied for this project: matrix profile, deep learning, time series forecasting, time series classification/regression, multi-future prediction, multi-model learning (i.e., time series data with graph data), online learning, and anomaly detection.

• Embeddings and Representation Learning

Representation learning is a fundamental building block for analyzing entities in a database. I have conducted researches in three directions for this topic to analyze Visa's data: 1) static embedding learning framework, 2) removing or alleviating the impact of an undesirable feature in the embedding, and 3) scalable and end-to-end embedding learning with downstream models. With the outcomes of these studies, embeddings for entities like merchants, merchant categories, and countries have been learned and adopted for various analytic tasks.

I published 22 peer-reviewed papers and 14 patents at Visa as of 1/19/2023.

Supervisor: Wei Zhang

Research Assistant

University of California, Riverside (UCR)

3 Years

Riverside, California

• All Pairs Similarity Search for Time Series Subsequences (Matrix Profile)

The all-pairs-similarity-search (or similarity join) problem has been extensively studied for text and a handful of other data types. However, there has been little progress on similarity joins for time series subsequences. The goal of the project is to develop an efficient/scalable algorithm solving the similarity join problem for time series data and show the utility of such algorithm when it's treated as a primitive operation for time series. The application of time series join includes visualization, motif/discord mining, clustering, etc.

I published 19 peer-reviewed papers at UCR.

Supervisor: Prof. Eamonn Keogh

Research Center for IT Innovation (CITI), Academia Sinica

2 Years

Research Assistant

Taipei, Taiwan

• Audio Word Representation of Audio Signals

Audio word (AW) representation symbolizes any local audio event as a codeword within a pre-constructed dictionary. Over the course of the project, I have conducted a systematic evaluation with various AW extracting configurations on audio classification/auto-tagging systems. Based on the result of the systematic evaluation, I have proposed a framework that aims to standardize the modularization of the AW representation extraction. I have also examined the possibility of incorporating various ideas (e.g., multi-scale feature learning, bagging) into the AW extraction process to learn better AW representation.

I published 8 peer-reviewed papers at CITI.

Supervisor: Dr. Yi-Hsuan Yang

HONORS, AWARDS, AND SERVICE

- Honorable mention for 2019 SIGKDD doctoral dissertation award.
- First place in AALTD' 16 time-series classification challenge
- Travel Award: SDM 2018, KDD 2017, ICDM 2016.
- Program Committee: KDD 2019-2022, MiLeTS 2020-2022, AAAI 2021, ECML-PKDD (ADS) 2020.

EDUCATION

University of California, Riverside (UCR)

Ph.D. in Computer Science

University of California, Los Angeles (UCLA)

M.S. in Mechanical Engineering, Systems and Control

Virginia Polytechnic Institute and State University (Virginia Tech)

B.S. in Mechanical Engineering

PUBLICATION

- Chin-Chia Michael Yeh, Mengting Gu, Yan Zheng, Huiyuan Chen, Javid Ebrahimi, Zhongfang Zhuang, Junpeng Wang, Liang Wang, and Wei Zhang, "Embedding Compression with Hashing for Efficient Representation Learning in Large-Scale Graph," ACM SIGKDD International Conference on Knowledge Discovery and Data Mining (KDD), 2022.
- Chin-Chia Michael Yeh, Yan Zheng, Junpeng Wang, Huiyuan Chen, Zhongfang Zhuang, Wei Zhang, and Eamonn Keogh, "Error-bounded Approximate Time Series Joins using Compact Dictionary Representations of Time Series," SIAM International Conference on Data Mining (SDM), 2022.
- Huiyuan Chen, **Chin-Chia Michael Yeh**, Fei Wang, and Hao Yang, "Graph Neural Transport Networks with Non-local Attentions for Recommender Systems," *ACM Web Conference* (WWW), 2022.
- Audrey Der, Chin-Chia Michael Yeh, Renjie Wu, Junpeng Wang, Yan Zheng, Zhongfang Zhuang, Liang Wang, Wei Zhang, and Eamonn Keogh, "Matrix Profile XXVII: A Novel Distance Measure for Comparing Long Time Series," *IEEE International Conference on Knowledge Graph* (ICKG), 2022.
- Jiarui Sun, Mengting Gu, **Chin-Chia Michael Yeh**, Yujie Fan, Girish Chowdhary, and Wei Zhang, "Dynamic Graph Node Classification via Time Augmentation," *IEEE International Conference on Big Data* (BigData), 2022.
- Prince O Aboagye, Yan Zheng, **Chin-Chia Michael Yeh**, Junpeng Wang, Zhongfang Zhuang, Huiyuan Chen, Liang Wang, Wei Zhang, and Jeff Phillips, "Quantized Wasserstein Procrustes Alignment of Word Embedding Spaces," *Biennial Conference of the Association for Machine Translation in the Americas* (AMTA), 2022.
- Huiyuan Chen, Yusan Lin, Menghai Pan, Lan Wang, **Chin-Chia Michael Yeh**, Xiaoting Li, Yan Zheng, Fei Wang, and Hao Yang, "Denoising Self-attentive Sequential Recommendation," *ACM Conference on Recommender Systems* (RecSys), 2022.
- Huiyuan Chen, Xiaoting Li, Kaixiong Zhou, Xia Hu, **Chin-Chia Michael Yeh**, Yan Zheng,and Hao Yang, "TinyKG: Memory-Efficient Training Framework for Knowledge Graph Neural Recommender Systems," *ACM Conference on Recommender Systems* (RecSys), 2022.
- Archit Rathore, Sunipa Dev, Vivek Srikumar, Jeff M Phillips, Yan Zheng, **Chin-Chia Michael Yeh**, Junpeng Wang, Wei Zhang, and Bei Wang, "An Interactive Visual Demo of Bias Mitigation Techniques for Word Representations From a Geometric Perspective," *NeurIPS 2021 Competitions and Demonstrations Track*, Proceedings of Machine Learning Research (PMLR), 2022.

- Junpeng Wang, Liang Wang, Yan Zheng, **Chin-Chia Michael Yeh**, Shubham Jain, and Wei Zhang, "Learning-From-Disagreement: A Model Comparison and Visual Analytics Framework," *IEEE Transactions on Visualization and Computer Graphics* (TVCG), 2022.
- Bo Dong, Yuhang Wu, Chin-Chia Michael Yeh, Yusan Lin, Yuzhong Chen, Hao Yang, Fei Wang, Wanxin Bai, Krupa Brahmksri, Yimin Zhang, Chinna Kummitha, and Verma Abhisar, "Semi-supervised Context Discovery for Peer-Based Anomaly Detection in Multi-Layer Networks," *International Conference on Information and Communications Security* (ICICS), 2022.
- Jingzhu He, Yuhang Lin, Xiaohui Gu, **Chin-Chia Michael Yeh**, and Zhongfang Zhuang, "PerfSig: Extracting Performance Bug Signatures via Multi-modality Causal Analysis," *International Conference on Software Engineering* (ICSE), 2022.
- Chin-Chia Michael Yeh, Zhongfang Zhuang, Junpeng Wang, Yan Zheng, Javid Ebrahimi, Ryan Mercer, Liang Wang, and Wei Zhang, "Online Multi-horizon Transaction Metric Estimation with Multi-modal Learning in Payment Networks," ACM International Conference on Information and Knowledge Management (CIKM), 2021.
- Huiyuan Chen, Lan Wang, Yusan Lin, **Chin-Chia Michael Yeh**, Fei Wang, and Hao Yang, "Structured Graph Convolutional Networks with Stochastic Masks for Recommender Systems," *International ACM SIGIR Conference on Research and Development in Information Retrieval* (SIGIR), 2021.
- Prince Osei Aboagye, Yan Zheng, Chin-Chia Michael Yeh, Junpeng Wang, Wei Zhang, Liang Wang, Hao Yang, and Jeff Phillips, "Normalization of Language Embeddings for Cross-Lingual Alignment," International Conference on Learning Representations (ICLR), 2021.
- Junpeng Wang, Wei Zhang, Hao Yang, **Chin-Chia Michael Yeh**, and Liang Wang, "Visual Analytics for RNN-Based Deep Reinforcement Learning," *IEEE Transactions on Visualization and Computer Graphics* (TVCG), 2021.
- Jingzhu He, Chin-Chia Michael Yeh, Yanhong Wu, Liang Wang, and Wei Zhang, "Mining Anomalies in Subspaces of High-dimensional Time Series for Financial Transactional Data," Joint European Conference on Machine Learning and Knowledge Discovery in Databases (ECML-PKDD), 2021.
- Chin-Chia Michael Yeh, Zhongfang Zhuang, Yan Zheng, Liang Wang, Junpeng Wang, and Wei Zhang, "Merchant Category Identification Using Credit Card Transactions," *IEEE International Conference on Big Data* (BigData), 2020.
- Chin-Chia Michael Yeh, Zhongfang Zhuang, Wei Zhang, and Liang Wang, "Multi-future Merchant Transaction Prediction," Joint European Conference on Machine Learning and Knowledge Discovery in Databases (ECML-PKDD), 2020.
- Chin-Chia Michael Yeh, Dhruv Gelda, Zhongfang Zhuang, Yan Zheng, Liang Gou, and Wei Zhang, "Towards a Flexible Embedding Learning Framework," *IEEE International Conference on Data Mining Workshop on Multi-Source Data Mining* (MSDM), 2020.
- Yan Zhu, Chin-Chia Michael Yeh, Zachary Zimmerman, and Eamonn Keogh, "Matrix Profile XVII: Indexing the Matrix Profile to Allow Arbitrary Range Queries," *IEEE International Conference on Data Engineering* (ICDE), 2020.
- Yan Zhu, Shaghayegh Gharghabi, Diego Furtado Silva, Hoang Anh Dau, Chin-Chia Michael Yeh, Nader Shakibay Senobari, Abdulaziz Almaslukh, Kaveh Kamgar, Zachary Zimmerman, Gareth Funning, Abdullah Mueen, and Eamonn Keogh, "The Swiss Army Knife of Time Series Data Mining: Ten Useful Things You Can Do with the Matrix Profile and ten Lines of Code," Data Mining and Knowledge Discovery (DMKD), 2020.
- Zhongfang Zhuang, Chin-Chia Michael Yeh, Liang Wang, Wei Zhang, and Junpeng Wang, "Multi-stream RNN for Merchant Transaction Prediction," ACM SIGKDD International Conference on Knowledge Discovery and Data Mining Workshop on Machine Learning in Finance (MLF), 2020.

- Chin-Chia Michael Yeh, Yan Zhu, Hoang Anh Dau, Amirali Darvishzadeh, Mikhail Noskov, and Eamonn Keogh, "Online Amnestic DTW to allow Real-Time Golden Batch Monitoring," ACM SIGKDD International Conference on Knowledge Discovery and Data Mining (KDD), 2019.
- Shaghayegh Gharghabi, **Chin-Chia Michael Yeh**, Yifei Ding, Wei Ding, Paul Hibbing, Samuel LaMunion, Andrew Kaplan, Scott E. Crouter, and Eamonn Keogh, "Domain Agnostic Online Semantic Segmentation for Multi-dimensional Time Series," *Data Mining and Knowledge Discovery* (DMKD), 2019.
- Hoang Anh Dau, Anthony Bagnall, Kaveh Kamgar, **Chin-Chia Michael Yeh**, Yan Zhu, Shaghayegh Gharghabi, Chotirat Ann Ratanamahatana, and Eamonn Keogh, "The UCR Time Series Archive," *IEEE/CAA Journal of Automatica Sinica*, 2019.
- Chin-Chia Michael Yeh, "Towards a Near Universal Time Series Data Mining Tool: Introducing the Matrix Profile," University of California, Riverside, 2018.
- Alireza Abdoli, Amy C. Murillo, Chin-Chia Michael Yeh, Alec C. Gerry, and Eamonn J. Keogh, "Time Series Classification to Improve Poultry Welfare," *IEEE International Conference on Machine Learning and Applications* (ICMLA), 2018.
- Nader S. Senobari, Gareth J. Funning, Eamonn Keogh, Yan Zhu, **Chin-Chia Michael Yeh**, Zachary Zimmerman, and Abdullah Mueen, "Super-Efficient Cross-Correlation (SEC-C): A Fast Matched Filtering Code Suitable for Desktop Computers," *Seismological Research Letters*, 2018.
- Yan Zhu, Chin-Chia Michael Yeh, Zachary Zimmerman, Kaveh Kamgar, and Eamonn Keogh, "Matrix Profile XI: SCRIMP++: Time Series Motif Discovery at Interactive Speeds," *IEEE International Conference* on Data Mining (ICDM), 2018.
- Yan Zhu, Zachary Zimmerman, Nader S. Senobari, Chin-Chia Michael Yeh, Gareth Funning, Abdullah Mueen, Philip Brisk, and Eamonn Keogh, "Exploiting a Novel Algorithm and GPUs to Break the Ten Quadrillion Pairwise Comparisons Barrier for Time Series Motifs and Joins," Knowledge and Information Systems (KIS), 2018.
- Chin-Chia Michael Yeh, Yan Zhu, Liudmila Ulanova, Nurjahan Begum, Yifei Ding, Hoang Anh Dau, Zachary Zimmerman, Diego F. Silva, Abdullah Mueen, and Eamonn Keogh, "Time Series Joins, Motifs, Discords and Shapelets: a Unifying View that Exploits the Matrix Profile," Data Mining and Knowledge Discovery (DMKD), 2018.
- Shaghayegh Gharghabi, Yifei Ding, **Chin-Chia Michael Yeh**, Kaveh Kamgar, Liudmila Ulanova, and Eamonn Keogh, "Matrix Profile VIII: Domain Agnostic Online Semantic Segmentation at Superhuman Performance Levels," *IEEE International Conference on Data Mining* (ICDM), 2017.
- Chin-Chia Michael Yeh, Nickolas Kavantzas, and Eamonn Keogh, "Matrix Profile VI: Meaningful Multi-dimensional Motif Discovery," *IEEE International Conference on Data Mining* (ICDM), 2017.
- Chin-Chia Michael Yeh, Nickolas Kavantzas, and Eamonn Keogh, "Matrix Profile IV: Using Weakly Labeled Time Series to Predict Outcomes," *Proceedings of the VLDB Endowment* (VLDB), 2017.
- Chin-Chia Michael Yeh, Helga Van Herle, and Eamonn Keogh, "Matrix Profile III: The Matrix Profile Allows Visualization of Salient Subsequences in Massive Time Series," *IEEE International Conference on Data Mining* (ICDM), 2016.
- Yan Zhu, Zachary Zimmerman, Nader S. Senobari, Chin-Chia Michael Yeh, Gareth Funning, Abdullah Mueen, Philip Brisk, and Eamonn Keogh, "Matrix Profile II: Exploiting a Novel Algorithm and GPUs to Break the One Hundred Million Barrier for Time Series Motifs and Joins," *IEEE International Conference on Data Mining* (ICDM), 2016.
- Chin-Chia Michael Yeh, Yan Zhu, Liudmila Ulanova, Nurjahan Begum, Yifei Ding, Hoang Anh Dau, Diego F. Silva, Abdullah Mueen, and Eamonn Keogh, "Matrix Profile I: All Pairs Similarity Joins for Time Series: A Unifying View that Includes Motifs, Discords and Shapelets," *IEEE International Conference on Data Mining* (ICDM), 2016.

- Diego F. Silva, Chin-Chia Michael Yeh, Gustavo E. A. P. A. Batista, Eamonn Keogh, "SiMPle: Assessing Music Similarity Using Subsequences Joins," *International Society for Music Information Retrieval Conference* (ISMIR), 2016.
- Diego F. Silva, **Chin-Chia Michael Yeh**, Yan Zhu, Gustavo E. A. P. A. Batista, Eamonn Keogh, "Fast Similarity Matrix Profile for Music Analysis and Exploration," *IEEE Transactions Multimedia* (TMM), 2015.
- Chin-Chia Michael Yeh, Ping-Keng Jao, and Yi-Hsuan Yang. The AWtoolbox for characterizing audio information, Academia Sinica, Technical Report, 2015.
- Li Su, Chin-Chia Michael Yeh, Jen-Yu Liu, Ju-Chiang Wang, and Yi-Hsuan Yang, "A Systematic Evaluation of the Bag-of-frames Representation for Music Information Retrieval," *IEEE Transactions Multimedia* (TMM), 2014.
- Chin-Chia Michael Yeh, Ping-Keng Jao, and Yi-Hsuan Yang. "AWtoolbox: Characterizing Audio Information Using Audio Words," ACM International Conference Multimedia (MM), 2014.
- Chin-Chia Michael Yeh, Ju-Chiang Wang, Yi-Hsuan Yang, and Hsin-Min Wang, "Improving Music Autotagging by Intra-song Instance Bagging," *IEEE International Conference on Acoustics, Speech and Signal Processing* (ICASSP), 2014.
- Ping-Keng Jao, Chin-Chia Michael Yeh, and Yi-Hsuan Yang, "Modified LASSO Screening for Audio Word-based Music Classification Using Large-scale Dictionary," *IEEE International Conference on Acoustics*, Speech and Signal Processing (ICASSP), 2014.
- Chin-Chia Michael Yeh and Yi-Hsuan Yang, "Towards a More Efficient Sparse Coding Based Audio-word Feature Extraction System," Asia Pacific Signal and Information Processing Association Annual Summit and Conference (APSIPA ASC), 2013.
- Chin-Chia Michael Yeh, Li Su, and Yi-Hsuan Yang, "Dual-layer Bag-of-frames Model for Music Genre Classification," *IEEE International Conference on Acoustics, Speech and Signal Processing* (ICASSP), 2013.
- Jen-Yu Liu, Chin-Chia Michael Yeh, Yuan-Ching Teng, and Yi-Hsuan Yang, "Bilingual Analysis of Song Lyrics and Audio Words," *ACM International Conference Multimedia* (MM), 2012.
- Chin-Chia Michael Yeh and Yi-Hsuan Yang, "Supervised Dictionary Learning for Music Genre Classification," ACM International Conference on Multimedia Retrieval (ICMR), 2012.

PATENT

- Bo Dong, Yuhang Wu, Yu-San Lin, **Michael Yeh**, and Hao Yang, "System, Method, and Computer Program Product for User Network Activity Anomaly Detection," US Patent App. 17/763,282.
- Michael Yeh, Yan Zheng, Junpeng Wang, Wei Zhang, and Zhongfang Zhuang, "Error-bounded Approximate Time Series Join Using Compact Dictionary Representation of Time Series," WO Patent App. PCT/US2022/031792.
- Yan Zheng, Wei Zhang, **Michael Yeh**, Liang Wang, Junpeng Wang, Shubham Jain, and Zhongfang Zhuang, "System, Method, and Computer Program Product for Feature Analysis Using an Embedding Tree," WO Patent App. PCT/US2022/032863.
- Zhongfang Zhuang, Michael Yeh, Wei Zhang, Mengting Gu, Yan Zheng, and Liang Wang, "System, Method, and Computer Program Product for Analyzing Multivariate Time Series Using a Convolutional Fourier Network," WO Patent App. PCT/US2022/030629.
- Yan Zheng, **Michael Yeh**, Junpeng Wang, Wei Zhang, Liang Wang, Hao Yang, and Prince Osei Aboagye, "Method, System, and Computer Program Product for Normalizing Embeddings for Cross-embedding Alignment," WO Patent App. PCT/US2022/030813.
- Junpeng Wang, Liang Wang, Yan Zheng, **Michael Yeh**, Shubham Jain, Wei Zhang, Zhongfang Zhuang, and Hao Yang, "System, Method, and Computer Program Product to Compare Machine Learning Models," WO Patent App. PCT/IB2022/052974.

- Sunipa Dev, Yan Zheng, Michael Yeh, Junpeng Wang, Wei Zhang, and Archit Rathore, "System, Method, and Computer Program Product for Debiasing Embedding Vectors of Machine Learning Models," WO Patent App. PCT/US2022/022474.
- Huiyuan Chen, Yu-San Lin, Lan Wang, **Michael Yeh**, Fei Wang, and Hao Yang, "Structured Graph Convolutional Networks with Stochastic Masks for Network Embeddings," WO Patent App. PCT/US2021/040312.
- Michael Yeh, Zhongfang Zhuang, Junpeng Wang, Yan Zheng, Javid Ebrahimi, Liang Wang, and Wei Zhang, "Time Series Predictive Model for Estimating Metric for a Given Entity," WO Patent App. PCT/US2022/014795.
- Zhongfang Zhuang, **Michael Yeh**, Wei Zhang, and Ebrahimi Javid, "Residual Neural Networks for Anomaly Detection," WO Patent App. PCT/US2021/038329.
- Junpeng Wang, Wei Zhang, Hao Yang, **Michael Yeh**, Liang Wang, "System, Method, and Computer Program Product for Dynamic User Interfaces for RNN-Based Deep Reinforcement Machine-Learning Models," WO Patent App. PCT/IB2021/053632.
- Zhongfang Zhuang, **Michael Yeh**, Liang Wang, Wei Zhang, and Junpeng Wang, "System, Method, and Computer Program Product for Multivariate Event Prediction Using Multi-Stream Recurrent Neural Networks," US Patent App. 17/148,984.
- Michael Yeh, Liang Gou, Wei Zhang, Dhruv Gelda, Zhongfang Zhuang, Yan Zheng, "System, Method, and Computer Program Product for Analyzing a Relational Database Using Embedding Learning," US Patent App. 17/066,852.
- Yan Zheng, Yuwei Wang, Wei Zhang, **Michael Yeh**, and Liang Wang, "Unsupervised Embeddings Disentanglement Using a GAN for Merchant Recommendations," US Patent App. 16/688,847.

RELEVANT SKILL

Programming Language

• Proficient: MATLAB, Python, and LATEX

• Familiar: Java, C#, and C++

Natural Language

• Bilingual Proficiency: English, Mandarin Chinese