

CHIRAG MODI

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Positions

Flatiron Institute — New York, NY

October 2020–Present

Flatiron Research Fellow
Center for Computational Astrophysics
Center for Computational Mathematics

University of California — Berkeley, CA

August 2020–October 2020

Postdoctoral Fellow
Berkeley Center for Cosmological Physics
Department of Physics

Education

University of California, Berkeley — Berkeley, CA

Fall 2014 – Summer 2020

Ph.D. student in Physics

August 2020

Advisor: Uroš Seljak

GPA: 3.887/4.0

Thesis: Reconstruction of Cosmological Fields in Forward Model Framework

Master of Arts in Physics

May, 2017

Indian Institute of Technology Bombay — Mumbai, India

Fall 2010 – Spring 2014

Bachelor of Technology (with Honors) in Engineering Physics

CPI: 9.64/10

Bachelor of Technology (Minor) in Statistics

Silver Medal, Graduated top of the Physics Class

Research Interests

Cosmology: Large scale structures, differentiable simulations, forward-modeling approaches to analysis

Statistics: Bayesian inference, optimization, machine learning, simulations based inference

Professional Services

Learning the Universe Workshop, CCA, Flatiron Institute

August 2021

Organized a workshop to bring together leading cosmologists and machine learning experts

Statistics and Machine Learning Discussion Group, UC Berkeley, Physics

Fall 2017- Fall 2018

Founded a weekly discussion group to enhance collaboration between science and statistics community.

Later evolved to official Berkeley-wide discussion group hosted at Berkeley Institute of Data Science.

Referee - Grants

Fall, 2022

European Research Council (ERC) Starting Grant

Referee - Journals

since 2017

Nature Astronomy, Physical Review Letters, Physical Review D, AAS Astrophysical Journal (ApJ), Monthly Notices of the Royal Astronomical Society (MNRAS) & Astronomy & Computing, Journal for Cosmological Physics (JCAP), ICML

Awards and Recognitions

Lyman Spitzer, Jr. Postdoctoral Fellowship

January, 2020

Department of Astrophysical Sciences at Princeton University

Declined

Conference Travel Grants

Summer, 2017 & 2018

Department of Physics, University of California, Berkeley

Institute Silver Medal <i>Indian Institute of Technology, Bombay</i>	Mumbai, India, 2014
World Rank 2 & Gold Medal <i>International Olympiad of Astronomy and Astrophysics</i>	Beijing, China, 2010
Gold Medal <i>International Astronomy Olympiad</i>	Hongzhou, China, 2009
DAAD WISE Scholarship - Deutscher Akademischer Austausch Dienst (DAAD) <i>German Academic Exchange Service</i>	Germany, Summer, 2010
All India Rank 48 - Joint Entrance Examination <i>Indian Institute of Technology (over 500,000 students take the exam)</i>	India, 2010
KVPY Fellowship - Kishore Vaigyanik Protsahan Yojna <i>Government of India</i>	India, 2009-2010
NTSE Fellowship - National Talent Search Scholarship <i>Government of India</i>	India, 2008-2010

Teaching Experience

Seminar , Flatiron Wide Algorithms Meeting, Flatiron Institute, NY <i>Pedagogical talk on how to develop differentiable simulations for scientists across the Flatiron Institute</i>	October 2021
Teaching Assistant , UC Berkeley, Physics <i>Assisted in developing course - "Data science and Bayesian statistics for physical sciences"</i>	Fall 2017
Graduate Student Instructor , UC Berkeley, Physics <i>Over 3 semesters; Courses- Mechanics and Wave Motion, Honor Sequence Course</i>	Fall 2014-Fall 2015
Teaching Assistant Instructor , IIT Bombay, Physics <i>Over 6 semesters; Courses- Quantum Mechanics, Modern Physics, Electricity and Magnetism</i>	Fall 2011-Spring 2014
Olympiad Facilitator , OCSC- International Astronomy Olympiad, HBCSE-TIFR, India <i>Academic Training: Selection and Preparation of Indian Team for International Astronomy Olympiads</i>	Summer 2010
Instructor , Splash at Berkeley <i>Outreach Program: Taught courses on amateur astronomy, card games from India</i>	Fall 2015 - Fall 2017

Students Supervised

Tri Nguyen <i>4th year Graduate, MIT Visiting Predoc at Flatiron, 1 paper in prep</i>	August 2022-present
Kwan Ngai Pok <i>2nd year Undergraduate, The Chinese University of Hong Kong Visiting Summer intern at Flatiron, 1 peer-reviewed conference paper</i>	June 2022-present
Adrian Bayer <i>5th year Graduate, UC Berkeley 1 preprint submitted to JCAP. 1 more paper in prep</i>	April 2021-present
Max Lee <i>1st year Graduate, Columbia University 1 paper in prep</i>	October 2020-present

Open Source Softwares

PMWD - Particle Mesh With Derivatives : <i>memory efficient simulations in JAX</i> https://github.com/eelregit/pmwd	Co-Developer
FlowPM : <i>Particle Mesh simulation in TensorFlow</i> https://github.com/modichirag/flowpm	Main Developer
CLEFT : <i>Parallelized python code to Compute 1-loop real-space power spectrum of biased tracers</i> https://github.com/modichirag/flowpm	Sole Developer

Publications

Led/Co-Led/Major Contributions

ArXiv Google Scholar

First author: 12, Second author: 7, Journal papers: 12, Peer-reviewed conference papers: 3, Under Review: 3, Preprint: 3

21. Forecasting the power of Higher Order Weak Lensing Statistics with automatically differentiable simulations
Lanzieri D., Lanusse F., Modi C., Horowitz B. Under review in LSST-DESC
20. Differentiable Cosmological Simulation with Adjoint Method
Li Y., Modi C., et.al. (arXiv:2211.09815) Submitted to JCAP
19. pmwd: A Differentiable Cosmological Particle-Mesh N-Body Library
Li Y., Lu L., Modi C., et.al. (arXiv:2211.09958) Submitted to JOSS
18. Emulating cosmological growth functions with B-Splines
Kwan N.P., Modi C., Li Y., Ho S. (arXiv:2211.06564) NeurIPS-ML4Science 2022
17. Joint velocity and density reconstruction of the universe with nonlinear differentiable forward modeling
Bayer A., Modi C., Ferraro S. (arXiv:2210.15649) Submitted to JCAP
16. Reconstructing the Universe with Variational Self Boosted Sampling
Modi C., Li, Y., Blei, D. (arXiv: 2206.15433) *Spotlight Talk*
ICML-ML4Astro 2022
15. Delayed Rejection Hamiltonian Monte Carlo for Multi-Scale Distributions
Modi C., Barnett A., Carpenter B. (arXiv:2110.00610) Submitted to Bayesian Analysis
14. CosmicRIM : Reconstructing Early Universe by Combining Differentiable Simulations with Recurrent Inference Machines
Modi C., Lanusse F., Seljak U., Spergel D.N., Perreault-Levasseur L. (arXiv:2104.12864) ICLR-SimDL 2021
13. Estimating COVID-19 mortality in Italy early in the COVID-19 pandemic
Modi C., Böhm V., Ferraro S., Stein G., Seljak U. (medRxiv:20067074v2) Nature Comm. 12,2729 (2021)
12. Mind the gap: the power of combining photometric surveys with intensity mapping
Modi C., White M., Castorina E., Slosar A. (arXiv:2102.08116) JCAP 10(2021)056
11. FlowPM: Distributed TensorFlow Implementation of the FastPM Cosmological N-body Solver
Modi C., Lanusse F., Seljak U. (arXiv:2010.11847) ASCOM 2021.100505
10. Simulations and Symmetries
Modi C., Chen S., White M. (arXiv:1910.07097) MNRAS 492,5754 (2020)
9. Generative learning counterfactual analysis for econometrics synthetic control applications
Modi C., Seljak U. (arXiv:1910.07178) Accepted to NeurIPS-CML2019
8. On the validity of the Born approximation in modeling cross correlations
Böhm V., Modi C., Castorina E. (arXiv:1910.06722) JCAP 03(2020)045
7. Reconstructing large-scale structure with neutral hydrogen surveys
Modi C., White M., Slosar A., Castorina E. (arXiv:1907.02330) JCAP 11(2019)023
6. Intensity mapping with neutral hydrogen and the Hidden Valley simulations
Modi C., Feng Y., White M., Castorina E. (arXiv:1904.11923) JCAP 09(2019)024
5. Cosmological Reconstruction From Galaxy Light: Neural Network Based Light-Matter Connection
Modi C., Feng Y., Seljak U. (arXiv:1805.02247) JCAP 10(2018)028
4. Modeling CMB lensing cross correlations with CLEFT
Modi C., White M., Vlah Z. (arXiv:1706.03173) JCAP 08(2017)009
3. Halo Bias in Lagrangian Space: Estimators and Theoretical Predictions
Modi C., Castorina E., Seljak U. (arXiv:1612.01621) MNRAS 472,3959 (2017)
2. A Fast Algorithm for Identifying Friends-of-Friends Halos
Feng Y., Modi C. (arXiv:1607.03224) ASCOM 20(2017)44-51
1. Local Random Potentials of High Differentiability to Model the Landscape
Battfeld T., Modi C. (arXiv:1409.5135) JCAP 03(2015)010

Science Collaborations (Small)

Papers in small teams of 4-10 people with regular participation and important science contribution

6. Differentiable Stochastic Halo Occupation Distribution
Horowitz B., et al. (including CM) (arXiv:2211.03852) submitted to JCAP
5. SimBIG: A Forward Modeling Approach To Analyzing Galaxy Clustering
Haan C., et al. (including CM) (arXiv:2211.00723) Submitted to PNAS
4. SimBIG: Mock Challenge for a Forward Modeling Approach to Galaxy Clustering
Haan C., et al. (including CM) (arXiv:2211.00660) Submitted to JCAP
3. Towards a non-Gaussian Generative Model of large-scale Reionization Maps
Lin Y., et al. (including CM) (arXiv:2210.14273) NeurIPS-MI4Science 2022
2. nbodykit: an open-source, massively parallel toolkit for large-scale structure
Hand N., et al. (including CM) (arXiv:1712.05834) The Astronomical Journal, (Oct, 2018)
1. Towards Optimal Extraction of Cosmological Information from Non-linear Data
Seljak U., Aslanyan G., Feng Y., Modi C. (arXiv:1706.06645) JCAP 12(2017)009

Science Collaborations (Large)

Papers as a part of science team of large survey collaborations

3. The DESI *N*-body Simulation Project II: Suppressing Sample Variance with Fast Simulations
Ding Z., et al. (including CM) (arxiv:2202.06074) MNRAS, 514, 3308 (2022)
2. The clustering of galaxies in the completed SDSS-III Baryon Oscillation Spectroscopic Survey:
Anisotropic galaxy clustering in Fourier-space
Beutler F., et al. (including CM) (arXiv:1607.03150) MNRAS, 466, 2242 (2016)
1. The clustering of galaxies in the completed SDSS-III Baryon Oscillation Spectroscopic Survey:
Baryon Acoustic Oscillations in Fourier-space
Beutler F., et al. (including CM) (arXiv:1607.03149) MNRAS, 464, 3409, (2016)

Selected Talks

**: invited talks*

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| Sampling, Transport, and Diffusions, Flatiron Institute, NY | November 2022 |
| *Origins Data Science Lab (ODSL) Seminar, Munich, Germany | October 2022 |
| *Spotlight Talk, Machine Learning for Astrophysics, ICML 2022, Baltimore | July 2022 |
| *Large-Scale Structure Cosmology beyond 2-Point Statistics, Summer Workshop Aspen | June 2022 |
| *Interplay of Fundamental Physics and Machine Learning, Summer Workshop Aspen | June 2022 |
| *Cosmology Seminar, Tata Institute of Fundamental Research, Mumbai, India | April 2022 |
| Debating the potential of machine learning for astronomical surveys, IAP, Paris | October 2021 |
| *Flatiron Wide Algorithms Meeting, Flatiron Institute, NY | October 2021 |
| *Cosmology Seminar, Midwest Cosmology Network | June 2021 |
| *Cosmology Lunch Seminar, Princeton University, NJ | May 2021 |
| *DESI-AI Telecon, DESI Collaboration | January 2021 |
| DESI December Meeting | December 2020 |
| *CHORD Telecon, McGill University, Montreal, Quebec | August 2020 |
| *Research Progress Meeting, LBNL, Berkeley, CA | April 2020 |
| *Cosmology Seminar, Perimeter Institute, Waterloo, Canada | January 2020 |
| *Research Progress Meeting, LBNL, Berkeley, CA | November 2019 |
| *NERSC Data Seminar, LBNL, Berkeley, CA | November 2019 |
| Cosmology Seminar, KIPAC, Stanford, CA | October 2019 |

Cosmology Lunch Seminar, Princeton/IAS, NJ	August 2019
*Machine Learning in the era of large astronomical surveys, KSPA, UC Santa Cruz, CA	July 2019
Dark Energy Spectroscopic Instrument (DESI) Collaboration Meeting, LBNL, Berkeley, CA	July 2019
Paving the way for next generation of cosmological surveys, SCA, Sesto, Italy	July 2018
Cosmology Seminar, MPA, Garching, Germany	July 2018
The Nonlinear Universe 2018, BCCP, Smartno, Slovenia	July 2018
Modeling the Extragalactic Sky, BCCP, Berkeley, CA	Jan 2018
Low Redshift Universe, Nordita, Stockholm, Sweden	July 2017
The Non Linear Universe, BCCP & CCA, Smartno, Slovenia	July 2017
DESI Lunch Talk, Lawrence Berkeley National Lab, Berkeley, CA	December 2016

Posters

Emulating cosmological growth functions with B-Splines <i>Machine Learning and the Physical Sciences</i> Workshop at 36th Conference on Neural Information Processing Systems (NeurIPS)	December 2022
CosmicRIM : Reconstructing Early Universe by Combining Differentiable Simulations with Recurrent Inference Machines <i>Deep Learning for Simulation</i> Workshop at The Ninth International Conference on Learning Representations (ICLR)	May 2021
Generative Learning of Counterfactual for Synthetic Control Applications in Econometrics <i>"Do the right thing": machine learning and causal inference for improved decision making</i> Workshop Workshop at 33rd Conference on Neural Information Processing Systems (NeurIPS)	December 2019
Quantifying and Understanding the Galaxy-Halo Connection <i>Kavli Institute of Theoretical Physics, UC Santa Barbara</i>	May 2017
Prospective Graduate Student Open House <i>Department of Physics, UC Berkeley</i>	March 2017 & 2018
6th Workshop on Algorithms for Modern Massive Data Sets (MMDS) <i>Berkeley Institute of Data Science, UC Berkeley</i>	June 2016