Ecole Polytechnique, 1 Rue Honoré d'Estienne d'Orves, 91120 Palaiseau France

Curriculum Vitae

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Research interests

My research work focuses on statistical learning theory, in particular non-parametric algorithms such as random forests. This class of algorithms exhibits good predictive performance that are not yet fully explained by theory. Therefore analyzing random forests from a theoretical perspective is both challenging and very exciting! I am also interested in the notion of explainable AI, i.e., providing insights about how algorithm predictions are built (variable importance, list of simple decision rules). I am also working on missing value theory, trying to design algorithms that can easily handle incomplete data and understand the impact of imputation on predictive performances. More recently, I started exploring the connections between random forests and neural networks, another kind of non-parametric algorithms with tremendous empirical performance. I have also started to work on causality.

Training

- 2009-2013 **Degree from École Normale Supérieure de Paris** *in mathematics (with a minor in physics).*
- 2009-2010 Bachelor in mathematics and physics, with honors (bien/très bien).
- 2010-2011 Master thesis on Metropolis-Hasting algorithm on Riemanian varieties. Several other research topics were spherical black holes, modelling growing interface, introduction to statistical learning.
- 2011-2012 Master degree on *Random modelling* from university Paris 7, with honors (très bien).
 - 2012 Internship at Robert Debré Hospital (Paris) on glycemic variability for diabetic patients (6 months).
- 2012-2015 **PhD in statistics** *on "Learning with random forests"* supervised by Gérard Biau (LSTA University Paris 6) et de Jean-Philippe Vert (Mines Institut Curie) Reviewers: Peter Bühlmann, Pierre Geurts. Jury: Sylvain Arlot, Arnaud Guyader
- March 2016 Academic visit with Professor Zaid Harchaoui to the Courant Institute (New-York).
- 2016 2023 Assistant Professor in Applied Mathematics, at École Polytechnique in Paris (CMAP).

- 2023 ... **Professor in Applied Mathematics,** *at Sorbonne Université in Paris* (LPSM, SCAI).
- Dec. 2020 Habilitation à diriger des recherches Random forests, interpretability, neural networks and missing values.
 Reviewers: Sylvain Arlot, Giles Hooker, Gabor Lugosi
 Jury: Florence D'Alché-Buc, Olga Klopp, Eric Moulines.

Teaching

- 2012-2013 **Tutorial sessions in mathematics (TD, 24h)** for first-year bachelor students in Paris Sciences et Lettres (PSL).
- 2013-2014 **Tutorial sessions in mathematics (TD, 24h)** for second-year bachelor students in Paris Sciences et Lettres (PSL).
- 2013-2015 **Probability and Statistics (New course, 48h)** for second-year bachelor students in economy.
- 2016-2019 **Tutorial sessions in Machine Learning I (TD/TP, 18h)** for first-year graduate students in "Data science for business" (X-HEC).
- 2016-2017 **Tutorial sessions in "The Art of Regression" (TD, 36h)** for third-year engineering students.
- 2016-2018 **Tutorial sessions in Machine Learning II (TD/TP, 18h)** for third-year engineering students.
- 2016-2018 **Tutorial sessions in "Statistics in Action" (TD/TP, 18h)** for third-year engineering students.
- 2017-2019 Machine Learning Course (Course, 9h) for first-year graduate students in "Data science for business" (X-HEC).
- 2018-2023 Deep Learning Course (New course, 21h) for second-year master students.
- 2019-2020 Tutorial sessions in Deep Learning (TP, 21h) for second-year master students.
- 2019-2023 **Deep Learning and Optimization Course (lectures and lab sessions)** for firstyear graduate students in "Data science for business" (X-HEC).
- 2018-2023 Learning Theory Course (New course, 12h) for third year engineering students.
- 2022-2023 **MOOC** Deep Learning and Optimization, with Aymeric Dieuleveut (in progress).

Besides teaching courses, I gave oral examination training to Bachelor students for two years in some preparatory class for the "grandes écoles". From 2009 to 2014, I also participated in a monthly mentoring program named TalENS directed towards high school students from Paris suburb in order to encourage them to keep studying beyond their 'baccalauréat'. In particular, I co-organized a week of intensive classes for high school students in August 2013 and August 2014.

Past responsibilities

- 2013, 2014 **Co-organizer of a week of intensive classes** *for high school students* taking place at École Normale Supérieure.
- 2013 2015 Co-organizer of the PhD students seminar, at LSTA, University Paris 6.

- 2016 2017 **Co-organizer of the "Café des statistiques" weekly seminar**, *at École Polytechnique*.
- 2017, 2018 **Co-organizer of the one-day conference Young Statistician and Probabilists**, *at Institut Henri Poincaré*.
- 2017, 2018 Co-head of the third year of Applied Mathematics at École Polytechnique.
- 2017, 2018 **Co-organizer of the Data Science Summer School (DS3)**, École Polytechnique.
- 2017 2019 Member of the scientific comittee of the DS3, École Polytechnique.

Current responsibilities

- 2012 **Reviewer** for the Journal of Machine Learning Research, The Annals of Statistics, Electronic Journal of Statistics, International Conference on Machine Learning, Neural Information Processing Systems and others.
- 2017 In charge of data science third-year projects.
- 2017 Co-director of the Master (MScT) "Artificial Intelligence and Advanced Visual Computing", created in September 2018 at École Polytechnique.
- 2018 **Co-director of the internships of first and second year** in the "Artificial Intelligence and Advanced Visual Computing" training.
- 2020 Scientific responsible of the Artificial intelligence program of Labex Mathématiques Hadamard (LMH) with Frédéric Chazal.

Jury

- 2023 **Reviewer of the PhD defense of Jean-Samuel Leboeuf,** "On the generalization properties of VC classes and application to decision trees", Laval University, Canada.
- December Jury member of the PhD defense of Clément Bénesse, "On the links between 2022 Global Sensitivity Analysis and Algorithmic Fairness for eXplainable and Fair Machine Learning", Toulouse III University, France.
- December Jury member of the PhD defense of Baptiste Kerleguer, "Multi-fidelity surrogate 2022 modeling adapted to functional outputs for uncertainty quantification of complex models", École polytechnique, France.
- June 2019 Jury member and reviewer of the PhD defense of Antonio Sutera, "Importance measures derived from random forests: characterisation and extension", Liege University, Belgium.
- June 2019 Jury member and reviewer of the PhD defense of Irving Gomez Mendez, entitled "Random forests and autoencoders with missing data", CIMAT, Mexico.
- June 2021 Member of the selection committee for an assistant professor position, Université Gustave Eiffel.
- June 2022 **Member of the selection committee for an assistant professor position**, *Université de Bordeaux*.

Talks

Dec. 2012 PhD students seminar, LSTA, Paris 6.

- March 2013 Computational Biology team seminar, Institut Curie.
- June 2013 Journées de statistique, SFDS, Toulouse.
- Dec. 2013 NIPS, workshop MLCB, Reno, Nevada.
- March 2014 PhD students seminar, MAP5, Paris 5.
- March 2014 Poster at the colloquium "Digital: Big scale and complexity", IMT.
- April 2014 "Random modelling and applications" seminar, Caen.
- April 2014 SMILE seminar, ENS Ulm.
- June 2014 Journées de statistique, SFDS, Rennes.
- January 2015 Maths & companies week, organized by AMIES, Paris.
- January 2015 Young Statisticians and Probabilists conference, Institut Henri Poincaré.
 - Feb. 2015 **Probability and statistics seminar,** *Institut de Mathématiques et de Modélisation de Montpellier.*
 - June 2015 Journées de statistique, SFDS, Lille.
 - Sept. 2015 MODAL seminar, INRIA Lille.
- October 2015 Statistic seminar, Université de Strasbourg.
- Nov. 2015 **STA seminar**, *Telecom ParisTech*.
- January 2016 Statistic seminar, Université de Toulouse.
- June 2016 Journées de statistique, SFDS, Montpellier.
- August 2016 MAS conference, Grenoble.
- Sept. 2016 Statistic seminar, Compiègne.
- January 2017 Statistic seminar, Agro ParisTech.
 - May 2017 Statistic seminar, MAP5.
 - May 2017 Statistic seminar, École des ponts.
 - July 2017 Joint Statistical Meetings (JSM 2017), Baltimore.
- January 2018 Invited speaker at a workshop on the Interface of Machine Learning and Statistical Inference, *Banff, Canada*.
 - March 2018 **Conference to prepare high school students to a conference by Yann LeCun**, *Bourg La Reine.*
 - April 2018 Statistic seminar, Rennes.
 - April 2018 Statistic seminar, Versailles.
 - May 2018 Statistic seminar, Telecom ParisTech.
- January 2019 Probability and Statistic seminar, Lille university.
- January 2019 Invited speaker at Journée Statistique / Apprentissage à Paris Saclay, IHES.
- March 2019 Invited speaker at BNP Cardiff conference, Nanterre.
- March 2019 Invited speaker at Sanofi conference, Lyon.
- May 2019 Statistic seminar, Paris 7 university.
- October 2019 Invited Speaker at Conference on Big Data and Machine Learning in Econometrics, Finance, and Statistics, Chicago university.
- October 2019 Invited speaker in a thematic class, Puebla, Mexico.

- January 2021 Statistic seminar, Angers.
 - March 2021 Statistic seminar for M2 students, University Paris-Saclay.
 - May 2021 Statistical workshop, Amsterdam School of Economics.
 - July 2021 ENBIS Workshop: Interpretability for Industry 4.0, Naples.
- January 2022 Statistical seminar for M2 students, Ecole Polytechnique.
 - Feb. 2022 Statistical seminar, Berlin, Weierstrass Institute.
 - Feb. 2022 Statistical seminar, Orsay.
 - March 2022 Statistical seminar, Vannes.
 - March 2022 Statistical seminar, Montpellier.
 - April 2022 Statistical seminar, Centre Borelli, ENS Paris-Saclay.
 - June 2022 Journées de statistique, SFDS, Lyon.
 - Sept. 2022 Statistical and Optimization seminar, Toulouse.
 - Nov. 2022 Econometrics seminar, Cambridge.
 - Dec. 2022 International Conference on Statistics and Data Science, Florence.
 - Feb. 2023 Econometrics seminar, Amsterdam University.
 - Feb. 2023 Data Science seminar, London School of Economics.
 - April 2023 Stat'Learn conference, Montpellier.
 - June 2023 Quarter on Causality, conference, Institut Pascal, Paris Saclay.

Grant and Awards

- April 2016 **Grant from the Pierre Ledoux Foundation** *to fund a visit to the Courant Institute,* New-York.
- August 2016 **Recipient of the Jacques Neveu 2016 Prize**, rewarding a PhD thesis in probability or statistics, received during the MAS conference, Grenoble.
 - June 2018 Missing DatalA project funded by DatalA institute.
 - June 2020 PhD thesis funded by SCAI (Sorbonne Center for Artificial Intelligence) on neural networks.
 - June 2021 **Recipient of an Emergence Project,** provided by Paris city to develop a topic in machine learning (150.000 euros).

Supervision - Internships

- July 2013 Co-supervision of the internship of Nelly Alandou, Clément Benesse et Pablo Le Henaff, first-year students in Paris Sciences et Lettres.
- Spring 2014 **Supervision of the internship of Arthur Pajot,** *third-year student at University Paris 6.*
 - Avril 2015 Supervision of the internship of Charlotte Rougier, lycéenne en première S.
 - 2016 **Supervision of the internship of Jurriaan Parie**, *third-year student at University Paris 6.*
 - 2016 **Supervision of several third-year projects in data science,** *at École Polytechnique.*

- 2020 **Co-supervision of the M2 internship of Ludovic Arnould** with Claire Boyer (LPSM).
- 2021 **Co-supervision of the post-doctoral research of Marine Le Morvan** with Julie Josse (INRIA Montpellier) and Gaël Varoquaux (INRIA Saclay).
- 2021 **Co-supervision of the M2 internship of Alexis Ayme** with Claire Boyer (LPSM) and Aymeric Dieuleveut (CMAP).
- 2022 Co-supervision of the M2 internship of Patrick Lutz with Claire Boyer (LPSM).
- 2022 **Co-supervision of the M2 internship of Khadim Sene** with Alexandre Py-Renaudie (IPP, IPVF) and Jean-François Guillemoles (IPP, IPVF).

Supervision - PhD

- 2016 2020 **Co-supervision of the PhD thesis of Jaouad Mourtada** *entitled Contributions to statistical learning: density estimation, expert aggregation and random forests* with Stéphane Gaïffas (University Paris 7).
- 2018 2019 **Co-supervision of the PhD thesis of Nicolas Prost** with Julie Josse (Ecole Polytechnique) and Gael Varoquaux (Inria).
- 2018 2021 **Co-supervision of the PhD thesis (CIFRE) of Clement Benard** *entitled Forêts aléatoires et interprétabilité des algorithmes d'apprentissage* with Gérard Biau (LPSM) and Sebastien Da Veiga (Safran).
 - 2020 Co-supervision of the PhD thesis of Ludovic Arnould with Claire Boyer (LPSM).
 - 2020 **Co-supervision of the PhD thesis of Bénédicte Colnet** with Julie Josse (INRIA Montpellier) and Gaël Varoquaux (INRIA Saclay).
 - 2021 **Co-supervision of the PhD thesis of Alexis Ayme** with Claire Boyer (LPSM) and Aymeric Dieuleveut (CMAP).

Book

2022 Interpretability for Industry 4.0 : Statistical and Machine Learning Approaches, B. Iooss, R. Kenett, P. Secchi, B.M. Colosimo, F. Centofanti, C. Bénard, S. Da Veiga, E. Scornet, S. N. Wood, Y. Goude, M. Fasiolo Editors: A. Lepore, B. Palumbo, J.-M. Poggi, Springer.

Published papers

- 2015 **Consistency of random forests,** *E. Scornet, G. Biau, and J.-P. Vert* The Annals of Statistics, Vol. 43, pp. 1716-1741.
- 2016 **On the asymptotics of random forests,** *E. Scornet* Journal of Multivariate Analysis, Vol. 146, pp. 72–83.
- 2016 **Random forests and kernel methods,** *E. Scornet* IEEE Transactions on Information Theory, Vol. 62, pp. 1485-1500.
- 2016 **A Random Forest Guided Tour,** *G. Biau and E. Scornet* TEST, Vol. 25, pp. 197-227, with Discussion.
- 2016 Promenade en forêts aléatoires, E. Scornet MATAPLI, Vol. 111.

- 2017 Kernel multitask regression for toxicogenetics, E. Bernard, Y. Jiao, E. Scornet, V. Stoven, T. Walter and J.-P. Vert Molecular Informatics, Vol. 36.
- 2017 Universal consistency and minimax rates for online Mondrian Forest, J. Mourtada, S. Gaïffas, E. Scornet NIPS.
- 2017 **Tuning parameters in random forests,** *E. Scornet* ESAIM Procs, Vol. 60 pp. 144-162.
- 2018 Impact of subsampling and tree depth on random forests, *R. Duroux, E. Scornet* ESAIM: Probability and Statistics, Vol. 22, pp. 96-128.
- 2018 Neural Random Forests, G. Biau, E. Scornet, J. Welbl, Sankhya A, 1-40.
- 2020 Minimax optimal rates for Mondrian trees and forests, J. Mourtada, S. Gaïffas, E. Scornet, The Annals of Statistics, 48(4), 2253-2276.
- 2020 Linear predictor on linearly-generated data with missing values: non consistency and solutions, *M. Le Morvan, N. Prost, J. Josse, E. Scornet., G. Varoquaux,* AISTAT.
- 2020 Neumann networks: differential programming for supervised learning with missing values, *M. Le Morvan, J. Josse, T. Moreau, E. Scornet, G. Varoquaux* Oral, NeurIPS.
- 2021 SIRUS: Stable and Interpretable RUle Set for Classification , *C. Bénard*, *G. Biau*, *S. Da Veiga*, *E. Scornet*, Electronic Journal of Statistics 2021, Vol. 15, pp. 427-505.
- 2021 Interpretable Random Forests via Rule Extraction, C. Bénard, G. Biau, S. Da Veiga, E. Scornet, AISTAT.
- 2021 AMF: Aggregated Mondrian Forests for Online Learning, J. Mourtada, S. Gaïffas, E. Scornet, Journal of the Royal Statistical Society: Series B (Statistical Methodology), 83(3), 505-533.
- 2021 Analyzing the tree-layer structure of Deep Forests, L. Arnould, C. Boyer, E. Scornet, ICML.
- 2021 What's a good imputation to predict with missing values? *M. Le Morvan, J. Josse, E. Scornet, G. Varoquaux* Oral, NeurIPS.
- 2021 **Trees, forests, and impurity-based variable importance,** *E. Scornet,* Annales de l'Institut Henri Poincaré.
- 2022 SHAFF: Fast and consistent SHApley eFfect estimates via random Forests, *C. Bénard, G. Biau, S. Da Veiga, E. Scornet,* AISTAT.
- 2022 MDA for random forests: inconsistency, and a practical solution via the Sobol-MDA, C. Bénard, S. Da Veiga, E. Scornet, Biometrika.
- 2022 Near-optimal rate of consistency for linear models with missing values, *A. Ayme, C. Boyer, A. Dieuleveut, E. Scornet* ICML.
- 2022 **Generalizing a causal effect: sensitivity analysis and missing covariates,** *B. Colnet, J. Josse, E. Scornet, G. Varoquaux* Journal of Causal Inference.
- 2023 Is interpolation benign for random forests?, L. Arnould, C. Boyer, E. Scornet AISTAT.

2023 **Sparse tree-based initialization for neural networks,** *P. Lutz, L. Arnould, C. Boyer, E. Scornet.* ICLR.

Submitted papers

- 2019 **On the consistency of supervised learning with missing values,** *J. Josse, N. Prost, E. Scornet, G. Varoquaux.*
- 2022 Reweighting the RCT for generalization: finite sample error and variable selection, *B. Colnet, J. Josse, G. Varoquaux, E. Scornet.*
- 2023 Naive imputation implicitly regularizes high-dimensional linear models, A. Ayme, C. Boyer, A. Dieuleveut, E. Scornet..

Hobbies

- From 2014 to 2019, Stage and lighting director of the musicals *Bloody Monday*, *Doré Mirador* and *Au bonheur des âmes*, original creation and production with a troupe of 40 artists.
- From 2018, amateur actor in the theater company *Dans de beaux drames* in *Le repas des fauves* (2019) and *Le porteur d'histoire* (2021).
- Chess, Tennis, Badminton, application of probability theory to understand board games ("Mon premier vergé").