# Minghao Ye

370 Jay Street, 9th Floor Brooklyn, NY 11201 United States

Research Summary I have been focusing on designing intelligent traffic engineering solutions to optimize routing strategies for software-defined wide-area networks using artificial intelligence and machine learning techniques, aiming to improve network load balancing performance with good QoS provisioning under dynamic traffic scenarios, reduce network disturbance and routing update overhead, accelerate traffic engineering operations in large-scale networks, and deploy robust routing strategies that are resilient to unexpected link failures.

Education

New York University (NYU)

New York, NY **Ph.D.** in Electrical Engineering | GPA: 3.98/4.0 May 2024 (Expected) May 2019 M.S. in Electrical Engineering | GPA: 4.0/4.0

Research Topic: Leveraging Machine Learning for Intelligent Traffic Engineering Solutions in Wide-Area Networks (Advisor: Prof. H. Jonathan Chao)

Academic Honors: The Dante Youla Award For Graduate Research Excellence in Electrical Engineering (2023), ECE MS Student Academic Achievement Award (2018)

The Hong Kong Polytechnic University (PolyU) **B.Eng.** (Hons.) in Electronic Engineering

Hong Kong, China Jun. 2017

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Website: wp.nyu.edu/minghao

Academic Honors: Best Semester GPA Award, Best Academic Improvement Award (2017)

Sun Yat-sen University (SYSU)

Guangzhou, China

**B.Enq.** in Microelectronic Science and Engineering | 2+2 program with PolyU Jun. 2017

**Professional** Experience

Software Engineer Intern DreamBig Semiconductor Inc. May 2023 - Aug. 2023

San Jose, CA

Software Group | Supervisor: Mr. Faisal Masood (VP of Engineering)

- Researched critical networking services of major cloud service providers (e.g., Azure, AWS, Google Cloud) with daily sync-up meetings
- Created an internal knowledge base to document, investigate, and analyze technical details of the latest cloud networking technologies (e.g., Private Link, Network Load Balancer)
- Contributed to the research and development progress of DreamBig's novel SmartNIC design with an emphasis on SONiC-DASH features

#### Graduate Research Assistant

Sep. 2018 - May 2019

Brooklyn, NY

Department of Electrical and Computer Engineering, NYU High-Speed Networking Lab | Supervisor: Prof. H. Jonathan Chao

Project Title: Traffic Engineering with Reinforcement Learning [11] •

- Designed and implemented a rule-based heuristic called Critical Top-K that reroutes elephant flows from the most congested links to alleviate network congestion effectively
- Conducted extensive experiments on NYU's High Performance Computing (HPC) clusters to evaluate our Reinforcement Learning-based Traffic Engineering (RL-TE) solution that learns to identify and reroute the most critical flows in the network
- Achieved close-to-optimal load balancing performance with up to 12.2% improvement over the best heuristic scheme by rerouting only 10%-21.3% of total traffic

#### Research Assistant Intern

Jun. 2018 - Jul. 2018

Huazhong University of Science and Technology

Wuhan, China

Cyber-Physical-Social Systems Lab | Supervisor: Prof. Laurence T. Yang & Dr. Huazhong Liu Project Title: Network Traffic Prediction with Multivariate Multi-order Markov Models [12]

- Applied multivariate multi-order Markov models and a novel tensor operation called *Unified* Product to perform network traffic prediction
- Utilized a Linux cloud platform to carry out network traffic prediction experiments using real-world network traffic dataset from FiberHome
- Improved the prediction accuracy by up to 38.47% compared to the Z-eigen based approach

#### System Engineer Intern

Jul. 2016 - Aug. 2016

Cisco Systems (China) Networking Technology Co., Ltd.

Guangzhou, China

Service Provider Solution Group | Supervisor: Mr. Mark Li (System Engineer Manager)

- Oversaw pre-sales and post-sales technical support for Cisco products
- Performed routine maintenance at China Telecom's data center in Shenzhen
- Investigated emerging software-defined networking (SDN) applications in service provider industries for group presentation and discussion

# Teaching & Mentoring

#### Course Instructor

Jan. 2023 - May 2023 Brooklyn, NY

Department of Electrical and Computer Engineering, NYU

Course, ECE CV 6262 Pate Conten and Cloud Computing (2)

Course: ECE-GY 6363 Data Center and Cloud Computing (2023 Spring)

- Provided instructions on course materials to 48 graduate students enrolled in the course
- Held weekly online Zoom meetings (1 hour per week) for quizzes and Q&A sessions
- Performed course administrative tasks using the NYU Brightspace digital learning platform
- Received an instructor rating of 4/5 in terms of clear, effective, inclusive, receptive

#### Graduate Teaching Assistant (TA)

Feb. 2019 - Present

Department of Electrical and Computer Engineering, NYU

Highlights: More than 4 years of TA experience in teaching 3 different networking courses

Courses: (1) Data Center and Cloud Computing, 2021 Fall - 2022 Fall; (2) High-Speed Networks,

2019 Spring - 2021 Spring and 2023 Fall; (3) Communication Networks, 2020 Spring

- Delivered 2-hour regular lectures to students regarding recent advances in TE and 5G/MEC
- Designed core course components including quizzes, lab structures, and tutorial slides
- Provided short lectures on lab materials and assisted students during lab sessions
- Graded students' exams, quizzes, and lab demos/reports with constructive feedback

### Graduate Research Project Mentorship

Sep. 2019 - Present Brooklyn, NY

Department of Electrical and Computer Engineering, NYU

Vilup Liang Boyn Hap Ko Zhou (2022) Present as advised with C

- Yilun Liang, Boyu Han, Ke Zhou (2023 Present, co-advised with Chen-Yu Yen): "Leveraging Multipath Transport for Improving Application Performance in Dynamic Networks"
- Po Yen Chen, Zihan Lin (2023 Present): "Multi-constrained Distributed QoS Routing"
- Xing Fang, Boyu Han, Xingda Bao, Tyler Lin, Xiao Xie, Senlin Xiao, Ke Zhou, Yilun Liang (2022 Present): "Design and Implementation of SD-WAN Traffic Engineering"
- Yang Hu (2021 2022): "Destination-based Routing Update Overhead Mitigation with Reinforcement Learning" [5, 10]
- Ke Chen, Han Wang, Shuwen Fang (2020 2021): "Adaptive Forward Error Correction for Real-time Communications Based on Reinforcement Learning" [7]
- Han Wang, Yang Li (2019 2020): "Traffic Matrix Prediction with Deep Learning Models"
- Daihui Dou (2019): "Investigation on 5G and Multi-access Edge Computing Technologies"

Selected Research Projects

# Enabling Lookahead Routing for Scalable TE with Supervised Learning [1] % Graph Neural Networks (GNN) + Supervised Learning (SL) Dec. 2022 - May 2023

- Formulated a multi-TMs routing optimization problem to derive an optimal routing for multiple future traffic matrices with good load balancing performance
- Designed a scalable TE framework called Roracle based on GNN and SL to efficiently learn from optimal multi-TMs routing targeting future traffic matrices during offline training
- Deployed Roracle in large networks (204 nodes and 964 edges) to quickly infer good routing strategies with up to 36% worst-case performance improvement and >71× speedup

# Reinforcement Learning-based TE for QoS Provisioning and Load Balancing [2] & Reinforcement Learning (RL) + Linear Programming (LP) Mar. 2022 - Feb. 2023

- Proposed a TE solution called QoS-RL that achieves promising load balancing performance for network operators and provides good QoS (e.g., low latency) for users simultaneously
- Leveraged RL and LP to intelligently update a few destination-based forwarding entries for different priorities of traffic to reduce management overhead and mitigate service disruption
- Provided at least <u>95.5%</u> of optimal delay on average for high priority traffic while achieving above <u>90</u>% of optimal load balancing performance in most cases

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Graph Neural Networks (GNN) + Supervised Learning (SL)

Dec. 2021 - Jul. 2022

- Proposed a learning-based TE called LARRI to directly predict a routing strategy (instead of predicting future traffic demands) for accommodating highly dynamic network traffic
- Employed SL to learn from optimal path-based range routing for future traffic scenarios and designed a scalable GNN-based framework to facilitate training and inference
- Improved the worst-case load balancing performance by up to  $\underline{43.3\%}$  under traffic fluctuations with the lowest end-to-end delay

### Mitigating Routing Update Overhead for Destination-based TE [5, 10] % ()

2-stage Reinforcement Learning (RL) + Linear Programming (LP) Jul. 2021 - Dec. 2021

- Customized a 2-stage RL approach called FlexEntry to identify critical destination-based forwarding entries for routing updates in different traffic scenarios
- Adopted LP to produce reward signals for RL and optimize traffic split ratios for the selected critical entries to control traffic distribution
- Achieved near-optimal performance in unseen traffic scenarios with at most 99.3% of average entry update savings in six real networks

# Flexible and Disturbance-aware TE with Reinforcement Learning in SDN [6, 9] & Graph Neural Networks (GNN) + Reinforcement Learning (RL) Jul. 2021 - Nov. 2021

- Proposed a new QoS metric named *network disturbance* to evaluate the negative impact of TE's flow rerouting operations on WANs, such as service disruption
- Designed a disturbance-aware TE with GNN and RL to intelligently reroute flexible numbers of critical flows under dynamic traffic fluctuations and unexpected single link failures
- Achieved close-to-optimal performance (i.e., above 90% of optimal performance) in <u>99%</u> of network scenarios and mitigated network disturbance by up to <u>38.6%</u> in five real networks

### Adaptive Forward Error Correction (FEC) for Real-time Communications [7] % C Reinforcement Learning (RL) + Supervised Learning (SL) May 2020 - Sep. 2021

- Designed a no-reference packet-level video quality assessment method with SL to generate real-time video quality scores as feedback information without reconstructing videos
- Leveraged RL to determine redundancy rates for video frames under dynamic packet loss and added redundant packets accordingly to improve video quality with loss recovery
- Achieved good video quality in  $\geq 95\%$  cases with  $\geq 50\%$  savings on additional bandwidth consumption when transmitting redundant packets over the Internet

### Federated TE with Supervised Learning in Multi-region Networks [8] %

2-layer Graph Neural Networks (GNN) + Supervised Learning (SL) Feb. 2021 - May 2021

- Designed a 2-layer GNN architecture to model different levels of network abstractions in multi-region networks (intra-region and inter-region)
- Exploited light-weight GNN message exchanges to facilitate collaborations among regions and adopted SL to predict cross-region traffic at border routers for routing optimization
- Boosted distributed TE's performance by up to <u>28.9%</u> with low computation cost in large networks (<1s execution time in the BRITE network with 204 nodes and 964 links)

### Selected Course Projects

#### Adaptive Traffic Engineering for Resilient Networks

Apr. 2020 - May 2020

Course Project of ECE7363 Network Design and Algorithms at NYU

- Incorporated a self-attention method to process the dependency of traffic matrix and graphstructured network topology using the Transformer architecture
- Customized a Reinforcement Learning approach to learn a critical flow selection policy against various link failures by observing the reward generated from Linear Programming
- Improved network performance with low rerouting impact while being resilient to different link failure scenarios in the Abilene network with real traffic traces

#### Solving LunarLander-v2 with Deep Q-Networks

Apr. 2020 - May 2020

Course Project of ECE9243 Optimal Learning and Control for Robotics at NYU

- Implemented the Deep Q-Network (DQN) algorithm with PyTorch to solve complex control tasks of the LunarLander-v2 environment in OpenAI Gym
- Explored different hyperparameter settings and neural network architectures to learn a good policy to successfully "land the spaceship on the lunar surface"

### Age-invariant Face Recognition (

Oct. 2017 - Dec. 2017

Course Project of EL9123 Machine Learning at NYU

- Performed face recognition based on two aging face databases including the MORPH Album 2 (78000 images of 13000 people) and the FG-NET database
- Preprocessed facial images by detecting feature points, cropping faces, and enhancing images with a median filter and histogram stretch
- Applied Principal Component Analysis (PCA) and Local Binary Patterns (LBP) to effectively extract facial features and perform aging face recognition with C++ and OpenCV
- Fine-tuned the parameters of the patch division scheme and the Weighted Chi-square distance to obtain high recognition accuracy on aging faces

#### Awards

# The Dante Youla Award For Graduate Research Excellence in Electrical Engineering Tandon School of Engineering, NYU May 2023

• This award is given in memory of the late ECE Professor Emeritus Dante Youla for timely recognition of important research contributions made by Ph.D. students. It recognizes one impactful paper in which the awardee is the principal author or a significant external award.

• I was selected as the award recipient with a recently published journal paper in the *IEEE/ACM Transactions on Networking (ToN)*, which is entitled "FlexDATE: Flexible and Disturbance-Aware Traffic Engineering With Reinforcement Learning in Software-Defined Networks". A Certificate of Merits was awarded to me at the ceremony.

#### IEEE ICNP 2021 Student Registration Award

Travel Grant Chairs of IEEE ICNP 2021

Oct. 2021

- The purpose of this award is to encourage students' participation in the conference by funding their conference registration. Recipients of this reward show evidence of a serious interest in networking, as demonstrated by coursework and project experience.
- As a first-time ICNP attendee, author, and presenter, I wrote a proposal to apply for the registration award and was selected as the award recipient by the travel grant chairs.

#### NYU ECE MS Student Academic Achievement Award

Tandon School of Engineering, NYU

Oct. 2018

- The Academic Achievement Award is given to top MS students in the ECE department, which recognizes their outstanding academic work.
- As the award recipient, I am one of the top MS students among 200+ ECE MS students with a perfect GPA (4.0/4.0). A Certificate of Merits was awarded to me at the ceremony.

#### PolyU EIE Best Semester GPA Award

Department of Electronic and Information Engineering, PolyU

Mar. 2017

- The Best Semester GPA Award is given to the student with the highest semester GPA in the EIE Department at PolyU.
- $\bullet$  In the 2016-2017 Fall semester at PolyU, I got a 4.2/5.0 GPA with two A+ grades in EIE core elective courses and was selected as the award recipient.

#### PolyU EIE Best Academic Improvement Award

Department of Electronic and Information Engineering, PolyU

Mar. 2017

- The Best Academic Improvement Award is given to the student with the highest GPA improvements in the EIE Department at PolyU.
- In the 2016-2017 Fall semester at PolyU, I got a 4.2/5.0 GPA with two A+ grades in EIE core elective courses, which is considered a great improvement over previous semesters.

# Memberships & Services

#### Organization Membership

- IEEE Graduate Student Member
- IEEE Communications Society (ComSoc) Graduate Student Member
- IEEE Young Professionals Member

#### Reviewer for International Conferences (Total 4 Reviews)

- IEEE/ACM International Symposium on Quality of Service (IWQoS)
- IEEE International Conference on Communications (ICC)
- IEEE Global Communications Conference (GLOBECOM)
- International Teletraffic Congress (ITC)

### Reviewer for International Journals (Total 25 Reviews) [ORCiD]

- IEEE Journal on Selected Areas in Communications (JSAC) 2 reviews
- IEEE Systems Journal 9 reviews
- IEEE Access 5 reviews
- Elsevier Computer Networks 2 reviews
- Journal of Parallel and Distributed Computing (JPDC) 5 reviews
- EURASIP Journal on Wireless Communications and Networking (JWCN) 2 reviews

#### Technical Skills

Programming Languages: Python, C/C++, SQL, PHP, MATLAB, Bash, LaTeX

Frameworks, Libraries & Tools: TensorFlow, PyTorch, Keras, Scikit-learn, Pandas, NumPy, Matplotlib, OpenCV, Gym, NetworkX, Git, Docker, Kubernetes, Azure, AWS, Hadoop, DPDK, OVS, Mininet, Wireshark, Gurobi, Linux, HPC

**Technologies:** Machine Learning, Deep Learning, Reinforcement Learning, TCP/IP, Computer Networking, Data Center & Cloud Computing, Software-Defined Networking, Traffic Engineering/Routing, Network Modeling & Analysis, Network Design & Optimization, Network Security, Data Structure & Algorithms, Computer Systems Architecture, Database Systems

# Publications [Google Scholar] [DBLP]

- \*I have published 12 papers in top networking conferences and journals with 180+ citations.
- [1] (ICNP '23) Minghao Ye, Junjie Zhang, Zehua Guo, and H. Jonathan Chao, "Roracle: Enabling Lookahead Routing for Scalable Traffic Engineering with Supervised Learning," *The* 31st IEEE International Conference on Network Protocols (ICNP), 2023. (Acceptance rate: 18.8%, 34/181) [PDF]
- [2] (IWQoS '23) Minghao Ye, Yang Hu (co-first author), Junjie Zhang, Zehua Guo, and H. Jonathan Chao, "Reinforcement Learning-based Traffic Engineering for QoS Provisioning and Load Balancing," IEEE/ACM 31st International Symposium on Quality of Service (IWQoS), 2023. (Acceptance rate: 23.5%, 62/264) [PDF]
- [3] (INFOCOM '23) Minghao Ye, Junjie Zhang, Zehua Guo, and H. Jonathan Chao, "LARRI: Learning-based Adaptive Range Routing for Highly Dynamic Traffic in WANs," *IEEE International Conference on Computer Communications (INFOCOM)*, 2023. (Selected as one of the five fast-tracked papers for submission to *IEEE/ACM Transactions on Networking*. Acceptance rate: 19.2%, 252/1312) [PDF]
- [4] (ToN 23) Yuntian Zhang, Ning Han, Tengteng Zhu, Junjie Zhang, Minghao Ye, Songshi Dou, and Zehua Guo, "Prophet: Traffic Engineering-centric Traffic Matrix Prediction," accepted. *IEEE/ACM Transactions on Networking (ToN)*, 2023. (Impact factor: 3.7) [PDF]
- [5] (JSAC 22) Minghao Ye, Yang Hu, Junjie Zhang, Zehua Guo, and H. Jonathan Chao, "Mitigating Routing Update Overhead for Traffic Engineering by Combining Destination-based Routing with Reinforcement Learning," *IEEE Journal on Selected Areas in Communications* (JSAC), 2022. (Impact factor: 16.4) [PDF]
- [6] (ToN 22) Minghao Ye, Junjie Zhang, Zehua Guo, and H. Jonathan Chao, "FlexDATE: Flexible and Disturbance-Aware Traffic Engineering with Reinforcement Learning in Software-Defined Networks," *IEEE/ACM Transactions on Networking (ToN)*, 2022. (Impact factor: 3.7) [PDF]
- [7] (MMSys '22) Ke Chen, Han Wang, Shuwen Fang, Xiaotian Li, Minghao Ye, and H. Jonathan Chao, "RL-AFEC: Adaptive Forward Error Correction for Real-time Video Communication Based on Reinforcement Learning," *The 13th ACM Multimedia Systems Conference* (MMSys), 2022. (Acceptance rate: 34%, 16/46) [PDF]
- [8] (ICNP '21) Minghao Ye, Junjie Zhang, Zehua Guo, and H. Jonathan Chao, "Federated Traffic Engineering with Supervised Learning in Multi-region Networks," The 29th IEEE International Conference on Network Protocols (ICNP), 2021. (One of the 11 pre-accepted papers without conditional acceptance. Acceptance rate: 24.7%, 38/154) [PDF]
- [9] (IWQoS '21) Minghao Ye, Junjie Zhang, Zehua Guo, and H. Jonathan Chao, "DATE: Disturbance-Aware Traffic Engineering with Reinforcement Learning in Software-Defined Networks," *IEEE/ACM 29th International Symposium on Quality of Service (IWQoS)*, 2021. (Acceptance rate: 25%, 64/256) [PDF]
- [10] (NetAI '20) Junjie Zhang, Zehua Guo, Minghao Ye, and H. Jonathan Chao, "SmartEntry: Mitigating Routing Update Overhead with Reinforcement Learning for Traffic Engineering," ACM SIGCOMM Workshop on Network Meets AI & ML (NetAI), 2020. (9 out of 19 papers were accepted) [PDF] [Slides]
- [11] (JSAC 20) Junjie Zhang, Minghao Ye, Zehua Guo, Chen-Yu Yen, and H. Jonathan Chao, "CFR-RL: Traffic Engineering with Reinforcement Learning in SDN," *IEEE Journal on Selected Areas in Communications (JSAC)*, 2020. (Impact factor: 16.4) [PDF] [arXiv]
- [12] (TNSM 19) Huazhong Liu, Laurence T. Yang, Jinjun Chen, Minghao Ye, Jihong Ding, and Liwei Kuang, "Multivariate Multi-order Markov Multi-modal Prediction with Its Application in Network Traffic Management," *IEEE Transactions on Network and Service Management (TNSM)*, 2019. (Impact factor: 5.3) [PDF]

#### **Presentations**

- 1. "Reinforcement Learning-based Traffic Engineering for QoS Provisioning and Load Balancing," *IEEE/ACM 31st International Symposium on Quality of Service (IWQoS)*, Orlando, FL, USA, Jun. 19, 2023.
- 2. "LARRI: Learning-based Adaptive Range Routing for Highly Dynamic Traffic in WANs," *IEEE International Conference on Computer Communications (INFOCOM)*, Hoboken, NJ, USA, May 17, 2023.
- 3. "Federated Traffic Engineering with Supervised Learning in Multi-region Networks," The 29th IEEE International Conference on Network Protocols (ICNP), Online, Nov. 2, 2021. [Recording] [Teaser]
- 4. "DATE: Disturbance-Aware Traffic Engineering with Reinforcement Learning in Software-Defined Networks," *IEEE/ACM 29th International Symposium on Quality of Service (IWQoS)*, Online, Jun. 27, 2021. [Recording]
- 5. "SmartEntry: Mitigating Routing Update Overhead with Reinforcement Learning for Traffic Engineering," ACM SIGCOMM Workshop on Network Meets AI & ML (NetAI), Online, Aug. 10, 2020. [Recording]