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# Deepak Raina

## Current Position

**Purdue University** Indiana, USA

SERB - Overseas Visiting Doctoral Fellow (OVDF) January 2022 - Present

**Indian Institute of Technology** 

Prime Minister's Research Fellow (PMRF); Ph.D. in Robotics; GPA: 9/10 July 2019 - Present

EDUCATION

**Indian Institute of Technology** 

Jodhpur, India Master of Technology in Mechanical Engineering (Robotics); GPA: 9.24/10 July 2015 - June 2017

Maharishi Markandeshwar Engg. College

Ambala, India Bachelor of Technology in Mechanical Engineering; GPA:9/10 June 2011 - May 2015

Research Interests

Medical Robotics, Physical Human-Robot Interaction, Tele-robotics, Medical Image Analysis, Robot Learning from Demonstration, Space Robotics, Vision-guided Robotics, Motion-planning, Vehicle Dynamics

SKILLS

• Programming Languages: Python, C++, HTML

- Tools: ROS, Gazebo, MoveIt!, pyTorch, Pybullet, OpenCV, ADAMS; MATLAB, Qt-creator; Solidworks, ANSYS
- Hardware: Sawyer robots, Universal robots (UR10, UR5), RG2 gripper, Intel RealSense camera, Haptic devices

# Academic Experience

## **Doctoral Research Fellow**

July 2020 - Present

Delhi. India

Indian Institute of Technology, Delhi and Purdue University, USA

- Autonomous robotic manipulation of ultrasound probe:
  - \* Formulated a Bayesian Optimization (BO)-based search strategy, utilizing domain expertise, to efficiently locate high-quality images within the scanning region, eliminating the need for thorough scanning.
  - \* Proposed incorporating expert prior knowledge in Bayesian Optimization, obtained through expert demonstrations of high-quality probing poses for high image quality.
  - \* A novel expert's image quality metric model is developed, trained using a dataset of ultrasound images labelled for diagnostic quality by expert radiologists, which provides image feedback of the region to the
  - \* Formulated a new kernel metric, Deep Kernel, which is lower dimensional when compared to standard kernels, which leads to a sample-efficient BO framework for substantially optimizing the high-dimensional controller, including probe position, orientation, and force adjustment.
  - \* Achieved over 50% increase in sample efficiency in comparison to standard BO, with a probe pose and force accuracy of 98.7% and 97.8%, respectively

#### • Ultrasound image quality assessment:

- \* Developed a supervised CNN model for analyzing the quality of inter- and intra-patient ultrasound images, using a dataset of highly variable urinary bladder images, labelled for quality by expert radiologists.
- \* Using deep variational clustering, developed an unsupervised CNN model to classify the ultrasound image quality, to overcome annotation noise in the supervised CNN model.
- \* Achieved remarkable accuracy of 93%, surpassing the state-of-the art networks for image quality assessment
- o Development of robotic ultrasound probe gripper with jelly dispenser:
  - \* Designed a gripper that can accommodate various types of probes with varying cross-sections at the point of grip. The operator can easily attach and detach different probes using this gripper.
  - \* The gripper features an ultrasound gel dispenser that dispenses the gel automatically onto the patient's skin, using a camera image to detect the presence of gel between the probe and the body.
- Telerobotic Ultrasound (TR-US) for safety of doctors during COVID-19 (Video):
  - \* Developed the control architecture to teleoperate the ultrasound probe attached to the robotic arm
  - \* System performance analysis through 21 human trials at All India Institute of Medical Sciences (AIIMS), Delhi

\* Results demonstrated < 0.05 P-value on comparing tele-robotic and manual ultrasound images, gradual improvement of NASA-TLX test parameters, and 0.95 value of reliability index for questionnaire survey.

## Masters Research Fellow

June 2016 - May 2017

Indian Institute of Technology, Jodhpur

# o Impact modeling and control of multi-arm space robot for capturing orbiting objects:

- \* Proposed unified framework for impact modeling and post-impact control of orbiting objects.
- \* Post-impact reactionless control for stabilization of the multi-arm robot is proposed.
- \* Numerical studies of different impact scenarios are analyzed in case multi-arm open and closed-loop impacts.
- \* An adaptive reactionless control algorithm is proposed to capture unknown targets.

## Graduate Teaching Assistant

Indian Institute of Technology, Jodhpur and Delhi; Purdue University, USA

• MFET 442: Programming Robots with ROS

Jan-May 2023

o MCP100: Engineering Visualization and Communication

Jan-May 2020, Jan-Dec 2021 Aug-Dec 2019

o MCL211: Design of Machines

Jan-May 2017, Aug-Dec 2016

o ME311: Dynamics of Machines and Mechanisms

o ME222: Kinematics of Machines and Mechanisms

Jan-May 2016

- \* Designed and graded questions for homework assignments and quizzes
- \* Conducted weekly office hours and attended classes to assist students during in-class doubts.

#### Graduate Mentor

Indian Institute of Technology, Jodhpur and Delhi; Purdue University, USA

- o Mentored 1 undergraduate, 1 graduate and 5 intern students in Robotics, AI and Medical imaging analysis
- Facilitated weekly meetings to track project progress and provide guidance on hardware, software, and tools.
- The research outcomes were published in international academic journals, conferences and patents.

## Student Volunteer

I-Hub Foundation for Cobotics (IHFC) at IIT Delhi

Dec 2019 - Present

- Lead editor of half yearly newsletters.
- Promoting hub activities in social media, writing proposals for new initiatives

## Vice President

SAE INDIA Collegiate Club at MMEC Mullana

Mar 2014 - 2015

- o Organized and oversaw activities bringing together automobile enthusiasts, popularizing automobile engineering.
- Initiated participation of college in various automotive competitions organized by SAE, ASME etc.

## Team Captain

ASME-Human Powered Vehicle Challenge (HPVC) Team

Sep 2014 - Feb 2015

- Led a team of 15 students having 5 departmental heads for designing and fabricating a racing tricycle.
- Managed budget of USD 2000 allocating it to material procurement, transport and others.

## Industrial Experience

# TCS Robotics Research and Innovation Lab

Delhi, India

Researcher - Robotics group

Dec. 2017 - July 2019

# • Robotic packing of Long Distance Carriers (LDCs) (Video):

- \* Designed new industrial level system to automatically and optimally load parcels in LDC's.
- \* Developed collision-free motion planning module for picking parcels from conveyor and placing in LDC's.
- \* Helped achieve target filling rate of 12 seconds per LDC.

## • Palletizer - Automated Truck Loading System (ATLS):

- \* Designed GUI-based system having a UR-10 manipulator that can load heterogeneous boxes on a pallet.
- \* Increased system throughput by directly planning motions using UR-driver by surpassing ROS-MoveIt library.
- \* Successfully achieved target output of 12 seconds per pick and place of the box.

# • Vision-based Control of Redundant Robotic Manipulators (Video):

\* Path planning is done in image space using RRT-planner, which helps in satisfying multiple task constraints like FoV limits, joint limits, obstacles, singularities, occlusions etc. in the planning stage itself. \* A unique mapping between the feature space and the joint space is established by task-priority method, which uses some DoFs for visual servoing whereas redundant DoFs are used for secondary tasks.

## o Calibration: Robot and Camera:

- \* Developed a package for autonomous calibration of stereo camera with Universal Robots
- \* Automated transformation detection that helps with both eye-to-hand and eye-in-hand setup of the robot.
- \* Added testing support feature to verify the generated robot to camera transformation matrix.
- \* Dropped calibration time from 20 minutes to 9 minutes, and resource requirement from 2 person to a 1 person.
- Chitrakar: Robot Artist (Video):
  - \* Developed a robotic arm to draw a human face as a recognizable non-self-intersecting loop (Jordan curve).
  - \* Designed motion planning module and novel gripper to complete the drawing within 30 minutes.
  - \* This work demonstrates the use of robotics to augment humans in executing difficult craft-work.

#### Tata Automation Limited

Pune, India

Trainee

Jun. 2016 - Jul. 2016

- **BRABO**: This is first made-in-India industrial articulated robot. Designed and performed experiments for design evaluation, validation and testing of this robot.
- PID Tunning: Reduced the vibration of robot joints by tuning the PID values for motor-controller setup.

## Relevant Course-Work

Robotics, AI for Cognitive Robot Intelligence, Reinforcement Learning [Coursera], Computer Vision, Machine Learning [NPTEL], Linear-Systems Theory, Linear Algebra, Multibody Dynamics, Computer-Aided Design, Finite Element Method, Vehicle Dynamics

## ACHIEVEMENTS

- DST AWSAR 2022 Award: Distinguished as one of the nation's top 100 scientific research stories for my doctoral research story on Tele-robotic Ultrasound.
- SERB Overseas Visiting Doctoral Fellowship (2022-2023): Among 25 Ph.D. students to be selected across country to spend 1.5 years at Purdue University, USA.
- Runner-up International Robot Design Competition Award (2021): Awarded to our Telerobotic Ultrasound system at ICSR 2021 Robot Design Competition for the COVID-19 innovative response.
- Director's Honorarium (2021): Awarded by Director of IIT Delhi for my efforts in establishing the Technology Innovation Hub (TIH) on Collaborative robotics (Cobotics) at IIT Delhi.
- Prime Minister's Research Fellowship (2019-2023): Among 10 students to be selected across country in Mechanical Engineering. This fellowship is awarded by Ministry of Education (MoE) for persuing Ph.D. at IITs
- Dassault Systèmes Design Award (2014): Awarded  $2^{nd}$  prize in design of human-powered vehicle competition organized by ASME at IIT Delhi.
- Indira Gandhi Merit Scholarship (2011-2015): Awarded by Director of Higher Education for securing 7<sup>th</sup> rank in 12<sup>th</sup> state board exams.
- Letter of Appreciation (2011): Awarded by Union Minister of India Mr. Anurag Thakur for excellent performance in  $12^{th}$  state board exams

## **PUBLICATIONS**

#### • Conference

 Robotic Sonographer: Autonomous Robotic Ultrasound using Domain Expertise in Bayesian Optimization, [Accepted]

Deepak Raina, SH Chandrashekhara, Richard Voyles, Juan Wachs, Subir Kumar Saha IEEE International Conference on Robotics and Automation (ICRA) 2023.

• Deep Kernel and Image Quality Estimators for Optimizing Robotic Ultrasound Controller using Bayesian Optimization, [Accepted]

Deepak Raina, SH Chandrashekhara, Richard Voyles, Juan Wachs, Subir Kumar Saha IEEE International Symposium on Medical Robotics (ISMR) 2023.

• Expert-Agnostic Ultrasound Image Quality Assessment using Deep Variational Clustering, [Accepted] Deepak Raina, Dimitrios Ntentia, SH Chandrashekhara, Richard Voyles, Subir Kumar Saha IEEE International Conference on Robotics and Automation (ICRA) 2023.

 Slim U-Net: Efficient Anatomical Feature Preserving U-net Architecture for Ultrasound Image Segmentation, [Accepted]

Deepak Raina, Kashish Verma, Chandrashekhara SH, Subir Kumar Saha

ACM International Conference on Biomedical and Bioinformatics Engineering (ICBBE) 2022

• Comprehensive Telerobotic Ultrasound System for Abdominal Imaging: Development and in-vivo Feasibility Study, [Paper]

Deepak Raina, Hardeep Singh, Subir Kumar Saha, Chetan Arora, Ayushi Agarwal, Chandrashekhara Sh, Krithika Rangarajan, Suvayan Nandi

IEEE International Symposium on Medical Robotics (ISMR) 2021.

o AI-based Modeling and Control of Robotic Systems: A Brief Tutorial, [Paper]

Deepak Raina, S.K. Saha

IEEE International Conference on Robotics and Computer Vision (ICRCV) 2021.

• A Novel Image-based Path Planning Algorithm for Eye-in-Hand Visual Servoing of a Redundant Manipulator in a Human Centered Environment, [Paper]

Deepak Raina, P. Mithun, Suril V. Shah, Swagat Kumar

IEEE International Conference on Robot and Human Interactive Communication (Ro-Man), 2019.

• Impact Modeling and Estimation for Multi-Arm Space Robot while Capturing Tumbling Orbiting Objects, [Paper]

Deepak Raina, Suril V. Shah

ACM Proceedings of Advances in Robotics (AIR), 2017.

#### • Journal

• USQNet: Deep Learning Model for Enhancing Quality Assessment of Ultrasound Images using Multi-scale and Fine-grained processing, [Under Review]

Deepak Raina, SH Chandrashekhara, Richard Voyles, Juan Wachs, Subir Kumar Saha

IEEE Transactions on Biomedical Engineering (TBME) 2023.

o Tele-robotic ultrasound: an initial feasibility study, [Paper]

SH Chandrashekhara, K. Rangarajan, A. Agrawal, S. Thulkar, S. Gamanagatti, Deepak Raina, S.K. Saha and Chetan Arora,

World Journal of Methodology 2022.

• Comprehensive Impact Modeling and Reactionless Control for post-capturing and manoeuvring of orbiting objects using a Multi-arm space robot, [Paper]

Deepak Raina, Sunil Gora, Dheeraj Maheshwari, Suril V. Shah,

Acta Astronautica 2021.

o Design and Development for Roll Cage of All-Terrain Vehicle, [Paper]

Deepak Raina, Rahul Dev Gupta, Rakesh Kumar Phanden

International Journal for Technological Research in Engineering (IJTRE), 2015.

## Workshop

 $\circ\,$  Local and global feature fusion for ultrasound image quality assessment: Towards autonomous ultrasound,

Deepak Raina, Mythra V. Balakuntala, Richard Voyles, Subir Kumar Saha,

Workshop on Human-centered Autonomy in Medical Robotics,

IEEE International Conference on Robotics and Automation (ICRA) 2022 [Link]

• Telerobotic Ultrasound: Towards safer, precise and remote diagnosis of COVID-19 patients,

Deepak Raina, Suvayan Nandi, Subir Kumar Saha, Chetan Arora, Krithika Rangarajan and Chandrashekhara Sh, Workshop on Autonomous System in Medicine,

IEEE International Conference on Intelligent Robots and Systems (IROS) 2020 [Link]

o Chitrakar: Robotic System for Drawing Jordan Curve of Facial Portrait, [Paper]

Aniruddha Singhal, Ayush Kumar, Shivam Thukral, Deepak Raina, Swagat Kumar,

Workshop on Creativity and Robotics,

International Conference on Social Robotics (ICSR), 2020 [Link]

• Reactionless control and target manoeuvring of orbiting object in post-capture phase using a multi-arm space robot,

Deepak Raina, Sunil Gora, Suril V. Shah

Workshop on Space Robotics,

IEEE International Conference on Robotics and Automation (ICRA) 2020 [Link]

## • Book Chapters

• Modeling and Estimation of Closed-Loop Impact for Multi-arm Space Robot While Capturing a Tumbling Orbiting Object, [Paper]

Deepak Raina, Sunil Gora, Suril V. Shah

Machines, Mechanism and Robotics, Lecture Notes in Mechanical Engineering, Springer, 2019

## • Patents

Modular Robotic Ultrasound Probe Gripper with Autonomous Gel Dispenser [Submitted],
Deepak Raina, Ziming Zhao, Richard Voyles, Juan Wachs, Subir Kumar Saha, SH Chadrashekhara
App. No. 202311002219

o Autonomous multi-bin parcel loading system,

Aniruddha Singhal, Harshad Kahdilkar, Venkat Raju, Deepak Raina, Venkatesh S. Prasad, Sivam Thukral, Rajesh Sinha, Filed on July 14, 2019

#### • Theses

 Impact Modeling and Estimation for Multi-Arm Space Robot while Capturing Tumbling Orbiting Objects,

Supervisor: Prof. Suril V. Shah,

Department of Mechanical Engineering, IIT Jodhpur

## • News

• IIT Delhi, AIIMS New Delhi and Addverb Co-develop Telerobotic Ultrasound System During COVID Times

NDTV, Hindu, Dainik Jagran, News18, IIT Delhi, Times of India

 $\circ$  Chitrakar: A system that can transform images of human faces into drawings  $\underline{\text{TechXplore}}, \underline{\text{AtomsTalk}}$ 

## ACADEMIC PROJECTS

# Course Projects

Masters and Doctorate (Reports and Codes)

- $\circ~$  Symbolic motion planning of mobile manipulator in a room environment
- o Bayesian state estimation of underwater robot using acoustic observations
- o Hand gesture-based control of Music Player using Convolutional Neural Network (CNN)
- o Potential field-based motion planning of a serial robot among obstacles
- o Image-based visual servoing (IBVS) controller for the UR5 robotic arm
- o Solidworks API for triangulation of solid models using Delaunay Triangulation
- o Adaptive slicing procedure for layered manufacturing and generate G-Codes
- o Acceleration, braking, ride and steering dynamics calculation of Mahindra XUV500 and simulation in AdamsCar

## Design and fabrication of Off-Road Vehicle

SAE BAJA 2015

Lead Designer, Vice-captain

March 2014 - 15

- $\circ~$  Designed a roll-cage for this vehicle using design optimization techniques
- o The roll-cage, suspension arms, hub and knuckle was tested against all modes of failure with ANSYS
- Worked on braking system design and dynamics
- $\circ\,$  Prepared DFMEA for the vehicle. Ranked  $36^{th}$  out of 120 teams

# Design and fabrication of Human-Powered Vehicle

ASME HPVC 2014

Captain, Lead Designer

Sep 2013-Feb 2014

- o Designed a lightweight and stable HPV using tadpole configuration with Rollover Protection System
- o Performed ergonomics study so that human can apply its peak power with less fatigue
- $\circ$  The fairing is designed and validated to reduce drag forces. Won  $2^{nd}$  prize in Design

## EXTRA CO-CURRICULAR ACTIVITIES

- Represented M.M. University as a player in All India Inter University Badminton Championship
- Volunteering under National Service Scheme (NSS) for 2 years including 7 days' special camp every 6 months
- Green Belt in Martial Arts

## References

- Ph.D. Advisor: Prof. Subir Kumar Saha, Indian Institute of Technology, Delhi, India; Email: saha@mech.iitd.ac.in
- Ph.D. Advisor: Prof. Richard Voyles Purdue University, West Lafayette, USA; Email: rvoyles@purdue.edu
- Collaborator: Prof. Juan Wachs Purdue University, West Lafayette, USA; Email: jpwachs@purdue.edu
- Collaborator: Prof. S.H. Chandrashekhara All India Institute of Medical Sciences, Delhi, India; Email: drchandruradioaiims@gmail.com
- Collaborator: Prof. Chetan Arora Indian Institute of Technology, Delhi, India; Email: chetan@cse.iitd.ac.in