# Erkin Ötleş

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#### Interests

I am interested in designing technology to enhance health and harnessing machine learning to solve problems in medicine. I am a MD & PhD candidate at the University of Michigan. Methods I am interested in include: Machine Learning, Artificial Intelligence, Operations Research, Bioinformatics, and Biostatistics.

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| 2016 - 2024    | Medical Scientist Training Program Fellow (MD-PhD Trainee)  |
|----------------|---|
|                | University of Michigan - Ann Arbor  |
| 2024           | Doctor of Medicine, years 1-3 complete  |
|                | currently completing year 4.  |
| 2022           | Doctor of Philosophy (AI Lab & Industrial Engineering)  |
|                | Dissertation: Machine Learning for Healthcare: Model Development Implementation in Longitudinal Settings                                  |
|                | Advisors: Brian Denton (Industrial & Operations Engineering),   |
|                | Jenna Wiens (Computer Science & Engineering)  |
| 2013 - 2016    | Masters of Engineering, Industrial & Systems Engineering  |
|                | University of Wisconsin - Madison   |
|                | Decisions Science & Operations Research (Concentration: Computer Science)   |
| 2007 - 2011    | Bachelors of Science, Industrial & Systems Engineering  |
|                | University of Wisconsin - Madison   |
|                | Dean's Honor List   |
| Work           |   |
| 2018 - Current | Researcher, University of Michigan  |
|                | Developing & studying machine learning methods for clinical problems.   |
|                | Methodologically focused on optimizing performance of human-ML model teams  |
|                | over time. Notable projects: early warning systems for hospital acquired infections   |
|                | & deterioration, personalized models for cancer risk, dynamic outcome prediction  |
|                | utilizing deep learning. Led and maintain the deployment of two ML models in  |
|                | Michigan Medicine's Epic EHR (utilized Epic Cognitive Computing Platform & designed and developed an in-house ML model service platform). |
|                | designed and developed an in-nouse min model service platform).   |

#### 2015 - 2016 Lead Healthcare Data Scientist, MetaStar

Led early formation of the data science division. Transitioned organization from SAS based report distribution to self-service reporting using Tableau dashboards and Python for ML. Drove transition to ML & advanced analytics. Designed data-driven regional & statewide healthcare quality improvement efforts.

| 2011 - 2013                      | Solutions Engineer & Tech Coordinator, Epic Systems Corporation Designed and developed analytics tools for Accountable Care Organizations. Worked with customers to design & validate patient tracking and quality measurement methods. Led technical support of two customer implementations. Managed and resolved install issue escalations often managing teams containing internal developers, customer technical and clinical teams. Certified on Ambulatory Clinical Documentation, MyChart, and Clinical Analytics Infrastructure (Cogito). |
|----------------------------------|--|
| 2011                             | Health Systems Engineering, UW Hospital<br>Led design of next generation of inpatient rooms. Managed teams consisting of<br>clinicians, administrators, and vendors. Developed data mining tools & processes to<br>analyze quality of care as well as patient satisfaction.  |
| 2007 - 2010                      | Engineering Co-ops Boston Scientific (Cardiac Pacing Division) & Electronic Theatre Controls   |
| Development P                    | Projects (GitHub)  |
| 2019 - Present<br>2018 - Present | T-Square - Longitudinal data transformer for RNNs (Python & TensorFlow) Wave - Apple Watch app to assess hydration status using orthostatic heart rate measurements. (currently in beta testing)   |
| 2017                             | M is for Medicine - iMessage sticker pack (Appstore link)  |
| Manuscripts ( <u>G</u>           | <u>oogle Scholar</u> )   |
| 2022                             | Ötleş E, Seymour J, Wang H, Denton BT. <b>Dynamic prediction of work status for workers with occupational injuries: assessing the value of longitudinal observations.</b> <u>Journal of the American Medical Informatics Association</u> .   |
| 2022                             | Kamran F, Tang S, Ötleş E, McEvoy DS, Saleh SN, Gong J, Li BY, Dutta S, Liu X,, Donnelly JP, Shenoy E, Ayanian J, Nallamothu K, Sjoding MW, Wiens J. Early Identification of Hospitalized Patients with COVID-19 at Risk of Clinical Deterioration: A Model Development and Multi-Site External Validation Study. bmj.   |
| 2022                             | Ötleş E, Denton B, Qu B, Murali A, Merdan S, Auffenberg G, Hiller S, Lane BR, George AK, Singh K. <b>Development and Validation of Models to Predict Pathologic Outcomes of Radical Prostatectomy in Regional and National Cohorts.</b> The Journal of Urology.  |
| 2021                             | Ötleş E, Oh J, Li B, Bochinski M, Joo H, Ortwine J, Shenoy E, Washer L, Young VB, Rao K, Wiens J. <b>Mind the Performance Gap: Examining Dataset Shift During Prospective Validation.</b> <u>Machine Learning for Healthcare Conference. PMLR.</u>   |
| 2021                             | Wong A, Ötleş E, Donnelly JP, Krumm A, McCullough J, DeTroyer-Cooley O, Pestrue J, Phillips M, Konye J, Penoza C, Ghous M, Singh K., 2021. External Validation of a Widely Implemented Proprietary Sepsis Prediction Model in Hospitalized Patients. JAMA Internal Medicine.   |
|                                  |  |

Solano QP, Hayward L, Chopra Z, Quanstrom K, Kendrick D, Abbott KL, Kunzmann M, Ahle S, Schuller M, Ötleş E, George BC. **Natural Language Processing and Assessment of Resident Feedback Quality.** J Surg Educ.

| 2021         | Abbott KL, George BC, Sandhu G, Harbaugh CM, Gauger PG, Ötleş E, Matusko N, Vu JV. <b>Natural Language Processing to Estimate Clinical Competency Committee Ratings</b> . <u>Journal of Surgical Education</u> .   |
|--------------|--|
| 2021         | Ötleş E, Kendrick D, Solano QP, Schuller M, Ahle SL, Eskender MH, Carnes E, George BC. Using Natural Language Processing to Automatically Assess Feedback Quality: Findings From Three Surgical Residencies. <u>Academic Medicine.</u>                       |
| 2021         | Singh K, Valley TS, Tang S, Li BY, Kamran F, Sjoding MW, Wiens J, Ötleş E, Donnelly JP, Wei MY, Singh K. Validating a Widely Implemented Deterioration Index Model Among Hospitalized COVID-19 Patients.  Annals of the American Thoracic Society. (medRxiv) |
| 2020         | Beasley JW, Holden RJ, Ötleş E, Green LA, Steege LM, Wetterneck TB. It's time to bring human factors to primary care policy and practice. Applied Ergonomics.  |
| 2017         | Gorski JK, Batt RJ, Ötleş E, Shah MN, Hamedani AG, Patterson BW.  The impact of emergency department census on the decision to admit.  Academic Emergency Medicine.  |
| 2016         | Patterson BW, Batt RJ, Wilbanks MD, Ötleş E, Westergaard MC, Shah MN. Cherry picking patients: examining the interval between patient rooming and resident self-assignment. Academic Emergency Medicine.   |
| Under Review |  |
| 2023         | Measuring and Optimizing for Rank-Based Compatibility When Updating Risk Stratification Models   |
| 2022         | Teaching Artificial Intelligence as a Fundamental Toolset of Medicine:<br>A Trainee's Perspective  |
| Abstracts    |  |
| 2021         | Comparative Assessment of a Machine Learning Model and Rectal Swab Surveillance to Predict Hospital Onset Clostridioides difficile IDWeek  |
| 2020         | A NLP Approach for Assessment of Surgical Trainee Feedback Quality, Association for Surgical Education Annual Meeting  |
| 2019         | Return to Work After Injury: A Sequential Prediction & Prescription Problem, Machine Learning for Healthcare   |
| 2017         | Immune Genomic Expression Correlates with Discharge Location & Poor Outcomes in Trauma Patients, Academic Surgical Congress  |
| 2016         | Cues for PE Diagnosis in the Emergency Department: A Socio-technical Systems Approach for Clinical Decision Support, JAMIA   |

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| Works   | 1n | Progress |

| 2020 | Michigan Covid-19 Utilization & Risk Evaluation System (M-CURES) |
|------|--|
| 2019 | Digital Scribes: Enabling Clinical Artificial Intelligence & NLP |

## Books & Chapters

2016 <u>Human Factors</u>, WHO Technical Series on Safer Primary Care

## White Papers & Other Works

| 2011 - Ongoing | YouTube Channel: Simulation Tools (90k views)                                   |
|----------------|---|
| 2017           | A Community Pharmacy Initiative to Decrease Hospital Readmissions by Increasing |
|                | Patient Adherence and Competency of Therapy, MetaStar                           |
| 2012           | Improving the Quality and Efficiency of Primary Care through Industrial and     |
|                | Systems Engineering - A White Paper, I-PrACTISE                                 |

#### Peer Review

| 2022        | AMIA Annual Symposium                      |
|-------------|--|
| 2021-2022   | Gut  |
| 2022        | JAMIA                                      |
| 2020 - 2022 | Machine Learning for Healthcare Conference |

#### Selected Press

| 2021 | Forbes: Trust The AI? You Decide   |
|------|--|
| 2021 | The Washington Post: Sepsis prediction tool used by hospitals misses many cases, study says. Firm that developed the tool disputes those findings. |
| 2021 | The Verge: A hospital algorithm designed to predict a deadly condition misses most cases   |
| 2021 | WIRED: An Algorithm That Predicts Deadly Infections Is Often Flawed  |
| 2021 | STAT News: A popular algorithm to predict sepsis misses most cases and sends frequent false alarms, study finds                                    |

#### Presentations

| 2021 | Engineering Machine Learning for Medicine<br>Georgia Tech, ISyE 8803 - Virtual.                                    |
|------|--|
| 2021 | Medical Decision Making with Machine Learning: Model Development, Validation, and Updating INFORMS 2021 - Virtual. |
| 2021 | High-confidence machine learning: A clinical decision-making case study INFORMS 2021 - Virtual.                    |
| 2021 | Engineering Machine Learning for Medicine: Developing, Deploying, and Evaluating Dynamic Prediction Models         |

| CHEPS Seminar Fall 2021 | - Ann Arbor, MI. |
|-------------------------|------------------|
|                         |                  |

| 2021 | Comparative Assessment of a Machine Learning Model and Rectal Swab Surveillance to Predict Hospital Onset <i>Clostridioides difficile IDWeek - Virtual.</i> |
|------|---|
| 2021 | Characterizing the Performance Gap.  Machine Learning for Healthcare Conference - Virtual.  |
| 2021 | Considerations When Updating Models Used in Clinical Settings. INFORMS Healthcare Conference - Virtual.   |
| 2020 | Dynamic Machine Learning for Medical Practice.  INFORMS Annual Conference - Virtual.  |
| 2020 | Prediction & Prevention: Powering Precision Health.  University of Michigan Precision Health Symposium - Virtual.   |
| 2020 | Dynamic Prediction of Patient Outcomes.  University of Michigan Medical Scientist Training Program - Virtual.   |
| 2020 | Friday Night AI: AI & COVID-19.  Ann Arbor District Library - Virtual.  |
| 2020 | "You Did Great, Now Do Better" - NLP for Operative Feedback Quality.  University of Michigan - Department of Surgery Grand Rounds (Scrubs Surgery Olympics) |
| 2020 | A NLP Approach for Assessment of Surgical Trainee Feedback Quality.<br>Association for Surgical Education   |
| 2020 | A NLP Approach for Assessment of Surgical Trainee Feedback Quality.  University of Michigan - Department of Surgery Moses Gunn Research Day                 |
| 2019 | Dynamic Prediction of Patient Outcomes: A Deep Learning Approach. INFORMS Annual Conference - Seattle, WA.  |
| 2019 | Dynamic Prediction of Patient Outcomes.  CHEPS Symposium - Ann Arbor, MI.   |
| 2019 | Return to Work After Injury: Sequential Prediction & Decision.  Machine Learning for Healthcare - Ann Arbor, MI.  |
| 2019 | Occupational Injury: Dynamic Prediction.  University of Michigan Medical Scientist Training Program - Roscommon, MI.  |
| 2019 | Looking to the Future: Digital Scribes.  American Academy of Family Physicians Commission on Quality & Practice - Kansas City, MO.                          |
| 2018 | Shamu: Bringing Your Health Plan to Life.  Gupta Health Hackathon - Ann Arbor, MI.  |
| 2017 | Augmenting Cancer Surveillance with Machine Learning. CHEPS Symposium - Ann Arbor, MI.  |

| 2017   | Machine Learning in Primary Care.  I-PrACTISE Annual Meeting - Madison, WI.   |  |
|--|---|--|
| 2016   | Primary Care & Predictive Analytics.  I-PraCTISE Colloquia - Madison, WI.   |  |
| 2015   | Forecasting Emergency Department Admissions. INFORMS Healthcare Conference - Nashville, TN.   |  |
| 2015   | FlexSim Emergency Room Simulation Competition.  Society for Health Systems Annual Conference - Orlando, FL.   |  |
| 2014   | Industrial Engineering in Primary Care.  NAPCRG Annual Meeting - New York, City NY.   |  |
| 2014   | 2013 I-PraCTISE Conference Review. I-PraCTISE Annual Meeting - Madison, WI.   |  |
| Policy   |   |  |
| 2016   | Integration of Drug Price Information into Electronic Medical Records, AMA.   |  |
| Grants   |   |  |
| 2018 - 2019  | Innovation Fellowship, <u>Developing AI assistants for Physicians</u> . AAFP.   |  |
| Awards & Honors  |   |  |
| Awards & Hone  | ors   |  |
| 2021   | Kass Award (excellence in research in infectious diseases) - IDWeek   |  |
| 2021<br>2020   | Kass Award (excellence in research in infectious diseases) - IDWeek<br>University of Michigan Surgery Olympics Mentor (1st place)   |  |
| 2021<br>2020<br>2020   | Kass Award (excellence in research in infectious diseases) - IDWeek<br>University of Michigan Surgery Olympics Mentor (1st place)<br>MSTP Program Activities Committee  |  |
| 2021<br>2020<br>2020<br>2017   | Kass Award (excellence in research in infectious diseases) - IDWeek<br>University of Michigan Surgery Olympics Mentor (1st place)<br>MSTP Program Activities Committee<br>University of Michigan Surgery Olympics (1st place)   |  |
| 2021<br>2020<br>2020   | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place)   |  |
| 2021<br>2020<br>2020<br>2017<br>2017   | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place)   |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present   | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society)  |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011  | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List  |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011<br>2007 - 2011   | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List Colbeck Scholarship  |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011  | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List  |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011                            | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List Colbeck Scholarship Thomas Engineering Scholarship   |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011             | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List Colbeck Scholarship Thomas Engineering Scholarship WV Distinguished Scholarship  |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>Teaching | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List Colbeck Scholarship Thomas Engineering Scholarship   |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>Teaching | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List Colbeck Scholarship Thomas Engineering Scholarship WV Distinguished Scholarship  Lecturer, Industrial & Systems Engineering  |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>Teaching | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List Colbeck Scholarship Thomas Engineering Scholarship WV Distinguished Scholarship WV Distinguished Scholarship  Lecturer, Industrial & Systems Engineering University of Wisconsin - Madison Health Systems Engineering (ISyE 417)  Teaching Assistant, Industrial & Systems Engineering                                   |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>Teaching | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List Colbeck Scholarship Thomas Engineering Scholarship WV Distinguished Scholarship WV Distinguished Scholarship  Lecturer, Industrial & Systems Engineering University of Wisconsin - Madison Health Systems Engineering (ISyE 417)  Teaching Assistant, Industrial & Systems Engineering University of Wisconsin - Madison |  |
| 2021<br>2020<br>2020<br>2017<br>2017<br>2013<br>2011 - Present<br>2011 - Present<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>2007 - 2011<br>Teaching | Kass Award (excellence in research in infectious diseases) - IDWeek University of Michigan Surgery Olympics Mentor (1st place) MSTP Program Activities Committee University of Michigan Surgery Olympics (1st place) Michigan SlingHealth's Innovation Demo Day Competition (1st Place) SHS FlexSim Emergency Room Simulation Competition (1st Place) Alpha Pi Mu (Industrial Engineering Honor Society) Tau Beta Pi (Engineering Honor Society) Dean's Honor List Colbeck Scholarship Thomas Engineering Scholarship WV Distinguished Scholarship WV Distinguished Scholarship  Lecturer, Industrial & Systems Engineering University of Wisconsin - Madison Health Systems Engineering (ISyE 417)  Teaching Assistant, Industrial & Systems Engineering                                   |  |

# Leadership

| 2020 - 2022    | Program Advisory Committee, University of Michigan MSTP                  |
|----------------|--|
| 2020 - 2021    | External Relations Chair, INFORMS University of Michigan Student Chapter |
| 2016 - 2017    | President, Medical Innovation Group UMMS                                 |
| 2015 - 2016    | Communications Chair, INFORMS UW - Madison                               |
| 2012 - Present | National Advisory Council, I-PrACTISE                                    |
| 2009 - 2011    | Industry Chair, Engineering Expo 2011                                    |
| 2010 - 2011    | External Relations Officer, Institute of Industrial Engineers            |
| 2010 - 2011    | College of Engineering Rep., Associated Students of Madison              |
| 2010 - 2011    | Engineering Student Council Rep., Polygon                                |
| 2009 - 2010    | Fundraising Chair, Institute of Industrial Engineers                     |
|                |  |

## Service

| 2021           | University of Michigan MSTP Scientific Retreat Co-Chair           |
|----------------|---|
| 2019 - Present | University of Michigan MSTP Journal Editor                        |
| 2019           | IOE Coding Club   |
| 2015 - 2016    | Health IT Thread Designer, UW - Madison, SMPH Curriculum Redesign |
| 2015 - 2016    | EMS Volunteer, Cross Plains EMS                                   |
| 2011           | Organizing Volunteer, Wisconsin Science Olympiad                  |
| 2009 - 2010    | STEM Mentoring, Young Scientists of America                       |
| 2009 - 2010    | Emergency Department Volunteer, United Hospital                   |
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# Mentorship

| 2020 - 2021 | Max Klaben - IOE Undergrad     |
|-------------|--------------------------------|
| 2020 - 2021 | Isabelle Miner - IOE Undergrad |

## Professional Memberships

American Medical Association, INFORMS, I-PrACTISE, IISE

#### Skills

Docker, Java, Keras, Matlab, MUMPS (Caché), Python, PyTorch, R, SQL, Swift, TensorFlow, Unix