## **CURRICULUM VITAE**

# FRANCISCO JESUS RODRIGUEZ RUIZ

Research Scientist (DeepMind)

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## PROFESSIONAL APPOINTMENTS

Research Scientist. DeepMind (London, UK)

2019 - Present

- Deep Learning Team (Data Efficient and Bayesian Deep Learning Group)
- Research topics: Variational inference, probabilistic methods, Bayesian deep networks

Postdoctoral Research Fellow. Univ. of Cambridge (UK) & Columbia Univ. (USA) 2016 – 2019

- Marie Skłodowska-Curie Fellowship (European Commission)
- Working with Prof. David M. Blei and Prof. Zoubin Ghahramani
- Research topics: Probabilistic models for econometrics (shopping and location data) and electronic health records. Efficient and flexible variational inference algorithms

Postdoctoral Researcher. Columbia University (USA)

2015 - 2016

- · Working with Prof. David M. Blei
- Research topics: Probabilistic models for econometrics (shopping data). Variational inference

## **EDUCATION AND TRAINING**

Ph.D. in Machine Learning. University Carlos III in Madrid (Spain)  Research topics: Bayesian non-parametrics for psychiatric applications and signal pro-	2015 ocessing
<ul> <li>Visiting Student Research Collaborator (3 months). University of Sheffield (UK) Supervisor: Prof. Neil D. Lawrence</li> </ul>	2014
Research topic: Natural gradients for collapsed variational inference  • Visiting Student Research Collaborator (3 months). Princeton University (USA)	2013
Supervisor: Prof. David M. Blei Research topic: Bayesian non-parametric models for recommendation systems	
Ms.C. in Machine Learning and Communications. University Carlos III in Madrid (Spain	1) 2012
Telecommunications Engineering. University of Seville (Spain)	2010
RESEARCH SUPPORT	
Marie Skłodowska-Curie Fellowship (European Commission)	2016 – 2019
Postdoctoral researcher. Hosted by Prof. David M. Blei	2015 – 2016
(Competitive) Ph.D. Scholarship by the Spanish Ministry of Education • FPU Grant No. AP2010-5333	2012 – 2015
Introduction to research grant. University of Seville (Spain). 2 months	2010
Introduction to research grant. Spanish National Research Council (Spain). 2 months • Institute of Optics "Daza de Valdés"	2009
HONORS AND AWARDS	
Fellowships / Grants	
Marie Skłodowska-Curie Fellowskin for nostdoctoral researchers, European Commissi	on 2016

Marie Skłodowska-Curie Fellowship for postdoctoral researchers. European Commission	2016
Nvidia Hardware Grant	2016
Ms.C. Studentship. University Carlos III in Madrid	2010
(Competitive) "FPU" Ph.D. Scholarship. Spanish Ministry of Education	2012
Bs.C. Thesis grant. Asitano, Prodetur, and University of Seville	2010
Competitive Engineering studentship for high school students. University of Seville  Covered the tuition and accommodation for the 5 years of the Engineering degree	2005

Reviewer / Presenter Awards	
Top 33% Reviewer (International Conference on Machine Learning)	2020
Best Reviewer Award (Advances in Neural Information Processing Systems Conference)	2019
Best Reviewer Award (International Conference on Machine Learning)	2019
Best Reviewer Award (Advances in Neural Information Processing Systems Conference)	2018
Outstanding Program Committee Award (AAAI Conference on Artificial Intelligence)	2018
Best Reviewer Award (Advances in Neural Information Processing Systems Conference)	2017
IBM Poster Presentation Award (Machine Learning Symposium). NY Academy of Sciences	2017
Best Student Awards	
Best Student Award in M.Sc. "Machine Learning and Communications" (1/20)	2012
National Best Student Award. Ministry of Education (#1 in Telecom. Engineering in Spain)	2011
University-level awards for outstanding academic grades  Best Student Award in Telecommunications Engineering. University of Seville (1/200)  Best Student Award in Engineering. "Ayto. de Sevilla" (1/1000)  Best Student Award in Engineering. "Real Maestranza de Sevilla" (1/1000)  Best Student Award in Engineering. "Caja de Ingenieros" (1/1000)	2011 2011 2011 2011
TEACHING	
Columbia University	
Instructor and class developer. Columbia University (USA). Columbia Business School  Class on Natural Language Processing for Ph.D. students. 2 weeks (6h/day)  Tasks: Develop and teach course material and lab sessions. Prepare homework assignment	2017 nts
Instructor and course developer. Columbia University (USA). Data Science Institute  • Data Science Bootcamp for Ph.D. students and postdoctoral researchers. 1 week (6h/day)  • Tasks: Develop and teach course material and lab sessions  • Highly positive feedback from students	2017
<ul><li>M.Sc. project supervisor. Columbia University (USA). Computer Science Department</li><li>Project title: "Scalable approaches for training word embeddings"</li></ul>	2017
University Carlos III in Madrid	
Teaching assistant. University Carlos III in Madrid (Spain). Department of Signal Processing  Communication Theory (class for undergraduates)  Network Access Technologies (class for undergraduates)  Feedback survey scores above 4.5/5 in all courses  Received congratulatory letter from the Vice President of Undergraduate Studies	– 2015 2012
<ul><li>B.Sc. project supervisor. University Carlos III in Madrid (Spain)</li><li>Project title: "Probability estimation in basketball"</li></ul>	2014
ORGANIZING COMMITTEES	
Workshop Organizer. Neural Information Processing Systems • "I Can't Believe It's Not Better!" Workshop	2020
Symposium Organizer. 2 <sup>nd</sup> Symposium on Advances in Approximate Bayesian Inference	2019
Symposium Organizer. 1 <sup>st</sup> Symposium on Advances in Approximate Bayesian Inference	2018
Workflow Chair. Intl. Conference on Artificial Intelligence and Statistics. Lanzarote (Spain)	2018
Workshop Organizer. Neural Information Processing Systems. Long Beach (USA)  • "Advances in Approximate Bayesian Inference" Workshop	2017
Volunteer at conferences  Advances in Neural Information Processing Systems. South Lake Tahoe (USA)  International Conference on Artificial Intelligence and Statistics. La Palma (Spain)	2012 2012

#### **PUBLICATIONS IN PEER-REVIEWED JOURNALS**

#### **Under review**

- S. Athey, R. Donnelly, F. J. R. Ruiz, D. M. Blei. "Counterfactual Inference for Consumer Choice Across Many Product Categories." Quantitative Marketing and Economics. 2019
- A. B. Dieng, F. J. R. Ruiz, D. M. Blei, M. K. Titsias. "Prescribed generative adversarial networks." Journal of Machine Learning Research. 2019

#### Accepted

- A. B. Dieng, F. J. R. Ruiz, D. M. Blei. "Topic modeling in embedding spaces." Transactions of the Association for Computational Linquistics. 2020
- F. J. R. Ruiz, S. Athey, D. M. Blei. "Shopper: A probabilistic model of consumer choice with complements and substitutes." Annals of Applied Statistics. 2020
- "Best of AoAS session" at Joint Statistical Meetings of the Americal Statistics Association. 2020
- H. M. Levitin, J. Yuan, Y. L. Cheng, F. J. R. Ruiz, E. C. Bush, J. N. Bruce, P. Canoll, A. lavarone, A. Lasorella, D. M. Blei, P. A. Sims. "De novo Gene Signature Identification from Single-Cell RNA-Seq with Hierarchical Poisson Factorization." Molecular Systems Biology. 2019
- S. Athey, D. M. Blei, R. Donnelly, F. J. R. Ruiz, T. Schmidt. "Estimating heterogeneous consumer preferences for restaurants and travel time using mobile location data." American Economics Association Papers and Proceedings. 2018
- F. J. R. Ruiz, I. Valera, L. Svensson, F. Perez-Cruz. "Infinite factorial finite state machine for blind multiuser channel estimation." IEEE Transactions on Cognitive Communications and Networking. 2018
- M. Fatemi, K. Granstrom, L. Svensson, F. J. R. Ruiz, L. Hammarstrand. "Poisson multi-Bernoulli radar mapping using Gibbs sampling." IEEE Transactions on Signal Processing. 2017
- M. Pradier, F. J. R. Ruiz, F. Perez-Cruz. "Prior design for dependent Dirichlet processes: An application to marathon modeling." PlosONE. 2016
- I. Valera, F. J. R. Ruiz, P. M. Olmos, C. Blanco, F. Perez-Cruz. "Infinite continuous feature model for psychiatric comorbidity analysis." Neural Computation. 2016
- I. Valera, F. J. R. Ruiz, F. Perez-Cruz. "Infinite factorial unbounded-state hidden Markov model." IEEE Transactions on Pattern Analysis and Machine Intelligence. 2015
- F. J. R. Ruiz, F. Perez-Cruz. "A generative model for predicting outcomes in college basketball." Journal of Quantitative Analysis in Sports (Special Issue: Prediction methodology for the NCAA men's basketball tournament). 2015
- F. J. R. Ruiz, I. Valera, C. Blanco, F. Perez-Cruz. "Bayesian nonparametric comorbidity analysis of psychiatric disorders." Journal of Machine Learning Research. 2014

# **PUBLICATIONS IN PEER-REVIEWED CONFERENCES**

## **Accepted**

- F. J. R. Ruiz, M. K. Titsias, T. Cemgil. A. Doucet. "Unbiased gradient estimation for variational autoencoders using coupled Markov chains." Uncertainty in Artificial Intelligence (online). 2021
- M. K. Titsias, F. J. R. Ruiz, S. Nikoloutsopoulos, A. Galashov. "Information theoretic meta learning with Gaussian processes." Uncertainty in Artificial Intelligence (online). 2021
- X. Chen, X. Han, J. Hu, F. J. R. Ruiz, L. Liu. "Order matters: Probabilistic modeling of node sequence for graph generation." International Conference on Machine Learning (online). 2021
- L. Richter, A. Boustati, N. Nüsken, F. J. R. Ruiz, Ö. D. Akyildiz. "VarGrad: A Low-Variance Gradient Estimator for Variational Inference." Neural Information Processing Systems (online). 2020
- A. B. Dieng, F. J. R. Ruiz, D. M. Blei. "Topic modeling in embedding spaces." Conference on Empirical Methods in Natural Language Processing (online). 2020

- F. J. R. Ruiz, M. K. Titsias. "A contrastive divergence for combining variational inference and MCMC." International Conference on Machine Learning (Long Beach, USA). 2019
- M. K. Titsias, F. J. R. Ruiz. "Unbiased implicit variational inference." Artificial Intelligence and Statistics (Naha, Japan). 2019
- F. J. R. Ruiz, M. K. Titsias, A. B. Dieng, D. M. Blei. "Augment and reduce: Stochastic inference for large categorical distributions." International Conference in Machine Learning (Stockholm, Sweden). 2018
- M. Rudolph, F. J. R. Ruiz, S. Athey, D. M. Blei. "Structured embeddings models for grouped data." Advances in Neural Information Processing Systems (Long Beach, USA). 2017
- L. Liu, F. J. R. Ruiz, S. Athey, D. M. Blei. "Context selection for embeddings models." Advances in Neural Information Processing Systems (Long Beach, USA). 2017
- C. A. Naesseth, F. J. R. Ruiz, S. W. Linderman, D. M. Blei. "Reparameterization gradients through acceptance-rejection sampling algorithms." International Conference on Artificial Intelligence and Statistics (Fort Lauderdale, USA). Best paper award. 2017
- F. J. R. Ruiz, M. K. Titsias, D. M. Blei. "The generalized reparameterization gradient." Advances in Neural Information Processing Systems (Barcelona, Spain). 2016
- M. Rudolph, F. J. R. Ruiz, S. Mandt, D. M. Blei. "Exponential family embeddings." Advances in Neural Information Processing Systems (Barcelona, Spain). 2016
- F. J. R. Ruiz, M. K. Titsias, D. M. Blei. "Overdispersed black-box variational inference." Uncertainty in Artificial Intelligence (Jersey City, USA). Oral presentation. 2016
- I. Valera, F. J. R. Ruiz, L. Svensson, F. Perez-Cruz. "Infinite factorial dynamical model." Advances in Neural Information Processing Systems (Montreal, Canada). 2015
- I. Valera, F. J. R. Ruiz, L. Svensson, F. Perez-Cruz. "A Bayesian nonparameteric approach for blind multiuser channel estimation." European Signal Processing Conference (Nice, France). 2015
- P. Gopalan, F. J. R. Ruiz, R. Ranganath, D. M. Blei. "Bayesian nonparametric Poisson factorization for recommendation systems." International Conference on Artificial Intelligence and Statistics (Reykjavik, Iceland). 2014
- F. J. R. Ruiz, I. Valera, C. Blanco, F. Perez-Cruz. "Bayesian nonparametric modeling of suicide attempts." Advances in Neural Information Processing Systems (South Lake Tahoe, USA). <u>Spotlight session</u>. 2012
- F. J. R. Ruiz, F. Perez-Cruz. "Zero-error codes for the noisy-typewriter channel." IEEE Information Theory Workshop (Paraty, Brazil). 2011

## **ARXIV PREPRINTS**

- A. B. Dieng, F. J. R. Ruiz, D. M. Blei. "The dynamic embedded topic model." 2020
- D. Tran, F. J. R. Ruiz, S. Athey, D. M. Blei. "Bayesian model criticism with potential outcomes." 2017

## **EXTRA TRAINING**

Android: Applications programming. University of Valencia (Spain). 12 weeks	2013
Machine Learning summer school. La Palma (Spain). 9 days	2012
Machine Learning summer school. Technical University of Denmark. 40 hours	2011

#### SERVICE TO PROFESSION

Area Chair for Machine Learning conferences

• Intl. Conference on Machine Learning, Intl. Conference on Learning Representations

#### Reviewer

 Journal of Machine Learning Research, IEEE Transactions of Pattern Analysis and Machine Intelligence, Journal of the Royal Statistical Society, IEEE Transactions of Cognitive Communications and Networking, Annals of Applied Statistics, Statistics and Computing, Neural Networks, Entropy

 Machine Learning conferences (Intl. Conference on Machine Learning, Advances in Neural Information Processing Systems, Intl. Conference on Artificial Intelligence and Statistics, Intl. Conference on Learning Representations, Uncertainty in Artificial Intelligence, AAAI Conference on Artificial Intelligence)

2018

#### **MEDIA COVERAGE**

Interview at El País Retina. "The next frontier of AI: Systems that doubt themselves."

#### **OTHER MERITS**

Languages: Spanish (native), English (fluent)

Software: Python, C/C++, MatLab, Java

Professional memberships: NYC Ascent, National Postdoctoral Association (NPA), Marie Curie

Alumni Association

Other interests: Board games, piano, swing dancing

• Developed a board game recommendation website: https://www.boardgamefinder.net

## **REFEREES**

David M. Blei (Columbia University) <david.blei@columbia.edu>

Susan Athey (Stanford University) <athey@susanathey.com>

Michalis K. Titsias (DeepMind) <mtitsias@google.com>

Fernando Perez-Cruz (Swiss Data Science Center) <fernando-perezcruz@sdsc.ethz.ch>