Arun Srivatsan Rangaprasad

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SPECIALTIES

Computer vision / Deep learning / Point cloud registration / 3D reconstruction / Data encryption and encoding / Color science / SLAM / Classical machine learning / Sensor design and calibration / Robot Manipulation / Mechanism Design / Rapid Prototyping

PROFESSIONAL EXPERIENCE

| Staff CVML Researcher and Manager | Apple Inc. | 2019-Present |
|-----------------------------------|---------------------------------------|--------------|
| Project Scientist | Carnegie Mellon University | 2018 - 2019 |
| Research Assistant | Carnegie Mellon University | 2013 - 2018 |
| Project Officer | Indian Institute of Technology Madras | 2012- 2013 |

EDUCATION

Carnegie Mellon University
Pittsburgh, USA
PhD and MS in Pobotics

PhD and MS in Robotics 2013- 2018

Thesis: Probabilistic approaches for pose estimation

Indian Institute of Technology Madras Chennai, India M. Tech and B. Tech in Engineering Design

Tech and B. Tech in Engineering Design 2007-2012

(Institute Gold Medalist)

SKILLS

Software Matlab, Python, C, ROS, Pytorch, Git, Solidworks, Mathematica

Hardware Arduino, 3D printing, Laser cutting, Machining,

EXPERIENCE

AR/VR Algorithm Development

2019-Current

Apple Inc., Vision Products Group

- Growing a team to incubate innovative ideas and algorithms for next-generation Augmented Reality with a
 focus on: Algorithm-Sensor co-design, computer vision, machine learning, multimodal sensor fusion,
 health and comfort
- Shipped several CV/ML algorithms on Apple Vision Pro and iOS.
- Work has been featured in WWDC 2020, 2021 and 2023
- Setup a large indoor space for long-term targeted data collection to support various teams across Apple
- Collaborating with upwards of 20 teams across Apple including system, design, hardware, software, applications, and health.

App Clip Codes Development

2019-Current

Apple Inc., Vision Products Group

- Worked on development of Apple Proprietary QR codes called App Clip Codes. [Link]
- Used color science theory, encryption/decryption techniques to develop algorithms for securely encoding information in the code
- Used computer vision and deep learning techniques to develop algorithms for decoding the codes

- Collaborated with design teams to ensure the algorithms developed support the visual design
- Shipped the product worldwide as part of iOS 14.3

Multimodal Perception 2018 - 2019

Carnegie Mellon University

- Developed systems, tools and algorithms for simultaneous localization and mapping in robotic surgeries (Body-SLAM) using vision and touch sensing. [Video]
- Used deep learning techniques to perform tasks such as classification, segmentation, registration and hole filling for point clouds.

Probabilistic Approaches to Pose Estimation

2013 - 2018

Carnegie Mellon University

- Developed linear Bayesian filtering algorithms for pose estimation. Applications include 3D reconstruction, hand-eye calibration, SLAM, manipulation, structure from motion and object tracking. [Video]
- Developed a generalized framework for registration of point clouds. The approach generalizes and improves existing methods such as ICP, CPD, G-ICP, EM-ICP, and GoICP. [Video] [Video]
- Developed an augmented reality system for minimally invasive robotic surgeries. The system allows for real time model update and intuitive dynamic annotations by surgeons. [Video]

Kinematic, dynamics, control and singularity analysis of spatial parallel manipulators

2010- 2012

Indian Institute of Technology Madras

- Designed and developed a parallel manipulator with applications in aviation training/trauma recovery. [Video]
- Developed a concept called safe working zones (SWZ), which helps find the workspace of a manipulator free of singular configurations, link interferences and not restricted by the physical limits of the joints.
- Used population-based nonconvex optimization (NSGA) to design coupler curves for four bar and six bar mechanisms.

Design and fabrication of a new parallel manipulator

Summer 2011

Centre for Artificial Intelligence and Robotics

Conceptualized, designed and prototyped a novel 3 DoF parallel manipulator with reconfigurable degrees
of freedom.

Development of exoskeleton for shoulder complex

Summer 2010

Simon Fraser University

 Prototyped an exoskeleton for shoulder complex for rehabilitation of paralytic and stroke affected people.

HONORS AND AWARDS

| Recipient of the Centre for Machine Learning and Health (CMLH) Fellowship in Digital Health. | 2018 |
|--|------|
| Best paper finalist at the International Symposium on Medical Robotics (ISMR). | 2018 |
| Gold medalist, Institute Merit Prize for highest CGPA among students of all departments in IITM. | 2012 |
| Institute Merit Prize for highest CGPA among all students of the Department of Engineering Design. | 2012 |
| 3rd prize in ASME International Student Mechanism and Robot Design Contest, Washington DC. | 2011 |

PATENTS

- 1. Have 35 patents issued and 36 pending patent applications from my work at Apple.
- 2. Arun Srivatsan Rangaprasad, and Anselm Grundhoefer, "Color Correction Based on Perceptual Criteria and Ambient Light Chromaticity", US 20230298541 · Issued Sep 21, 2023
- 3. Arun Srivatsan Rangaprasad, Anselm Grundhoefer, Mohamed Selim Ben Himane, Dhruv A Govil, Joseph M Luxton, Jean-Charles Bernard Marcel Bazin, and Shubham Agrawal, "VISUAL MARKER", US 20230297801 · Issued Sep 21, 2023
- Jean-Charles Bernard Marcel Bazin, Anselm Grundhoefer, and Arun Srivatsan Rangaprasad, "Optimal matching of image portion data sets", US 11734527 · Issued Aug 22, 2023
- 5. Anselm Grundhoefer, and Arun Srivatsan Rangaprasad, "Time varying visual marker verification and decoding", US 11,610,088 · Issued Mar 21, 2023
- 6. Ying Bai, Kieran Dimond, James Christopher Schneider, Marco Cavallo, Arun Srivatsan Rangaprasad, Tiejian Zhang, "Visualization of non-visible phenomena", US20220292821A1 · Issued Sep 15, 2022
- 7. Arun Srivatsan Rangaprasad, Anselm Grundhoefer, Selim Ben Mohammed Himane, Dhruv Govil, Luxton Joseph, Jean Charles Bazin, Shubham Agrawal, "Visual Marker", WO2021257527A1 · Issued Dec 23, 2021
- 8. Arun Rangaprasad Srivatsan, Anselm Grundhoefer, Dhruv A Govil, "Colored visual markers for variable use", US20210150295A1 · Issued May 20, 2020
- 9. Sandipan Bandyopadhyay, R. Arun Srivatsan and Tarun Mehta, "A reconfigurable parallel manipulator", Indian patent 5187/CHE/2012, December 2012.
- 10. Sandipan Bandyopadhyay, R. Arun Srivatsan and Tarun Mehta, "An encoder mounting assembly", Indian provisional patent 3277/CHE/2012, August 2012.
- 11. R. Arun Srivatsan, Bhavin Gawali, Hem Rampal, Kartik Mehta, Sandipan Bandyopadhyay and G. Saravana Kumar, "A hands free device for enabling the differently-abled to turn the pages of a book while reading: A device to automatically flip pages of book without use of hands", Indian patent 2597/CHE/2010, September 2010.

PUBLICATIONS

- 1. Tejas Zodage, Rahul Chakwate, Vinit Sarode, R. Arun Srivatsan, and Howie Choset, "Correspondence Matrices are Underrated", In proceedings of IEEE International Conference on 3D Vision(3DV), 2020.
- 2. Vinit Sarode, Animesh Dhagat, **R. Arun Srivatsan**, Nicolas Zevallos, Simon Lucey and Howie Choset, "MaskNet: A Fully-Convolutional Network to Estimate Inlier Points", *In proceedings of IEEE International Conference on 3D Vision*(3DV), 2020.
- 3. Vinit Sarode, Xueqian Li, Hunter Goforth, Yasuhiro Aoki, **R. Arun Srivatsan**, Simon Lucey and Howie Choset, "PCRNet: Point Cloud Registration Network using PointNet Encoding", *arXiv* preprint *arXiv*:1908.07906, 2019.
- 4. Vinit Sarode, Xueqian Li, Hunter Goforth, Yasuhiro Aoki, **R. Arun Srivatsan**, Simon Lucey and Howie Choset, "One Framework to Register Them All: PointNet Encoding for Point Cloud Alignment", *arXiv* preprint *arXiv*:1912.05766, 2019.
- 5. **R. Arun Srivatsan**, Nicolas Zevallos, Prasad Vagdargi and Howie Choset, "Registration with a small number of sparse measurements", in the International Journal of Robotic Research (IJRR), 2019. [PDF]

- 6. Hunter Goforth, Yasuhiro Aoki, **R. Arun Srivatsan** and Simon Lucey, "PointNetLK: Robust & Efficient Point Cloud Registration using PointNet", in proceedings of conference on Computer Vision and Pattern Recognition (CVPR), 2019. [PDF]
- 7. P. Yin, R. Arun Srivatsan, Y. Chen, X. Li, H. Zhang, L. Xu, L. Li, Z. Jia, J. Ji and Y. He, "MRS-VPR: a multi-resolution sampling based global visual place recognition method", In proceedings of the IEEE International Conference on Robotics and Automation, Montreal, Canada, May 2019. [PDF]
- 8. P. Yin, L. Xu, X. Li, C. Yin, Y. Li, R. Arun Srivatsan, L. Li, J. Ji and Y. He, "A Multi-Domain Feature Learning Method for Visual Place Recognition", In proceedings of the IEEE International Conference on Robotics and Automation, Montreal, Canada, May 2019. [PDF]
- 9. Murali Karnam, Aravind Baskar, **R. Arun Srivatsan**, and Sandipan Bandyopadhyay, "Computation of the safe working zones of parallel manipulators", Robotica, 2019. [PDF]
- 10. Tejas Zodage, Arkadeep N Chaudhury, **R. Arun Srivatsan**, Nicolas Zevallos and Howie Choset, "Hand-held stiffness measurement device for tissue analysis", in the proceedings of the Hamlyn symposium on Medical Robotics, UK, DOI: 10.31256/HSMR2019.54, June 2019. [PDF]
- 11. Stam Athiniotis, R. Arun Srivatsan, and Howie Choset, "Deep Q Reinforcement Learning for Autonomous Navigation of Surgical Snake Robot in Confined Spaces", in the proceedings of the Hamlyn symposium on Medical Robotics, UK, DOI: 10.31256/HSMR2019.18, June 2019. [PDF]
- 12. **R. Arun Srivatsan**, Tejas Zodage and Howie Choset, "Globally optimal registration of noisy point clouds", arXiv preprint arXiv:1908.08162, 2019.
- 13. R. Arun Srivatsan, Mengyun Xu, Nicolas Zevallos and Howie Choset, "Probabilistic Pose Estimation Using a Bingham Distribution-Based Linear Filter", in the International Journal of Robotics Research (IJRR), 2018. [PDF]
- 14. **R. Arun Srivatsan**, "Probabilistic Approaches for Pose Estimation", PhD thesis report, Carnegie Mellon University, CMU-RI-TR-18-24, 2018. [PDF]
- 15. Nicolas Zevallos, **R. Arun Srivatsan**, Hadi Salman, Lu Li, Jianing Qian, Saumya Saxena, Mengyun Xu, Kartik Patath and Howie Choset, "A Real-time Augmented Reality Surgical System for Overlaying Stiffness Information", in proceedings of Robotics: Science and Systems, Pittsburgh, PA, 2018. [PDF]
- 16. Hadi Salman, Elif Ayvali, R. Arun Srivatsan, Yifei Ma, Nicolas Zevallos, Rashid Yasin, Long Wang, Nabil Simaan and Howie Choset, "Trajectory-Optimized Sensing for Active Search of Tissue Abnormalities in Robotic Surgery", in proceedings of international conference on robotics and automation (ICRA), Brisbane, Australia, 2018. [PDF]
- 17. Nicolas Zevallos, R. Arun Srivatsan, Hadi Salman, Lu Li, Jianing Qian, Saumya Saxena, Mengyun Xu, Kartik Patath and Howie Choset, "A surgical system for automatic registration, stiffness mapping and dynamic image overlay", in proceedings of 2018 International Symposium on Medical Robotics (ISMR), Atlanta, GA, 2018, pp. 1-6. (Best paper finalist) [PDF]
- 18. R. Arun Srivatsan, Mengyun Xu, Nicolas Zevallos and Howie Choset, "Bingham Distribution-Based Linear Filter for Online Pose Estimation", in proceeding of the Robotics: Science and Systems, 2017. [PDF]
- 19. Lu Li, Bocheng Yu, Chen Yang, Prasad Vagdargi, R. Arun Srivatsan and Howie Choset, "Development of an Inexpensive Bi-axial Force Sensor for Minimally Invasive Surgery", in proceedings of the IEEE/RSJ International Conference on Intelligent Robots and Systems, Vancouver, Canada, 2017. [PDF]
- 20. Kartik Patath, R. Arun Srivatsan, Nico Zevallos, Howie Choset, "Dynamic Texture Mapping of 3D models for Stiffness Map Visualization", workshop on medical imaging, IEEE/RSJ International Conference on Intelligent Robots and Systems, Vancouver, Canada, 2017. [PDF]
- 21. **R. Arun Srivatsan**, Prasad Vagdargi and Howie Choset, "Sparse Point Registration", in proceedings of the International Symposium on Robotics Research, 2017. [PDF]

- 22. Prasad Vagdargi, **R. Arun Srivatsan**, Nicolas Zevallos, Feroze M. Naina and Howie Choset, "Multimodal Approach to Registration Using Stereo Imaging and Contact Sensing", workshop on Haptics in Robotics: Science and Systems, 2017. [PDF]
- 23. **R. Arun Srivatsan** and Howie Choset, "Multiple Start Branch and Prune Filtering Algorithm for Nonconvex Optimization", in the proceedings of Workshop on the Algorithmic Fundamentals of Robotics, San Francisco, 2016. [PDF]
- 24. **R. Arun Srivatsan**, Gillian T. Rosen, Feroze M. Naina, and Howie Choset, "Estimating SE(3) elements using a dual-quaternion based linear Kalman filter", in the proceedings of Robotics Science and Systems, Michigan, 2016. [PDF]
- 25. **R. Arun Srivatsan**, Long Wang, Elif Ayvali, Nabil Simaan, and Howie Choset, "Simultaneous Registration and Stiffness mapping of a Flexible Environment using Stiffness and Geometric Prior", in the proceedings of the Hamlyn symposium on Medical Robotics, London, UK, June 2016. [PDF]
- 26. **R Arun Srivatsan**, Elif Ayvali, Long Wang, Rajarshi Roy, Nabil Simaan and Howie Choset, "Complementary Model Update: A Method for Simultaneous Registration and Stiffness Mapping in Flexible Environments", In the proceedings of the International Conference on Robotics and Automation, Sweden, May 2016. [PDF]
- 27. Elif Ayvali, R Arun Srivatsan, Long Wang, Rajarshi Roy, Nabil Simaan, and Howie Choset, "Using Bayesian Optimization to Guide Probing of a Flexible Environment for Simultaneous Registration and Stiffness Mapping", in proceedings of the International Conference on Robotics and Automation, Sweden, May 2016.

 [PDF]
- 28. S. Agarwal, R. Arun Srivatsan, S. Bandyopadhyay, "Analytical Determination of the Proximity of Two Right-circular Cylinders in Space", ASME. J. Mechanisms Robotics; 8(4):041010-041010-10, 2013. [PDF]
- 29. **R. Arun Srivatsan**, Rajarshi Roy, Long Wang, Nabil Simaan, and Howie Choset, "Registering Surgical Tool to a Soft Body using Mechanical Palpation" Tech. report CMU-RI-TR-13, Robotics Institute, Carnegie Mellon University, June, 2015. [PDF]
- 30. R. Arun Srivatsan, Matthew Travers and Howie Choset, "Using Lie algebra for shape estimation of medical snake robots", proceedings of the 27th IEEE/RSJ International Conference on Intelligent Robots and Systems, Chicago, 2014. [PDF]
- 31. **R. Arun Srivatsan** and Sandipan Bandyopadhyay, "Analysis of constraint equations and their singularities", in proceedings of 14th International Symposium on Advances in Robot Kinematics, Slovenia, June 2014.

 [PDF]
- 32. **R. Arun Srivatsan**, "Design, analysis and development of MaPaMan", Masters thesis report, Indian Institute of Technology Madras, 2018. [PDF]
- 33. **R. Arun Srivatsan**, Sandipan Bandyopadhyay, Ashitava Ghosal, "Analysis of the degrees-of-freedom of spatial parallel manipulators in regular and singular configurations", Mechanism and Machine Theory, Vol 69, Pages 127-141, 2013. [PDF]
- 34. **R. Arun Srivatsan** and Sandipan Bandyopadhyay, "On the position kinematic analysis of MaPaMan: a reconfigurable three-degrees-of-freedom spatial parallel manipulator", Mechanism and Machine Theory, Vol 62, Pg.150-165, 2013. [PDF]
- 35. A. V. Vishwanath, R. Arun Srivatsan and M. Ramanathan, "Minimum area enclosure and alpha hull of a set of freeform planar closed curves", Computer-Aided Design, Volume 45, Issue 3, Pages 751-763, 2013.

 [PDF]
- 36. Jaideep Badduri, R. Arun Srivatsan, G. Saravana Kumar and Sandipan Bandyopadhyay, "Coupler-curve synthesis via multi-objective optimisation using NSGA-II", In proceedings of iNaCoMM, December 2013. [PDF]
- 37. **R. Arun Srivatsan**, Sandipan Bandyopadhyay, "Determination of the safe working zone of a parallel manipulator", Proceedings of the 6th International Workshop of Computational Kinematics, Vol 15, 2013. [PDF]

- 38. **R. Arun Srivatsan**, Sandipan Bandyopadhyay, "An analytical formulation for finding the proximity of two arbitrary cylinders in space", proceedings of the International Conference on Advances in Robotics, 2013. [PDF]
- 39. Jaideep Badduri, R. Arun Srivatsan, G. Saravana Kumar and Sandipan Bandyopadhyay, "Coupler-curve synthesis of a planar four-bar mechanism using a genetic algorithm-based optimization method", 9th International Conference on Simulated Evolution And Learning, Volume 7673, pp 460-469, 2012. [PDF]
- 40. **R. Arun Srivatsan**, Long Wang, Elif Ayvali, Nabil Simaan and Howie Choset, "Simultaneous Registration and Stiffness mapping of a Flexible Environment using Stiffness and Geometric Prior", in the proceedings of the Hamlyn symposium on Medical Robotics, UK, June 2016. [PDF]

AUTHORED GRANTS

NSF CMMI- 1734360, "In-Situ Collaborative Robotics in Confined Spaces", 2017. PI: Howie Choset and Nabil Simaan

ACADEMIC SERVICE

Invited Speaker at Workshop on Continuum Robots in Medicine - Design, Integration, and Applications, IROS 2017. Reviewer for journals: IEEE T-RO, IEEE T-PAMI, ROBOTICA, TBME, RAM, RAL, ASME JMR, Mechatronics. Reviewer for conferences: RSS, ICRA, IROS, WAFR, ICAR, IDETC/CIE, Bio-Rob, Hamlyn symposium. Teaching Assistant for, "Robot Kinematics and Dynamics", CMU, 2014. Teaching Assistant for, "Geometric Modeling" and "Computer Aided Design" at IIT Madras, 2012.

| MENTORING | | |
|--------------------------|---|-------------|
| PhD students | | |
| Tawaana Homavazir | University of California SD | 2022 |
| Bingxin Hou | Santa Clara University | 2021 |
| Arkadeep Chaudhary | Carnegie Mellon University | 2018-2019 |
| Tejas Sudharshan Mathai | Carnegie Mellon University | 2016-2018 |
| Venkataraman Rajagopalan | Carnegie Mellon University | 2015-2018 |
| Masters students | | |
| Rita Tlemcani | Stanford University | 2022 |
| Tejas Zodage | Carnegie Mellon University | 2018-2020 |
| Xueqian Li | Carnegie Mellon University | 2018-2020 |
| Mengjie Li | Carnegie Mellon University | 2018-2020 |
| Stamatis Athiniotis | Carnegie Mellon University | 2018-2020 |
| Animesh Dhagat | Carnegie Mellon University | 2018-2019 |
| Hadi Salman | Carnegie Mellon University | 2017-2018 |
| Bradley Saund | Carnegie Mellon University | 2017 |
| Shohin Mukherjee | Carnegie Mellon University | 2017 |
| Feroze Naina | Carnegie Mellon University | 2016-2017 |
| Undergraduate students | | |
| Vinit Sarode | Visvesvaraya National Institute of Technology | 2018-2020 |
| Long Tran | Carnegie Mellon University | 2018-2020 |
| Olivia Xu | Carnegie Mellon University | 2017-2018 |
| Tejas Zodage | Birla Institute of Technology and Sciences | 2017-2018 |
| Prasad Vagdargi | Visvesvaraya National Institute of Technology | 2017 |
| Karthik Patath | Visvesvaraya National Institute of Technology | Summer 2017 |
| Gillian Rosen | Carnegie Mellon University | 2014-2016 |
| Nate Appelson | Carnegie Mellon University | 2014-2016 |
| | | |