## Michele Santacatterina

#### Personal Data

EMAIL: michele.santacatterina@nyulangone.org

SKYPE ID: miksanta86

PROFILES: Personal Website, Google Scholar, LinkedIn, Research Gate

RESEARCH INTERESTS: Biostatistics, Causal Inference, Data Science, Healthcare, Real-World Data

### ACADEMIC APPOINTMENTS

CURRENT Assistant Professor of Biostatistics,

2021 OCT Division of Biostatistics, Department of Population Health,

NYU Langone Health

CURRENT Assistant Research Professor of Biostatistics and Bioinformatics,

2021 SEP The Biostatistics Center, Department of Biostatistics and Bioinformat-

ics, Milken Institute School of Public Health,

George Washington University

Co-Investigator of the Data Coordinating Center for the COVID-19 Community Research

Partnership Study and the Hurricane Maria Mortality Project.

### **EDUCATION**

## **Academic Degrees**

2018 Apr	Ph.D., Medical Science, Karolinska Institutet, Stockholm, Sweder
2012 Dro	

2013 DEC Main topics: Biostatistics, Causal Inference, Data Science, Optimization.

2012 MAR M.S., Biostatistics, University of Milano-Bicocca, Milan, Italy

2009 OCT Main topics: Classical and Bayesian inference, Survival analysis, Longitudinal data anal-

ysis, Statistical methods for Epidemiology, and Design of Experiments.

2009 SEP B.S., Statistics and Computer Science, University of Padua, Padua, Italy

2006 SEP Selected topics: Probability, Statistical inference, Statistical models, Computational

Statistics, Algebra, Linear Optimization, and Information Technology.

#### **Relevant Courses**

2016 MAR Course SF3961 "Statistical Inference" at KTH Royal Institute of Technol-

οσν

2015 Nov Organized and taught by Prof. Henrik HULT.

15-ECTS Ph.D.-level course within the Mathematical Statistics Ph.D. Program at KTH.

2015 JUN Course SF2822 "Applied nonlinear optimization" at KTH Royal Institute

of Technology

2015 MAR Organized and taught by Prof. Anders Forsgren.

7.5-ECTS MSc-level course within the Applied Mathematics Program at KTH.

## Other Education

2019 JAN Auditing: CS6780 - Advanced Machine Learning

Taught by Prof. Thorsten Joachims, Cornell University, Department of Computer Science and Department of Information Science.

2014 DEC Course on "Regression Models" by John Hopkins University on Cours-

ERA

Organized and taught by Prof. Brian CAFFO, Prof. Roger D. PENG and Assoc. Prof. Jeff Leek, Johns Hopkins University.

Certification and grades.

2013 DEC Course on "Causal inference from observational data" at Karolinska

Institutet

Organized by the Swedish Interdisciplinary Graduate School at Karolinska Institutet. Taught by Prof. Miguel Hernán, Harvard School of Public

Health.

2013 JUN Summer School in "Modern Methods in Biostatistics and Epidemiol-

ogy", Treviso, Italy

Organized jointly by Harvard School of Public Health and Karolinska

Institutet.

Course attended:

"Causal Inference" by Prof. Andrea ROTNITZKY, Harvard School of Public Health

2010 FEB SAS Masterclass in Business Intelligence, Milan, Italy

Organized jointly by SAS and ACCENTURE.

Certification obtained:

SAS Certified Base Programmer for SAS 9

2009 Aug Visiting Student, Department of Mathematics, University of Barcelona

2009 FEB Course attended: Probability, Statistical inference.

### RESEARCH EXPERIENCE

2018 Aug- 2020 Aug | Postdoctoral Associate, TRIPODS Center for Data Science and Cornell

Tech, Cornell University

Development of novel statistical methods for optimal decision making using experimental and observational data with applications in public health and medicine.

Mentors: Prof. Nathan Kallus, Prof. Thorsten Joachims, Prof. Kilian Wein-

BERGER

2013 DEC - 2018 APR | Ph.D. student, Unit of Biostatistics, Karolinska Institutet

Study and development of statistical methods based on mathematical programming techniques with application in public health and medical research. Teaching assistant.

Advisor: Prof. Matteo BOTTAI

2017 Jun - 2017 SEPT | Visiting Scholar, Cornell Tech, Cornell University

Collaborate on research into novel optimization approaches to causal inference.

Faculty Sponsor: Prof. Nathan KALLUS

2013 JAN - 2013 Nov | Research assistant, Unit of Biostatistics, Karolinska Institutet

Application of statistical methods in public health research, with focus on HIV research.

Writing of grant applications (KID funding). Teaching assistant.

2012 MAR - 2012 DEC | Research assistant, Department of Public Health, Karolinska Institutet

Application of statistical methodologies for medical and public health research.

2011 SEPT - 2012 FEB | Master's Thesis, Department of Public Health, Karolinska Institutet

Title: Access to antiretroviral therapy and treatment effectiveness among injection drug

users: results from a Swedish population based study.

Advisor: Prof. Rino Bellocco

2008 Nov - 2009 Jan | Internship, Department of Pediatrics, University of Padua.

Application and evaluation of methods for survival analysis using data from patients

with anaplastic large-cell lymphoma.

Contact persons: Prof. Laura VENTURA and Dr. Gloria TRIDELLO

## **Manuscripts and Publications**

Work in progress

2021 Prediction of severe hypoglycemia: machine learning approaches in the EDIC Cohort

Santacatterina, M., Uschner, D., Bebu, I.

Application of machine learning approaches to predict hypoglycemia

2021 | Analysis of cause-specific mortality of the Hurricane Maria in Puerto Rico

Santacatterina, M., et. al.,

Evaluation of the excess cause-specific mortality after Hurricane Maria in Puerto Rico.

2021 | Predicting the risk of bleeding disorders

Santacatterina, M. and Vaughan, R.

Application of novel machine learning methods to help understand and predict the risk of bleeding disorders.

2020 Quantile based regression for life expectancy estimation with censored data. Garcia-Pareja, C., and Santacatterina, M., et. al.

Novel statistical method for estimating life expectancy.

## Statistical and data science methodology

#### 2021 | Deep survival analysis with longitudinal X-rays for COVID-19

Shu, M., Bowen, R.S., Herrmann, C., Qi, G., Santacatterina, M. and Zabih, R. In Proceedings of the IEEE/CVF International Conference on Computer Vision, pp. 4046-4055. 2021

Development of a deep learning method that handles images longitudinally for better predictions of COVID-19 outcomes

## 2021 Robust weights that optimally balance confounders for estimating marginal hazard ratios

Santacatterina, M., Acceptable after revision in Statistical Methods in Medical Research, 2021 (\*)

Novel optimization method for estimating marginal hazard ratios for Cox models.

## More robust estimation of average treatment effects using kernel optimal matching in an observational study of spine surgical interventions

Kallus, N., Pennicooke, B., Santacatterina, M. Statistics in medicine 40, no. 10 (2021): 2305-2320. (\*)

Extension and application of Kernel Optimal Matching to robustly estimate sample average treatment effects under lack of overlap.

### 2020 | Optimal weighting for estimating generalized average treatment effects

Kallus, N., and Santacatterina, M., Acceptable after revision in the Journal of Causal Inference, 2020 (\*)

Formulation of a new general causal estimand and development of an optimization method for its estimation.

## 2020 Optimal balancing of time-dependent confounders for marginal structural models

Kallus, N., and Santacatterina, M., Acceptable after revision in the Journal of Causal Inference, 2020 (\*)

Novel method that estimates causal effects affected by time-dependent confounders from longitudinal observational studies.

# 2019 Kernel optimal orthogonality weighting: a balancing approach to estimating effects of continuous treatments

Kallus, N., and Santacatterina, M., arXiv preprint arXiv:1910.11972, 2019 (\*) Novel optimization method for estimating causal dose-response curves.

## 2019 | CAB: Continuous Adaptive Blending estimator for policy evaluation and learning

Su, Y., Wang, L., Santacatterina, M., Joachims, T, In International Conference on Machine Learning, pp. 6005-6014. PMLR, 2019.

Novel method for estimating optimal targeted policies.

# 2019 Optimal probability weights for estimating causal effects of time-varying treatments with marginal structural Cox models

Santacatterina, M., Garcia-Pareja, C., Bellocco, R., Sönnerborg, A., Ekström, A.M., Bottai, M., Statistics in medicine 38, no. 10 (2019): 1891-1902.

Use of optimal probability weights when estimating treatment effects with longitudinal data. Comparisons, through simulations, with existing methods.

#### 2018 | Optimal probability weights for inference with constrained precision

Santacatterina, M., and Bottai, M., Journal of the American Statistical Association 113, no. 523 (2018): 983-991.

Proposal of a method for obtaining optimal probability weights based on solving a constrained nonlinear optimization problem.

(\*) The order of authors follows alphabetical order.
Santacatterina, M. is the corresponding author of those manuscripts.

#### Healthcare

## 2021 | Prevention of Covid-19 with the BNT162b2 and mRNA-1273 Vaccines

Santacatterina, M., et. al., The New England journal of medicine, 10.1056/NEJMc2113575, 2021

Letter to the Editor about the evaluation of vaccine effectiveness in real-world settings in the United States

2021 Using Repeated Antibody Testing to Minimize Bias from False Positives Estimates of Prevalence and Incidence of SARS-CoV-2 Infection

Santacatterina, M., et. al., Under Review in the American Journal of Epidemiology, 2021 Novel proposal of a combined parallel and sequential testing framework to reduce overestimation of prevalence and incidence

Antibody responses among participants in the COVID-19 Community Research Partnership receiving one or two doses of COVID-19 mRNA vaccine
Friedman-Klabanoff, D. J., Berry, A. A., Tjaden, A. H., Santacatterina, M., et. al., Under Review in Clinical Infectious Diseases, 2021

Examination of seroconversion rates among vaccinated people

The effect of patient age on discharge destination and complications after lumbar spinal fusion

Pennicooke, B., Santacatterina, M., et al., Journal of Clinical Neuroscience 91 (2021): 319-326.

A medical study evaluating the effect of age on surgical outcomes.

2021 Analysis of Accumulated SARS-CoV-2 Seroconversion in North Carolina: The COVID-19 Community Research Partnership

Williamson, J.C., Wierzba, T.F., Santacatterina, M., et al., medRxiv (2021) A public health study on COVID-19 seroconversion.

- Duration of SARS-CoV-2 Sero-Positivity in a Large Longitudinal Sero-Surveillance Cohort: The COVID-19 Community Research Partnership COVID-19 Community Research Partnership Study Group, BMC Infect Dis 21, 889 (2021).

  A medical study on the duration of antibodies among COVID-19 positive participants.
- 2020 Does state malpractice environment affect outcomes following spinal fusions? A robust statistical and machine learning analysis of 549,775 discharges following spinal fusion surgery in the United States

Chan, A.K., **Santacatterina**, **M.**, et al., Neurosurgical focus 49, no. 5 (2020): E18. A medical study on the effect of malpractice claims on clinical outcomes.

2017 Risk behaviour determinants among people who inject drugs in Stockholm, Sweden over a 10-year period, from 2002 to 2012

Karlsson, N., Santacatterina, M., et al., Harm reduction journal 14, no. 1 (2017): 1-11. A study on understanding the underlying causes that drive various types and levels of risk behaviours among people who inject drugs.

2017 | Effect of therapy switch on time to second-line antiretroviral treatment failure in HIV-infected patients

Häggblom, A., Santacatterina, M., (a) et al., PloS one 12, no. 7 (2017): e0180140.

A medical study on the effect of therapy switch on time to second-line antiretroviral treatment failure among HIV-infected patients.

2016 Impact of peer support on virologic failure in HIV-infected patients on antiretroviral therapy-a cluster randomized controlled trial in Vietnam

Sönnerborg, A., Tam, V.V., El-Khatib, Z., Santacatterina, M., et al., BMC infectious diseases 16, no. 1 (2016): 1-14.

A randomized control trial evaluating the impact of peer support on clinical outcomes in Vietnam.

2016 Inferences and conjectures in clinical trials: a systematic review of generalizability of study findings

Santacatterina, M., and Bottai, M., Journal of internal medicine 279, no. 1 (2016): 123-126. Systematic review on generalizability and heterogeneity of study findings in randomized clinical trials.

2015 Correlates of mobile phone use in HIV care: Results from a cross-sectional study in South Africa

Madhvani, N., Longinetti, E., Santacatterina, M., et al., Preventive medicine reports 2 (2015): 512-516.)

A cross-sectional study on the evaluation of the use of mobile phones as reminders in  $\mbox{HIV}$  care.

2014 Temporal Trends in the Swedish HIV-1 Epidemic: Increase in Non-B Subtypes and Recombinant Forms over Three Decades

Neogi, U., Häggblom, A., Santacatterina, M., et al., PloS one 9, no. 6 (2014): e99390.

A study on the temporal trend of the subtype distribution from the beginning of the HIV-1 epidemic in Sweden.

The State-Led Large Scale Public Private Partnership 'Chiranjeevi Program' to Increase Access to Institutional Delivery among Poor Women in Gujarat, India: How Has It Done? What Can We Learn?

De Costa, A., Kranti, S.V., Ryan, K., Sankara Raman, P., Santacatterina, M., et al., PLoS One 9, no. 5 (2014): e95704.

A study determining risk factors associated with disclosing HIV status among antiretroviral therapy recipients in South Africa.

2014 Gender perspective of risk factors associated with disclosure of HIV status, a cross-sectional study in Soweto, South Africa

Longinetti, E., **Santacatterina**, **M.**, El-Khatib, Z., PLoS One 9, no. 4 (2014): e95440. A cross-sectional study on risk factors for viremia and drug resistance.

2013 Antibiotic prescribing in women during and after delivery in a non-teaching, tertiary care hospital in Ujjain, India: a prospective cross-sectional study

Sharma, M., Sanneving, L., Kalpana, M., Santacatterina, M., et al., Journal of pharmaceutical policy and practice 6, no. 1 (2013): 1-7.

A study that aimed at present antibiotic prescribing among inpatients during and after delivery in rural India.

(a) These authors contributed equally to this work.

Monitoring the efficacy of antiretroviral therapy by a simple reverse transcriptase assay in HIV-infected adults in rural Vietnam

Cuong, D.D., Agneskog, E., Nguyen Thi Kim, C., Santacatterina, M., et al., Future Virology 7, no. 9 (2012): 923-931.

Determination of the feasibility of viral load monitoring in a cohort of HIV treatmentnaive adult patients initiating antiretroviral therapy in rural Vietnam.

#### **Conferences and Invited Talks**

### Organizer

MAR 14, 2021 | EN

**ENAR 2021** 

Organizer and chair of the invited paper session: Leveraging real-world data for improved medical decision-making: challenges, opportunities, and recent developments

DEC 14, 2019 | NeurlPS, 2019

Organizer of the workshop: "Do the right thing": machine learning and causal inference for improved decision making, together with Thorsten Joachims (Cornell), Nathan Kallus (Cornell), Adith Swaminathan (Microsoft Research), David Sontag (MIT), and Angela Zhou (Cornell)

MAY 23, 2019 | Atlantic Causal Inference Conference 2019

Organizer of the symposium: Optimization methods for causal inference, together with Adam Kapelner (CUNY), Nathan Kallus (Cornell), Nikos Ignatiadis (Stanford), and Stefan Wager (Stanford)

**Talks** 

SEP 29, 2021 NYU Langone Health - Department of Population Health Seminar Series Real-World SARS-CoV-2 Vaccine Effectiveness in North Carolina: The COVID-19 Community Research Partnership. Invited Talk.

Aug 09, 2021 | JSM 2021. Optimal Weighting for Estimating Generalized Average Treatment Effects. Talk.

MAR 15, 2021 ENAR 2021. Robust Weights that Optimally Balance Confounders for Estimating the Effect of Binary and Continuous Treatments with Time-to-event Data. Talk.

FEB 19, 2021 | GWU - Statistics Seminar Series. Optimal weighting for estimating treatment effects. Invited talk.

DEC 01, 2020 | Harvard - Machine Learning and Causal Inference Reading group. *Optimal weighting for estimating treatment effects.* Invited talk.

- Aug 03, 2020 | JSM 2020 Health policy statistics section. Optimal estimation of generalized average treatment effects using Kernel Optimal Matching. Invited talk.
- MAR 22, 2020 | ENAR 2020 IMS invited session on challenges for precision medicine. Kernel optimal orthogonality weighting: a balancing approach to estimating effects of continuous treatments. Invited talk.
- JAN 15, 2020 McGill Department of Biostatistics Biostatistics Seminar. Kernel optimal orthogonality weighting: a balancing approach to estimating effects of continuous treatments. Invited talk.
- SEP 23, 2019 Cornell Machine Learning in Medicine. Kernel optimal orthogonality weighting: a balancing approach to estimating effects of continuous treatments. Invited talk.
- MAY 23, 2019 Atlantic Causal Inference Conference 2019. Optimal estimation of generalized average treatment effects using Kernel Optimal Matching. Talk and poster.
- OCT 24, 2018 | Second TRIPODS PI meeting. Optimal balancing of time-dependent confounders for marginal structural models . Talk.
  - SEP 7, 2018 | Cornell Al Seminar. Optimal Weighting for Causal Inference . Invited talk.
- APR 11, 2018 | EUROCIM Causal Inference 2018. Optimal balancing of time-dependent confounders for marginal structural models . Talk.
- OCT 18, 2017 | MELODEM Selection Group Meeting. Optimal probability weights for inference with constrained precision . Invited talk.
  - SEP 7, 2017 | Royal Statistical Society International Conference. Estimating treatment effects with optimal inverse probability weighting. Talk.
- APRIL 5, 2017 UK Causal Inference Meeting. Estimating treatment effects with optimal inverse probability weighting. Poster.
  - SEP 7, 2016 | Royal Statistical Society International Conference. Optimal probability weights for inference with constrained precision . Talk.
  - SEP 4, 2015 | Nordic and Baltic Stata Users Group meeting. Weight watchers: How to optimize your weight . Invited talk.
- SEP 28, 2014 | HIV Nordic conference. Antiretroviral therapy among HIV-infected people who inject drugs in Sweden: access and treatment response . Poster.

## **Advising and Mentoring**

#### Master Students

- Nolan Kuenster, M.Ph. in Epidemiology George Washington University (Advisor). Application of statistical methods for excess mortality estimation
- 2019 Yaniv Ravid, M.Eng. in Operations Research and Information Engineering Cornell Tech (Advisor). *A Python library for Kernel Optimal Matching*
- 2017 Claudia Carlucci, M.Sc. in Biostatistics University of Milano-Bicocca and Karolinska Institutet (Mentor). Modeling additive interaction with continuous variables: smoking and the risk for rheumatoid arthritis
- 2015 Chiara Chiavenna, M.Sc. in Biostatistics University of Milano-Bicocca and Karolinska Institutet (Mentor). Laplace regression with censored data: an overview and application to observational data in cardiovascular epidemiology

## TEACHING EXPERIENCE

#### 2021 JUL 2021 JUN

Lecturer at the George Washington University

Teaching, preparation of material and computer laboratory sessions =.

- PUBH 6002 Biostatistical Applications for Public Health
- Summer Institute in Health Data Science and Biostatistics.

### 2018 APR 2015 APR

Teaching Assistant at the Karolinska Institute

Preparation of material and teaching of computer laboratory sessions.

- "Biostatistics I" for the Doctoral Program in Epidemiology,
- "Biostatistics II" for the Doctoral Program in Epidemiology,
- "Biostatistics I" for the Research School for Clinical Epidemiology, and,
- "Biostatistics II" for the Research School for Clinical Epidemiology.

The courses are given once per semester. They cover notions of statistics and biostatistics and the use of STATA for data analysis.

## **FUNDING**

2021 Nov

CO-PI, NSF 21-530 - Smart Health and Biomedical Research in the Era of Artificial Intelligence and Advanced Data Science

2025 Nov

Project title: Interpretable survival analysis of complex longitudinal data. 1,199,980 USD.

Proposal submitted - Written in collaboration with Prof. Ramin Zabih (PI), Dr. Yifan Peng, and Dr. Alexander Rush.

2017 DEC

Karolinska Institutet Doctoral (KID) funding

2013 DEC

Project title: Novel methods for estimating optimal dynamic treatment regimes for HIV-infected patients. 1,280,000 SEK.

Written in collaboration with Prof. Matteo BOTTAI (PI), Prof. Anna Mia EKSTRÖM, Prof. Anders SÖNNERBORG and Prof. Rino BELLOCCO.

#### Other awards and merits

2017 JUN | KI Travel Grant
 2017 AUG | Visiting Scholar at Cornell Tech. 14,000 sek.
 2012 FEB | Programme Extra Plus - Fondazione Cariplo
 2011 SEPT | Visiting student with the aim of working on the Master's thesis at the Division of Global Health, Karolinska Institutet. 4,500 EUR.
 2009 AUG | Erasmus+ Grant
 2009 FEB | Visiting student at the Department of Mathematics, University of Barcelona. 1,500 EUR.

#### SERVICE

Chair and organizer of the working group for a summer Institute in Health Data Science Current 2020 Nov and Biostatistics Chair of the Data Analysis and Visualization Working Group of the Current COVID-19 Community Research Partnership Study 2020 OCT Active member of the Department Faculty Meetings Current 2020 SEPT Involved in the project WiTNY, Women in Technology and Entrepreneurship in New York. 2020 AUG 2019 FEB Member of the Steering committee for the EURO-CIM Current 2017 APR Reviewer for the Journal of the Royal Statistical Society - Series A, Biometrical Journal, Current 2018 AUG Computational Statistics and Data Analysis, NeurIPS, ICML, AISTAT, Nature Machine Intelligence, BMC Medical Research Methodology, Epidemiological methods, Journal of the American Statistical Association, Statistics in Biopharmaceutical Research, Clinical Infectious Diseases, Annals of Applied Statistics.

#### LANGUAGES

ENGLISH: Fluent (C1/2).

ITALIAN: Mother tongue.

SPANISH: Basic knowledge (A2).

SWEDISH: Basic knowledge (A2).

#### COMPUTER SKILLS

#### **Operative Systems**

Advanced user of Linux, MacOS and Windows.

## **Programming Languages**

Advanced: R and STATA

Intermediate: Python, scikit-learn and SAS

Notions of: Mathematica, SageMath, SQL, TensorFlow and Matlab

#### CHARACTER AND SKILLS

- Independent
- Cooperative
- Devoted

Open-minded

## OTHER INTERESTS

When I am not reading about biostatistics and data science, I like to learn more about contemporary history. I also enjoy keeping myself active by playing sports and going to the gym. I especially enjoy running in the forest. It is my way of releasing stress and enjoy life. I love to play and listen to music, especially electronic and film music. During the past few years I started several electronic music projects that included production using Ableton Live. Finally, together with my wife Alice, I have a dog named Mister Pom Princess "PK" Cake, which keeps me happily busy.