Maxime Vono

Senior Research Scientist, Criteo Al Lab https://mvono.github.io



Research interests

My current research interests lie in computational statistics, federated learning, privacy-preserving learning and recommender systems.

My Ph.D. works focused on deriving a broad <u>approximate statistical framework</u> and associated <u>Monte Carlo sampling</u> approaches by taking inspiration from the <u>variable splitting</u> method in optimisation, e.g., used by quadratic penalty approaches and the alternating direction method of multipliers (ADMM). During my journey at Huawei, I worked on distributed and federated Bayesian learning.

Keywords: Bayesian inference, computational statistics, federated learning, Monte Carlo methods, privacy-preserving learning, recommender systems.

Work experience

jan. 2022 - Senior Research Scientist, Criteo, Criteo Al Lab, Paris.

current I am working within the Recommendation research team.

nov. 2020 - **Research Scientist**, Lagrange Mathematics and Computing Research Center, Huawei, jan. 2022 Paris.

I worked with Alain Durmus (ENS Paris-Saclay) and Eric Moulines (Polytechnique, member of the French Academy of Sciences).

Research topics: distributed/federated Bayesian methods with applications to large-scale machine learning problems.

Mentoring: 1 Ph.D. student and 4 M.Sc. interns.

Publications: ICML (long talk) & AISTATS.

apr. 2017 - Data Scientist intern, Vekia, Lille.

sep. 2017 Machine learning techniques (random forests, sparse representations, time series, ...) applied to sales forecasting issues and supply chain management.

Led 4 major projects in different sectors: clothing, home improvement, food and health/beauty.

mar. 2016 - Data Scientist intern, Leroy Merlin France, Lille.

sep. 2016 Daily revenue forecasting (time series). The derived revenue forecasting algorithm is currently used to anticipate potential losses with respect to initial objectives.

sep. 2015 - Financial Auditor intern, EY, Paris.

feb. 2016 Financial statements analyses.

Education

2017-2020 **Ph.D. in Statistics**, *University of Toulouse*, Toulouse.

Asymptotically exact data augmentation - Models and Monte Carlo sampling with applications to Bayesian inference, under the supervision of Nicolas Dobigeon and Pierre Chainais.

Defended on October 7, 2020. Ph.D. committee: Pierre Chainais (advisor), Emilie Chouzenoux (examiner), Nicolas Dobigeon (advisor), Jalal Fadili (referee), Florence Forbes (referee), Jean-Michel Marin (examiner) and Eric Moulines (president). Do not hesitate to contact Jalal Fadili and Florence Forbes if you need their reports.

I was awarded a competitive scholarship from CIMI Excellence Laboratory. Rank: 1/50+. In spring 2019, I was a visiting research scholar at the **University of Oxford** in Arnaud Doucet's research group.

I was also a member of the ORION-B project which brings together observatorial astronomers, theoretical astrophysicists, data scientists and statisticians in order to analyse galactic and extra-galactic molecular line observations.

2016-2017 M.Sc. in Applied Mathematics, *University of Lille*, Lille.

Major in **Probability & Statistics**: Itô calculus, statistics, stochastic processes. *Honours*.

Clearance pricing policy optimisation with an application to Leroy Merlin France pricing strategy, under the supervision of Azzouz Dermoune.

2013-2017 M.Sc. in Engineering, École Centrale de Lille, Lille.

Major in **Data Analysis & Decision making (DAD):** optimisation, statistical estimation and learning. *Rank:* 1/24. *Top* 2% (250 students).

Award & Distinctions

- 2022 Top Reviewer, AISTATS.
- 2020 Prix Léopold Escande (top 15% Ph.D. thesis of Toulouse INP).
- 2018 Finalist, Best Student Paper Award, IEEE MLSP.

Industrial partnerships

- 2018 2019 **Intermarché**, *Strategy, Commercial Performance and Data direction*, Paris. Consultancy missions in data strategy and sales/revenue forecasting (32 days).
- 2016 2017 Leroy Merlin France, Pricing direction, Lille.

Dynamic pricing in clearance and promotional events (stochastic processes, robust control, Itô calculus). The derived pricing strategy was tested on real sales transactions and has been proposed to some French brick-and-mortar stores.

Supervision

2021 - 2022 Théo Fagnoni (M.Sc. intern), Ecole Centrale de Lille.

Differentially private Bayesian federated learning.

2021 - 2022 **Gatien Caillet (M.Sc. intern)**, University of Lille 1.

Latent variable models for personalized Bayesian federated learning.

- 2021 **Elie Louis (M.Sc. intern)**, *Mines ParisTech*, co-advised with Eric Moulines. Variational inference for black-box inverse problems with applications to astrophysics.
- 2021 **Ayoub Tajja (M.Sc. intern)**, *ENSTA ParisTech*, co-advised with Eric Moulines. Variational inference for non-linear inverse problems.
- 2020 2021 **Vincent Plassier (Ph.D. student)**, *Ecole Polytechnique*, co-advised with Alain Durmus and Eric Moulines.

Distributed Monte Carlo methods with applications to large-scale Bayesian inference.

Editorial activities

Refereeing for conferences

IEEE ICASSP Conferences (2019, 2020), IEEE MLSP Workshops (2019, 2020), ICML Conferences (2021, 2022), NeurIPS Conferences (2021), AISTATS Conferences (2022).

Refereeing for journals

Digital Signal Processing, IEEE Transactions on Signal Processing, Journal of Machine Learning Research, Statistics and Probability Letters.

Seminars and invited talks

2022/03 **Invited talk**, <u>SIAM Conference on Imaging Science</u>, Mini symposium on "Sparse Bayesian learning for image reconstruction with uncertainty quantification", online.

"Asymptotically exact data augmentation: models, algorithms and applications to image processing"

- 2022/01 **Invited talk**, <u>Al Seminar Series</u>, Technology Innovation Institute, online. "Bayesian federated learning"
- 2021/11 **Seminar**, <u>Signal & Communications Seminar</u>, IRIT, Toulouse, France. "Bayesian federated learning"
- 2021/11 **Seminar**, *SIMPAS Seminar*, Ecole Polytechnique, Paris, France. "Bayesian federated learning"
- 2021/09 **Invited talk**, *On Future Synergies for Stochastic and Learning Algorithms*, CIRM, Marseille, France.
 - "Bayesian federated learning"

Carlo within Gibbs"

- 2021/08 **Invited talk**, *Journées MAS 2020*, online.

 "Asymptotically exact data augmentation: models, algorithms and theory"
- 2021/06 Invited talk, Workshop on large scale simulation and high-dimensional sampling, Huawei Hong-Kong, Online.
 "DG-LMC: A turn-key and scalable synchronous distributed MCMC algorithm via Langevin Monte
- 2020/12 **Seminar**, Saminar The Paris-Saclay Signal Seminar, CentraleSupelec. "Efficient MCMC sampling via asymptotically exact data augmentation"
- 2020/11 **Invited talk**, Workshop on large scale simulation and high-dimensional sampling, Huawei Hong-Kong, Online.
 - "Asymptotically exact data augmentation (AXDA): An approximate statistical framework for Bayesian inference" and "Efficient sampling in high-dimensional and large-scale problems based on AXDA"
- 2020/09 **Seminar**, *Laplace's Demon Seminar*, Online. "Efficient MCMC sampling using ADMM-type splitting"
- 2020/02 **Seminar**, Actuarial Mathematics & Statistics Seminar, School of Mathematics of Heriot Watt University, Edinburgh, United Kingdom.

 "Asymptotically exact data augmentation: models, properties and algorithms"
- 2019/12 Invited talk, Toulouse Inderdisciplinary group on Deep Learning, Quai des Savoirs, Toulouse, France.
 - "Asymptotically exact data augmentation: models, properties and algorithms"
- 2019/12 **Invited talk**, *Workshop on optimization, probability and simulation*, Shenzhen Institute of Artificial Intelligence and Robotics for Society, University of Hong-Kong, Shenzhen, China. "Asymptotically exact data augmentation: models, properties and algorithms"
- 2019/04 **Invited talk**, *Mews Digital Day*, Mews Partners, Toulouse, France. "On artificial intelligence dedicated to supply chain and business strategy"
- 2019/03 **Seminar**, *OxCSML Seminar*, Department of Statistics, University of Oxford, Oxford, United Kingdom.
 - "Asymptotically exact data augmentation: models, properties and algorithms"
- 2018/05 Seminar, CRIStAL Seminar, Ecole Centrale de Lille, Lille, France.
 "Split-and-augmented Gibbs sampler A divide & conquer approach to solve large-scale inference problems"

Computer skills

Languages

Programming MATLAB, Python, R
Documents LATEX, Microsoft Office

French Mother tongue English Fluent

Spanish Fluent

Publications

Synthetic summary of the scientific production (submitted as gray subscripts)

	total		2022	2021	2020	2019	2018
international journal	7	=	2	4		1	
international conference	6	=	1	1		3	1
national conference	2	=			2		

Bibliometric indicators (source: Google Scholar, February 2022)

Citations: 105 H-index: 6

Full list of publications

International journal papers

- [JI7] M. Vono*, D. Paulin*, and A. Doucet (2022), Efficient MCMC sampling with dimension-free convergence rate using ADMM-type splitting, Journal of Machine Learning Research, vol. 23, no. 25, pp. 1-69.
- [JI6] **M. Vono**, N. Dobigeon, and P. Chainais (2022), *High-dimensional Gaussian sampling:* A review and a unifying approach based on a stochastic proximal point algorithm, SIAM Review, vol. 64, no. 1, pp. 3-56.
- [JI5] **M. Vono**, N. Dobigeon, and P. Chainais (2021), Asymptotically exact data augmentation: models, properties and algorithms, Journal of Computational and Graphical Statistics, vol. 30, no. 2, pp. 335-348.
- [JI4] P. Gratier, J. Pety, E. Bron, A. Roueff, J. H. Orkisz, M. Gerin, V. de Souza Magalhaes, M. Gaudel, M. Vono, S. Bardeau, J. Chanussot, P. Chainais, J. R. Goicoechea, V. V. Guzmán, A. Hughes, J. Kainulainen, D. Languignon, J. Le Bourlot, F. Le Petit, F. Levrier, H. Liszt, N. Peretto, E. Roueff, and A. Sievers (2021), Quantitative inference of the H₂ column densities from 3 mm molecular emission: A case study towards Orion B, Astronomy & Astrophysics, vol. 645, no. A27
- [JI3] E. Bron, E. Roueff, M. Gerin, J. Pety, P. Gratier, F. Le Petit, V. Guzmán, J. H. Orkisz, V. de Souza Magalhaes, M. Gaudel, **M. Vono**, S. Bardeau, P. Chainais, J. R. Goicoechea, A. Hughes, J. Kainulainen, D. Languignon, J. Le Bourlot, F. Levrier, H. Liszt, K. Oberg, N. Peretto, A. Roueff, and A. Sievers (2020), *Tracers of the ionization fraction in dense and translucent gas. I. Automated exploitation of massive astrochemical model grids*, Astronomy & Astrophysics, vol. 645, no. A28.
- [JI2] A. Roueff, M. Gerin, P. Gratier, F. Levrier, J. Pety, M. Gaudel, J. R. Goicoechea, J. H. Orkisz, V. de Souza Magalhaes, M. Vono, S. Bardeau, E. Bron, J. Chanussot, P. Chainais, V. V. Guzman, A. Hugues, J. Kainulainen, D. Languignon, J. Le Bourlot, F. Le Petit, H. S. Liszt, A. Marchal, M.-A. Miville-Deschenes, N. Peretto, E. Roueff, and A. Sievers (2020), C18O, 13CO, and 12CO abundances and excitation temperatures in the Orion B molecular cloud, Astronomy & Astrophysics, vol. 645, no. A26.
- [JI1] **M. Vono**, N. Dobigeon, and P. Chainais (2019). *Split-and-augmented Gibbs sampler Application to large-scale inference problems*, IEEE Transactions on Signal Processing, vol. 67, no. 6, pp. 1648-1661.

International conference papers

- [CI6] **M. Vono**, V. Plassier, A. Durmus, A. Dieuleveut and E. Moulines (2022), *QLSD: Quantised Langevin stochastic dynamics for Bayesian federated learning*, in AISTATS, Online
- [CI5] V. Plassier*, **M. Vono***, A. Durmus* and E. Moulines (2021), *DG-LMC: a turn-key and scalable synchronous distributed MCMC algorithm via Langevin Monte Carlo within Gibbs*, in ICML (long talk, top 14%), Online

- [C14] M. Vono, E. Bron, P. Chainais, F. L. Petit, S. Bardeau, S. Bourguignon, J. Chanussot, M. Gaudel, M. Gerin, J. R. Goicoechea, P. Gratier, V. V. Guzmán, A. Hughes, J. Kainulainen, D. Languignon, J. L. Bourlot, F. Levrier, H. S. Listz, K. I. Oberg, J. H. Orkisz, N. Peretto, J. Pety, A. Roueff, E. Roueff, A. Sievers, V. de Souza Magalhaes, and P. Tremblin (2019), A fully Bayesian approach for inferring physical properties with credibility intervals from noisy astronomical data, in WHISPERS, Amsterdam, Netherlands
- [Cl3] **M. Vono**, N. Dobigeon, and P. Chainais (2019), *Image restoration under Poisson noise and log-concave prior*, in ICASSP, Brighton, U.K.
- [Cl2] M. Vono, N. Dobigeon, and P. Chainais (2019), Efficient sampling through variable splitting-inspired Bayesian hierarchical models, in ICASSP, Brighton, U.K.
- [CI1] M. Vono, N. Dobigeon, and P. Chainais (2018), Sparse Bayesian binary logistic regression using the split-and-augmented Gibbs sampler. In MLSP, Aalborg, Denmark. Finalist for the Best Student Paper Awards.

National conference papers

- [CN2] **M. Vono**, N. Dobigeon, and P. Chainais (2019), *Modèles augmentés asymptotiquement exacts*, in GRETSI, Lille, France
- [CN1] **M. Vono**, N. Dobigeon, and P. Chainais (2019), *Un modèle augmenté asymptotiquement exact pour la restauration bayésienne d'images dégradées par un bruit de Poisson*, in GRETSI, Lille, France