# Dhruv Patel

# Curriculum Vitae

I am currently the Stephen Timoshenko Distinguished Postdoctoral Fellow at *Stanford University* working at the intersection of Deep Learning and Computational Sciences.

## Research Interests

Scientific Machine Learning, Deep Generative Modeling, Bayesian Inference, Uncertainty quantification, Computer Vision, Computational Mechanics, Medical Imaging.

# Academic History

### Postdoctoral Fellow,

Stanford University, Stanford, USA. Mechanics and Computation Group

#### PhD, Computational Mechanics,

University of Southern California (USC), Los Angeles, USA.

Thesis: Physics-based data-driven inference.

Advisor: Prof. Assad Oberai

### MTech, Appled Mechanics,

Indian Institute of Technology - Delhi, New Delhi, India.

Thesis: Modeling of a supercoiled DNA using elastic rod model employing self-contact phenomena.

#### BE, Mechanical Engineering,

L. D. College of Engineering (LDCE), Ahmedabad, India.

# Selected Honours & Awards

- 2022 **Best Dissertation Award**, Department of Mechanical Engineering, USC.
- 2022 Runner up of the **William F. Ballhaus Jr. Award for Best Dissertation** in Viterbi School of Engineering, USC.
- 2021 Stephen Timoshenko Distinguished Postdoctoral Fellowship, Stanford University
- 2019 The Honourable Mention of 2019 Karel Urbanek Award for Best Student Paper, SPIE Advanced Lithography, San Jose, CA  $(2^{nd} \text{ place})$ .
- 2018 Finalist of the Best Student Poster competition,  $13^{th}$  World Congress on Computational Mechanics, New York City, NY.
- $9^{th}$  Gene Golub SIAM summer school on inverse problems and uncertainty quantification scholar-ship, Breckenridge, CO.
- 2016 Prof. Karunes Memorial Award for Best Master's Thesis Applied Mechanics department, IIT
- 2015 Ministry of Human Resource and Deelopment, Government of India fellowship M.Tech., IIT Delhi.
- 2009 Ministry of Human Resource and Development, Government of India, national merit scholarship, 2013 B.E., LDCE.

## **Publications**

## Journal Articles

- D. Patel, R. Tibrewala, A. Vega, L. Dong, N. Hugenberg, A. Oberai "Circumventing the solution of inverse problems in mechanics through deep learning: Application to elasticity imaging", *Journal of Computer Methods in Applied Mechanics and Engineering (CMAME)*. [Link]
  Selected media highlights: 1, 2, 3, 4, 5
- [2] **D. Patel**, R. Bonam, A. Oberai "Deep learning-based detection, classification, and localization of defects in semiconductor processes", *Journal of Micro/nanolithography, MEMS, and MOEMS*. [Link]
  - Selected media highlights: 1, 2
- [3] **D. Patel**, V. Kher, B. Desai, L. Xiaomeng, S. Cen, N. Nanda, A. Gholamrezanezhad, V. Duddalwar, B. Varghese, A. Oberai "Machine learning-based predictors for COVID-19 disease severity", *Scientific Reports*. [Link]
- [4] **D. Patel**, A. Oberai "GAN-based priors for quantifying uncertainty in supervised learning" *SIAM/ASA Journal of Uncertainty Quantification*. [Link]
- [5] **D. Patel**, D. Ray, A. Oberai, "Solution of Bayesian inverse problems and model order reduction using deep generative modeling", *Journal of Computer Methods in Applied Mechanics and Engineering (CMAME)*. [Link]
- [6] R. Raad, D. Patel, C. Hsu, D. Ray, B. Varghese, S. Cen, D. Hwang, I. Gill, V. Duddalwar, A. Oberai "Probabilistic medical image imputation via deep adversarial learning", *Journal of Engineering with Computers*. [Link]
- [7] D. Ray, H. Ramaswamy, **D. Patel**, A. Oberai "The efficacy and generalizability of conditional GANs for posterior inference in physics-based inverse problems", *Numerical Algebra Control and Optimization special issue on Inverse problems*. [Link]
- [8] G. Cacciamani, Y. Xue, U. Durairaj, S. Roberts, D. Patel, R. Raad, G. Miranda, S. Sadeghi, A. Hung, I. Gill, M. Desai, P. Kuhn, A. Oberai "Machine learning framework-based prognostic classifier for predicting recurrence-free survival for patients undergoing radical cystectomy for urothelial bladder cancer", Journal of Clinical Oncology. [Link]
- [9] **D. Patel**, D. Ray, M. Abdelmalik, T. Hughes, A. Oberai "Variationally mimetic operator networks" (in review). [Link]
- [10] **D. Patel**, J. Lee, M. Farthing, T. Hesser, P. Kitanidis, E. Darve "Multi-fidelity Hamiltonian Monte Carlo" .

#### Peer-reviewed Conference and Workshop Articles

- [1] A. Dasgupta, **D. Patel**, D. Ray, A. Oberai "GAN-Flow: A dimension-reduced variational framework for physics-based inverse problems", *Machine Learning and the Physical sciences workshop*,  $36^{th}$  conference on Neural Information Processing System (NeurIPS), 2022. [Link]
- [1] **D. Patel**, J. Lee, M. Forghani, M. Farthing, T. Hesser, P. Kitanidis, E. Darve "Multi-Fidelity Hamiltonian Monte Carlo Method with Deep Learning-based Surrogate", *Second symposium on science-guided AI, AAAI Fall Symposium Series, virtual*, 2021. [Link]
- [2] D. Ray, **D. Patel**, H. Ramaswamy, A. Oberai "Efficient posterior inference and generalization in physics-based Bayesian inference with conditional GANs", *Deep inverse workshop*, 35<sup>th</sup> conference on Neural Information Processing System (NeurIPS), virtual, 2021. [Link]
- [3] **D. Patel**, C. Hsu, B. Varghese, S. Cen, D. Hwang, I. Gill, V. Duddalwar, A. Oberai "Probabilistic recovery of missing phase images in contrast-enhanced CT", *Medical imaging workshop*, 34<sup>th</sup> conference on Neural Information Processing System (NeurIPS), virtual, 2020. [Link]

- [4] **D. Patel**, D. Ray, H. Ramaswamy, A. Oberai "Bayesian inference in physics-driven problems with adversarial priors", *Deep inverse workshop*, 34<sup>th</sup> conference on Neural Information Processing System (NeurIPS), virtual, 2020. [Link]
- [5] D. Patel, A. Oberai "Generative Adversarial Network priors for Bayesian inference", Deep inverse workshop, 33<sup>rd</sup> conference on Neural Information Processing System (NeurIPS), Vancouver, BC, 2019. [Link]
- [6] D. Patel, R. Bonam, A. Oberai "Engineering neural networks for improved defect detection and classification", Proc. SPIE 10959, Metrology, Inspection, and Process Control for Microlithography XXXIII, SPIE Advanced Lithography, San Jose, CA, 2020. [Link]

#### Selected talks

- [1] **D. Patel**, J. Lee, P. Kitanidis, E. Darve "Multi-fidelity Hamiltonian Monte Carlo", *SIAM conference on Mathematics of Data Science (MDS), San Diego, CA*, 2022 (Invited talk)
- [2] **D. Patel** "Physics meets Machine Learning", *Institute of Computational and Mathematical Engineering (ICME), Stanford, Xpo Research Symposium, Stanford, CA,* 2022 (Invited talk)
- [3] **D. Patel** "Efficient Bayesian Inference using Deep Generative Priors and Multi-fidelity Modeling", Energy Resources Engineering (ERE) graduate seminar series, Stanford, CA, 2021 - virtual (Invited talk).[Link]
- [4] **D. Patel**, A. Oberai "Efficient Bayesian inference using deep generative modeling", *Mechanics and Computation group, Stanford, CA*, 2020 virtual (Invited talk).
- [5] **D. Patel**, A. Oberai "Solution of Bayesian inverse problems and uncertainty quantification in deep learning using deep generative modeling", *Combustion Research Facility, Sandia National Lab, Livermore, CA*, 2020 virtual (Invited talk).
- [6] **D. Patel**, A. Oberai "Solution of Bayesian inverse problems and uncertainty quantification in deep learning using deep generative modeling", *Mechanics of materials department, Sandia National Lab, Livermore, CA*, 2020 virtual (Invited talk).
- [7] **D. Patel**, A. Oberai "Physics-based data-driven deep generative models for efficient Bayesian inference", *Climate Modeling Aliance (CliMA)*, *Caltech, Pasadena, CA*, 2020 (Invited talk).
- [8] **D. Patel**, A. Oberai "To know what we don't know: quantifying uncertainty using sample-based priors", *Mechanics seminar series, Department of Aerospace and Mechanical Engineering, USC, Los Angeles, CA*, 2020.
- [9] **D. Patel**, R. Bonam, A. Oberai "Engineering neural networks for improved defect detection, classification, and localization", *SPIE Advanced Lithography, San Jose, CA*, 2019.
- [10] D. Patel, R. Tibrewala, A. Vega, L. Dong, N. Hugenberg, A. Oberai "Circumventing the solution of inverse problems in mechanics through deep learning", 13<sup>th</sup> World Congress on Computational Mechanics (WCCM), NYC, NY, 2018.

# Research Advising

#### PhD. candidates

- Summer 2021 Jason Liang (Stanford)
  - Present Learning disentangled representation of physical data using progressive variational autoencoders.
- Spring 2022 Elliot Epstein (Stanford)
  - Present Stochastic inference of ignition parameters for cryogenic rocket engines.

#### MS candidates

- Fall 2019 Chiao-Chih Hsu (USC)
  - Fall 2020 Implementing learning-based models to infer missing phase image of renal lesions from partially visible Contrast-Enhanced Computed Tomography (CECT) data.

Fall 2018 - Vijay Kothapalli (USC)

Summer 2019 Designed and developed deep learning-based models for time series data with application to Contrast-Enhanced Ultrasound (CEUS) imaging.

Undergraduate candidates

Summer 2020 Vikram Kher (USC)

Fall 2020 Developing ML-based tools for prediction of clinical prognosis and disease severity in COVID-19 patients. Winner: Best USC Viterbi summer undergraduate research project.

Summer 2019 Eeshan Gupta (USC)

Developed software tools for solving physics-driven Bayesian inverse problems using GAN priors.

Summer 2017 Adriana Vega, Raghav Tibrewala (RPI)

Developed deep learning-based elasticity imaging workflow to classify breast tumors based on its mechanical properties.

High-school student

Summer 2018 Jacqueline Wang (USC)

Developed data processing and visualization pipeline for the tumor classification project.

# Teaching Experience

Winter 2023 CME 599: Machine Learning for Computational Engineering, Stanford.

• Designing new course material and instructing this graduate level course.

Fall 2020 AME 599: Machine Learning and Computational Physics, USC.

- Assisted my advisor in preparing course material for the first offering of this graduate level course.
- $\circ\,$  Conducted office hours and graded assignments.

Spring 2017 ENGR 2050: Introduction to Engineering Design, RPI.

 Conducted studio sessions and assisted students in conceptual and detailed design of the project for the project-based undergraduate course.

Fall 2016 ENGR 1200: Engineering graphics and CAD, RPI.

- o Conducted lab sessions as a lead TA for the undergraduate course with 250+ students.
- Conducted office hours, graded assignments, and assisted 50+ students with final CAD project.

Spring 2016 Advanced Solid Mechanics, IIT-D.

Conducted office hours and tutorials and graded assignments.

# Professional Membership and Service

- Organizer, Mini-symposium on ML-driven model order reduction and inverse problems, SIAM Mathematics of Data Science (MDS), San Diego, CA, Sept. 2022; Mini-symposium on Operator Networks, U.S. National Congress on Computational Mechanics, Albuquerque, NM, July 2023.
- o Reviewer, International Conference on Learning Representation (ICLR); AAAI conference on Artificial Intelligence; Journal of Computational Physics (JCP); Journal of Computer Methods in Applied Mechanics and Engineering (CMAME); International Journal for Numerical Methods in Engineering (IJNME); Journal of Geosciences; Journal of Numerical Algebra, Control, and Optimization (NACO); Journal of Hydrology.
- o Central team placement coordinator, IIT Delhi.

# Computer Skills

Programming Python, C, C++, MATLAB, Fortran, Bash scripting

Languages

Scientific TensorFlow, PyTorch, TensorFlow Probability, FEniCS, MPI, OpenMP, data analysis packages tools and in python (Scikit-learn, pandas, Scipy), ParaView, Ansys, NX, Creo, LATEX, version control with libraries GitHub