

# Mats Julius Stensrud

MD Dr.philos

## Personal details

Address Chemin de l'Ochettaz 3, 1025 Saint Sulpice, Vaud, Switzerland

Email mats.stensrud@epfl.ch

## Current job

Sep 2020- **Tenure-Track Assistant Professor of Statistics, Chair of Biostatistics**, *Dep. of Mathematics*, Ecole Polytechnique Fédérale de Lausanne (EPFL), Switzerland. Statistical Methodology, Causal Inference, (Bio)medical applications.

## Work experience

- 2018-2020 Fulbright scholar and Kolokotrones fellow, Dep. of Epidemiology, Harvard School of Public Health, USA.
  September 2018-. Causal Inference, Longitudinal data. Statistical methodology
  - 2018 **Residency**, *Dep. of Medicine*, Diakonhjemmet Hospital, Oslo, Norway. 50% position March-September 2018. Clinical training in internal medicine (LIS 2)
  - 2018 Postdoctoral fellow, Dep. of Biostatistics, University of Oslo, Norway.
     50% position since March 2018. Causal Inference, Survival analysis, Epidemiologic methods
- 2016-2018 **Intern**, *Dep. of Medicine and Dep. of Surgery*, Diakonhjemmet Hospital, Oslo. 100% position. Clinical training in internal medicine and general surgery (LIS 1 / Turnus)

#### Education

- 2016 MD, Medical Doctor, University of Oslo, Norway.
- 2015 **Dr.philos**, *Neuroscience*, University of Oslo, Norway.

  Dissertation: Non-classical release of classical neurotransmitters
- 2014 **MSc**, *Applied Statistics*, University of Oxford, United Kingdom. Best achievements in the MSc program
- 2013 **BSc**, *Mathematics*, University of Oslo, Norway.

## **Teaching**

2021 **MATH-336 (Causal Inference)**, *Department of Mathematics*, EPFL. 3rd year BSc course.

- 2021 **MATH-449 (Biostatistics)**, *Department of Mathematics*, EPFL. 1st year MSc course.
- 2020 **MF9570 (Causal Inference)**, *Department of Biostatistics*, University of Oslo. PhD course. 7 hours of lectures on mediation analysis and causal mechanisms.
- 2019-2020 **HT194 (Clinical Epidemiology)**, *Harvard Medical School*, Harvard University. Teaching assistant for Prof. Miguel Hernán.
  - 2019 **EPI207 (Advanced Epidemiologic Methods)**, Harvard School of Public Health, Harvard University.

    Teaching assistant for Prof. James Robins.
  - 2017 **HEL8020 (Causal inference)**, *Faculty of Medicine*, University of Tromsø, Norway. Lecturing PhD-students and researchers causal inference methods for Health Registry Data.
  - 2015 **MF9490 (Statistics)**, *Faculty of Medicine*, University of Oslo, Norway. Lecturing statistics for PhD students in the Laboratory animal handling course.
- 2014-2016 **MED1100 (Statistics)**, *Faculty of Medicine*, University of Oslo, Norway. Classroom teaching. Introduction to statistics for 1st year MD students.

# Fellowships and grants

- 2019-2020 **Kolokotrones Fellow**, *Dep. of Epidemiology*, Harvard University. Causal Inference
- 2018-2019 **Fulbright Research Scholar**, *Dep. of Epidemiology*, Harvard University. Causal Inference
  - 2018 Unger Vetlesen Scholarship, Dep. of Epidemiology, Harvard University.
  - 2015 **Eckbo Legat**, *Dep. of Statistics*, University of Oxford.
  - 2014 Jansen Scholarship, Dep. of Statistics, University of Oxford.
  - 2013 **Norway Oxford Scholarship**, *Dep. of Statistics*, University of Oxford. Awarded to one Norwegian annually
  - 2013 **Senior Scholarship**, *Dep. of Statistics*, University of Oxford. For excellent academic records
- 2012, 2014 **Sønneland Scholarship**, Faculty of Medicine, University of Oslo.
  - 2011 **Apeland Viking Scholarship**, University of Wisconsin-Madison. Studies in Health Communication. Awarded to one Norwegian annually
  - 2009 **Fulbright Scholarship for Outstanding European Students**, Drexel University. Social science and American history

#### Awards

- 2018 Rothman Prize (Runner Up).Runner up for best article in Epidemiology in 2018.
- 2018 Statistical Excellence Award for Early-Career Writing (Runner Up).
  Runner up for best article in 2018 (Joint with Morten Valberg).
- 2018 **Best Paper Award**, Norwegian Epidemiological Association.

  Inequality in cancer risk suggest bad genes rather than bad luck, Nature Communications.

- 2018 Candidate at the Lindau Nobel Laureate Meeting.
  The Norwegian participant in the 68th Lindau Nobel meeting with 39 Nobel Laureates.
- 2014 **Gutierrez-Toscano Prize**, *Dep. of Statistics*, University of Oxford. I obtained the best achievements in the MSc program in Applied Statistics.

#### Selected talks

- 2021 **The 2021 Pacific Causal Inference Conference**, *Invited*, Beijing (online), China. Causal inference when resources are limited
- 2021 **Society of Epidemiologic Research**, *Contributed*, San Diego (online), USA. Non-discriminatory allocation of limited health resources
- 2021 **JGH Epidemiology Seminar 2021**, *Invited*, (online), Mnotreal. Causal inference in settings with competing events and truncation by death
- 2021 **Biometrischen Kolloquium 2021**, *Invited*, (online), Germany. Causal inference Under Resource Constraints
- 2020 **CMStatistics 2020**, *Invited*, London (online), UK. New estimands for causal inference conditional on post-treatment variables
- 2020 **Society of Epidemiologic Research**, *Contributed*, Boston (online), USA. New estimands for conditional causal effects
- Center for Statistics Adolphe Quetelet Seminar Series, Invited, University of Ghent, Belgium.
   Causal reasoning in settings with competing events and truncation by death
- 2020 Seminar in Probability Theory and Statistics , Invited, University of Basel, Switzerland.
  New estimands for causal inference conditional on a post-treatment event
- 2020 **Biostatistics seminar**, *Invited*, University of Geneva, Switzerland. Causal Inference Conditional on a Post-Treatment Variable
- 2020 **Joint Statistical Meeting**, *Contributed*, Philadelphia, USA. Causal Inference Conditional on a Post-Treatment Event
- 2020 European Causal Inference Meeting, Contributed, Oslo, Norway (Online due to COVID-19).
  Conditional Separable Effects
- 2020 **Boston University Causal Inference Seminar**, *Invited*, Boston University, USA. The separable effects: New estimands for causal inference in time-to-event settings
- 2019 Causal Inference Reading Group, Invited, University of Pennsylvania, USA. Separable Effects
- 2019 **Ulm Mathematical Colloquium**, *Invited*, Ulm, Germany. Causal Inference in Continuous Time
- 2019 **Society of Epidemiologic Research**, *Invited*, Minneapolis, USA. Separable effects: new estimands for causal inference in competing risk settings
- 2019 **Lifetime Data Science: Foundations and Frontiers**, *Invited*, Pittsburgh, USA. New Estimands for Causal Inference in the Presence of Competing Risks

- 2019 Biostatistics group meeting, Harvard Pilgrim Health Care Institute, Invited, Boston, USA.
  Separable effects for competing risks settings.
- 2019 **Atlantic Causal Inference Conference**, *Contributed*, Montreal, Canada. Causal inference in the presence of competing risks
- 2019 **European Causal Inference Meeting**, *Contributed*, Bremen, Germany. Separable effects: New estimands for causal inference in competing risk settings
- 2018 European Causal Inference Meeting, Contributed, Florence, Italy.
  Marginal structural models for survival analysis in continuous time: Theoretically appealing and practically feasible
- 2017 Causal Inference for Longitudinal Data, Invited, Columbia University, USA.
- 2017 **Workshop on Causal Inference in Health Registry Research**, *Invited*, Oslo, Norway.
- 2016 Biostatistics seminar, Invited, Oslo, Norway.
- 2016 NordStat, The Nordic Statistical Meeting, Invited, Copenhagen, Denmark.
- 2016 Bergen Biostatistical Seminar, Invited, Bergen, Norway.
- 2015 Instrumental Variables and Causal Inference, Invited, Copenhagen, Denmark.

# Postdoc supervision

2020 **Pål Christie Ryalen**, *Department of Mathematics*, EPFL, Switzerland. Theory and methods for survival analysis

# PhD supervision

- 2020- **Matias Janvin**, *Department of Mathematics*, EPFL, Switzerland. PhD student, research on causal inference methods (main supervisor).
- 2020- Niklas Nyboe Maltzahn, Department of Mathematics, EPFL, Switzerland. visiting PhD student, research on estimation in continuous time multistate models (co-supervisor).
- 2020-2021 **Aaron Sarvet**, *Harvard School of Public Health*, Harvard University, USA. Co-advisor and committee member
- 2017-2019 **Pål Christie Ryalen**, *Faculty of Medicine*, University of Oslo, Norway. PhD in biostatistics (co-supervisor). Thesis defended September 5th 2019.

### Peer review service 2017-2021

- Journal of the American Statistical Association (2021)
- o PNAS (2021)
- o Biometrika (2019, 2020, 2021)
- Statistical Science (2020, 2021)
- o Epidemiology (2018, 2019, 2020, 2021
- o British Medical Journal (BMJ) (2018, 2021)
- Annals of Applied Statistics (2017,2021)

- o Biometrics (2020, 2021)
- Lifetime Data Analysis (2020)
- European Journal of Epidemiology (2020, 2021)
- o American Journal of Epidemiology (2019, 2020)
- Scandinavian Journal of Statistics (2019, 2020)
- Statistics in Medicine (2019)
- Biometrical Journal (2018)
- o Annals of Internal Medicine (2018, 2019, 2020), awarded top grade reviewer.

# Other professional activities

- 2021 Causal report for Armasuisse, Report on Causality Research, Switzerland).
- 2021 **Joint Statistical Meeting (JSM)**, Contributed Session Organizer Causal Inference When Resources Are Limited, USA (Virtual due to COVID-19).
- 2021 Conference on Uncertainty in Artificial Intelligence (UAI), Senior Program Committee Member, USA (Virtual due to COVID-19).
- 2021 Research Council, Grant reviewer, Israel.
- 2020 **Conference on Uncertainty in Artificial Intelligence (UAI)**, *Program Committee*, Vancouver (Virtual due to COVID-19).
- 2019-2020 **Kolokotrones Symposium on Data Science**, *Organizer of monthly seminars*, Harvard School of Public Health.
- 2017-2018 Medical Research Council, Grant reviewer, United Kingdom.

# A: Peer-reviewed publications with original content

- [1] Martinussen, T., **Stensrud, M. J.,** "Estimation of separable direct and indirect effects in continuous time". In: *Biometrics (accepted)* (2021).
- [2] Stensrud, M. J., Hernán, M. A., Tchetgen Tchetgen, E. J., Robins, J. M., Didelez, V., Young, J. G., "A generalized theory of separable effects in competing event settings". In: *Lifetime Data Analysis* (2021), pp. 1–44.
- [3] **Stensrud, M. J.**, Young, J. G., Martinussen, T., "Discussion on "Causal mediation of semicompeting risks" by Yen-Tsung Huang". In: *Biometrics (accepted)* (2021).
- [4] Didelez, V., **Stensrud, M. J.,** "On the logic of collapsibility for causal effect measures". In: *Biometrical Journal* (2021).
- [5] Ryalen, P. C., Møller, B., Laache, C., **Stensrud, M. J.**, Røysland, K., "Prognosis of cancer survivors: estimation based on differential equations". In: *Biostatistics* (accepted) (2021).
- [6] Young, J. G., Stensrud, M. J., "Identified versus interesting causal effects in fertility trials and other settings with competing or truncation events". In: *Epidemiology* (2021).
- [7] Aris, I. M., Sarvet, A. L., **Stensrud, M. J.**, Neugebauer, R., Li, L.-J., Hivert, M.-F., Oken, E., Young, J. G., "Separating Algorithms from Questions and Causal Inference with Unmeasured Exposures: An Application to Birth Cohort Studies of Early BMI Rebound". In: *American Journal of Epidemiology* (2021).
- [8] Accorsi, E. K., Qiu, X., Rumpler, E., Kennedy-Shaffer, L., Kahn, R., Joshi, K., Goldstein, E., Stensrud, M. J., Niehus, R., Cevik, M., "How to detect and reduce potential sources of biases in studies of SARS-CoV-2 and COVID-19". In: European Journal of Epidemiology (2021), pp. 1–18.
- [9] Wanis, K. N., Sarvet, A., Ruffolo, L. I., Levstik, M. A., Tomiyama, K., Al-Judaibi, B. M., Stensrud, M. J., Hernandez-Alejandro, R., "Estimating the effect of increasing utilization of living donor liver transplantation using observational data". In: Transplant International (2021).
- [10] **Stensrud, M. J.**, Young, J. G., Didelez, V., Robins, J. M., Hernán, M. A., "Separable Effects for Causal Inference in the Presence of Competing Events". In: *Journal of the American Statistical Associaton, Theory & Methods* (2020).
- [11] **Stensrud, M. J.**, Hernan, M. A., "Why Test for Proportional Hazards?" In: *JAMA* (2020).
- [12] Young, J. G., **Stensrud, M. J.**, Tchetgen Tchetgen, E. J., Hernán, M. A., "A causal framework for classical statistical estimands in failure-time settings with competing events". In: *Statistics in Medicine* (2020). DOI: 10.1002/sim.8471.
- [13] Sarvet, A. L., Wanis, K. N., **Stensrud, M. J.**, Hernán, M. A., "A graphical description of partial exchangeability". In: *Epidemiology* (2020).

- [14] Chiu, Y.-H., **Stensrud, M. J.**, Dahabreh, I. J., Rinaudo, P., Diamond, M. P., Hsu, J., Hernández-Díaz, S., Hernán, M. A., "The effect of prenatal treatments on offspring events in the presence of competing events: an application to a randomized trial of fertility therapies." In: *Epidemiology (Cambridge, Mass.)* (2020).
- [15] **Stensrud, M. J.**, Røysland, K., Ryalen, P. C., "On null hypotheses in survival analysis". In: *Biometrics* (2019).
- [16] **Stensrud, M. J.**, Røysland, K., Ryalen, P. C., "Sufficient cause interaction for time-to-event outcomes". In: *Epidemiology* (2019).
- [17] Ryalen, P. C., **Stensrud, M. J.**, Røysland, K., "The additive hazard estimator is consistent for continuous-time marginal structural models". In: *Lifetime data analysis* (2019), pp. 1–28.
- [18] Huitfeldt, A., Swanson, S. A., **Stensrud, M. J.**, Suzuki, E., "Effect heterogeneity and variable selection for standardizing causal effects to a target population". In: *European journal of epidemiology* (2019), pp. 1–11.
- [19] Huitfeldt, A., **Stensrud, M. J.**, Suzuki, E., "On the collapsibility of measures of effect in the counterfactual causal framework". In: *Emerging themes in epidemiology* 16.1 (2019), p. 1.
- [20] Aalen, O. O., Stensrud, M. J., Didelez, V., Daniel, R., Røysland, K., Strohmaier, S., "Time-dependent mediators in survival analysis: Modeling direct and indirect effects with the additive hazards model". In: Biometrical Journal (2019).
- [21] Wanis, K., Sarvet, A., **Stensrud, M. J.**, Hernán, M. A., "A graphical description of partial exchangeability". In: *Epidemiology* (2020).
- [22] **Stensrud, M. J.**, Aalen, J. M., Aalen, O. O., Valberg, M., "Limitations of hazard ratios in clinical trials". In: *European Heart Journal* (2018), ehy770.
- [23] **Stensrud, M. J.**, Valberg, M., "Preventing cancer: Mere rhetoric or a promising plan?" In: *Significance* (2018).
- [24] Ryalen, P. C., **Stensrud, M. J.**, Røysland, K., "Transforming cumulative hazard estimates". In: *Biometrika* (2018). DOI: 10.1093/biomet/asy035.
- [25] Ryalen, P. C., **Stensrud, M. J.**, Fosså, S., Røysland, K., "Causal inference in continuous time: an example on prostate cancer therapy". In: *Biostatistics* (2018).
- [26] **Stensrud, M. J.**, Strohmaier, S., Valberg, M., Aalen, O. O., "Can chance cause cancer? A causal consideration". In: *European Journal of Cancer* 75 (2017), pp. 83–85.
- [27] Valberg, M., **Stensrud, M. J.**, Aalen, O. O., "The surprising implications of familial association in disease risk". In: *BMC public health* 18.1 (2018), p. 135.
- [28] Aalen, O. O., Gran, J. M., Røysland, K., **Stensrud, M. J.**, Strohmaier, S., "Feedback and Mediation in Causal Inference Illustrated by Stochastic Process Models". In: *Scandinavian Journal of Statistics* 45.1 (2018), pp. 62–86.

- [29] **Stensrud, M. J.**, Valberg, M., "Inequality in genetic cancer risk suggests bad genes rather than bad luck". In: *Nature Communications* 8.1 (2017), p. 1165.
- [30] **Stensrud, M. J.**, Valberg, M., Aalen, O. O., "Can Collider Bias Explain Paradoxical Associations?" In: *Epidemiology* 28.4 (2017), e39–e40.
- [31] **Stensrud, M. J.**, Strohmaier, S., "Diastolic hypotension due to intensive blood pressure therapy: Is it harmful?" In: *Atherosclerosis* 265 (2017), pp. 29–34.
- [32] **Stensrud, M. J.**, Valberg, M., Røysland, K., Aalen, O. O., "Exploring Selection Bias by Causal Frailty Models". In: *Epidemiology* 28.3 (2017), pp. 379–386.
- [33] Tangerud, Å., Potapenko, I., Skjerven, H. K., **Stensrud, M. J.,** "Radiologic evaluation of lumps in the male breast". In: *Acta Radiologica* 57.7 (2016), pp. 809–814.
- [34] **Stensrud, M. J.**, Sogn, C. J., Gundersen, V., "Immunogold characteristics of VGLUT3-positive GABAergic nerve terminals suggest corelease of glutamate". In: *Journal of Comparative Neurology* 523.18 (2015), pp. 2698–2713.
- [35] **Stensrud, M. J.**, Puchades, M., Gundersen, V., "GABA is localized in dopaminergic synaptic vesicles in the rodent striatum". In: *Brain Structure and Function* 219.6 (2014), pp. 1901–1912.
- [36] **Stensrud, M. J.**, Chaudhry, F., Leergaard, T., Bjaalie, J., Gundersen, V., "Vesicular glutamate transporter-3 in the rodent brain: Vesicular colocalization with vesicular  $\gamma$ -aminobutyric acid transporter". In: *Journal of Comparative Neurology* 521.13 (2013), pp. 3042–3056.

## B: Preprint articles with original content

- [1] **Stensrud, M. J.**, Robins, J. M., Sarvet, A., Tchetgen, E. J. T., Young, J. G., "Conditional separable effects". In: *JASA T & M (revision invited), arXiv preprint arXiv:2006.15681* (2021).
- [2] Sarvet, A. L., Wanis, K. N., Young, J., Hernandez-Alejandro, R., Hernán, M. A., **Stensrud, M. J.,** "Causal inference with limited resources: proportionally-representative interventions". In: *arXiv* preprint *arXiv*:2002.11846 (2020).

#### Msc students at EPFL

- 2021 Andreu Arderiu, Master thesis advisor, Department of Mathematics.
- 2021 Jeremy Völlmin, Master thesis advisor, Department of Mathematics.
- 2021 **Mehdi Guelzim**, *Master semester project advisor*, Department of Mathematics.

# Department service at EPFL

- 2020- **Working committee member**, *Designing a new EPFL Master in Statistics.*, Department of Mathematics.
- 2020- **Msc admission committee**, *Msc in Mathematics*, Department of Mathematics. PhD jury member for:
- 2021 Mario Krali, PhD candidacy exam jury, Department of Mathematics.
- 2021 **Tse Timmy Rong Tian**, *PhD candidacy exam jury*, Department of Mathematics.
- 2020 Sonia Alouini, PhD candidacy exam jury, Department of Mathematics.