# Zhihao Ruan

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#### **EDUCATION**

#### **University of Pennsylvania**

Philadelphia, PA

Master of Science in Engineering in Robotics, GPA: 4.0/4.0

May 2022

General Robotics, Automation, Sensing & Perception (GRASP) Laboratory

 Selected Coursework: Modern Convex Optimization, Reinforcement Learning, Advanced Topics in Machine Perception, Interactive Computer Graphics

# **University of Michigan**

Ann Arbor, MI

Bachelor of Science in Computer Science Engineering, GPA: 3.9/4.0
 College of Engineering

Sept 2018 - May 2020

• **Selected Coursework:** Embedded Systems Design (grader), Machine Learning (grader), Computer Vision, Autonomous Robotics, GPU Programming & Architecture, Operating Systems

# **Shanghai Jiao Tong University**

Shanghai, China Sept 2016 – Aug 2020

Bachelor of Science in Electrical and Computer Engineering, GPA: 3.6/4.0
 University of Michigan-Shanghai Jiao Tong University Joint Institute (UM-SJTU Joint Institute)

o **Selected Coursework:** Electromagnetics, Signals and Systems, Analog Circuits, Semiconductor Devices

#### **SCHOLARSHIP AND HONORS**

James B. Angell Scholar
University of Michigan Honors
University of Michigan "Dean's List"
SJTU Undergraduate Excellent Scholarship
UM-SJTU Joint Institute "Dean's List"
"Honorable Mention" of 2017 Interdisciplinary Contest in Modeling

Mar 2020 Dec 2018, May 2019, Dec 2019 Dec 2018, Apr 2019, Dec 2019 June 2017, June 2018 June 2017, Dec 2017, June 2018

Tionorable Mention of 2017 interdisciplinary contest in

# **WORK EXPERIENCE**

**TuSimple, Inc.** *Planning & Prediction Research Engineer Internship* 

Philadelphia, PA (Remote)

May 2021 – Present

o Developed motion planning software & algorithms for autonomous trucks.

### RESEARCH EXPERIENCE

### F1/10 Autonomous Racing Group, Real-Time & Embedded Systems Lab (mLab)

Philadelphia, PA

Apr 2017

CAD2CAV: Computer Aided Design for Cooperative Autonomous Vehicles

Feb 2021 - Present

- o Built a 3D building model rendering pipeline in **Unreal Engine 4** for 2D AutoCAD floor plans.
- Wrote graph-based multi-agent path planner in ROS (Robotics Operating System) & C++ with **Ant Colony Optimization solver for Capacitated Vehicle Routing Problem**, **Spectral Clustering**, and *k*-**Way Graph Partitioning**.
- o Implemented FMT\* for real-time obstacle avoidance and Pure Pursuit as the controller for F1/10 autonomous racing vehicles.
- Applied Cartographer SLAM and on-board Tiny-YOLO v4 object detection on F1/10 autonomous racing vehicles.

### **Interactive Sensing and Computing (ISC) Lab**

Ann Arbor, MI

Research Assistant of Prof. Alanson Sample, Synthetic Health Sensor

Jan 2019 - Dec 2019

- Built an embedded system in C & MATLAB with STM32 microprocessor and Panasonic's GridEye® 8 × 8 IR sensor through I<sup>2</sup>C & UART that can collect, detect and visualize heat distribution in the room.
- $\circ$  Constructed **a complete C API** for Panasonic's GridEye 8  $\times$  8 IR sensor for **STM32** microprocessor from scratch.
- Implemented **Direct Digital Synthesis (DDS) in C** of a frequency-sweep ultrasonic sine wave from 39kHz to 41kHz with STM32 microprocessor and ultrasonic transducers.
- Designed two different ultrasound distance measurement algorithms in **Python** including **FMCW** (**Frequency-Modulated Continuous Wave**) algorithm and **phase-based ranging algorithm** with STM32 microprocessor.

#### **SOCIAL WORK EXPERIENCE**

#### Student's Union, UM-SJTU Joint Institute of Shanghai Jiao Tong University

Deputy Director of Media Department & Lead of Photography Team

Shanghai, China

Aug 2017 - Jul 2018

- o Took pictures & report all student's events at institute's official social media platforms.
- o Arranged team building events for Media Department.

# Center for Learning & Teaching, UM-SJTU Joint Institute of Shanghai Jiao Tong University

Teaching Assistant for VY 200: Academic Writing II

Shanghai, China Mar 2018 - May 2018

o Assisted professor on homework & quizzes grading, in-class activities organization.

o Held office hours & provided instructions for writing academic essays.

#### **PROJECT EXPERIENCE**

# **Minimum-Snap Trajectory Generation and Control for Quadrotors**

Philadelphia, PA

April 2021 – May 2021

ESE 650: Learning in Robotics, Univ. of Pennsylvania

- Planned quadrotor trajectory in densely cluttered environments with A\*/Dijkstra's Algorithm.
- Formulated minimum-snap trajectory smoothing algorithm into a Quadratic Programming (QP) problem with CVXPY.
- Designed Constrained Gradient Descent solver to optimize time duration for each min-snap trajectory segment.
- Analyzed quadrotor dynamics and developed Non-linear Geometric Controller for quadrotors.

Mini Minecraft in C++ Philadelphia, PA

CIS 560: Interactive Computer Graphics, Univ. of Pennsylvania

Nov 2020 - Dec 2020

- Achieved mesh rendering with interleaved Vertex Buffer Object (VBO) data in Qt and OpenGL and applied CPU parallel optimization.
- Created procedural weather effect in GLSL shader program, L-system river generation, procedural terrain generation with Perlin Noise and terrain smoothing with Fractal Brownian Motion (FBM).
- o Implemented mesh collision checking with ray tracing and 3D grid marching.
- o Created and implemented animated texturing for "grass," "dirt," "stone," "ice," "water," "lava," etc.
- o Developed **redstone texturing & redstone circuit logic**; supports "redstone wire," "power lever," "redstone torch".

#### **Deep Neural Network Implementation for Machine Perception**

Philadelphia, PA

CIS 680: Advanced Topics in Machine Perception, Univ. of Pennsylvania

Sept 2020 - Dec 2020

- o Implemented YOLO v1 for object detection in PyTorch, featuring anchor-based detection & Non-Max Suppression (NMS).
- Implemented SOLO for instance segmentation, using ResNet50 FPN as backbone and MatrixNMS.
- Implemented **Regional Proposal Network (RPN)** and **FasterRCNN** object detection head using ResNet50 FPN as backbone, featuring **ROI Pooling**, reaching an **mAP of 0.581**.
- Implemented multiple GAN architectures including Variational Auto-Encoders (VAE), DC-GAN, CycleGAN, BicycleGAN. Achieved Fréchet Inception Distance (FID) score of 70.87 on CycleGAN and 76.82 on BicycleGAN.

# **Computer Graphics Development with OpenGL**

Philadelphia, PA

CIS 560: Interactive Computer Graphics, Univ. of Pennsylvania

Sept 2020 - Nov 2020

- Implemented 3D mesh rasterization with provided mesh file in Qt 5.15 and OpenGL, integrated with scene graphs, with polar spherical camera model, perspective-correct barycentric interpolation, texture mapping, Lambertian reflection, and custom-scale anti-aliasing.
- Designed various shaders in GLSL including Blinn-Phong reflection shader, Worley noise shader, Gaussian blur shader, and Matcap shader.
- Built an deformable/editable mesh with Half-edge mesh structure, featuring a Maya-like application interface with Qt and Catmull-Clark surface subdivision.

# **Real-Time On-Device Flow Statistics Detection and Prediction**

Shanghai, China

Undergraduate Major Design Experience, UM-SJTU Joint Institute

June 2020 - Aug 2020

- Built a system in Python which detects human traffic flow, automatically analyzes & detects entrances on Raspberry Pi 4B, stores data on a server, visualizes analyzed data on a self-designed front-end website in real time (~ 15 FPS with Google Coral Edge TPU USB accelerator).
- Achieved **20 FPS and 90% accuracy** object tracking & people counting with **self-designed Kalman filter tracker**, automatic entrance detection with density-based clustering algorithm **DBSCAN** in Python.

# Linux Infrastructure Implementation on x86 PCs

EECS 482: Introduction to Operating Systems, Univ. of Michigan

Ann Arbor, MI Jan 2020 – Apr 2020

- Implemented mutex, conditional variables & thread class using context switching API in Linux kernel library with multiprocessor support provided using interrupt handling and CPU guard in C++.
- o Built Unix pager with swap-backed & file-backed pages with page fault handing and process switching & forking support in C++.
- Emulated Unix-style file system using inode and directory entry structures with client request handling using Berkeley sockets and safe concurrency using C++ Boost library.

# **MXNet Optimization with GPU**

Ann Arbor, MI

EECS 498: GPU Programming & Architecture, Univ. of Michigan

Nov 2019 - Dec 2019

o Implemented GPU parallelization of forward kernel of MXNet incubator 1.3.x with tiled matrix multiplication and GPU shared **memory**; boosted inference speed **from 30s to** < **3s** on fashion-mnist dataset and Nvidia TITAN Xp graphics card.

#### **DOAPP: Dynamic Object Avoidance and Path Planning**

Ann Arbor, MI

Undergraduate Major Design Experience, Univ. of Michigan

Oct 2019 - Dec 2019

- o Implemented a GPU-accelerated motion planning algorithm originally proposed by Chonhyon Park, et al. in ROS C++ & CUDA with Nvidia GPU parallel programming & optimization that could perform real-time obstacle avoidance.
- o Built a controller and trajectory follower in ROS C++ for Dynamixel motors on robot arm from scratch and achieved 30 Hz signal transmission.

#### **Robotics Algorithm Development in LCM**

Ann Arbor, MI

EECS 467: Autonomous Robotics, Univ. of Michigan

Sept 2019 - Oct 2019

- Implemented a SLAM algorithm in C++ with occupancy grid mapping, particle filter localization, A\* path planning. Entire system run on a mobile robot with Raspberry Pi 3 and LiDAR.
- Implemented robot manipulation algorithms in Python including Forward Kinematics, Inverse Kinematics (based on Geometry). Entire system run on a mobile robot with robot arm that could localize & pick up a block using AprilTag automatically.

### **Cost-Function Prediction Market Simulation with Bayesian Traders**

Ann Arbor, MI

ML Research Paper Reading Group of Prof. Sindhu Kutty, University of Michigan

May 2019 - Aug 2019

- o Simulated cost-function based prediction market mechanism in Python, with its performance evaluated and compared with traditional machine learning algorithms.
- Reconstructed exponential-family prediction markets in different probability distributions mathematically.

#### **Interactive Game: Step on White Tiles**

Ann Arbor, MI

EECS 373: Introduction to Embedded Systems Design, Univ. of Michigan

Mar 2019 - Apr 2019

- Visualized black & white tiles flow by driving a projector with FPGA by programming VGA protocols in Verilog.
- o Decoded signals from Nintendo controller in Verilog.
- o Built a complete menu selection user interface in C on an LCD display with SmartFusion microprocessor and Nintendo controller.
- o Achieved stepping detection on projected tiles through **SPI protocol in C** with Pixy® camera.
- Enabled sound effects using SmartFusion<sup>®</sup> microprocessor, Adafruit<sup>®</sup> Audio Sound Board and Dell<sup>®</sup> stereos in Verilog.

#### **SKILLS**

**Programming Languages:** C/C++, Python, MATLAB, Verilog.

Development Tools: CVXPY, STM32CubeMX, OpenCV, PyTorch, Scikit-Learn, LCM (Lightweight Communications and

Marshalling), ROS (Robotics Operating System), CUDA