

NATHANAEL JO

153 Caselli Ave, San Francisco, CA 94114

Mobile: (424) 303-3032 | Email: nathanjo@law.stanford.edu | Github: [nathanaj99](https://github.com/nathanaj99)

Research Interests	Machine Learning; Algorithmic Fairness; AI in Society; Economics and Computation	
Academics	University of Southern California , Los Angeles	2020 – 2021
	Master of Science in Applied Data Science	GPA: 3.90/4.00
	<i>Relevant Coursework:</i> Machine Learning, Analysis of Algorithms, Data Mining, Knowledge Graphs	
	University of Southern California , Los Angeles	2017 – 2021
Grants, Awards, and Honors	Bachelor of Arts in Mathematics	GPA: 3.98/4.00
	Bachelor of Arts in Data Science	
	<i>Relevant Coursework:</i> Numerical Methods, Advanced Statistics, Object-Oriented Programming, Data Visualization and UI Design	
	USC Discovery Scholar	2021
	Epstein Industrial and Systems Engineering Fellowship	2021
	Viterbi School of Engineering Anonymous Endowment	2021
	Presidential Scholarship	2017 – 2021
	Harry A. Miller Endowed Scholarship	2019 – 2020
Journal Articles	Academic Achievement Award	2018 – 2020
	Undergraduate Research Associate Grant	2018
	Phi Beta Kappa Honor Society	
	Papers Under Review	
	[1] “Learning Optimal Prescriptive Trees from Observational Data,” N. Jo , Sina Aghaei, Andrés Gómez, Phebe Vayanos. Request for Revision at <i>Management Science</i> .	
	• <u>INFORMS Undergraduate Operations Research Prize Award 2021, Finalist</u>	
	• <u>USC Discovery Scholar Prize 2021</u>	
	[2] “Drop a Line, Submit on Time? Experimental Evidence on the Effect of Tailored Predeadline Reminders on Pollution Reporting,” Elinor Benami, N. Jo , Daniel Ho. Submitted to <i>Journal of the Association of Environmental and Resource Economists</i> .	
	[3] “ODTLearn: A Python Package for Learning Optimal Decision Trees for Prediction and Prescription,” Patrick Vossler, Sina Aghaei, N. Jo , Nathan Justin, Phebe Vayanos, Andrés Gómez. Submitted to <i>Journal of Machine Learning Research</i> .	
	Working Papers	
	[4] “Small Building Detection using Satellite Imagery to Assess the Disparate Impact of California’s Accessory Dwelling Unit Liberalization Laws,” N. Jo* , Andrea Vallebuena*, Derek Ouyang, Kit Rodolfa, Daniel Ho.	

Conference Proceedings

Accepted Papers

[5] “Fairness in Contextual Resource Allocation Systems: Metrics and Incompatibility Results,” **N. Jo***, Bill Tang*, Kathryn Dullerud, Sina Aghaei, Phebe Vayanos. In *37th AAAI Conference on Artificial Intelligence*, 2023.

Working Papers

[6] “Estimating and Implementing Fairness Metrics with Probabilistic Protected Features,” Emily Black, **N. Jo**, Hadi Elzayn, Daniel Ho.

[7] “Learning Fair Optimal Classification Trees,” **N. Jo**, Sina Aghaei, Andrés Gómez, Phebe Vayanos.

Workshop Papers

[8] “Learning Optimal Prescriptive Trees from Observational Data,” **N. Jo**, S. Aghaei, A. Gómez, P. Vayanos. In *36th AAAI Conference on Artificial Intelligence*, AAAI Workshop on AI for Behavior Change, 2022.

Talks

Conference Presentations

“Learning Optimal Prescriptive Trees from Observational Data”

- INFORMS Annual Conference 2022: Session on Discrete Optimization for Society and Technology
- INFORMS Annual Conference 2021: Session on Interpretable Machine Learning – Exact and Approximation Algorithms
- CORS Annual Conference 2021: Session on ML/OR for Social Good

“Learning Optimal Fair Decision Trees”

- CPAIOR Annual Conference 2022
- INFORMS Annual Conference 2022: Session on Interpretable Machine Learning for Social Good

Other Research Experience

Regulation, Evaluation, and Governance Lab, Stanford University 2021 – Present
Computational Research Fellow, Principal Investigator: Dan E. Ho

USC Center for Artificial Intelligence in Society 2020 – Present
Visiting Researcher, Principal Investigator: Phebe Vayanos

Security and Political Economy Lab, USC 2018 – 2020
Principal Investigator: Benjamin Graham

- Performed data cleanup, analysis, and visualization in R on a 40-variable timeseries dataset with 180 countries to evaluate trends in nations’ laws and its correlation to how governments distribute power

Africa Regional Grant on HIV, UNDP & USC Program on Global Health 2018
Principal Investigator: Laura Ferguson

- Analyzed the progress of sub-Saharan African countries in removing the legal barriers for vulnerable populations living with HIV: an endline evaluation of a United Nations grant

Industry Experience	Sony Pictures Entertainment , Los Angeles 2019 <i>Data Science Intern</i>
	<ul style="list-style-type: none"> • Revamped various Agile metrics for 80 teams in a pilot project to drive increased operational efficiency • Evaluated competing models that predict upcoming movie earnings to optimize pre-release marketing decisions
Teaching Experience	University of Southern California 2018 – 2020 <i>Teaching Assistant</i>
	<ul style="list-style-type: none"> • MATH226 Multivariable Calculus (undergraduate level, ~200 students)
Activities and Involvements	OutRight Action International , New York City 2021 <i>UN Program Intern</i>
	<ul style="list-style-type: none"> • Monitored developments at the UN regarding LGBTQI+ issues and drafted communications to governments and UN bodies • Conducted legal research to support civil society advocacy efforts, particularly to advance LGBTQI+ interests
	USC Kappa Sigma Fraternity 2018 – 2021 <i>VP of Philanthropy, VP of External Relations</i>
	USC Queer & Ally Student Assembly 2018 – 2021 <i>Greek Life Student Liaison</i>
	Joint Educational Program (USC) 2019 <i>Volunteer Teacher</i>
	<ul style="list-style-type: none"> • Taught French to 30 LAUSD students twice a week as part of a volunteer program
Languages	English and Indonesian (native), French (intermediate), Chinese (basic)
Technical Skills	<ul style="list-style-type: none"> • Machine learning using Tensorflow, PyTorch, and Python (scikit, NLTK, etc.) • Computer vision technologies and frameworks (PIL, Rasterio, OpenCV, etc.) • Optimization and quantitative modelling (using Gurobi) • Large-scale parallel computing using Apache Hadoop, Spark, and Dask • Data management (MongoDB, Apache Suite, etc.) and database modelling • Full-stack web development (HTML, CSS—Bootstrap, Javascript, PHP, etc.) • Data analysis and visualization using Tableau, WEKA, Excel VBA, etc. • Cloud and GPU computing (AWS EC2, Google GCP, Azure, etc.) • Other languages: R, SQL, C/C++, Java, Swift