# Angel Andres Daruna

Curriculum Vitae

## **Professional Summary**

Ph.D.-trained AI/ML research scientist with a track record of excelling in federal agency funded R&D projects (e.g., DARPA) at the intersection of computer vision, geospatial intelligence, and multimodal fusion. I specialize in building scalable, interpretable ML systems using state-of-the-art techniques such as transformers, multimodal fusion, self-supervised learning, LoRA, RAG, vector DB, and LLM agents.

## Skills:

Software:	Python, PyTorch, Lightning, Hydra, Github, Docker, Kubernetes, ROS, Ubuntu Linux, Gazebo, SQL
Machine Learning:	Multimodal Fusion, Explainable AI, Transformers, Agentic AI, Uncertainty Estimation, Graph Embedding, Continual Learning
Hardware:	Prototyping field robots with microcontrollers, FPGAs, various depth and image sensors, motors, many DoF arms, and others
Research:	Data exploration, problem identification, literature review, study design and planning, statistical testing, and user studies
Language:	English (native) and Spanish (proficient)

# **Education**

2022	Ph.D. in Robotics Georgia Institute of Technology - Atlanta, GA Advisor: Sonia Chernova Committee: Matthew Gombolay, Zsolt Kira, Devi Parikh, Mohan Sridharan GPA: 3.76
2021	M.S. in Computer Science Georgia Institute of Technology - Atlanta, GA GPA: 3.76
2015	B.S. in Computer Engineering Georgia Institute of Technology - Atlanta, GA GPA: 3.91
2013	B.S. in Computer Engineering Florida International University - Miami, FL GPA: 3.69 (transfer)

# **Research Experience**

2024 Manager: Han-Pang Chiu Remote, FL	<ul> <li>Critical Mineral Assessment with Al Assistance</li> <li>Used Machine Learning (ML) algorithms to automate Mineral Prospectivity Mapping (MPM) by learning associations between geospatial data and few historical as part of the DARPA CriticalMAAS program</li> <li>Our novel MPM approach uses a masked image modeling framework to pretrain a backbone neural network in a self-supervised manner using unlabeled geospatial data alone</li> <li>Served as a technical lead, guiding our team to consistently dominate in performer evaluations and integrate our tool within USGS mineral assessment workflows</li> </ul>
2023 Manager: Han-Pang Chiu Remote, FL	<ul> <li>Worldwide Visual Geolocation</li> <li>► Developed a state-of-the-art worldwide visual geolocation pipeline using a transformer based multimodal fusion architecture as a subcontractor for NGA</li> <li>► The implemented pipeline scales to datasets of tens of millions images using multi-GPU training through docker and Kubernetes</li> </ul>
2022 Manager: Han-Pang Chiu Remote, FL	<ul> <li>Deep Learning Uncertainty Quantification</li> <li>Developed and published a new approach to estimate deep neural network predictive uncertainty as part of the DARPA Enabling Confidence program</li> <li>Posed uncertainty propagation as a non-linear optimization problem using factor graphs to balance the benefits of sampling and analytical propagation techniques</li> <li>Evaluated with statistical testing across multiple experiments that included three datasets and two neural network architectures, observing statistically significant improvements</li> </ul>
2021 Advisor: Sonia Chernova Atlanta, GA	<ul> <li>Explainable Knowledge Graph Embedding</li> <li>Developed an inference reconciliation framework to provide NL explanations of a robot's decision-making supported by graph embedding predictions using a pedagogical XAI approach</li> <li>Leveraged subgraph feature extraction and decision trees to explain graph embedding inferences to non-experts in NL, enabling users to correct over 86% of erroneous graph facts</li> <li>User studies showed user's preferred our explanations and feedback from users significantly improved graph embedding fact prediction performance and robot task performance</li> </ul>

 Clearly communicated results in manuscript submitted to IEEE IROS 2022 with supplementary open-source code on GitHub

2020 Advisor: Sonia Chernova Atlanta, GA

#### Continual Knowledge Graph Embedding

► Identified and defined a new research problem within knowledge graph embedding by relaxing common assumptions

Developed a modular machine learning pipeline using Python and Pytorch that generated data and implemented, trained, and evaluated 5 continual learning techniques for graph embeddings

► Used a variety of metrics that tracked scalability, learning speed, and inference performance to quantitatively compare each technique, for example Deep Generative Replay using a Variational Auto-Encoder

► Extracted actionable conclusions from experiments and clearly communicated them in a manuscript published in RA-L 2021 with supplementary open-source code on GitHub

#### **Robust One-shot Task-Plan Execution**

 Developed a simulation pipeline using ROS and VirtualHome simulator to sample realistic household environments

► Implemented, trained, and evaluated multiple machine learning representations (word embeddings, knowledge graph embeddings, markov-logic networks) through ablation studies using a dataset of over 8000+ sampled simulations

► Deployed models for validation in 50 robot experiments that integrated mapping, navigation, obstacle avoidance, object detection and segmentation, and arm motion planning

► Derived data-driven insights from experiments that were presented in a manuscript published at ICRA 2021

#### Winning Fetchlt! Mobile Manipulation Challenge

 Worked closely with a diverse team to build a task execution software stack that was entered in an autonomous manufacturing and assembly challenge in ICRA, 2019

► Wrote an open-source computer vision ROS package (rail\_mesh\_icp) that was used to approximate pose estimates of multiple physical parts with 3mm of clearance for peg-and-whole mobile manipulation

Aided in design of- and integration of point-to-point navigation stack with collision mapping, which was used all 45 minutes of the challenge enabling safe, autonomous base navigation

► The integrated system won first prize, which was a free Fetch

2020 Advisor: Sonia Chernova Atlanta, GA

2019 Challenge Rep: Sarah Elliott Montreal, Canada mobile manipulator; provided supplementary open-source code on GitHub

2018 **Robot Common-Sense Embedding** Analyzed weaknesses within existing approaches to modeling Advisor<sup>.</sup> Sonia Chernova semantic knowledge graphs for robotics applications Atlanta, GA Developed a machine learning pipeline using C++ and Python that applied knowledge graph embedding to the problem of modeling semantic knowledge graphs for robotics applications Quantitatively evaluated our framework against existing approaches in regards to inference performance and scalability Our method empirically advanced the state-of-the-art and results were presented in a manuscript published in ICRA 2019, with supplementary open-source code on GitHub 2018 Mentored First Place Undergraduate Research Project Director: Guided an undergraduate team of 4 to build a SLAM and semantic mapping software system for robot autonomy in home Greg Durgin Atlanta, GA environments System design integrated mapping with object detection and segmentation to provide robots a semantic overlay of a 3D grid map Assisted integrating a VLP-16 LiDAR in ROS with simulation

and on a mobile manipulator robot for navigation and 3D mapping

# **Publications**

- 1. **Daruna, Angel**, et al. "Enabling Scalable Mineral Exploration: Self-Supervision and Explainability." 2024 IEEE International Conference on Big Data (BigData). IEEE, 2024.
- 2. Daruna, Angel, et al. "GFM4MPM: Towards Geospatial Foundation Models for Mineral Prospectivity Mapping." Proceedings of the 32nd ACM International Conference on Advances in Geographic Information Systems. 2024.
- Chiu, Han-pang, Yi Yao, Angel Daruna, Yunye Gong, Abhinav Rajvanshi, and 3. Giedrius Burachas. "UNCERTAINTY ESTIMATION FOR NEURAL NETWORKS USING GRAPHICAL REPRESENTATION." U.S. Patent Application No. 18/672,221.
- 4. Daruna, Angel, Devleena Das, and Sonia Chernova. "Explainable Knowledge

Graph Embedding: Inference Reconciliation for Knowledge Inferences Supporting Robot Actions." 2022 IEEE International Conference on Intelligent Robots and Systems (IROS). Under review.

- 5. **Daruna, Angel**, Mehul Gupta, Mohan Sridharan, Sonia Chernova, "Continual Learning of Knowledge Graph Embeddings." *2021 IEEE Robotics and Automation Letters (RA-L)*. IEEE, 2021.
- 6. Liu, Weiyu, Dhurv Bansal, **Angel Daruna**, and Sonia Chernova. "Learning Instance-Level N-Ary Semantic Knowledge At Scale For Robots Operating in Everyday Environments." pending publication, *Robotics: Science and Systems 2021*. 2021.
- 7. **Daruna, Angel**, Lakshmi Nair, Weiyu Liu, Sonia Chernova, "Towards Robust One-shot Task Execution using Knowledge Graph Embeddings." 2021 IEEE International Conference on Robotics and Automation (ICRA). IEEE, 2021.
- 8. Liu, Weiyu, **Angel Daruna**, and Sonia Chernova. "Cage: Context-aware grasping engine." *2020 IEEE International Conference on Robotics and Automation (ICRA)*. IEEE, 2020.
- 9. Liu, Weiyu, **Angel Daruna**, Zsolt Kira, and Sonia Chernova. "Path ranking with attention to type hierarchies." *Proceedings of the AAAI Conference on Artificial Intelligence*. Vol. 34. No. 03. 2020.
- 10. Chernova, Sonia, Vivian Chu, **Angel Daruna**, Haley Garrison, Meera Hahn, Priyanka Khante, Weiyu Liu, and Andrea Thomaz. "Situated bayesian reasoning framework for robots operating in diverse everyday environments." *Robotics Research*. Springer, Cham, 2020. 353-369.
- 11. **Daruna, Angel**, Weiyu Liu, Zsolt Kira, Sonia Chernova. "Robocse: Robot common sense embedding." *2019 International Conference on Robotics and Automation (ICRA)*. IEEE, 2019.
- 12. Siddhartha Banerjee, **Angel Daruna**, David Kent, Weiyu Liu, Jonathan Balloch, Abhinav Jain, Akshay Krishnan, Muhammad Asif Rana, Harish Ravichandar, Binit Shah, Nithin Shrivatsav. "Taking Recoveries to Task: Recovery-Driven Development for Recipe-based Robot Tasks." *Proceedings of International Symposium of Robotics Research.* IFRR, 2019.

# **Industry Experience**

2022 - present Manager: Han-Pang Chiu Remote, FL

## Advanced Computer Scientist @ SRI International

 Worked with multidisciplinary technical teams and managers to progress Machine Learning technologies through ideation, design, development, evaluation, deployment, and transition

	<ul> <li>Co-authored multiple conference articles, white papers, RFIs, and proposals for DARPA, NGA, and ARPA-E agencies</li> <li>Communicated with government clients through presentations and meetings, understanding and meeting client expectations</li> </ul>
2021 Manager: Han-Pang Chu Remote, GA	<ul> <li>Vision and Language Navigation Intern @ SRI International</li> <li>Developed a VLN pipeline in Pytorch that hierarchically combined object, natural language, and scene features using Gated Attention Network (Transformer-like) layers</li> <li>Trained the scalable pipeline via imitation and reinforcement learning on GPU clusters using Docker, Tensorboard, and Kubernetes</li> <li>Communicated progress to team members through weekly presentations using data visualizations and presented final results to the division</li> </ul>
2017 Manager: Carlos Montesinos Santa Clara, CA	<ul> <li>Computer Vision and Drone Intern @ Intel</li> <li>Designed the system architecture and built 3 prototype iterations for a proof-of-concept drone application using ROS Python that leveraged real-time deep learning architectures (MobileNet) to do object detection in Tensorflow</li> <li>Analyzed ROS logs from field testing on the Intel Edison and RealSense hardware to debug system errors and optimize performance</li> <li>Mentored more junior team members. Together with senior members, co-authored and submitted two Invention Disclosure Forms related of our work and presented the applications to the Intel Drone Group VP, Anil Nanduri</li> </ul>
2016 Manager: Chris Lightcap Ft. Lauderdale, FL	<ul> <li>Software Engineer @ ADEX, MagicLeap</li> <li>Optimized and designed evaluation of Kalman filtering 6-DoF pose estimation algorithm for augmented reality game controllers</li> <li>Evaluated development microcontrollers against a high accuracy pose estimation system, the Optotrak Certus, and analyzed pose trajectory logs with various filtering parameter settings to optimize high-accuracy pose estimation performance</li> </ul>

 Wrote a C++ program with an OpenCV user interface that displays real-time plots to assist users to tune filters for game controllers

# **Distinguished Awards:**

2016-2021 National Science Foundation Graduate Research Fellowship Program

- 2016-2018 The National GEM Consortium GEM Full Fellow - Intel Sponsored
- 2016-2020 Goizueta Foundation Goizueta Foundation Graduate Fellowship Program
- 2016-2020 Georgia Tech President's Fellowship